A tutorial on the universality and expressiveness of fold by Graham Hutton

narrated by Anton Trunov & Jesús Domínguez

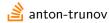
IMDEA Software Institute Madrid, Spain

Papers We Love. Mad Madrid, Spain

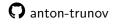
Anton Trunov

I'm a research programmer at IMDEA Software Institute









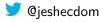
Jesús Domínguez

I'm a PhD student at IMDEA Software Institute

My interests include:

- Type Theory
- Logic
- Concurrency
- Semantics of programming languages







Why we love the paper

- Highly readable
- Starts with the basics
- Teaches how to calculate functions' implementations
- Good overview of the area

```
sum :: [Int] -> Int
sum [] = 0
sum (x:xs) = x + (sum xs)
```

```
sum :: [Int] -> Int
sum [] = 0
sum (x:xs) = x + (sum xs)
all :: [Bool] -> Bool
all [] = True
all (x:xs) = x && (all xs)
```

```
rec :: [a] -> b
rec [] = v
rec (x:xs) = x `f` (rec xs)
```

More examples of the same pattern

```
reverse :: [a] -> [a]
reverse [] = []
reverse (x:xs) = x `snoc` (reverse xs)
  where snoc x xs = xs ++ [x]
```

More examples of the same pattern

```
reverse :: [a] -> [a]
reverse [] = []
reverse (x:xs) = x `snoc` (reverse xs)
   where snoc x xs = xs ++ [x]

filter :: (a -> Bool) -> [a] -> [a]
filter p [] = []
filter p (x:xs) = x ?: (filter p xs)
   where (?:) x xs = if p x then x : xs else xs
```

More examples of the same pattern

```
reverse :: [a] -> [a]
reverse [] = []
reverse (x:xs) = x `snoc` (reverse xs)
 where snoc x xs = xs ++ [x]
filter :: (a -> Bool) -> [a] -> [a]
filter p [] = []
filter p (x:xs) = x ?: (filter p xs)
 where (?:) x xs = if p x then x : xs else xs
(++) :: [a] -> [a] -> [a]
(++) [] ys = ys
(++) (x:xs) ys = x : ((++) xs ys)
```

Abstracting out the pattern

```
foldr :: (a -> b -> b) -> b -> [a] -> b
foldr f v [] = v
foldr f v (x:xs) = x `f` (foldr f v xs)
```

What does fold do?

foldr (
$$\oslash$$
) v [\mathbf{x}_1 , \mathbf{x}_2 , \mathbf{x}_3 , ..., \mathbf{x}_{n-1} \mathbf{x}_n]
= $\mathbf{x}_1 \oslash (\mathbf{x}_2 \oslash (\mathbf{x}_3 \oslash \dots (\mathbf{x}_{n-1} \oslash (\mathbf{x}_n \oslash \mathbf{v})) \dots))$

Compare with

$$x_1 : (x_2 : (x_3 : ... (x_{n-1} : (x_n : [])) ...))$$

What does fold do?

foldr (
$$\oslash$$
) v [x_1 , x_2 , x_3 , ..., x_{n-1} x_n] = $x_1 \oslash (x_2 \oslash (x_3 \oslash ... (x_{n-1} \oslash (x_n \oslash v)) ...))$

Compare with

$$x_1 : (x_2 : (x_3 : \dots (x_{n-1} : (x_n : [])) \dots))$$

- foldr "replaces" (:) with ⊘
- and [] with v

sum = foldr (+) 0

$$x_1 + (x_2 + (x_3 + ... (x_{n-1} + (x_n + 0)) ...))$$

```
 \begin{aligned} & \text{sum} &= \text{foldr} \ (+) \ 0 \\ & \text{$x_1$} \ + \ (\text{$x_2$} \ + \ (\text{$x_3$} \ + \ \dots \ (\text{$x_{n-1}$} \ + \ (\text{$x_n$} \ + \ 0)) \ \dots \ )) \end{aligned} \\ & \text{all} &= \text{foldr} \ (\&\&) \ \text{True} \\ & \text{$x_1$} \ \&\& \ (\text{$x_2$} \ \&\& \ (\text{$x_3$} \ \&\& \ \dots \ (\text{$x_{n-1}$} \ \&\& \ (\text{$x_n$} \ \&\& \ \text{True})) \ \dots \ )) \end{aligned}
```

```
 \begin{aligned} & \text{sum} = \text{foldr} \ (+) \ 0 \\ & \text{$x_1$} + (\text{$x_2$} + (\text{$x_3$} + \dots (\text{$x_{n-1}$} + (\text{$x_n$} + 0)) \dots)) \\ & \text{all} = \text{foldr} \ (\&\&) \ \text{True} \\ & \text{$x_1$} \&\& \ (\text{$x_2$} \&\& \ (\text{$x_3$} \&\& \ \dots (\text{$x_{n-1}$} \&\& \ (\text{$x_n$} \&\& \ \text{True})) \dots)) \\ & \text{length} = \text{foldr} \ (\text{const} \ (1+)) \ 0 \\ & 1 + (1 + (1 + \dots (1 + (1 + 0)) \dots)) \end{aligned}
```

```
 \begin{aligned} & \text{sum} = \text{foldr} \ (+) \ 0 \\ & \text{$x_1$} + (\text{$x_2$} + (\text{$x_3$} + \dots (\text{$x_{n-1}$} + (\text{$x_n$} + 0)) \dots)) \\ & \text{all} = \text{foldr} \ (\&\&) \ \text{True} \\ & \text{$x_1$} \&\& \ (\text{$x_2$} \&\& \ (\text{$x_3$} \&\& \dots (\text{$x_{n-1}$} \&\& \ (\text{$x_n$} \&\& \ \text{True})) \dots)) \\ & \text{length} = \text{foldr} \ (\text{const} \ (1+)) \ 0 \\ & 1 + (1 + (1 + \dots (1 + (1 + 0)) \dots))) \\ & \text{map } f = \text{foldr} \ (\text{$x_1$} : (\text{f} \ \text{$x_2$} : (\text{f} \ \text{$x_3$} : \dots (\text{f} \ \text{$x_{n-1}$} : (\text{f} \ \text{$x_n$} : [])) \dots)) \\ \end{aligned}
```

```
reverse = foldr snoc []

where snoc x xs = xs ++ [x]

x_1 `snoc` (x_2 `snoc` ... (x_{n-1} `snoc` (x_n `snoc` [])) ... )
```

```
reverse = foldr snoc []
  where snoc x xs = xs ++ [x]
x<sub>1</sub> `snoc` (x<sub>2</sub> `snoc` ... (x<sub>n-1</sub> `snoc` (x<sub>n</sub> `snoc` [])) ... )

filter p (x:xs) = foldr (?:) []
  where (?:) x xs = if p x then x : xs else xs
x<sub>1</sub> ?: (x<sub>2</sub> ?: (x<sub>3</sub> ?: ... (x<sub>n-1</sub> ?: (x<sub>n</sub> ?: [])) ... ))
```

```
reverse = foldr snoc []
  where snoc x xs = xs ++ [x]
x_1 `snoc` (x_2 `snoc` ... (x_{n-1} `snoc` (x_n `snoc` []) ...
filter p(x:xs) = foldr(?:)[]
  where (?:) x xs = if p x then x : xs else xs
x_1 ?: (x_2 ?: (x_3 ?: ... (x_{n-1} ?: (x_n ?: [])) ... ))
(++) xs ys = foldr (:) ys xs
-- or, in the point-free style: (++) = flip (foldr (:))
x_1 : (x_2 : (x_3 : \dots (x_{n-1} : (x_n : ys)) \dots))
```

Advantages of using fold

- Less boilerplate we don't repeat the recursion scheme
- Can be easier to understand the essence of the algorithm can be seen clearer
- The code can be constructed in a systematic manner
- Easier code transformations
- Makes it easier to prove the properties of functions

```
dropWhile :: (a -> Bool) -> [a] -> [a]
dropWhile p [] = []
dropWhile p (x:xs) = if p x then dropWhile p xs else x : xs
-- example:
dropWhile even [4,2,1,2,3,4,5] = [1,2,3,4,5]
```

```
dropWhile :: (a -> Bool) -> [a] -> [a]
dropWhile p [] = []
dropWhile p (x:xs) = if p x then dropWhile p xs else x : xs
-- example:
dropWhile even [4,2,1,2,3,4,5] = [1,2,3,4,5]
The folding function f gets
```

the head of the list x

```
dropWhile :: (a -> Bool) -> [a] -> [a]
dropWhile p [] = []
dropWhile p (x:xs) = if p x then dropWhile p xs else x : xs
-- example:
dropWhile even [4,2,1,2,3,4,5] = [1,2,3,4,5]
```

- The folding function f gets

 the head of the list x
 - the nead of the list x
 - the result of calling fold on tail

```
dropWhile :: (a -> Bool) -> [a] -> [a]
dropWhile p [] = []
dropWhile p (x:xs) = if p x then dropWhile p xs else x : xs
-- example:
dropWhile even [4,2,1,2,3,4,5] = [1,2,3,4,5]
```

The folding function f gets

- the head of the list x
- the result of calling fold on tail

$$\underbrace{x_1}_{\text{head}} \oslash \underbrace{\left(x_2 \oslash \left(x_3 \oslash ... \left(x_{n-1} \oslash \left(x_n \oslash v\right)\right)...\right)\right)}_{\text{foldr f v } \left[x_2, ..., x_n\right]}$$

```
dropWhile :: (a -> Bool) -> [a] -> [a]
dropWhile p [] = []
dropWhile p (x:xs) = if p x then dropWhile p xs else x : xs
-- example:
dropWhile even [4,2,1,2,3,4,5] = [1,2,3,4,5]
```

The folding function f gets

- the head of the list x
- the result of calling fold on tail

$$\underbrace{x_1}_{\text{head}} \oslash \underbrace{(x_2 \oslash (x_3 \oslash ... (x_{n-1} \oslash (x_n \oslash v))...))}_{\text{foldr f v } [x_2, ..., x_n]}$$

• but not the tail itself!

```
tail :: [a] -> [a]
tail [] = [] -- Exception in Haskell
tail (_:xs) = xs
```

foldr (\x (xs, acc) -> (x : xs, xs)) ([], []) $[x_1, x_2, x_3]$

[] **==>** ([], [])

```
tail :: [a] -> [a]
tail [] = []
                         -- Exception in Haskell
tail (:xs) = xs
tail :: [a] -> [a]
tail = snd . foldr (\langle x (xs, acc) \rightarrow (x : xs, xs) \rangle ([], [])
Example:
foldr (\x (xs, acc) -> (x : xs, xs)) ([], []) [x_1, x_2, x_3]
[] ==> ([], [])
x_3 ==> ([x_3], [])
```

```
tail :: [a] -> [a]
tail [] = []
                         -- Exception in Haskell
tail (:xs) = xs
tail :: [a] -> [a]
tail = snd . foldr (\langle x (xs, acc) \rightarrow (x : xs, xs) \rangle ([], [])
Example:
foldr (\x (xs, acc) -> (x : xs, xs)) ([], []) [x_1, x_2, x_3]
[] ==> ([], [])
x_3 ==> ([x_3], [])
x_2 ==> ([x_2, x_3], [x_3])
```

```
tail :: [a] -> [a]
tail [] = []
                         -- Exception in Haskell
tail (:xs) = xs
tail :: [a] -> [a]
tail = snd . foldr (\langle x (xs, acc) \rightarrow (x : xs, xs) \rangle ([], [])
Example:
foldr (\x (xs, acc) -> (x : xs, xs)) ([], []) [x_1, x_2, x_3]
[] ==> ([], [])
x_3 ==> ([x_3], [])
x_2 ==> ([x_2, x_3], [x_3])
x_1 = ([x_1, x_2, x_3], [x_2, x_3])
```

Let's get back to dropWhile:

```
dropWhile :: (a -> Bool) -> [a] -> [a]
dropWhile p = snd . foldr f ([], [])
  where
    f x (xs, rec) = (x : xs, if p x then rec else x : xs)
```

foldr is not a silver bullet

Let's get back to dropWhile:

```
dropWhile :: (a -> Bool) -> [a] -> [a]
dropWhile p = snd . foldr f ([], [])
   where
     f x (xs, rec) = (x : xs, if p x then rec else x : xs)

Compare to:
dropWhile :: (a -> Bool) -> [a] -> [a]
```

dropWhile p [] = []
dropWhile p (x:xs) = if p x then dropWhile p xs else x : xs

Programs written using fold can be less readable than programs written using explicit recursion.

Iterators vs recursors

```
foldr :: (a -> b -> b) -> b -> [a] -> b
foldr f v [] = v
foldr f v (x:xs) = f x (foldr f v xs)
```

Iterators vs recursors

```
foldr :: (a -> b -> b) -> b -> [a] -> b
foldr f v [] = v
foldr f v (x:xs) = f x (foldr f v xs)
```

```
foldrRec :: (a \rightarrow [a] \rightarrow b \rightarrow b) \rightarrow b \rightarrow [a] \rightarrow b
foldrRec f v [] = v
foldrRec f v (x:xs) = f x xs (foldrRec f v xs)
```

foldr is called an iterator a.k.a catamorphism
foldrRec is called a recursor a.k.a paramorphism
foldrRec implements a pattern called primitive recursion

dropWhile again

```
foldrRec :: (a -> [a] -> b -> b) -> b -> [a] -> b
foldrRec f v [] = v
foldrRec f v (x:xs) = f x xs (foldrRec f v xs)
```

foldrRec via foldr

```
foldr :: (a -> b -> b) -> b -> [a] -> b foldr f = foldrRec (const . f)
```

foldrRec via foldr

```
foldr :: (a -> b -> b) -> b -> [a] -> b
foldr f = foldrRec (const . f)
```

```
foldrRec :: (a -> [a] -> b -> b) -> b -> [a] -> b
foldrRec f v = snd . foldr g ([], v)
  where
    g x (xs, rec) = (x : xs, f x xs rec)
```

```
fold1 :: (b -> a -> b) -> b -> [a] -> b
fold1 f v [] = v
fold1 f v (x:xs) = fold1 f (f v x) xs
```

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

foldl f v [] = v

foldl f v (x:xs) = foldl f (f v x) xs

foldl (\bigcirc) v [x<sub>1</sub>, x<sub>2</sub>, x<sub>3</sub>, ..., x<sub>n-1</sub> x<sub>n</sub>]

=

(...(((v \bigcirc x_1) \bigcirc x_2) \bigcirc x_3) ... \bigcirc x_{n-1}) \bigcirc x_n
```

```
foldl :: (b -> a -> b) -> b -> [a] -> b

foldl f v [] = v

foldl f v (x:xs) = foldl f (f v x) xs

foldl (\otimes) v [x<sub>1</sub>, x<sub>2</sub>, x<sub>3</sub>, ..., x<sub>n-1</sub> x<sub>n</sub>]

=

(...(((v \otimes x<sub>1</sub>) \otimes x<sub>2</sub>) \otimes x<sub>3</sub>) ... \otimes x<sub>n-1</sub>) \otimes x<sub>n</sub>

\Leftrightarrow

x<sub>n</sub> \otimes (x<sub>n-1</sub> \otimes ... (x<sub>3</sub> \otimes (x<sub>2</sub> \otimes (x<sub>1</sub> \otimes v))) ... )
```

```
fold1 :: (b -> a -> b) -> b -> [a] -> b
foldl f v \Pi = v
foldl f v (x:xs) = foldl f (f v x) xs
fold1 (\Diamond) v [x_1, x_2, x_3, ..., x_{n-1} x_n]
(\dots(((\vee \otimes x_1) \otimes x_2) \otimes x_3) \dots \otimes x_{n-1}) \otimes x_n
  Ġ,
x_n \oslash (x_{n-1} \oslash \dots (x_3 \oslash (x_2 \oslash (x_1 \oslash v))) \dots)
  =
(foldr (flip (\lozenge)) v) . reverse
```

```
fold1 :: (b -> a -> b) -> b -> [a] -> b
foldl f v \Pi = v
foldl f v (x:xs) = foldl f (f v x) xs
fold1 (\Diamond) v [x_1, x_2, x_3, ..., x_{n-1} x_n]
(\dots(((\vee \otimes x_1) \otimes x_2) \otimes x_3) \dots \otimes x_{n-1}) \otimes x_n
  (G
x_n \oslash (x_{n-1} \oslash \dots (x_3 \oslash (x_2 \oslash (x_1 \oslash v))) \dots)
  =
(foldr (flip (\lozenge)) v) . reverse
fold1 :: (b -> a -> b) -> b -> [a] -> b
foldl f v = (foldr (flip f) v) . reverse
```

```
fold1 (\bigcirc) v xs
=
(...(((v \bigcirc x<sub>1</sub>) \bigcirc x<sub>2</sub>) \bigcirc x<sub>3</sub>) ... \bigcirc x<sub>n-1</sub>) \bigcirc x<sub>n</sub>
```

```
foldl (\bigcirc) v xs

= (...(((v \bigcirc x<sub>1</sub>) \bigcirc x<sub>2</sub>) \bigcirc x<sub>3</sub>) ... \bigcirc x<sub>n-1</sub>) \bigcirc x<sub>n</sub>

= (\bigcirc x<sub>n</sub>) . (\bigcirc x<sub>n-1</sub>) ... . (\bigcirc x<sub>3</sub>) . (\bigcirc x<sub>2</sub>) . (\bigcirc x<sub>1</sub>) \$ v
```

```
foldl (\bigcirc) v xs = (...(((v \bigcirc x<sub>1</sub>) \bigcirc x<sub>2</sub>) \bigcirc x<sub>3</sub>) ... \bigcirc x<sub>n-1</sub>) \bigcirc x<sub>n</sub> = (\bigcirc x<sub>n</sub>) . (\bigcirc x<sub>n-1</sub>) ... . (\bigcirc x<sub>3</sub>) . (\bigcirc x<sub>2</sub>) . (\bigcirc x<sub>1</sub>) \$ v = id . (\bigcirc x<sub>n</sub>) . (\bigcirc x<sub>n</sub>) . (\bigcirc x<sub>n-1</sub>) ... . (\bigcirc x<sub>3</sub>) . (\bigcirc x<sub>2</sub>) . (\bigcirc x<sub>1</sub>) \$ v
```

```
foldl (\(\infty\)) v xs
(\dots(((v \otimes x_1) \otimes x_2) \otimes x_3) \dots \otimes x_{n-1}) \otimes x_n
id . (\lozenge x_n) . (\lozenge x_{n-1}) ... . (\lozenge x_3) . (\lozenge x_2) . (\lozenge x_1) $ v
((\ldots((id \cdot (\otimes x_n)) \cdot (\otimes x_{n-1})) \ldots)
```

```
foldl (\(\infty\)) v xs
(\dots(((v \otimes x_1) \otimes x_2) \otimes x_3) \dots \otimes x_{n-1}) \otimes x_n
id . (\lozenge x_n) . (\lozenge x_{n-1}) ... . (\lozenge x_3) . (\lozenge x_2) . (\lozenge x_1) $ v
((\ldots((id \cdot (\otimes x_n)) \cdot (\otimes x_{n-1})) \ldots)
    =
foldr (\x rec -> rec . (\x x)) id xs v
```

Universal Property of fold

Theorem

Given $f: a \rightarrow b \rightarrow b$, v: b, and $g: [a] \rightarrow b$, we have,

$$g[] = v$$

$$g(x : xs) = f \times (g \times s) \iff g = fold \ f \ v$$

Universal Property of fold

How to prove this?

$$(+1)$$
 . $\mathit{sum} = \mathit{fold}\ (+)\ 1$

Universal Property of fold

How to prove this?

$$(+1)$$
 . $sum = fold (+) 1$

By universal property:

Universal Property of fold: List objects

Universal Property of fold: Initial Algebras

$$F_{A} X :\equiv 1 + A \times X$$

$$map \ F_{A} \ f :\equiv id_{1} + id_{A} \times f$$

$$Y \qquad 1 + A \times Y$$

$$F_{A} \ L(A) \xrightarrow{ln} \ L(A)$$

$$F_{A} \ B \xrightarrow{f} \ B$$

$$L(A) \xrightarrow{-\frac{\exists !}{\exists cata} \ f} \ B$$

$$F_{A} \ L(A) \xrightarrow{ln} \ L(A)$$

$$map \ F_{A} \ (cata \ f) \downarrow \qquad \qquad \downarrow cata \ f \qquad (cata \ f) \circ ln = f \circ (map \ F_{A} \ (cata \ f))$$

$$F_{A} \ B \xrightarrow{f} \ B \qquad \qquad = f \circ (id_{1} + id_{A} \times (cata \ f))$$

4 □ ▶ 4 □ ▶ 4 □ ▶ 4 □ ▶ 9 Q ○

Fold and other datatypes

$$id [] = []$$

 $id (x : xs) = (:) x (id xs)$ \iff $id = fold (:) []$

Fold and other datatypes

$$id [] = []$$

 $id (x : xs) = (:) x (id xs)$ \iff $id = fold (:) []$

```
foldr :: (a -> b -> b) -> b -> [a] -> b
foldr f v [] = v
foldr f v (x:xs) = f x (foldr f v xs)
```

```
data LTree a =
   Leaf a | Split (LTree a) (LTree a)
data BTree a =
   Empty | Node a (BTree a) (BTree a)
```

```
data LTree a =
   Leaf a | Split (LTree a) (LTree a)
data BTree a =
   Empty | Node a (BTree a) (BTree a)

cata_LTree :: ...... -> LTree a -> b
cata_BTree :: ..... -> BTree a -> b
```

```
data I.Tree a =
  Leaf a | Split (LTree a) (LTree a)
data BTree a =
  Empty | Node a (BTree a) (BTree a)
cata LTree :: ...... -> LTree a -> b
cata BTree :: ..... -> BTree a -> b
cata LTree :: (b -> b -> b) -> (a -> b) -> LTree a -> b
cata BTree :: (a -> b -> b -> b) -> b -> BTree a -> b
Since:
Split :: LTree a -> LTree a -> LTree a
Leaf :: a -> LTree a
Node :: a -> BTree a -> BTree a -> BTree a
Empty :: BTree a
```

```
cata_LTree :: (b -> b -> b) -> (a -> b) -> LTree a -> b
cata_LTree fs fl (Leaf x) = fl x
cata_LTree fs fl (Split l r) =
   fs (cata_LTree fs fl l) (cata_LTree fs fl r)

cata_BTree :: (a -> b -> b -> b) -> b -> BTree a -> b
cata_BTree fn v Empty = v
cata_BTree fn v (Node x l r) =
   fn x (cata_BTree fn v l) (cata_BTree fn v r)
```

Compiler optimizations: rewrite rules

```
{−# RULES
   "map" [~1] forall f xs.
                map f xs =
                build (\c n \rightarrow foldr (mapFB c f) n xs)
-}
where
build :: (forall b. (a \rightarrow b \rightarrow b) \rightarrow b \rightarrow b) \rightarrow [a]
build g = g(:)
mapFB :: (e -> lst -> lst) -> (a -> e) -> a -> lst -> lst
mapFB c f = \x ys -> c (f x) ys
```

The equations guiding the compiler must be correct!

Advantage: Reasoning made easier!

Interactive session in Coq: the fusion property of fold.

Outro

Thank you!

Get in touch with us after the talk!

github.com/anton-trunov/fold-tutorial-talk

Outro

Questions?