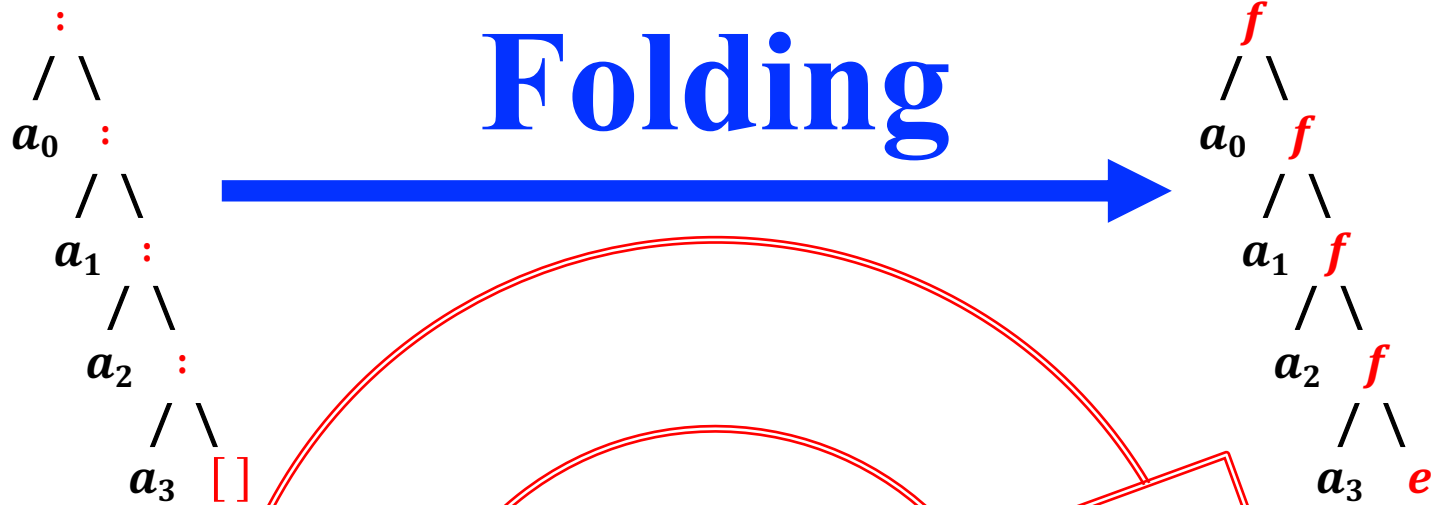


Folding



CHEAT-SHEET
#4

slides by



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<https://fpilluminated.com/>

We want to write function *decimal*, which given the digits of an integer number

$[d_0, d_1, \dots, d_n]$

computes the integer value of the number

$$\sum_{k=0}^n d_k * 10^{n-k}$$

```
haskell> decimal [1,2,3,4]
1234
```

```
scala> decimal(List(1,2,3,4))
val res0: Int = 1234
```

$$d_0 * 10^3 + d_1 * 10^2 + d_2 * 10^1 + d_3 * 10^0 = 1 * 1000 + 2 * 100 + 3 * 10 + 4 * 1 = 1234$$

Thanks to the universal property of *fold*, if we are able to define *decimal* so that its equations match those on the left hand side of the following equivalence, then we are also able to implement *decimal* using a *right fold*

The universal property of *fold*

$g [] = v$	\Leftrightarrow	$g = fold f v$	
$g (x : xs) = f x (g xs)$			$g :: [\alpha] \rightarrow \beta$
			$v :: \beta$
			$f :: \alpha \rightarrow \beta \rightarrow \beta$

i.e. given *foldr*

$$\begin{aligned} foldr &:: (\alpha \rightarrow \beta \rightarrow \beta) \rightarrow \beta \rightarrow ([\alpha] \rightarrow \beta) \\ foldr f v [] &= v \\ foldr f v (x : xs) &= f x (foldr f v xs) \end{aligned}$$

we can reimplement *decimal* like this:

$$decimal = foldr f v$$

Notice that f has two parameters: the head of the list, and the result of recursively calling g with the tail of the list

$$g(x : xs) = f\ x\ (g\ xs)$$

In order to define our *decimal* function however, the two parameters of f are not sufficient. When *decimal* is passed $[d_k, \dots, d_n]$, f is passed digit d_k , so f needs n and k in order to compute 10^{n-k} , but $n - k$ is the number of elements in $[d_k, \dots, d_n]$ minus one, so by nesting the definition of f inside that of *decimal*, we can avoid explicitly adding a third parameter to f :

```
decimal :: [Int] -> Int
decimal [] = 0
decimal (d:ds) = f d (decimal ds) where
  e = length ds
  f :: Int -> Int -> Int
  f d ds = d * (10 ^ e) + ds
```



```
def decimal(digits: List[Int]): Int =
  val e = digits.length-1
  def f(d: Int, ds: Int): Int =
    d * Math.pow(10, e).toInt + ds
  digits match
    case Nil => 0
    case d +: ds => f(d, decimal(ds))
```



The unnecessary complexity of the *decimal* functions on this slide is purely due to them being defined in terms of f . See next slide for simpler refactored versions in which f is inlined.

We nested f inside *decimal*, so that the equations of *decimal* match (almost) those of g . They don't match perfectly, in that the f nested inside *decimal* depends on *decimal*'s list parameter, whereas the f nested inside g does not depend on g 's list parameter. Are we still able to redefine *decimal* using *foldr*? If the match had been perfect, we would be able to define *decimal* = *foldr* f 0 (with $v = 0$), but because f needs to know the value of $n - k$, we can't just pass f to *foldr*, and use 0 as the initial accumulator. Instead, we need to use (0, 0) as the accumulator (the second 0 being the initial value of $n - k$, when $k = n$), and pass to *foldr* a helper function h that manages $n - k$ and that wraps f , so that the latter has access to $n - k$.

```
h :: Int -> (Int,Int) -> (Int,Int)
h d (ds, e) = (f d ds, e + 1) where
  f :: Int -> Int -> Int
  f d ds = d * (10 ^ e) + ds
```

```
decimal :: [Int] -> Int
decimal ds = fst (foldr h (0,0) ds)
```



```
def h(d: Int, acc: (Int,Int)): (Int,Int) = acc match { case (ds, e) =>
  def f(d: Int, ds: Int): Int =
    d * Math.pow(10, e).toInt + ds
  (f(d, ds), e + 1)
}
def decimal(ds: List[Int]): Int =
  ds.foldRight((0,0))(h).head
```



Same *decimal* functions as on the previous slide, but refactored as follows:

1. inlined *f* in all four functions
2. inlined *e* in the first two functions
3. renamed *h* to *f* in the last two functions



```
decimal :: [Int] -> Int
decimal [] = 0
decimal (d:ds) = d*(10^(length ds))+(decimal ds)
```

```
f :: Int -> (Int,Int) -> (Int,Int)
f d (ds, e) = (d * (10 ^ e) + ds, e + 1)
```

```
decimal :: [Int] -> Int
decimal ds = fst (foldr f (0,0) ds)
```



```
def decimal(digits: List[Int]): Int = digits match
  case Nil => 0
  case d +: ds => d * Math.pow(10, ds.length).toInt + decimal(ds)
```

```
def f(d: Int, acc: (Int,Int)): (Int,Int) = acc match
  case (ds, e) => (d * Math.pow(10, e).toInt + ds, e + 1)
```

```
def decimal(ds: List[Int]): Int =
  ds.foldRight((0,0))(f).head
```

The definition of *decimal* using a **right fold** is inefficient because it computes $\sum_{k=0}^n d_k * 10^{n-k}$ by computing 10^{n-k} for each k .

Not every function on lists can be defined as an instance of *foldr*. ... Even for those that can, an alternative definition may be more efficient. To illustrate, suppose we want a function *decimal* that takes a list of digits and returns the corresponding decimal number; thus

$$\mathit{decimal} [x_0, x_1, \dots, x_n] = \sum_{k=0}^n x_k 10^{(n-k)}$$

It is assumed that the most significant digit comes first in the list. One way to compute *decimal* efficiently is by a process of multiplying each digit by ten and adding in the following digit. For example

$$\mathit{decimal} [x_0, x_1, x_2] = 10 \times (10 \times (10 \times 0 + x_0) + x_1) + x_2$$

This decomposition of a sum of powers is known as **Horner's rule**.

Suppose we define \oplus by $n \oplus x = 10 \times n + x$. Then we can rephrase the above equation as

$$\mathit{decimal} [x_0, x_1, x_2] = ((0 \oplus x_0) \oplus x_1) \oplus x_2$$

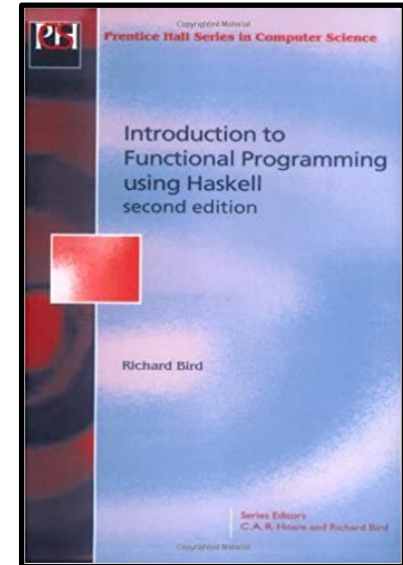
This is almost like an instance of *foldr*, except that the grouping is the other way round, and the starting value appears on the left, not on the right. In fact the computation is dual: instead of processing from right to left, the computation processes from left to right.

This example motivates the introduction of a second fold operator called *foldl* (pronounced 'fold left'). Informally:

$$\mathit{foldl} (\oplus) e [x_0, x_1, \dots, x_{n-1}] = (\dots ((e \oplus x_0) \oplus x_1) \dots) \oplus x_{n-1}$$

The parentheses group from the left, which is the reason for the name. The full definition of *foldl* is

$$\begin{aligned} \mathit{foldl} &:: (\beta \rightarrow \alpha \rightarrow \beta) \rightarrow \beta \rightarrow [\alpha] \rightarrow \beta \\ \mathit{foldl} f e [] &= e \\ \mathit{foldl} f e (x:xs) &= \mathit{foldl} f (f e x) xs \end{aligned}$$



Richard Bird

If we look back at our initial recursive definition of *decimal*, we see that it splits its list parameter into a **head** and a **tail**.

```
decimal :: [Int] -> Int
decimal [] = 0
decimal (d:ds) = d*(10^(length ds)) + (decimal ds)
```

```
def decimal(digits: List[Int]): Int = digits match
  case Nil => 0
  case d +: ds => d * Math.pow(10, ds.length).toInt + decimal(ds)
```

If we get *decimal* to split the list into **init** and **last**, we can make it more efficient by using **Horner's rule**:

```
(⊕) :: Int -> Int -> Int
n ⊕ d = 10 * n + d
```

```
extension (n: Int)
  def ⊕(d: Int): Int = 10 * n + d
```

```
decimal :: [Int] -> Int
decimal [] = 0
decimal ds = (decimal (init ds)) ⊕ (last ds)
```

```
def decimal(digits: List[Int]): Int = digits match
  case Nil => 0
  case ds :+ d => decimal(ds) ⊕ d
```

We can then improve on that by going back to splitting the list into a **head** and a **tail**, and making *decimal* tail recursive:

```
decimal :: [Int] -> Int -> Int
decimal [] acc = acc
decimal (d:ds) acc = decimal ds (acc ⊕ d)
```

```
def decimal(ds: List[Int], acc: Int=0): Int = digits match
  case Nil => acc
  case d +: ds => decimal(ds, acc ⊕ d)
```

And finally, we can improve on that by defining *decimal* using a **left fold**:

```
decimal :: [Int] -> Int
decimal = foldl (⊕) 0
```

```
def decimal(ds: List[Int]): Int =
  ds.foldLeft(0)(_⊕_)
```

Recap

In the case of the *decimal* function, defining it using a **left fold** is simple and mathematically more efficient

$$\mathit{decimal} [1,2,3,4] = 10 * (10 * (10 * (10 * 0 + d_0) + d_1) + d_2) + d_3 = 10 * (10 * (10 * (10 * 0 + 1) + 2) + 3) + 4 = 1234$$

```
decimal :: [Int] -> Int
decimal = foldl1 (⊕) 0

(⊕) :: Int -> Int -> Int
n ⊕ d = 10 * n + d
```

```
def decimal(ds: List[Int]): Int =
  ds.foldLeft(0)(_⊕_)

extension (n: Int)
  def ⊕(d: Int): Int = 10 * n + d
```

whereas defining it using a **right fold** is more complex and mathematically less efficient

$$\mathit{decimal} [1,2,3,4] = d_0 * 10^3 + (d_1 * 10^2 + (d_2 * 10^1 + (d_3 * 10^0 + 0))) = 1 * 1000 + (2 * 100 + (3 * 10 + (4 * 1 + 0))) = 1234$$

```
decimal :: [Int] -> Int
decimal ds = fst (foldr f (0,0) ds)

f :: Int -> (Int,Int) -> (Int,Int)
f d (ds, e) = (d * (10 ^ e) + ds, e + 1)
```

```
def decimal(ds: List[Int]): Int =
  ds.foldRight((0,0))(f).head

def f(d: Int, acc: (Int,Int)): (Int,Int) = acc match
  case (ds, e) => (d * Math.pow(10, e).toInt + ds, e + 1)
```

Folding Unfolded

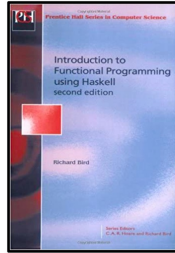
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Haskell and Scala

See how **recursive functions** and **structural induction** relate to **recursive datatypes**

Follow along as the **fold abstraction** is introduced and explained

Watch as **folding** is used to simplify the definition of **recursive functions** over **recursive datatypes**

Part 1 - through the work of



A tutorial on the universality and expressiveness of fold

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Folding Unfolded

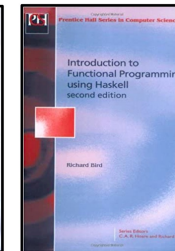
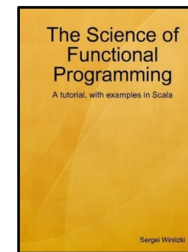
Polyglot FP for Fun and Profit
Haskell and Scala

See **aggregation functions** defined **inductively** and implemented using **recursion**

Learn how in many cases, **tail-recursion** and the **accumulator trick** can be used to avoid **stackoverflow errors**

Watch as **general aggregation** is implemented and see **duality theorems** capturing the relationship between **left folds** and **right folds**

Part 2 - through the work of



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