

# Chapter 7: Computations lifted to a functor context II

## Part 1: Examples of monads and semimonads

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# Computations within a functor context: Semimonads

Intuitions behind adding more “generator arrows”

Example:

$$\sum_{i=1}^n \sum_{j=1}^n \sum_{k=1}^n f(i, j, k)$$

Using Scala's `for`/`yield` syntax (“functor block”)

```
(for { i ← 1 to n          (1 to m).flatMap { i ⇒
    j ← 1 to n            (1 to n).flatMap { j ⇒
    k ← 1 to n            (1 to n).map { k ⇒
    } yield f(i, j, k)
    } yield f(i, j, k)
}).sum                      } } }.sum
```

- `map` replaces the last left arrow, `flatMap` replaces other left arrows
  - ▶ When the functor is *also* filterable, we can use “`if`” as well
- Standard library defines `flatMap()` as equivalent of `map() ∘ flatten`
  - ▶ `(1 to n).flatMap(j ⇒ ...)` is `(1 to n).map(j ⇒ ...).flatten`
- `flatten: F[F[A]] ⇒ F[A]` can be expressed through `flatMap` as well:
  - ▶ `(xss: Seq[Seq[A]]).flatten = xss.flatMap { (xs: Seq[A]) ⇒ xs }`
- Functors having `flatMap`/`flatten` are “flattenable” or **semimonads**
  - ▶ Most of them also have method `pure: A ⇒ F[A]` and so are **monads**

# What is `flatMap` doing with the data in a collection?

Consider this schematic code using `Seq` as the container type:

```
val result = for {
  i ← 1 to m
  j ← 1 to n
  x = f(i,j)
  k ← 1 to p
  y = g(i,j,k)
} yield h(x,y)

val result = {
  (1 to m).flatMap { i ⇒
    (1 to n).flatMap { j ⇒
      val x = f(i,j)
      (1 to p).map { k ⇒
        val y = g(i,j,k)
        h(x,y) } } } }
```

Computations are repeated for all  $i$ , for all  $j$ , etc., from each collection

- All collections must have the same container type
  - ▶ Each *generator line* finally computes a container of the same type
  - ▶ The total number of resulting data items is  $\leq m * n * p$
  - ▶ All the resulting data items must fit within *the same* container type!
  - ▶ The set of *container capacity counts* must be closed under multiplication
- What container types have this property?
  - ▶ `Seq`, `NonEmptyList` – can hold *any* number of elements  $\geq$  min. count
  - ▶ `Option`, `Either`, `Try`, `Future` – can hold 0 or 1 elements (“pass/fail”)
  - ▶ “Tree-like” containers, e.g. can hold only 3, 6, 9, 12, ... elements
  - ▶ “Non-standard” containers:  $F^A \equiv \text{String} \Rightarrow A$ ;  $F^A \equiv (A \Rightarrow \text{Int}) \Rightarrow \text{Int}$

# Working with list-like monads

`Seq`, `NonEmptyList`, `Iterator`, `Stream`

Typical tasks solved with “list-like” monads:

- Create a list of all combinations or all permutations of a sequence
- Traverse a “solution tree” with DFS and filter out incorrect solutions
  - ▶ Can use eager (`Seq`) or lazy (`Iterator`, `Stream`) evaluation strategies
  - ▶ Usually, list-like containers have many additional methods
    - ★ `append`, `prepend`, `concat`, `fill`, `fold`, `scan`, etc.

Examples: see code

- 1 All permutations of `Seq("a", "b", "c")`
- 2 All subsets of `Set("a", "b", "c")`
- 3 All subsequences of length 3 out of the sequence `(1 to m)`
- 4 All solutions of the “8 queens” problem
- 5 Generalize examples 1-3 to support arbitrary length  $n$  instead of 3
- 6 Generalize example 4 to solve  $n$ -queens problem
- 7 Transform Boolean formulas between CNF and DNF

# Intuitions for pass/fail monads

Option, Either, Try, Future

- Container  $F^A$  can hold  $n = 1$  or  $n = 0$  values of type  $A$
- Such containers will have methods to create “pass” and “fail” values

Schematic example of a functor block program using the `Try` functor:

```
val result: Try[A] = for { // computations in the Try functor
  x ← Try(...) // first computation; may fail
  y = f(x) // no possibility of failure in this line
  if p(y) // the entire expression will fail if this is false
  z ← Try(g(x, y)) // may fail here
  r ← Try(...) // may fail here as well
} yield r // r is of type A, so result is of type Try[A]
```

- Computations may yield a result ( $n = 1$ ), or may fail ( $n = 0$ )
- The functor block chains several such computations *sequentially*
  - ▶ Computations are sequential even if using the `Future` functor!
  - ▶ Once any computation fails, the entire functor block fails ( $0 * n = 0$ )
  - ▶ Only if *all* computations succeed, the functor block returns *one* value
  - ▶ Filtering can also make the entire expression fail
- “Flat” functor block replaces a chain of nested `if/else` or `match/case`

# Working with pass/fail monads

Typical tasks solved with pass/fail monads:

- Perform a linear sequence of computations that may fail
- Avoid crashing on failure, instead return an *error value*

Examples: see code

- 1 Read values of Java properties, checking that they all exist
- 2 Obtain values from `Future` computations in sequence
- 3 Make arithmetic safe by returning error messages in `Either`
- 4 Fail less: allow up to 2 computations out of  $n$  to throw an exception
- 5 Generalize example 3 to support up to  $k$  failures instead of 2

# Working with tree-like monads

Typical tasks solved with tree-like monads:

- Traverse a syntax tree, substitute subexpressions
- ???

Examples: see code

- 1 Implement variable substitution for a simple arithmetic language
- 2 ???

# Single-value monads (non-standard containers)

Reader, Writer, Eval, Cont, State

- Container holds exactly 1 value, together with a “context”
- Usually, methods exist to insert a value and to work with the “context”

Typical tasks:

- Collect extra information about computations along the way
- Chain of computations with a nonstandard evaluation strategy

Examples: see code

- ➊ Dependency injection with the `Reader` monad
- ➋ Perform computations and log information about each step
- ➌ Perform lazy or memoized computations in a sequence
- ➍ A chain of asynchronous operations
- ➎ A sequence of steps that update state while returning results



# Semimonad laws I: The intuitions

What properties of functor block programs do we expect to have?

- In  $x \leftarrow c$ , the value of  $x$  will *go over items* held in container  $c$
- Manipulating items in container is followed by a generator:

$x \leftarrow \text{cont1}$	$y \leftarrow \text{cont1}$
$y = f(x)$	$\quad \text{.map}(x \Rightarrow f(x))$
$z \leftarrow \text{cont2}(y)$	$z \leftarrow \text{cont2}(y)$

$\text{cont1.flatMap}(x \Rightarrow \text{cont2}(f(x))) = \text{cont1.map}(f).\text{flatMap}(y \Rightarrow \text{cont2}(y))$

- Manipulating items in container is preceded by a generator:

$x \leftarrow \text{cont1}$	$x \leftarrow \text{cont1}$
$y \leftarrow \text{cont2}(x)$	$z \leftarrow \text{cont2}(x)$
$z = f(y)$	$\quad \text{.map}(f)$

$\text{cont1.flatMap}(\text{cont2}).\text{map}(f) = \text{cont1.flatMap}(x \Rightarrow \text{cont2}(x).\text{map}(f))$

- After  $x \leftarrow c$ , further computations will use *all those*  $x$

$x \leftarrow \text{cont}$	$y \leftarrow \text{for } \{ x \leftarrow \text{cont}$
$y \leftarrow p(x)$	$\quad \quad \text{yy} \leftarrow p(x) \} \text{yield } yy$
$z \leftarrow \text{cont2}(y)$	$z \leftarrow \text{cont2}(y)$

$\text{cont.flatMap}(x \Rightarrow p(x).\text{flatMap}(\text{cont2})) = \text{cont.flatMap}(p).\text{flatMap}(\text{cont2})$

## Semimonad laws II: The laws for `flatMap`

To use the concise notation, denote `flatMap` by `flm`

A **semimonad**  $S^A$  has  $\text{flm}^{[S, A, B]} : (A \Rightarrow S^B) \Rightarrow S^A \Rightarrow S^B$  with 2 laws:

- ①  $\text{flm} (f^{A \Rightarrow B} \circ g^{B \Rightarrow S^C}) = \text{fmap } f \circ \text{flm } g$  (naturality in  $A$ )

$$\begin{array}{ccc} & S^B & \\ \text{fmap } f^{A \Rightarrow B} \nearrow & & \searrow \text{flm } g^{B \Rightarrow S^C} \\ S^A & \xrightarrow{\text{flm } (f^{A \Rightarrow B} \circ g^{B \Rightarrow S^C})} & S^C \end{array}$$

- ②  $\text{flm} (f^{A \Rightarrow S^B} \circ h^{S^B \Rightarrow S^C}) = \text{flm } f \circ h$  (naturality in  $B$ )

$$\begin{array}{ccc} & S^B & \\ \text{flm } f^{A \Rightarrow S^B} \nearrow & & \searrow h^{S^B \Rightarrow S^C} \\ S^A & \xrightarrow{\text{flm } (f^{A \Rightarrow S^B} \circ h^{S^B \Rightarrow S^C})} & S^C \end{array}$$

$\text{flm} (f^{A \Rightarrow S^B} \circ \text{flm } g^{B \Rightarrow S^C}) = \text{flm } f \circ \text{flm } g$  (composition) – this is law 2 with  $h = \text{flm } g$

$$\begin{array}{ccc} & S^B & \\ \text{flm } f^{A \Rightarrow S^B} \nearrow & & \searrow \text{flm } g^{B \Rightarrow S^C} \\ S^A & \xrightarrow{\text{flm } (f^{A \Rightarrow S^B} \circ \text{flm } g^{B \Rightarrow S^C})} & S^C \end{array}$$

Is there a shorter formulation of the laws?

## Semimonad laws III: The laws for `flatten`

The methods `flatten` (denoted by `ftn`) and `flatMap` are equivalent:

$$\text{ftn}^{[S,A]} : S^{S^A} \Rightarrow S^A = \text{flm}^{[S,S^A,A]}(m^{S^A} \Rightarrow m)$$

$$\text{flm}(f^{A \Rightarrow S^B}) = \text{fmap } f \circ \text{ftn}$$

A commutative triangle diagram. The top-left node is  $S^A$ , the top-right node is  $S^{S^B}$ , and the bottom-right node is  $S^B$ . An arrow from  $S^A$  to  $S^{S^B}$  is labeled  $\text{fmap } f^{A \Rightarrow S^B}$ . An arrow from  $S^{S^B}$  to  $S^B$  is labeled  $\text{ftn}$ . A diagonal arrow from  $S^A$  to  $S^B$  is labeled  $\text{flm}(f^{A \Rightarrow S^B})$ .

It turns out that `flatten` has *only one* law:

❶  $\text{fmap}(h^{S^A \Rightarrow S^B}) \circ \text{ftn}^{[S,B]} = \text{ftn}^{[S,A]} \circ \text{fmap } f$  (naturality)

A commutative pentagon diagram. The top-left node is  $S^{S^A}$ , the top-right node is  $S^{S^B}$ , the middle-right node is  $S^B$ , the bottom-right node is  $S^A$ , and the bottom-left node is  $S^A$ . An arrow from  $S^{S^A}$  to  $S^{S^B}$  is labeled  $\text{fmap}(h^{S^A \Rightarrow S^B})$ . An arrow from  $S^{S^B}$  to  $S^B$  is labeled  $\text{ftn}^{[S,B]}$ . An arrow from  $S^{S^A}$  to  $S^A$  is labeled  $\text{ftn}^{[S,A]}$ . An arrow from  $S^A$  to  $S^A$  is labeled  $h^{S^A \Rightarrow S^B}$ . An arrow from  $S^A$  to  $S^B$  is labeled  $h^{S^A \Rightarrow S^B}$ .

$\text{fmap}(\text{ftn}^{[S]}) \circ \text{ftn}^{[S]} = \text{ftn}^{[S^S]} \circ \text{ftn}^{[S]}$  (associativity) – this is law 1 with  $h = \text{ftn}$

A commutative pentagon diagram. The top-left node is  $S^{S^{S^A}}$ , the top-right node is  $S^{S^A}$ , the middle-right node is  $S^A$ , the bottom-right node is  $S^A$ , and the bottom-left node is  $S^A$ . An arrow from  $S^{S^{S^A}}$  to  $S^{S^A}$  is labeled  $\text{fmap}(\text{ftn}^{[S]})$ . An arrow from  $S^{S^A}$  to  $S^A$  is labeled  $\text{ftn}^{[S]}$ . An arrow from  $S^{S^{S^A}}$  to  $S^A$  is labeled  $\text{ftn}^{[S^S]}$ . An arrow from  $S^A$  to  $S^A$  is labeled  $\text{ftn}^{[S]}$ . An arrow from  $S^A$  to  $S^A$  is labeled  $\text{ftn}^{[S]}$ .

## Semimonad laws III: Deriving the laws for `flatten`

Denote for brevity  $f_{\uparrow} \equiv \text{fmap}^{[S]} f$

Express  $\text{flm } f = f_{\uparrow} \circ \text{ftn}$  and substitute into  $\text{flm}$ 's 2 laws:

- ①  $\text{flm } (f \circ g) = f_{\uparrow} \circ \text{flm } g$  gives  $(f \circ g)_{\uparrow} \circ \text{ftn} = f_{\uparrow} \circ g_{\uparrow} \circ \text{ftn}$   
– this law holds automatically due to functor composition law
  - ②  $\text{flm } (f \circ h) = \text{flm } f \circ h$  gives  $(f \circ h)_{\uparrow} \circ \text{ftn} = f_{\uparrow} \circ \text{ftn} \circ h$ ;  
using the functor composition law, we reduce this to  $h_{\uparrow} \circ \text{ftn} = \text{ftn} \circ h$   
– this is the naturality law for `flatten`
- `flatten` has the simplest type signature and just one law (naturality)
  - It is usually easy to check naturality!

## Semimonad laws IV: Checking naturality of `flatten`

Implement `flatten` for various standard monads and check naturality

- $F^A \equiv 1 + A$ ;  $\text{ftn} : 1 + 1 + A \Rightarrow 1 + A$
- $F^A \equiv Z + A$ ;  $\text{ftn} : Z + Z + A \Rightarrow Z + A$
- $F^A \equiv \text{List}^A$ ;  $\text{ftn} : \text{List}^{\text{List}^A} \Rightarrow \text{List}^A$
- $F^A \equiv A \times W$ ;  $\text{ftn} : A \times W \times W \Rightarrow A \times W$
- $F^A \equiv R \Rightarrow A$ ;  $\text{ftn} : (R \Rightarrow R \Rightarrow A) \Rightarrow R \Rightarrow A$
- $F^A \equiv S \Rightarrow A \times S$ ;  $\text{ftn} : (S \Rightarrow (S \Rightarrow A \times S) \times S) \Rightarrow S \Rightarrow A \times S$
- $F^A \equiv (A \Rightarrow R) \Rightarrow R$ ;  
 $\text{ftn} : (((A \Rightarrow R) \Rightarrow R) \Rightarrow R) \Rightarrow R \Rightarrow (A \Rightarrow R) \Rightarrow R$

Naturality of all these `flatten` functions is easy to verify

- Code implementing `flatten` is fully parametric in  $A$

# Exercises I

- 1 Confucius gave wisdom on each of the 7 days of a week. Sometimes the wise proverbs were hard to remember. If Confucius forgets what he said on a given day, he also forgets what he said on all the previous days of the week. Is this setup described by a filterable functor?
- 2 Define `evenFilter(p)` on an `IndexedSeq[T]` such that a value `x: T` is retained if `p(x)=true` and only if the sequence has an *even* number of elements `y` for which `p(y)=false`. Does this define a filterable functor?

Implement `filter` for these functors if possible (law checking optional):

- 3  $F^A \equiv \text{Int} + \text{String} \times A \times A \times A$
- 4 `final case class Q[A, Z](id: Long, user1: Option[(A, Z)], user2: Option[(A, Z)])` – with respect to the type parameter `A`
- 5  $F^A = \text{MyTree}^A$  defined recursively as  $F^A \equiv 1 + A \times F^A \times F^A$
- 6 `final case class R[A](x: Int, y: Int, z: A, data: List[A])`, where the standard functor `List` already has `withFilter` defined
- 7 \* Show that  $C^A \equiv A + A \times A \Rightarrow 1 + Z$  is a filterable contrafunctor

# Filterable functors: The laws in depth I

Is there a shorter formulation of the laws that is easier to remember?

- Intuition: When  $p(x) = \text{false}$ , replace  $x : A$  by  $1 : \text{Unit}$  in  $F[A]$ 
  - ▶ (1) How to replace  $x$  by  $1$  in  $F[A]$  without breaking the types?
  - ▶ (2) How to transform the resulting type back to  $F[A]$ ?
- We could do (1) if instead of  $F^A$  we had  $F^{1+A}$  i.e.  $F[\text{Option}[A]]$ 
  - ▶ Now use `filter` to replace  $A$  by  $1$  in each item of type  $1 + A$
  - ▶ Get  $F^{1+A}$  from  $F^A$  using `inflate` :  $F^A \Rightarrow F^{1+A} = \text{fmap}(\text{Some}^{A \Rightarrow 1+A})$
  - ▶ Filter  $F^{1+A} \Rightarrow F^{1+A}$  using `fmap` ( $x^{1+A} \Rightarrow \text{filter}_{\text{Opt}}(p^{A \Rightarrow \text{Boolean}})(x)$ )

$$\text{filter } p : F^A \xrightarrow{\text{inflate}} F^{1+A} \xrightarrow{\text{fmap}(\text{filter}_{\text{Opt}} p)} F^{1+A} \xrightarrow{\text{deflate}} F^A$$

- Doing (2) means *defining* a function `deflate` :  $F[\text{Option}[A]] \Rightarrow F[A]$ 
  - ▶ standard library already has `flatten[T] : Seq[Option[T]]  $\Rightarrow$  Seq[T]`
- Simplify  $\text{fmap}(\text{Some}^{A \Rightarrow 1+A}) \circ \text{fmap}(\text{filter}_{\text{Opt}} p) = \text{fmap}(\text{bop}(p))$  where we defined `bop` ( $p$ ) :  $(A \Rightarrow 1 + A) \equiv x \Rightarrow \text{Some}(x).\text{filter}(p)$
- In this way, express `filter` through `deflate` (see example code)
  - ▶  $\text{filter } p = \text{fmap}(\text{bop } p) \circ \text{deflate}$ . – Notation:  $\text{bop } p$  is  $\text{bop}(p)$ , like  $\cos x$

$$\text{filter } p : F^A \xrightarrow{\text{fmap}(\text{bop } p)} F^{1+A} \xrightarrow{\text{deflate}} F^A$$

## Filterable functors: Using `deflate`

- So far we have expressed `filter` through `deflate`
- We can also express `deflate` through `filter` (assuming law 4 holds):

$$\text{deflate} : F^{1+A} \xrightarrow{\text{filter}(\cdot.\text{nonEmpty})} F^{1+A} \xrightarrow{\text{fmap}(\cdot.\text{get})} F^A$$

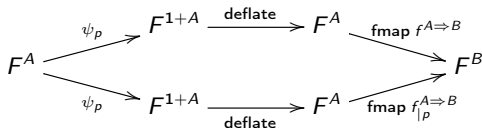
```
def deflate[F[_],A](foa: F[Option[A]]): F[A] =  
  foa.filter(_.\nonEmpty).map(_.\get) // _.\get is 0 + x^A ⇒ x^A  
  // for F = Seq, this would be foa.collect { case Some(x) ⇒ x }  
  // for arbitrary functor F we need to use the partial function, _.\get
```

- This means `deflate` and `filter` are **computationally equivalent**
  - ▶ We could specify filterable functors by implementing `deflate`
    - ★ The implementation of `filter` would then be derived by library
- Use `deflate` to verify that some functors are certainly not filterable:
  - ▶  $F^A = A + A \times A$ . Write  $F^{1+A} = 1 + A + (1 + A) \times (1 + A)$ 
    - ★ cannot map  $F^{1+A} \Rightarrow F^A$  because we do not have  $1 \rightarrow A$
  - ▶  $F^A = \text{Int} \Rightarrow A$ . Write  $F^{1+A} = \text{Int} \Rightarrow 1 + A$ 
    - ★ type signature of `deflate` would be  $(\text{Int} \Rightarrow 1 + A) \Rightarrow \text{Int} \Rightarrow A$
    - ★ cannot map  $F^{1+A} \Rightarrow F^A$  because we do not have  $1 + A \rightarrow A$
- `deflate` is easier to implement and to reason about



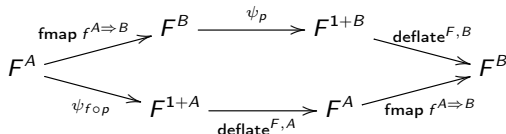
## \* Filterable functors: The laws in depth II

- We were able to define **deflate** only by assuming that law 4 holds
- Now, law 4 is satisfied *automatically* if **filter** is defined via **deflate**!
  - ▶ Denote  $\psi_p^{F^A \Rightarrow F^{1+A}} \equiv \text{fmap}(\text{bop } p)$  for brevity, then  $\text{filter } p = \psi_p \circ \text{deflate}$
  - ▶ Law 4 then becomes:  $\psi_p \circ \text{deflate} \circ \text{fmap } f^{A \Rightarrow B} = \psi_p \circ \text{deflate} \circ \text{fmap } f|_p$



- We would like to interchange **deflate** and **fmap** in both sides
  - ▶ We need a *naturality* law; let's express law 1 through **deflate**:

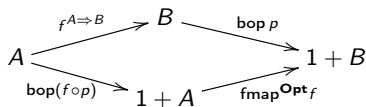
$$\text{fmap } f^{A \Rightarrow B} \circ \psi_p \circ \text{deflate}^{F, B} = \psi_{f \circ p} \circ \text{deflate}^{F, A} \circ \text{fmap } f^{A \Rightarrow B}$$



Can we simplify  $\text{fmap } f \circ \psi_p = \text{fmap } f \circ \text{fmap}(\text{bop } p) = \text{fmap}(f \circ \text{bop } p)$ ?

## \* Filterable functors: The laws in depth III

- Have property:  $f^{A \Rightarrow B} \circ \text{bop} (p^{B \Rightarrow \text{Boolean}}) = \text{bop} (f \circ p) \circ \text{fmap}^{\text{Opt}} f$  (see code)

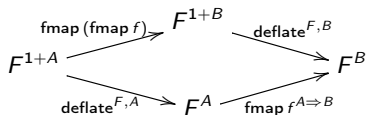


We can now rewrite Law 1 as

$$\text{fmap} (\text{bop} (f \circ p)) \circ \text{fmap} (\text{fmap}^{\text{Opt}} f) \circ \text{deflate} = \text{fmap} (\text{bop} (f \circ p)) \circ \text{deflate} \circ \text{fmap } f$$

Remove common prefix  $\text{fmap} (\text{bop} (f \circ p)) \circ \dots$  from both sides:

$$\text{fmap} (\text{fmap}^{\text{Opt}} f^{A \Rightarrow B}) \circ \text{deflate}^{F, B} = \text{deflate}^{F, A} \circ \text{fmap } f^{A \Rightarrow B} \quad \text{— law 1 for deflate}$$



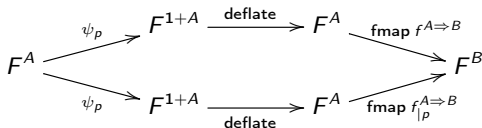
- deflate**:  $F^{1+A} \Rightarrow F^A$  is a **natural transformation** (has naturality law)
  - Example:  $F^A = 1 + A \times A$
  - $F^{1+A} = 1 + (1 + A) \times (1 + A) = 1 + 1 \times 1 + A \times 1 + 1 \times A + A \times A$
- natural transformations map containers  $G^A \Rightarrow H^A$  by rearranging data in them

## \* Filterable functors: The laws in depth IV

- The naturality law for **deflate**:

$$\text{fmap}(\text{fmap}^{\text{Opt}} f^{A \Rightarrow B}) \circ \text{deflate}^{F,B} = \text{deflate}^{F,A} \circ \text{fmap} f^{A \Rightarrow B}$$

Law 4 expressed via **deflate**:



$$\psi_p \circ \text{deflate}^{F,A} \circ \text{fmap} f^{A \Rightarrow B} = \psi_p \circ \text{deflate}^{F,A} \circ \text{fmap} f_{|p}$$

- Use naturality to interchange **deflate** and **fmap** in both sides of law 4:

$$\psi_p \circ \text{fmap}(\text{fmap}^{\text{Opt}} f) \circ \text{deflate}^{F,B} = \psi_p \circ \text{fmap}(\text{fmap}^{\text{Opt}} f_{|p}) \circ \text{deflate}^{F,B}$$

[omit  $\text{deflate}^{F,B}$  from both sides; expand  $\psi_p$ ]

$$\text{bop } p \circ \text{fmap}^{\text{Opt}} f = \text{bop } p \circ \text{fmap}^{\text{Opt}} f_{|p} \quad \text{— check this by hand:}$$

`x  $\Rightarrow$  Some(x).filter(p).map(f)`

`x  $\Rightarrow$  Some(x).filter(p).map { x if p(x)  $\Rightarrow$  f(x) }`

- These functions are equivalent because law 4 holds for **Option**

# Filterable functors: The laws in depth V

Maybe  $\psi_p \circ \text{deflate}$  is easier to handle than **deflate**? Let us define

$$\text{fmapOpt}^{F,A,B}(f^{A \Rightarrow 1+B}) : F^A \Rightarrow F^B = \text{fmap } f \circ \text{deflate}^{F,B}$$

A commutative triangle diagram with  $F^A$  at the bottom-left vertex,  $F^{1+B}$  at the top vertex, and  $F^B$  at the bottom-right vertex. An arrow labeled  $\text{fmap } f^{A \Rightarrow 1+B}$  points from  $F^A$  to  $F^{1+B}$ . An arrow labeled  $\text{deflate}^{F,B}$  points from  $F^{1+B}$  to  $F^B$ . A bottom arrow labeled  $\text{fmapOpt } f^{A \Rightarrow 1+B}$  points directly from  $F^A$  to  $F^B$ .

- **fmapOpt** and **deflate** are *equivalent*:  $\text{deflate}^{F,A} = \text{fmapOpt}^{F,1+A,A}(\text{id}^{1+A \Rightarrow 1+A})$
- Express laws 1 – 3 in terms of **fmapOpt**: do they get simpler?
  - ▶ Express **filter** through **fmapOpt**:  $\text{filter } p = \text{fmapOpt}^{F,A,A}(\text{bop } p)$
  - ▶ Consider the expression needed for law 2:  $x \Rightarrow p_1(x) \wedge p_2(x)$
  - ▶  $\text{bop}(x \Rightarrow p_1(x) \wedge p_2(x)) = x^A \Rightarrow (\text{bop } p_1)(x). \text{flatMap}(\text{bop } p_2)$  – see code
    - ★ Denote this computation by  $\diamond_{\text{Opt}}$  and write

$$q_1^{A \Rightarrow 1+B} \diamond_{\text{Opt}} q_2^{B \Rightarrow 1+C} \equiv x^A \Rightarrow q_1(x). \text{flatMap}(q_2)$$

- ▶ Similar to composition of functions, except the types are  $A \Rightarrow 1 + B$ 
  - ★ This is a particular case of **Kleisli composition**; the general case:  
 $\diamond_M : (A \Rightarrow M^B) \Rightarrow (B \Rightarrow M^C) \Rightarrow (A \Rightarrow M^C)$ ; we set  $M^A \equiv 1 + A$
  - ★ The **Kleisli identity** function:  $\text{id}_{\diamond_{\text{Opt}}}^{A \Rightarrow 1+A} \equiv x^A \Rightarrow \text{Some}(x)$
  - ★ Kleisli composition  $\diamond_{\text{Opt}}$  is associative and respects the Kleisli identity!
  - ★ **fmapOpt** lifts a Kleisli<sub>Opt</sub> function  $f^{A \Rightarrow 1+B}$  into the functor  $F$

# Filterable functors: The laws in depth VI

Simplifying down to two laws

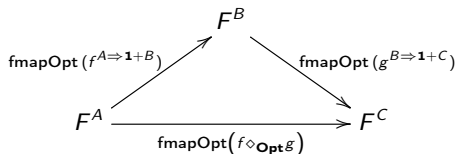
- Only *two* laws are necessary for `fmapOpt`!

- Identity law** (covers old law 3):

$$\text{fmapOpt}(\text{id}_{A \Rightarrow 1+A}^{\text{Opt}}) = \text{id}_{F^A \Rightarrow F^A}$$

- Composition law** (covers old laws 1 and 2):

$$\text{fmapOpt}(f^{A \Rightarrow 1+B}) \circ \text{fmapOpt}(g^{B \Rightarrow 1+C}) = \text{fmapOpt}(f \diamond_{\text{Opt}} g)$$



- The two laws for `fmapOpt` are very similar to the two functor laws
  - Both of them use more complicated types than the old laws
  - Conceptually, the new laws are simpler (lift  $f^{A \Rightarrow 1+B}$  into  $F^A \Rightarrow F^B$ )

## \* Filterable functors: The laws in depth VII

Showing that old laws 1 – 3 follow from the identity and composition laws for `fmapOpt`

- Old law 3 is *equivalent* to the identity law for `fmapOpt`:

$$\text{filter}(x^A \Rightarrow \text{true}) = \text{fmap}(x^A \Rightarrow 0 + x) \circ \text{deflate} = \text{fmapOpt}(\text{id}_{\diamond_{\text{Opt}}}) = \text{id}^{F^A \Rightarrow F^A}$$

- Derive old law 2: need to work with  $q_{1,2} \equiv \text{bop}(p_{1,2}) : A \Rightarrow 1 + A$

- ▶ The Boolean conjunction  $x \Rightarrow p_1(x) \wedge p_2(x)$  corresponds to  $q_1 \diamond_{\text{Opt}} q_2$
- ▶ Apply the composition law to Kleisli functions of types  $A \Rightarrow 1 + A$ :

$$\begin{aligned}\text{filter } p_1 \circ \text{filter } p_2 &= \text{fmapOpt } q_1 \circ \text{fmapOpt } q_2 \\ &= \text{fmapOpt}(q_1 \diamond_{\text{Opt}} q_2) = \text{fmapOpt}(\text{bop}(x \Rightarrow p_1(x) \wedge p_2(x)))\end{aligned}$$

- Derive old law 1:

- ▶ express `filter` through `fmapOpt`; old law 1 becomes

$$\text{fmap } f \circ \text{fmapOpt}(\text{bop } p) = \text{fmapOpt}(\text{bop}(f \circ p)) \circ \text{fmap } f \quad - \text{eq. } (*)$$

- ▶ lift  $f^{A \Rightarrow B}$  to  $\text{Kleisli}_{\text{Opt}}$  by defining  $k_f^{A \Rightarrow 1+B} = f \circ \text{id}_{\diamond_{\text{Opt}}}$ ; then we have  $\text{fmapOpt}(k_f) = \text{fmap } k_f \circ \text{deflate} = \text{fmap } f \circ \text{fmap } \text{id}_{\diamond_{\text{Opt}}} \circ \text{deflate} = \text{fmap } f$
- ▶ rewrite eq. (\*) as  $\text{fmapOpt}(k_f \diamond_{\text{Opt}} \text{bop } p) = \text{fmapOpt}(\text{bop}(f \circ p) \diamond_{\text{Opt}} k_f)$
- ▶ it remains to show that  $k_f \diamond_{\text{Opt}} \text{bop } p = \text{bop}(f \circ p) \diamond_{\text{Opt}} k_f$
- ▶ use the properties  $k_f \diamond_{\text{Opt}} q = f \circ q$  and  $q \diamond_{\text{Opt}} k_f = q \circ \text{fmap}^{\text{Opt}} f$ , and  $f \circ \text{bop } p = \text{bop}(f \circ p) \circ \text{fmap}^{\text{Opt}} f$  (property from slide 11)

# Summary: The methods and the laws

Filterable functors can be defined via `filter`, `deflate`, or `fmapOpt`

- All three methods are *equivalent* but have different roles:
  - ▶ The easiest to use in program code is `filter` / `withFilter`
  - ▶ The easiest type signature to implement and reason about is `deflate`
  - ▶ Conceptually, the laws are easiest to remember with `fmapOpt`
- \* The 2 laws for `fmapOpt` are the 2 functor laws with a Kleisli “twist”
- \* Category theory accommodates this via a generalized definition of functors as liftings between “twisted” types. Compare:
  - ▶  $\text{fmap} : (A \Rightarrow B) \Rightarrow F^A \Rightarrow F^B$  – ordinary container (“endofunctor”)
  - ▶  $\text{contrafmap} : (B \Rightarrow A) \Rightarrow F^A \Rightarrow F^B$  – lifting from reversed functions
  - ▶  $\text{fmapOpt} : (A \Rightarrow 1 + B) \Rightarrow F^A \Rightarrow F^B$  – lifting from  $\text{Kleisli}_{\text{Opt}}$ -functions
- CT gives us some *intuitions* about how to derive better laws:
  - ▶ look for type signatures that resemble a generalized sort of “lifting”
  - ▶ look for natural transformations and use the naturality law
- However, CT does not directly provide any derivations for the laws
  - ▶ you will not find the laws for `filter` or `deflate` in any CT book
  - ▶ CT is abstract, only gives hints about possible further directions
    - ★ investigate functors having “liftings” with different type signatures
    - ★ replace `Option` in the  $\text{Kleisli}_{\text{Opt}}$  construction by another functor

# Structure of filterable functors

How to recognize a filterable functor by its type?

Intuition from `deflate`: reshuffle data in  $F^A$  after replacing some  $A$ 's by 1

- “reshuffling” usually means reusing different parts of a disjunction

Some constructions of exponential-polynomial filterable functors

- 1  $F^A = Z$  (constant functor) for a fixed type  $Z$  (define `fmapOpt f = id`)
  - Note:  $F^A = A$  (identity functor) is *not* filterable
- 2  $F^A \equiv G^A \times H^A$  for any filterable functors  $G^A$  and  $H^A$
- 3  $F^A \equiv G^A + H^A$  for any filterable functors  $G^A$  and  $H^A$
- 4  $F^A \equiv G^{H^A}$  for *any* functor  $G^A$  and filterable functor  $H^A$
- 5  $F^A \equiv 1 + A \times G^A$  for a filterable functor  $G^A$ 
  - Note: *pointed* types  $P$  are isomorphic to  $1 + Z$  for some type  $Z$ 
    - ★ Example of non-trivial pointed type:  $A \Rightarrow A$
    - ★ Example of non-pointed type:  $A \Rightarrow B$  when  $A$  is different from  $B$
  - So  $F^A \equiv P + A \times G^A$  where  $P$  is a pointed type and  $G^A$  is filterable
  - Also have  $F^A \equiv P + A \times A \times \dots \times A \times G^A$  similarly
- 6  $F^A \equiv G^A + A \times F^A$  (recursive) for a filterable functor  $G^A$
- 7  $F^A \equiv G^A \Rightarrow H^A$  if contrafunctor  $G^A$  and functor  $H^A$  *both filterable*
  - Note: the functor  $F^A \equiv G^A \Rightarrow A$  is not filterable



## \* Worked examples II: Constructions of filterable functors I

(2) The `fmapOpt` laws hold for  $F^A \times G^A$  if they hold for  $F^A$  and  $G^A$

- For  $f^{A \Rightarrow 1+B}$ , get  $\text{fmapOpt}_F(f) : F^A \Rightarrow F^B$  and  $\text{fmapOpt}_G(f) : G^A \Rightarrow G^B$
- Define  $\text{fmapOpt}_{F \times G} f \equiv p^{F^A} \times q^{G^A} \Rightarrow \text{fmapOpt}_F(f)(p) \times \text{fmapOpt}_G(f)(q)$
- Identity law:  $f = \text{id}_{\diamond_{\text{Opt}}}$ , so  $\text{fmapOpt}_F f = \text{id}$  and  $\text{fmapOpt}_G f = \text{id}$ 
  - ▶ Hence we get  $\text{fmapOpt}_{F+G}(f)(p \times q) = \text{id}(p) \times \text{id}(q) = p \times q$
- Composition law:

$$\begin{aligned} & (\text{fmapOpt}_{F \times G} f_1 \circ \text{fmapOpt}_{F+G} f_2)(p \times q) \\ &= \text{fmapOpt}_{F \times G}(f_2) (\text{fmapOpt}_F(f_1)(p) \times \text{fmapOpt}_G(f_1)(q)) \\ &= (\text{fmapOpt}_F f_1 \circ \text{fmapOpt}_F f_2)(p) \times (\text{fmapOpt}_G f_1 \circ \text{fmapOpt}_G f_2)(q) \\ &= \text{fmapOpt}_F(f_1 \diamond_{\text{Opt}} f_2)(p) \times \text{fmapOpt}_G(f_1 \diamond f_2)(q) \\ &= \text{fmapOpt}_{F \times G}(f_1 \diamond_{\text{Opt}} f_2)(p \times q) \end{aligned}$$

- Exactly the same proof as that for functor property for  $F^A \times G^A$ 
  - ▶ this is because `fmapOpt` corresponds to a generalized functor
- New proofs are necessary only when using non-filterable functors
  - ▶ these are used in constructions 4 – 6

## \* Worked examples II: Constructions of filterable functors II

(5) The `fmapOpt` laws hold for  $F^A \equiv 1 + A \times G^A$  if they hold for  $G^A$

- For  $f^{A \Rightarrow 1+B}$ , get  $\text{fmapOpt}_G(f) : G^A \Rightarrow G^B$
- Define  $\text{fmapOpt}_F(f)(1 + a^A \times q^{G^A})$  by returning  $0 + b \times \text{fmapOpt}_G(f)(q)$  if the argument is  $0 + a \times q$  and  $f(a) = 0 + b$ , and returning  $1 + 0$  otherwise
- Identity law:  $f = \text{id}_{\text{Opt}}$ , so  $f(a) = 0 + a$  and  $\text{fmapOpt}_G f = \text{id}$ 
  - ▶ Hence we get  $\text{fmapOpt}_F(\text{id}_{\text{Opt}})(1 + a \times q) = 1 + a \times q$
- Composition law: need only to check for arguments  $0 + a \times q$ , and only when  $f_1(a) = 0 + b$  and  $f_2(b) = 0 + c$ , in which case  $(f_1 \diamond_{\text{Opt}} f_2)(a) = 0 + c$ ; then

$$\begin{aligned} & (\text{fmapOpt}_F f_1 \circ \text{fmapOpt}_F f_2)(0 + a \times q) \\ &= \text{fmapOpt}_F(f_2) (\text{fmapOpt}_F(f_1)(0 + a \times q)) \\ &= \text{fmapOpt}_F(f_2) (0 + b \times \text{fmapOpt}_G(f_1)(q)) \\ &= 0 + c \times (\text{fmapOpt}_G f_1 \circ \text{fmapOpt}_G f_2)(q) \\ &= 0 + c \times \text{fmapOpt}_G(f_1 \diamond_{\text{Opt}} f_2)(q) \\ &= \text{fmapOpt}_F(f_1 \diamond_{\text{Opt}} f_2)(0 + a \times q) \end{aligned}$$

This is a “greedy filter”: if  $f(a)$  is empty, will delete all data in  $G^A$

## \* Worked examples II: Constructions of filterable functors III

(6) The `fmapOpt` laws hold for  $F^A \equiv G^A + A \times F^A$  if they hold for  $G^A$

- For  $f^{A \Rightarrow 1+B}$ , we have  $\text{fmapOpt}_G(f) : G^A \Rightarrow G^B$  and  $\text{fmapOpt}'_F(f) : F^A \Rightarrow F^B$  (for use in recursive arguments as the inductive assumption)
- Define  $\text{fmapOpt}_F(f)(q^{G^A} + a^A \times p^{F^A})$  by returning  $0 + \text{fmapOpt}'_F(f)(p)$  if  $f(a) = 1 + 0$ , and  $\text{fmapOpt}_G(f)(q) + b \times \text{fmapOpt}'_F(f)(p)$  otherwise
- Identity law:  $\text{id}_{\diamond_{\text{Opt}}}(x) \neq 1 + 0$ , so  $\text{fmapOpt}_F(\text{id}_{\diamond_{\text{Opt}}})(q + a \times p) = q + a \times p$
- Composition law:  
 $(\text{fmapOpt}_F(f_1) \circ \text{fmapOpt}_F(f_2))(q + a \times p) = \text{fmapOpt}_F(f_1 \diamond_{\text{Opt}} f_2)(q + a \times p)$
- For arguments  $q + 0$ , the laws for  $G^A$  hold; so assume arguments  $0 + a \times p$ . When  $f_1(a) = 0 + b$  and  $f_2(b) = 0 + c$ , the proof of the previous example will go through. So we need to consider the two cases  $f_1(a) = 1 + 0$  and  $f_1(a) = 0 + b$ ,  $f_2(b) = 1 + 0$
- If  $f_1(a) = 1 + 0$  then  $(f_1 \diamond_{\text{Opt}} f_2)(a) = 1 + 0$ ; to show  $\text{fmapOpt}'_F(f_2)(\text{fmapOpt}'_F(f_1)(p)) = \text{fmapOpt}'_F(f_1 \diamond_{\text{Opt}} f_2)(p)$ , use the inductive assumption about  $\text{fmapOpt}'_F$  on  $p$
- If  $f_1(a) = 0 + b$  and  $f_2(b) = 1 + 0$  then  $(f_1 \diamond_{\text{Opt}} f_2)(a) = 1 + 0$ ; to show  $\text{fmapOpt}_F(f_2)(0 + b \times \text{fmapOpt}'_F(f_1)(p)) = \text{fmapOpt}'_F(f_1 \diamond_{\text{Opt}} f_2)(p)$ , rewrite  $\text{fmapOpt}_F(f_2)(0 + b \times \text{fmapOpt}'_F(f_1)(p)) = \text{fmapOpt}'_F(f_2)(\text{fmapOpt}'_F(f_1)(p))$  and again use the inductive assumption about  $\text{fmapOpt}'_F$  on  $p$

This is a “list-like filter”: if  $f(a)$  is empty, will recurse into nested  $F^A$  data

## Worked examples II: Constructions of filterable functors IV

Use known filterable constructions to show that

$F^A \equiv (\text{Int} \times \text{String}) \Rightarrow (1 + \text{Int} \times A + A \times (1 + A) + (\text{Int} \Rightarrow 1 + A + A \times A \times \text{String}))$   
is a filterable functor

- Instead of implementing `Filterable` and verifying laws by hand, we analyze the structure of this data type and use known constructions
- Define some auxiliary functors that are parts of the structure of  $F^A$ ,
  - ▶  $R_1^A = (\text{Int} \times \text{String}) \Rightarrow A$  and  $R_2^A = \text{Int} \Rightarrow A$
  - ▶  $G^A = 1 + \text{Int} \times A + A \times (1 + A)$  and  $H^A = 1 + A + A \times A \times \text{String}$
- Now we can rewrite  $F^A = R_1 [G^A + R_2 [H^A]]$ 
  - ▶  $G^A$  is filterable by construction 5 because it is of the form  $G^A = 1 + A \times K^A$  with filterable functor  $K^A = 1 + \text{Int} + A$
  - ▶  $K^A$  is of the form  $1 + A + X$  with constant type  $X$ , so it is filterable by constructions 1 and 3 with the `Option` functor  $1 + A$
  - ▶  $H^A$  is filterable by construction 5 with  $H^A = 1 + A \times (1 + A \times \text{String})$ , while  $1 + A \times \text{String}$  is filterable by constructions 5 and 1
- Constructions 3 and 4 show that  $R_1 [G^A + R_2 [H^A]]$  is filterable

Note that there are more than one way of implementing `Filterable` here

## \* Exercises II

- 1 Implement a `Filterable` instance for `type F[T] = G[H[T]]` assuming that the functor `H[T]` already has a `Filterable` instance (construction 4). Verify the laws rigorously (i.e. by calculations, not tests).
- 2 For `type F[T] = Option[Int  $\Rightarrow$  Option[(T, T)]]`, implement a `Filterable` instance. Show that the filterable laws hold by using known filterable constructions (avoiding explicit proofs or tests).
- 3 Implement a `Filterable` instance for  $F^A \equiv G^A + \text{Int} \times A \times A \times F^A$  (recursive) for a filterable functor  $G^A$ . Verify the laws rigorously.
- 4 Show that  $F^A = 1 + A \times G^A$  is in general *not* filterable if  $G^A$  is an arbitrary (non-filterable) functor; it is enough to give an example.
- 5 Show that  $F^A = 1 + G^A + H^A$  is filterable if  $1 + G^A$  and  $1 + H^A$  are filterable (even when  $G^A$  and  $H^A$  are by themselves not filterable).
- 6 Show that the functor  $F^A = A + (\text{Int} \Rightarrow A)$  is not filterable.
- 7 Show that one can define `deflate`:  $C^{1+A} \Rightarrow C^A$  for any contrafunctor  $C^A$  (not necessarily filterable), similarly to how one can define `inflate`:  $F^A \Rightarrow F^{1+A}$  for any functor  $F^A$  (not necessarily filterable).