Algebra of Functional Programs

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Filip Pawlak Algebra of Functional Programs

In this talk we will isolate four common recursion schemes (naturally associated with recursive data types), give them a generic theoretical treatment and prove a number of general laws about them. Then we will use these laws in an example. It is sometimes quite hard to reason about arbitrary recursively defined functions.

By sticking to well-defined recursion patterns, we are able to:

- use already proven theorems to optimize or prove properties
- calculate programs and reason about them more easily (chiefly because we can now refer to the recursion scheme in isolation)
- reuse code and ideas

sum [] = 0sum (x:xs) = x + sum xs

This sort of pattern is very common in functional programs.

It's so common that it deserves its own higher-order function in the standard library:

foldr :: (a -> b -> b) -> b -> [a] -> b foldr f e [] = e foldr f e (x : xs) = f x (foldr f e xs) But is it only for lists?

We could've defined our own list type:

data List a = Nil | Cons a (List a)

Then the fold function for that type would be:

foldList :: $(a \rightarrow b \rightarrow b) \rightarrow b \rightarrow List a \rightarrow b$ foldList f e Nil = e foldList f e (Cons x xs) = f x (foldList f e xs)

What about other data structures?

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data Rose a = Node a [Rose a]

foldRose :: $(a \rightarrow [b] \rightarrow b) \rightarrow Rose a \rightarrow b$ foldRose f (Node x ts) = f x (map (foldRose f) ts)

Do you see the pattern?

Folds in a sense "replace" data constructors with the functions/values that you pass as arguments.

We separate the "list shape" from type recursion:

data ListS a b = NilS | ConsS a b
data Fix s a = In (s a (Fix s a))
type List a = Fix ListS a
As an example, list [1, 2] is represented by
In (ConsS 1 (In (ConsS 2 (In NilS))))
We also define an inverse to in named out:
out :: Fix s a -> s a (Fix s a)

out $(\ln x) = x$

We separate the "list shape" from type recursion:

Now we define a function bimap which applies its arguments f and g to all the a's and b's in an argument of type ListS a b:

bimap ::
$$(a \rightarrow a') \rightarrow (b \rightarrow b') \rightarrow$$

ListS a b \rightarrow ListS a' b'
bimap f g NilS = NilS
bimap f g (ConsS a b) = ConsS (f a) (g b)

Datatype-generic fold

data ListS a b = NilS | ConsS a b
data Fix s a = In {out :: s a (Fix s a)}
type List a = Fix ListS a

Now we can write a different version of fold on List:

foldList :: (ListS a b \rightarrow b) \rightarrow List a \rightarrow b foldList f = f . bimap id (foldList f) . out

f gives the "interpretation" of constructors. For example sum = foldList add :: List Integer -> Integer, where

```
add :: ListS Integer Integer -> Integer
add NiIS = 0
add (ConsS m n) = m + n
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Now we also want to abstract away from the specific ListS shape. To be suitable, a shape must support bimap (so it must be a bifunctor):

class Bifunctor s where bimap :: $(a \rightarrow a') \rightarrow (b \rightarrow b') \rightarrow s a b \rightarrow s a' b'$ Then fold works for any suitable shape: fold :: Bifunctor $s \implies (s a b \rightarrow b) \rightarrow Fix s a \rightarrow b$ fold f = f. bimap id (fold f). out ...and one of these shapes is ListS: instance Bifunctor ListS where bimap f g NilS = NilS bimap f g (ConsS a b) = ConsS (f a) (g b)

Now we also want to abstract away from the specific ListS shape. To be suitable, a shape must support bimap (so it must be a bifunctor):

class Bifunctor s where bimap :: (a -> a') -> (b -> b') -> s a b -> s a' b' Then fold works for any suitable shape: fold :: Bifunctor s => (s a b -> b) -> Fix s a -> b fold f = f . bimap id (fold f) . out ...but binary trees also fit:

data TreeS a b = TipS a | BinS b b
instance Bifunctor TreeS where
bimap f g (TipS a) = TipS (f a)
bimap f g (BinS b 1 b 2) = BinS (g b 1) (g b 2)

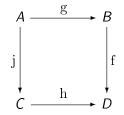
A category consists of:

- a collection of objects
- for each pair A, B of objects, a collection Mor(A, B) of arrows (also called morphisms)
- \bullet an identity arrow id A : A \rightarrow A for each object A
- composition $f \circ g : A \to C$ of compatible arrows $f : B \to C$ and $g : A \to B$
- composition is associative, and identities are neutral elements

The category $\ensuremath{\textbf{SET}}$ consists of:

- a collection of objects (sets, or in our case types)
- for each pair A, B of objects, a collection Mor(A, B) of arrows (total functions)
- \bullet an identity arrow id A : A \rightarrow A for each object A
- composition $f \circ g : A \to C$ of compatible arrows $f : B \to C$ and $g : A \to B$
- composition is associative, and identities are neutral elements

Before we go any further...



We compose morphisms along the arrows. We say that the diagram commutes when f \circ g = h \circ j.

A functor F is simultaneously

- an operation on objects
- an operation on arrows

such that

- Ff: FA \rightarrow FB when f: A \rightarrow B
- F id = id
- $F(f \circ g) = Ff \circ Fg$

(think fmap in Haskell)

Functor List is simultaneously

- an operation on objects (List A = [A])
- an operation on arrows (List f = map f)

such that

- \bullet List f : List A \rightarrow List B when f : A \rightarrow B
- List id = id
- List $(f \circ g) = List f \circ List g$

Functor ListS A is simultaneously

- an operation on objects ((ListS A) B = ListS A B)
- an operation on arrows ((ListS A) f = bimap id f) such that
 - (ListS A) f : ListS A B \rightarrow ListS A B' when f : B \rightarrow B'
 - (ListS A) id = id
 - (ListS A) (f \circ g) = (ListS A) f \circ (ListS A) g

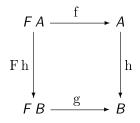
An **F-algebra** for functor F is a pair (A, f) where f : $F A \rightarrow A$.

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Eg. (List Integer, In) and (Integer, add) are both F-algebras for ListS Integer:

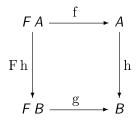
In :: ListS Integer (List Integer) -> List Integer
add :: ListS Integer Integer -> Integer

A homomorphism between F-algebras (A, f) and (B, g) is a morphism $h : A \rightarrow B$ such that the following diagram commutes:



...or, equivalently, that $h \circ f = g \circ F h$.

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An F-algebra (A, f) is **initial** if there is a unique homomorphism to each F-algebra (B, g).

We usually call the f function for an initial algebra in.

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Sidenote 1: (List Integer, In) is an initial algebra for the functor ListS Integer. (Integer, add) is not, as add doesn't even have an inverse.

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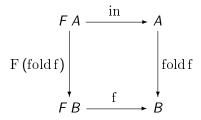
Sidenote 2: the existence of initial algebras is guaranteed for so-called polynomial functors (so all functors that we consider in this talk).

Once again, for an initial F-algebra (A, in), there is a unique homomorphism to each F-algebra (B, f). We call this homomorphism **fold f**.

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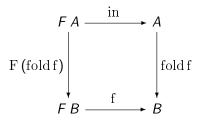
Sidenote: this homomorphism is also called a catamorphism.

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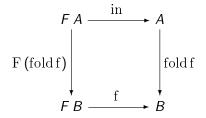
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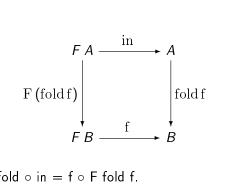


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Intuitively, it means that it behaves nicely with F.

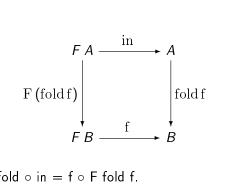


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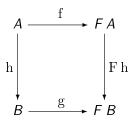
Because in \circ out = id, we can also write fold f = f \circ F fold f \circ out.

An **F-coalgebra** is a pair (A, f) where $f : A \rightarrow F A$.

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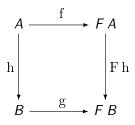
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...or, equivalently, that $g \circ h = F h \circ f$.

An F-coalgebra (B, g) is **terminal** if there is a unique homomorphism to it **from** every F-coalgebra (A, f).

It turns out that for a terminal F-coalgebra (B, g) the action g has an inverse, so B is isomorphic to F B (which is what we really want for our inductive data types). In this sense B is a fixed point of F.

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Sidenote: the existence of terminal coalgebras is guaranteed for all functors that we consider in this talk.

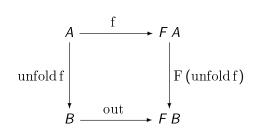
Once again, for a terminal F-coalgebra (B, out), there is a unique homomorphism to it from each F-algebra (A, f). We call this homomorphism unfold f.

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Sidenote: this homomorphism is also called an **anamorphism**.

The categorical view

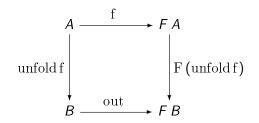
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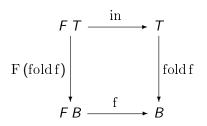
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Intuitively, unfold f takes some seed of type A and generates something of type B (eg. a list). f takes a seed and generates both an intermediate value (eg. a list element) and a seed for unfold to generate the rest of the structure (the tail of the list). (Note: there can be many values and many seeds, depending on the functor/the shape of the inductive type definition - take binary trees as an example.) (Note: there can be many values and many seeds, depending on the functor/the shape of the inductive type definition - take binary trees as an example.)

We have that out \circ unfold f = F unfold $f \circ f$. Because in \circ out = id, we also have unfold $f = in \circ F$ unfold $f \circ f$. (Note: there can be many values and many seeds, depending on the functor/the shape of the inductive type definition - take binary trees as an example.)

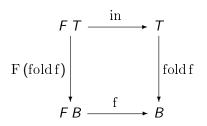
We have that out \circ unfold f = F unfold $f \circ f$. Because in \circ out = id, we also have unfold $f = in \circ F$ unfold $f \circ f$.

unfold :: Bifunctor $s \Longrightarrow (b \longrightarrow a b) \longrightarrow (b \longrightarrow Fix s a)$ unfold f = In . bimap id (unfold f) . f



Now we can finally prove some laws about these recursion schemes. We begin with fold. We will often make use of the following universal property, which is a consequence of the uniqueness of fold:

$$h = \operatorname{fold}_T f \iff h \circ \operatorname{in}_T = f \circ Fh$$



Now we can finally prove some laws about these recursion schemes. We begin with fold. We will often make use of the following universal property, which is a consequence of the uniqueness of fold:

$$h = \operatorname{fold}_T f \iff h \circ \operatorname{in}_T = f \circ Fh$$

It is a sort of "canned induction proof".

Intuitively, the evaluation rule shows "one step of evaluation" of a fold.

 $fold_{\mathcal{T}} f \circ in_{\mathcal{T}}$ $= \{universal \text{ property, letting } h = fold f \}$ $f \circ F(fold_{\mathcal{T}} f)$

Fusion (exact version)

$$h \circ \operatorname{fold}_{\mathcal{T}} f = \operatorname{fold}_{\mathcal{T}} g$$

$$\iff \{\operatorname{universal \ property}\}$$

$$h \circ \operatorname{fold}_{\mathcal{T}} f \circ \operatorname{in}_{\mathcal{T}} = g \circ F(h \circ \operatorname{fold}_{\mathcal{T}} f)$$

$$\iff \{\operatorname{functors}\}$$

$$h \circ \operatorname{fold}_{\mathcal{T}} f \circ \operatorname{in}_{\mathcal{T}} = g \circ Fh \circ F(\operatorname{fold}_{\mathcal{T}} f)$$

$$\iff \{\operatorname{evaluation \ rule}\}$$

$$h \circ f \circ F(\operatorname{fold}_{\mathcal{T}} f) = g \circ Fh \circ F(\operatorname{fold}_{\mathcal{T}} f)$$

Again, it's a kind of a "canned induction proof".

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$$h \circ \operatorname{fold}_{T} f = \operatorname{fold}_{T} g$$

$$\iff \{\operatorname{exact fusion}\}$$

$$h \circ f \circ F(\operatorname{fold}_{T} f) = g \circ Fh \circ F(\operatorname{fold}_{T} f)$$

$$\iff \{\operatorname{Leibniz}\}$$

$$h \circ f = g \circ Fh$$

Much easier to use.

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The identity function id is a fold:

$$id = fold_T f$$

$$\iff \{universal \text{ property}\}$$

$$id \circ in_T = f \circ F id$$

$$\iff \{identity\}$$

$$f = in_T$$

That is, fold τ in $\tau = id$. Not very suprising, actually.

Also, the destructor $out_{\mathcal{T}}$ of a datatype, the inverse of the constructor $out_{\mathcal{T}}$, can be written a a fold.

$$in \tau \circ fold \tau f = id$$

$$\iff \{identity \text{ as a fold}\}$$

$$in \tau \circ fold \tau f = fold \tau in \tau$$

$$\iff \{weak \text{ fusion}\}$$

$$in \tau \circ f = in \tau \circ F \text{ in } \tau$$

$$\iff \{Leibniz\}$$

$$f = F \text{ in } \tau$$

Therefore we can define $\operatorname{out}_T = \operatorname{fold}_T(F \operatorname{in}_T)$.

We should check that this also makes out the inverse of in when the composition is reversed:

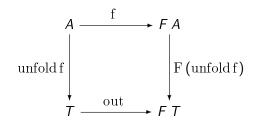
out $\tau \circ in \tau$ = {above} $fold_T(F in_T) \circ in_T$ = {evaluation rule} $F in \tau \circ Fout \tau$ = {functors} $F(in_T \circ out_T)$ = {in \circ out = id} id

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(Note: this is a corollary of a more general theorem, stating that every injective function on a recursive data type is a fold).

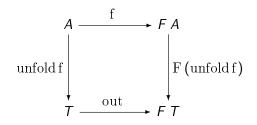
Universal property for unfold



The universal property for unfold is:

$$h = unfold_T f \iff out_T \circ h = F h \circ f$$

Universal property for unfold



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Again, a sort of "canned induction proof".

The laws are simply duals to the laws for fold, so we just present them without proof.

Evaluation rule: $\operatorname{out}_T \circ \operatorname{unfold}_T f = F \operatorname{unfold}_T f \circ f$ **Exact and weak fusion**: $\operatorname{unfold}_T f \circ h = \operatorname{unfold}_T g$ $\iff F (\operatorname{unfold}_T f) \circ f \circ h = F (\operatorname{unfold}_T f) \circ F h \circ g$ $\iff f \circ h = F h \circ g$ **Identity**: $\operatorname{unfold}_T \operatorname{out}_T = id$ **Constructors**: $\operatorname{in}_T = \operatorname{unfold}_T (F \operatorname{out}_T)$ The last law is a corollary of a more general law, stating that any surjective function to a recursive data type is an unfold. Unfortunately, the category SET doesn't really suit us: we'd like to do things like fold $f \circ unfold g$, but in this category initial F-algebras and terminal F-coalgebras can be different objects. Moreover, it contains only total functions, so we can't express nontermination.

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We solve these problems by moving to the category CPO, where the objects are pointed complete partial orders and the arrows are continuous functions. Now initial F-algebras and terminal F-coalgebras are the same objects, up to isomorphism, and are fixed points of the functor F (for so-called locally continuous functors, so all functors that appear in this talk). Unfortunately, the category SET doesn't really suit us: we'd like to do things like fold $f \circ unfold g$, but in this category initial F-algebras and terminal F-coalgebras can be different objects. Moreover, it contains only total functions, so we can't express nontermination.

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$$h = \text{fold}_T f \iff h \circ \text{in}_T = f \circ F h$$
 for strict f and h

Hylomorphisms

A **hylomorphism** h is a function which can be expressed as a composition of a fold following an unfold:

 $h = \mathsf{fold}_T g \circ \mathsf{unfold}_T f$

Hylomorphisms

A **hylomorphism** h is a function which can be expressed as a composition of a fold following an unfold:

 $h = \operatorname{fold}_T g \circ \operatorname{unfold}_T f$

If h is of that form, then it can also be written as $g \circ F h \circ f$:

h

 $= \{definition\}$

 $fold_T g \circ unfold_T f$

- = {recursive definitions of fold and unfold}
 - $g \circ F$ fold $T g \circ$ out $T \circ$ in $T \circ F$ unfold $T f \circ f$

$$= \ \{\mathsf{out} \circ \mathsf{in} = \mathsf{id}\}$$

 $g \circ F$ fold $T g \circ F$ unfold $T f \circ f$

 $g \mathrel{\circ} F \mathrel{h \mathrel{\circ}} f$

 $h = \operatorname{fold}_T g \circ \operatorname{unfold}_T f \implies h = g \circ F h \circ f$

The law we've just derived is the *deforestation* law. It sometimes allows us to compute h without creating the intermediate structure returned by unfold.

The implication in the other direction also holds, but the proof requires more machinery.

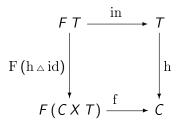
A **paramorphism** is like a fold, but on every level of the recursion we have access to both the original value and the result of applying the paramorphism (so it "eats its argument and keeps it too"). The factorial function is a natural example of a paramorphism.

Formally, for an initial F-algebra (T, in_T) and f : $F(C \times T) \rightarrow C$, para_T f : $T \rightarrow C$ is defined as follows:

$$\mathsf{para}_{\mathcal{T}} f = \mathsf{exl} \circ \mathsf{fold}_{\mathcal{T}} (f \vartriangle (\mathsf{in}_{\mathcal{T}} \circ F \mathsf{exr}))$$

...where exl, exr are pair projections and $(g \triangle h) x = (g x, h x)$.

 $\mathsf{para}_{\mathcal{T}} f = \mathsf{exl} \circ \mathsf{fold}_{\mathcal{T}} (f \vartriangle (\mathsf{in}_{\mathcal{T}} \circ F \mathsf{exr}))$



It enjoys the following universal property:

$$h = \operatorname{para}_{\mathcal{T}} f \iff h \circ \operatorname{in}_{\mathcal{T}} = f \circ F(h \land id) \land h \perp = f \perp$$

Unsurprisingly, we can derive for paramorphisms similar laws as those listed for catamorphisms.

The theorem states that the fork of two folds is a fold (so we can traverse the data structure only once instead of twice):

$$\mathsf{fold}_T f \vartriangle \mathsf{fold}_T g = \mathsf{fold}_T ((f \circ F \mathsf{exl}) \vartriangle (g \circ F \mathsf{exr}))$$

We will use it to derive a one-pass solution for the problem of calculating the average of a list.

$$\begin{aligned} & \text{fold}_{\mathcal{T}} f \bigtriangleup \text{fold}_{\mathcal{T}} g = \text{fold}_{\mathcal{T}} \left((f \circ F \text{ exl}) \bigtriangleup (g \circ F \text{ exr}) \right) \\ & \iff \\ & \{\text{universal property}\} \\ & (\text{fold}_{\mathcal{T}} f \bigtriangleup \text{fold}_{\mathcal{T}} g) \circ in = \\ & ((f \circ F \text{ exl}) \bigtriangleup (g \circ F \text{ exr})) \circ F (\text{fold}_{\mathcal{T}} f \bigtriangleup \text{fold}_{\mathcal{T}} g) \\ & \iff \\ & \{\text{property of fork, functors, property of extractions}\} \\ & (\text{fold}_{\mathcal{T}} f \bigtriangleup \text{fold}_{\mathcal{T}} g) \circ in = ((f \circ F (\text{fold}_{\mathcal{T}} f)) \bigtriangleup (g \circ F (\text{fold}_{\mathcal{T}} g))) \\ & \iff \\ & \{\text{property of fork}\} \\ & ((\text{fold}_{\mathcal{T}} f \circ in) \bigtriangleup (\text{fold}_{\mathcal{T}} g \circ in)) = \\ & ((f \circ F (\text{fold}_{\mathcal{T}} f)) \bigtriangleup (g \circ F (\text{fold}_{\mathcal{T}} g))) \\ & \iff \\ & \{\text{evaluation rule}\} \\ & ((f \circ F (\text{fold}_{\mathcal{T}} f)) \bigtriangleup (g \circ F (\text{fold}_{\mathcal{T}} g))) \\ & = \\ & ((f \circ F (\text{fold}_{\mathcal{T}} f)) \bigtriangleup (g \circ F (\text{fold}_{\mathcal{T}} g))) = \\ & ((f \circ F (\text{fold}_{\mathcal{T}} f)) \bigtriangleup (g \circ F (\text{fold}_{\mathcal{T}} g))) \end{aligned}$$

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 $average = DIV \circ sum riangle length$ $sum = fold_{ListInt}(const 0 riangle +)$ $length = fold_{ListInt}(const 0 riangle (1+))$

The banana split theorem lets us write:

 $sum riangle length = fold_{ListInt}(((const 0 riangle +) \circ F exl) riangle (const 0 riangle (1+)) \circ F exr)$

(∇ is like either in Haskell)

The end.



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- Jeremy Gibbons, *Calculating Functional Programs*, 2002.
- Erik Meijer et al., Functional Programming with Bananas, Lenses, Envelopes and Barbed Wire, 1991.