Parametricity properties of purely functional code "Theorems for free" demystified. A tutorial, with code examples in Scala

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Refactoring code by permuting the order of operations

• Expected properties of refactored code:

First extract user information, then convert stream to list; or first convert to list, then extract user information:

```
db.getRows.toList.map(getUserInfo) gives the same result as
db.getRows.map(getUserInfo).toList
```

First extract user information, then exclude invalid rows; or first exclude invalid rows, then extract user information:

```
db.getRows.map(getUserInfo).filter(isValid) gives the same result as
db.getRows.filter(getUserInfo andThen isValid).map(getUserInfo)
```

• These refactorings are guaranteed to be correct

Summary of the type notation

The short type notation helps in symbolic reasoning about types

Description	Scala examples	Notation
Typed value	x: Int	$x^{:Int}$ or $x:Int$
Unit type	Unit, Nil, None	1
Type parameter	A	Α
Product type	(A, B) or case class P(x: A, y: B)	$A \times B$
Co-product type	Either[A, B]	A + B
Function type	A => B	A o B
Type constructor	List[A]	List ^A
Universal quantifier	trait P { def f[A]: Q[A] }	$P \triangleq \forall A. Q^A$
Existential quantifier	sealed trait P[A]	$P^A \triangleq \exists B. Q^{A,B}$
	case class Q[A, B]() extends P[A]	

Example: Scala code def flm(f: A => Option[B]): Option[A] => Option[B] is denoted by flm: $(A \to \mathbb{1} + B) \to \mathbb{1} + A \to \mathbb{1} + B$

Summary of the code notation

The short code notation helps in symbolic reasoning about code

Scala examples	Notation	
() or true or "abc" or 123	1, true, "abc", 123	
def f[A](x: A) =	$f^A(x^{:A}) \triangleq \dots$	
{ (x: A) => expr }	$x^{:A} o expr$	
f(x) or x.pipe(f) (Scala 2.13)	$f(x)$ or $x \triangleright f$	
val p: (A, B) = (a, b)	$p^{:A\times B}\triangleq a\times b$	
{case (a, b) => expr} or p1 or p2	$a imes b o expr$ or $p riangleright \pi_1$ or $p riangleright \pi_2$	
Left[A, B](x) or Right[A, B](y)	$x^{:A} + \mathbb{O}^{:B}$ or $\mathbb{O}^{:A} + y^{:B}$	
<pre>val q: C = (p: Either[A, B]) match { case Left(x) => f(x) case Right(y) => g(y) }</pre>	$q^{:C} \triangleq p^{:A+B} \triangleright \begin{array}{c c} & C \\ \hline A & x^{:A} \to f(x) \\ B & y^{:B} \to g(y) \end{array}$	
def f(x) = { f(y) }	$f(x) \triangleq \dots \overline{f}(y) \dots$	
f andThen g and (f andThen g)(x)	$f \circ g$ and $x \triangleright f \circ g$ or $x \triangleright f \triangleright g$	
p.map(f).map(g)	$p \triangleright f^{\uparrow F} \triangleright g^{\uparrow F}$ or $p \triangleright f^{\uparrow F} ; g^{\uparrow F}$	

Refactored code: further examples

Writing the previous examples as equations:

- A transformation before map equals a transformation after map
- This is called a naturality law
- We expect it to hold if the code works the same way for all types

Naturality laws: equations

Naturality law for a function t is an equation involving an arbitrary function f that permutes the order of application of t and of a lifted f

- Lifting f before t equals to lifting f after t
- Intuition: *t* rearranges data in a collection, not looking at values Further examples:
 - ullet Reversing a list; reverse $^A: \mathsf{List}^A o \mathsf{List}^A$

$$\begin{aligned} & \text{list.map(f).reverse} &== \text{list.reverse.map(f)} \\ & (f^{:A \to B})^{\uparrow \text{List}} \, \mathring{\S} \, \text{reverse}^B &= \text{reverse}^A \, \mathring{\S} \, (f^{:A \to B})^{\uparrow \text{List}} \end{aligned}$$

ullet The pure method, pure[A]: A \Rightarrow L[A]. Notation: pu $_L: \mathcal{A} \to \mathcal{L}^\mathcal{A}$

pure(x).map(f) == pure(f(x))

$$pu^{A} \circ (f^{:A \to B})^{\uparrow L} = f \circ pu^{B}$$

Resoning with naturality: Simplifying the pure method

The naturality law of pure for a functor L:

Fix a value $b^{:B}$ and set A = 1 and $f \triangleq 1 \rightarrow b$ in the naturality law:

We have expressed pure(b) via a constant value pure(()) of type L[Unit] The naturality law of pure makes it equivalent to a "wrapped unit" value This simplifies the definition of a Pointed typeclass:

```
abstract class Pointed[L[_]: Functor] { def wu: L[Unit] }
Examples: for Option, wu = Some(()). For List, wu = List(())
```

Naturality laws in typeclasses

Another use of naturality laws is when implementing typeclasses

• Typeclasses require type constructors with methods map, filter, fold, flatMap, pure, and others

To be useful for programming, the methods must satisfy certain laws

- map: identity, composition
- filter: identity, composition, partial function, naturality
- fold (traverse): identity, composition, naturality
- flatMap: identity, associativity, naturality
- pure: naturality

We need to check the laws when implementing new typeclass instances Usually, typeclass instances are written in fully parametric code

Fully parametric code: example

Fully parametric code: "works in the same way for all types"

• Example of a fully parametric function:

```
def headOpt[A]: List[A] => Option[A] = {
  case Nil => None
  case head :: tail => Some(head)
}
```

- The code does not use explicit types
- The same code in the matrix notation:

$$\mathsf{headOpt}^{:\mathsf{List}^A \to \mathbb{1} + A} \triangleq \begin{array}{|c|c|c|c|c|} & \mathbb{1} & A \\ \hline \mathbb{1} & \mathsf{id} & \mathbb{0} \\ A \times \mathsf{List}^A & \mathbb{0} & h \times t \to h \end{array}$$

where $List^A \triangleq 1 + A \times List^A$ is a recursively defined type constructor: final case class List[A] (x: Option[(A, List[A]))

Naturality laws express the programmer's intuition about the properties of fully parametric code

Example of code that is *not* fully parametric:

An implementation of headOpt that has special code for Int type

• The code uses explicit run-time type detection

The function headOptBad fails the naturality law:

```
scala> headOptBad(List(1, 2, 3).map(x => s"value = $x"))
res0: Option[String] = Some(value = 1)

scala> headOptBad(List(1, 2, 3)).map(x => s"value = $x")
res1: Option[String] = Some(value = 101)
```

Full parametricity: The price we pay for "free theorems"

Free theorems only apply to fully parametric code:

- All argument types are combinations of type parameters
- All type parameters are treated as unknown, arbitrary types
- No hard-coded values of specific types (123: Int or "abc": String)
- No side effects (printing, var x, mutating values, writing files, networking, starting or stopping new threads, GUI events, etc.)
- No null, no throwing of exceptions, no run-time type comparison
- No run-time code loading, no external libraries with unknown code

"Fully parametric" is a stronger restriction than "purely functional" (referentially transparent)

Purely functional code is fully parametric if restricted to using only Unit type or type parameters

No hard-coded values of specific types, and no run-time type detection

Fully parametric programs are written using the 9 code constructions:

- ① Use Unit value (or a "named Unit"), e.g. (), Nil, or None. Notation: 1
- ② Use bound variable (a given argument of the function). Notation: x
- Create function: { x => expr(x) }. Notation: x → expr(x)
 Use function: f(x). Notation: f(x) or x ▷ f
- **5** Create tuple: (a, b). Notation: $a \times b$
- **6** Use tuple: p._1. Notation: $\nabla_1 p$ or $p \triangleright \nabla_1$
- Create disjunctive value: Left[A, B](x). Notation: $x^{:A} + 0^{:B}$
- 3 Use disjunctive value: { case ... } (pattern-matching); matrix code
- 9 Use recursive call: fmap(f)(tail). Notation: $\overline{fmap_{List}}(f)(t)$

Naturality laws and parametricity

- The parametricity theorem guarantees that all naturality laws hold as long as the method's code is fully parametric
- This saves us time: no need to check the naturality laws

Using the parametricity theorem is difficult

- The "theorems for free" (Reynolds; Wadler) approach needs to replace functions (one-to-one or many-to-one) by "relations" (many-to-many)
 - ▶ Derive a law with relation variables, then replace them by functions
- Alternative approach: analysis of dinatural transformations derives the naturality laws directly (Bainbridge et al.; Backhouse; de Lataillade)
 - ► See also a 2019 paper by Voigtländer
- Plan:
 - Start with natural transformations
 - Introduce profunctors and dinatural transformations
 - Commutativity laws for bifunctors and profunctors
 - Derive the naturality laws for dinatural transformations
 - Uniqueness of functor typeclass instances

Natural transformations and their laws

A **natural transformation** is a function t with type signature $F^A o G^A$ that satisfies the naturality law $f^{\uparrow F}$; t = t; $f^{\uparrow G}$. Notation t : F o G

- Many standard methods have the form of a natural transformation
 - Examples: headOption, lastOption, reverse, swap, map, flatMap, pure
- If there are several type parameters, use one at a time:
 - lacktriangledown For flatMap, denote flm : $\left(A o M^B
 ight) o M^A o M^B$, fix A
 - * flm: $F^B \to G^B$ where $F^B \triangleq A \to M^B$ and $G^B \triangleq M^A \to M^B$
 - ▶ The naturality law $f^{\uparrow F}$; flm = flm; $f^{\uparrow G}$ then gives the equation

$$\operatorname{\mathsf{flm}}(p^{:A o M^B} \, \mathring{\circ} \, f^{\uparrow M}) = \operatorname{\mathsf{flm}}(p^{:A o M^B}) \, \mathring{\circ} \, f^{\uparrow M}$$

The naturality law for $t^A: F^A \to G^A$ when F^A , G^A are contrafunctors:

$$F^{A} \xrightarrow{t^{A}} G^{A}$$

$$\downarrow^{(f^{:B\to A})^{\downarrow F}} \qquad \downarrow^{f^{\downarrow G}}$$

$$F^{B} \xrightarrow{t^{B}} G^{B}$$

$$f^{\downarrow F} \mathring{g} t = t \mathring{g} f^{\downarrow G}$$

Mnemonic rule: if $t: F \leadsto G$ then the lifting to F is on the left, the lifting to G is on the right

Dinatural transformations and profunctors

Some methods do *not* have the type signature of the form $F^A o G^A$

- find[A]: (A => Boolean) => List[A] => Option[A]
- fold[A, B]: List[A] => B => (A => B => B) => B with respect to B
 - ▶ The type parameter is in contravariant and covariant positions at once
 - ► This gives us neither a functor nor a contrafunctor
- Solution: use a profunctor $P^{X,Y}$ (contravariant in X, covariant in Y) with equal type parameters: $P^{A,A}$

A dinatural transformation is a function t with type signature $P^{A,A} \to Q^{A,A}$ that satisfies the naturality law $f^{\downarrow P}$; t; $f^{\uparrow Q} = f^{\uparrow P}$; t; $f^{\downarrow Q}$ where $P^{X,Y}$ and $Q^{X,Y}$ are suitable profunctors

- All pure functions have the type signature of a dinatural transformation
- All naturality laws (also for find, fold) are derived in this way
- The corresponding naturality law is guaranteed by parametricity
- Proof of parametricity theorem is a direct proof that any pure function t satisfies its law, by induction on the code structure of t
- The proof depends on the profunctor commutativity law and on the "standard" lifting codes for $f^{\uparrow P}$ and $f^{\downarrow P}$

Type constructors with two type parameters

In particular: bifunctors and profunctors

- In Scala syntax: L[A, B]. Example: type L[A, B] = Either[(A, B), B]
- In the type notation: $L^{A,B}$. Example: $L^{A,B} \triangleq A \times B + B$
- If a type constructor is fully parametric, its type parameters will be either in covariant or in contravariant positions
- Bifunctors: both type parameters are always in covariant positions
 - ► Example: type L[A, B] = Either[(A, B), B] is a bifunctor
 - ► Method bimap[A, B, C, D](f: A => C)(g: B => D): L[A, B] => L[C, D]
 - Laws: identity and composition for bimap
- Profunctors: one type parameter contravariant, the other covariant
 - ▶ Example: type P[X, Y] = Option[X] => (Y, Y) or $P^{X,Y} \triangleq \mathbb{1} + X \rightarrow Y \times Y$
 - ▶ Method xmap[A, B, C, D](f: C \Rightarrow A)(g: B \Rightarrow D): P[A, B] \Rightarrow P[C, D]
 - ► Laws: identity and composition for xmap
- If L[A, B] is a functor separately in A and B, is it a bifunctor?
- If P[A, B] is contravariant in A and covariant in B, is it a profunctor?
- They are as long as all liftings in A commute with liftings in B
 - ▶ These are the "commutativity laws" of bifunctors and profunctors

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Applying map to bifunctors and profunctors

The map method can be applied with respect to only one type parameter

- In a bifunctor L[A, B], fix B. Denote the resulting functor by $L^{\bullet,B}$
 - ▶ In the Scala syntax with "kind projector": L[?, B]
 - ▶ Lifting a function $f^{:U\to V}$ is denoted by $f^{\uparrow L^{\bullet,B}}: L^{U,B} \to L^{V,B}$

 - ▶ If fixing A instead, a lifting is denoted by $f^{\uparrow L^{A,\bullet}}: L^{A,U} \to L^{A,V}$ ▶ Commutativity law for bifunctors: $f^{\uparrow L^{\bullet,B}}: (g^{:B\to C})^{\uparrow L^{V,\bullet}} = g^{\uparrow L^{U,\bullet}}: f^{\uparrow L^{\bullet,C}}$
- In a profunctor P[A, B], fix B. The resulting contrafunctor is $P^{\bullet,B}$
 - ▶ Lifting a function $f^{:U\to V}$ is denoted by $f^{\downarrow P^{\bullet,B}}: P^{V,B} \to P^{U,B}$
 - ▶ If fixing A instead, a lifting is denoted by $f^{\uparrow P^{A, \bullet}}: P^{A, U} \to P^{A, V}$
 - \star For brevity, we may denote these liftings by $f^{\downarrow P}$ and $f^{\uparrow P}$ unambiguously
 - ▶ **Commutativity law** for profunctors: $f^{\downarrow P}$; $g^{\uparrow P} = g^{\uparrow P}$; $f^{\downarrow P}$

$$P^{A,B} \xrightarrow{(f^{:C \to A})^{\downarrow P}} P^{C,B}$$

$$(g^{:B \to D})^{\uparrow P} \downarrow \qquad \qquad \downarrow (g^{:B \to D})^{\uparrow P}$$

$$P^{A,D} \xrightarrow{(f^{:C \to A})^{\downarrow P}} P^{C,D}$$

- Commutativity laws hold for all fully parametric type constructors
 - ▶ It is not necessary to verify the bifunctor and profunctor laws!
- Proof is by induction on the type structure of $P^{X,Y}$

Proof of the composition law of xmap

If $P^{A,B}$ is a functor in a and a contrafunctor in B, define xmap by:

The xmap composition law:

Proof uses the commutativity law, $f^{\downarrow P}$, $g^{\uparrow P}=g^{\uparrow P}$, $f^{\downarrow P}$, for f_2 and g_1 :

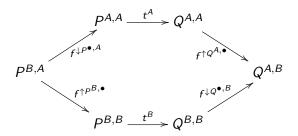
$$\begin{split} & \mathsf{xmap}\left(f_{1}\right)\left(g_{1}\right) \, \mathring{\$} \, \mathsf{xmap}\left(f_{2}\right)\left(g_{2}\right) = f_{1}^{\downarrow P} \, \mathring{\$} \, \underline{g_{1}^{\uparrow P}} \, \mathring{\$} \, f_{2}^{\downarrow P} \, \mathring{\$} \, g_{2}^{\uparrow P} \\ & = \underline{f_{1}^{\downarrow P}} \, \mathring{\$} \, f_{2}^{\downarrow P} \, \mathring{\$} \, \underline{g_{1}^{\uparrow P}} \, \mathring{\$} \, g_{2}^{\uparrow P} = \left(f_{2} \, \mathring{\$} \, f_{1}\right)^{\downarrow P} \, \mathring{\$} \, \left(g_{1} \, \mathring{\$} \, g_{2}\right)^{\uparrow P} \\ & = \mathsf{xmap}\left(f_{2} \, \mathring{\$} \, f_{1}\right)\left(g_{1} \, \mathring{\$} \, g_{2}\right) \end{split}$$

The naturality law for dinatural transformations

Given two profunctors $P^{X,Y}$ and $Q^{X,Y}$ and a function $t^A: P^{A,A} \to Q^{A,A}$. The naturality law is an equation for functions $P^{B,A} \to Q^{A,B}$:

$$f^{\downarrow P^{\bullet,A}} \circ t^A \circ f^{\uparrow Q^{A,\bullet}} \stackrel{!}{=} f^{\uparrow P^{B,\bullet}} \circ t^B \circ f^{\downarrow Q^{\bullet,B}}$$

Both sides must give the same result when applied to arbitrary $p: P^{B,A}$



This law reduces to natural transformation laws when P and Q are functors or contrafunctors

Example: writing the naturality law for filter

def filter[A]: (A => Boolean) => F[A] => F[A] for a filterable functor F Notation: filt^A: $(A \to 2) \to F^A \to F^A$ (the type Boolean is 2 = 1 + 1) Rewrite in the form of a dinatural transformation:

$$\mathsf{filt}^A: P^{A,A} \to Q^{A,A} \quad , \quad P^{X,Y} \triangleq X \to 2 \quad , \quad Q^{X,Y} \triangleq F^X \to F^Y$$

Write the code for the liftings using the specific types of P and Q:

$$(f^{:A \to B})^{\downarrow P^{\bullet,A}} = p^{:B \to 2} \to f \, {}^{\circ}_{\,\,} p \quad , \qquad f^{\uparrow P^{B,\bullet}} = \mathrm{id} \quad ,$$

 $(f^{:A \to B})^{\downarrow Q^{\bullet,B}} = q^{:F^B \to F^B} \to f^{\uparrow F} \, {}^{\circ}_{\,\,} q \quad , \qquad f^{\uparrow Q^{A,\bullet}} = q^{:F^A \to F^A} \to q \, {}^{\circ}_{\,\,} f^{\uparrow F}$

Rewrite the naturality law $f^{\downarrow P^{\bullet,A}}$; filt^A; $f^{\uparrow Q^{A,\bullet}} \stackrel{!}{=} f^{\uparrow P^{B,\bullet}}$; filt^B; $f^{\downarrow Q^{\bullet,B}}$ as

$$(p o f \, \S \, p) \, \S \, \mathsf{filt} \, \S \, (q o q \, \S \, f^{\uparrow F}) \stackrel{!}{=} \mathsf{id} \, \S \, \mathsf{filt} \, \S \, (q o f^{\uparrow F} \, \S \, q) \quad .$$

To simplify this equation, apply both sides to an arbitrary value $p^{:P^{B,A}}$ Evaluate the results and obtain the naturality law of filter,

filt
$$(f \circ p) \circ f^{\uparrow F} \stackrel{!}{=} f^{\uparrow F} \circ \text{filt } (p)$$

Uniqueness of functor implementations

Consequences of the parametricity theorem:

Statement 1: For any fully parametric type constructor F^A covariant in A, there is a unique lawful and fully parametric implementation of fmap with type signature fmap[A, B]: (A => B) => F[A] => F[B]

Statement 2: For any fully parametric type constructor F^A contravariant in A, there is a unique lawful and fully parametric implementation of cmap with type signature cmap[A, B]: (B => A) => F[A] => F[B]

 Note: many typeclasses may admit several lawful, fully parametric, but non-equivalent implementations of a typeclass instance for the same type constructor F[A]. For example, Filterable, Monad, Applicative instances are not always unique. But instances are unique for the functor and contrafunctor type classes.

Proof of Statement 1 (uniqueness of functor instances)

For a given functor F, we can construct the "standard" fmap (denoted by $...^{\uparrow F}$) that is involved in the naturality laws Suppose that there exists *another* lawful and fully parametric implementation fmap'(f):

$$\mathsf{fmap}': (A \to B) \to F^A \to F^B$$
, $\mathsf{fmap}'(f^{:A \to B}) = ???^{:F^A \to F^B}$

We need to show that fmap' = fmapBy parametricity, fmap' has a naturality law with respect to B:

$$\mathsf{fmap}'(f^{:A \to B} \, \S \, g^{:B \to C}) \stackrel{!}{=} \mathsf{fmap}'(f) \, \S \, g^{\uparrow F} = \mathsf{fmap}'(f) \, \S \, \mathsf{fmap} \, (g)$$

This suggests using the composition law for fmap':

$$fmap'(f \, g) = fmap'(f) \, fmap'(g) \stackrel{!}{=} fmap'(f) \, fmap(g)$$

Since $f^{:A\to B}$ is arbitrary, we may choose A=B and $f=\operatorname{id}^{:B\to B}$ to obtain

$$\underline{\mathsf{fmap}'(\mathsf{id})}\, \S\, \mathsf{fmap}'(g) = \mathsf{fmap}'(g) \stackrel{!}{=} \underline{\mathsf{fmap}'(\mathsf{id})}\, \S\, \mathsf{fmap}\, (g) = \mathsf{fmap}(g)$$

This must hold for arbitrary $g^{:B \to C}$, which proves that $\operatorname{fmap}_F' = \operatorname{fmap}_F$

Plan for a proof of commutativity law for profunctors

- Main idea: induction on the type expression of a profunctor $P^{X,Y}$
- A fully parametric $P^{X,Y}$ must be a combination of Unit type (1), parameters X and Y, products $A \times B$, co-products A + B, exponentials $A \to B$, and type recursion (use of P in its definition)
- For each of these cases, we need to show that the commutativity law holds given that it holds for all sub-expressions
 - ▶ Base case: show that the law holds for $P^{X,Y} \triangleq 1$ and $P^{X,Y} \triangleq Y$
 - Induction steps: if the law holds for $P^{X,Y}$ and $Q^{X,Y}$, show that it also holds for $P^{X,Y}+Q^{X,Y}$ and $P^{X,Y}\times Q^{X,Y}$ and $P^{Y,X}\to Q^{X,Y}$
 - ▶ Show that the law holds for a recursively defined $P^{X,Y} \triangleq S^{X,Y,P^{X,Y}}$ for a type constructor $S^{X,Y,R}$ contravariant in X, covariant in Y and R
 - ► We need to use the code of functor and contrafunctor instances for products, co-products, function types, and recursive types
- Example: For $R^{X,Y} \triangleq P^{X,Y} \times Q^{X,Y}$, the liftings to R are given by $f^{\uparrow R} \triangleq p \times q \rightarrow f^{\uparrow P}(p) \times f^{\uparrow Q}(q)$ and $f^{\downarrow R} \triangleq p \times q \rightarrow f^{\downarrow P}(p) \times f^{\downarrow Q}(q)$
 - ▶ Write $f^{\downarrow R}$, $g^{\uparrow R}$ explicitly using $f^{\downarrow P}$, $f^{\downarrow Q}$, $g^{\uparrow P}$, and $g^{\uparrow Q}$, and show that $f^{\downarrow R}$, $g^{\uparrow R} = g^{\uparrow R}$, $f^{\downarrow R}$ by assuming that the same law already holds for P and Q

Plan for a proof of parametricity theorem

ullet Need to prove the naturality law for $t^A:P^{A,A} o Q^{A,A}$ written as

- The code of t must be of the form $p \to \exp r$, where "expr" must be built up from some of the nine constructions
- Main idea: induction on the code of "expr", assuming that the naturality law holds for all sub-expressions
- Example: induction step for code construction 3 ("create function")
 - ▶ The code of t is $p \to z \to r$ and $Q^{X,Y} \triangleq Z^{Y,X} \to R^{X,Y}$
 - ▶ Inductive assumption is that any $x \rightarrow r$ satisfies the law; let $x = p \times z$
 - ▶ Assume that the law holds for $u \triangleq p \times z \rightarrow r$, $u : P^{A,A} \times Z^{A,A} \rightarrow R^{A,A}$
 - ▶ Derive the law for $t = p \rightarrow z \rightarrow u(p \times z)$ by a direct calculation
- There are some technical difficulties (dinatural transformations do not generally compose) but these difficulties can be overcome with tricks

Summary

- Fully parametric code enables powerful mathematical reasoning:
 - Naturality laws can be used for guaranteed correct refactoring
 - ▶ Naturality laws allow us to reduce the number of type parameters
 - ▶ In typeclass instances, all naturality laws hold, no need to check
 - ► Functor, contrafunctor, and profunctor typeclass instances are unique
 - Bifunctors and profunctors obey the commutativity law
- Full details and proofs are in the free upcoming book (Appendix D)
 - ▶ Draft of the book: https://github.com/winitzki/sofp