# Proving "theorems for free" via relational parametricity A tutorial using the syntax of Scala code

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#### Outline of the tutorial

- Motivation: practical applications of the parametricity theorem
- What is "fully parametric code"
- Naturality laws and their uses
  - Example: Covariant and contravariant Yoneda identities
- A complete proof of "theorems for free" in 6 steps
  - ▶ Step 1: Deriving fmap and cmap methods from types
  - Step 2: Motivation for the relational approach to naturality laws
  - ▶ Step 3: Definition and examples of relations
  - ► Step 4: Definition and properties of the relational lifting (rmap)
  - ▶ Step 5: Proof of the relational naturality law
  - ▶ Step 6: Deriving the wedge law from the relational naturality law
- Advanced applications of the parametricity theorem:
  - Beyond Yoneda: a first example
  - ► The Church encoding of recursive types
  - Simplifying universally quantified types where Yoneda fails

## Applications of parametricity. "Theorems for free"

**Parametricity theorem**: any fully parametric function obeys a certain law Some applications:

Naturality laws for code that works in the same way for all types

Naturality law for headOption: for all x: List[A] and f: A => B,
 x.headOption.map(f) == x.map(f).headOption

Uniqueness properties for fully parametric functions

- The map and contramap methods uniquely follow from types
- There is only one function f with type signature f[A]: A => (A, A)

Type equivalence for universally quantified types

- The type of functions pure[A]: A => F[A] is equivalent to F[Unit]
  - ► In Scala 3, this type is written as [A] => A => F[A]
- The type [A] => (A, (K, A) => A) => A is equivalent to List[K]
- The type [A] => ((A => K) => A) => A is equivalent to K

#### Requirements for parametricity. Fully parametric code

Parametricity theorem works only if the code is "fully parametric"

- "Fully parametric" code: use only type parameters and Unit, no run-time type reflection, no external libraries or built-in types
  - ► For instance, no IO-like monads
- "Fully parametric" is a stronger restriction than "purely functional"

Parametricity theorem applies only to a subset of a programming language

• Usually, it is a certain flavor of typed lambda calculus

### Examples of code that is not fully parametric

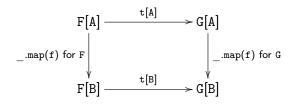
```
Explicit matching on type parameters using type reflection:
    def badHeadOpt[A]: List[A] => Option[A] = {
                                => None
      case Nil
      case (head: Int) :: tail => None // Run-time type match!
      case head :: tail => Some(head)
Using typeclasses: define a typeclass NotInt[A] with the method notInt[A]
that returns true unless A = Int
    def badHeadOpt[A: NotInt]: List[A] => Option[A] = {
      case h :: tail if notInt[A] => Some(h)
      case _ => None
Failure of naturality law:
    scala > badHeadOpt(List(10, 20, 30).map(x => s"x = $x"))
    res0: Option[String] = Some(x = 10)
    scala > badHeadOpt(List(10, 20, 30)).map(x => s"x = $x")
    res1: Option[String] = None
```

#### Fully parametric programs are written using the 9 code constructions:

- Use Unit value (or equivalent type), e.g. (), Nil, None
- Use bound variable (a given argument of the function)
- Create a function: { x => expr(x) }
- Use a function: f(x)
- Oreate a product: (a, b)
- Use a product: p.\_1 (or via pattern matching)
- Create a co-product: Left[A, B](x)
- Use a co-product: { case ... => ... } (pattern matching)
- Use a recursive call: e.g., fmap(f)(tail) within the code of fmap

#### Naturality laws require map

Naturality law: applying t[A]:  $F[A] \Rightarrow G[A]$  before  $\_.map(f)$  equals applying t[B]:  $F[B] \Rightarrow G[B]$  after  $\_.map(f)$  for any function f:  $A \Rightarrow B$ 



Example: F = List, G = Option, t = headOption
The naturality law of headOption: for all x: List[A] and f: A => B,
x.headOption.map(f) = x.map(f).headOption

Naturality laws are formulated using  $\_.map$  for F and G What is the code of map for a given F[\_]?

• Equivalently, the code of fmap[A, B]: (A => B) => F[A] => F[B]

#### Using naturality laws: the Yoneda identities

```
For covariant F[A], the type F[R] is equivalent to the type of functions
p[A]: (R \Rightarrow A) \Rightarrow F[A] satisfying the naturality law:
p[A](k).map(f) == p[B](k andThen f) for all f: A => B
Isomorphism maps:
inY[A]: F[R] \Rightarrow (R \Rightarrow A) \Rightarrow F[A] = fr \Rightarrow k \Rightarrow fr.map[A](k)
outY: ([A] \Rightarrow (R \Rightarrow A) \Rightarrow F[A]) \Rightarrow F[R] = p \Rightarrow p[R](identity[R])
Proofs of isomorphism:
outY(inY(fr)) == outY(k => fr.map(k)) == fr.map(identity) == fr
The other direction:
inY(outY(p)) == k => outY(p).map(k) == k => p(identity).map(k)
Use the naturality law: p(identity).map(k) == p(identity and Then k)
So: inY(outY(p)) == k \Rightarrow p(k) == p
```

• The naturality law and the code of inY must use the same \_.map For contravariant G[A], the type G[R] is equivalent to the type of functions  $q[A]: (A \Rightarrow R) \Rightarrow G[A]$  satisfying the appropriate naturality law

#### Example applications of the Yoneda identities

Many types can be converted to the form  $[A] \Rightarrow (R \Rightarrow A) \Rightarrow F[A]$  with a covariant F or to  $[A] \Rightarrow (A \Rightarrow R) \Rightarrow G[A]$  with a contravariant G Some examples (assume covariant F[] and contravariant G[]):

- [A] => A is equivalent to Nothing
- [A] => F[A] is equivalent to F[Nothing]
- [A] => G[A] is equivalent to G[Unit]
- [A] => A => A is equivalent to Unit
- [A] => A => F[A] is equivalent to F[Unit]
- [A] => (A, A) => A is equivalent to Boolean
- [A] => (A, A) => F[A] is equivalent to F[Boolean]
- [A] => (P => A) => Q => A is equivalent to Q => P
- [A] => (A => P) => A => Q is equivalent to P => Q
- [A] => F[A] => (A => P) => Q is equivalent to F[P] => Q
- flatMap is equivalent to flatten: (use Yoneda w.r.t. A)
  def flatMap[A, B]: F[A] => (A => F[B]) => F[B]
  def flatten[B]: F[F[B]] => F[B]

#### Step 1. Fully parametric type constructors

What is the fmap function for a given type constructor F[\_]?

- If the code of t[A]: F[A] => G[A] is fully parametric, then there are only a few ways to build the type constructors F[\_] and G[\_]
- Such "fully parametric" type constructors F[\_] are built as:

```
■ F[A] = Unit or F[A] = B where B is another type parameter
```

- $\bigcirc$  F[A] = A
- [S] F[A] = (G[A], H[A]) product types
- F[A] = Either[G[A], H[A]] co-product types
- 5 F[A] = G[A] => H[A] function types
- F[A] = G[F[A], A] recursive types
- **◊** F[A] = [X] ⇒ G[A, X] universally quantified types

The recursive type construction (Fix) can be defined as:

```
case class Fix[G[_, _], A](unfix: G[Fix[G[_, _], A], A])

F[A] = Fix[G, A] satisfies the type equation F[A] = G[F[A], A]
```

## Step 1. Deriving fmap from types

```
    What is the fmap function for a covariant type constructor F[]?

  fmap_F[A, B]: (A \Rightarrow B) \Rightarrow F[A] \Rightarrow F[B]
    If F[A] = Unit or F[A] = B then fmap_F(f) = identity
    2 If F[A] = A then fmap_F(f) = f
    \bullet If F[A] = (G[A], H[A]) then we need fmap_G and fmap_H
       fmap_F(f) = \{ case (ga, ha) => (fmap_G(f)(ga), \}
       fmap_H(f)(ha)) }
    4 If F[A] = Either[G[A], H[A]] then fmap_F(f) = \{
         case Left(ga) => Left(fmap_G(f)(ga))
         case Right(ha) => Right(fmap_H(f)(ha))
    6 If F[A] = G[A] => H[A] then we need cmap_G and fmap_H
       cmap_G[A, B]: (A \Rightarrow B) \Rightarrow G[B] \Rightarrow G[A]
       We define fmap_F(f)(p: G[A] \Rightarrow H[A]) =
        cmap_G(f) andThen p andThen fmap_H(f)
    6 If F[A] = G[F[A], A] then we need fmap_G1 and fmap_G2
       fmap_F(f) = fmap_G1(fmap_F(f)) and Then fmap_G2(f)
    If F[A] = [X] => G[A, X] then we need fmap_G1
       fmap_F(f) = p \Rightarrow [X] \Rightarrow fmap_G1(f)(p[X])
```

### Step 1. Deriving cmap from types

- When F[\_] is contravariant, we need the cmap function cmap\_G[A, B]: (A => B) => G[B] => G[A]
- Use structural induction on the type of F[\_]:
  - If F[A] = Unit or F[A] = B then cmap\_F(f) = identity
  - If F[A] = A then F is not contravariant!
  - If F[A] = (G[A], H[A]) then we need cmap\_G and cmap\_H
    cmap\_F(f) = { case (gb, hb) => (cmap\_G(f)(gb),
    cmap\_H(f)(hb)) }
  - If F[A] = Either[G[A], H[A]] then cmap\_F(f) = {
     case Left(gb) => Left(cmap\_G(f)(gb))
     case Right(hb) => Right(cmap\_H(f)(hb))
     }
    }
  - If F[A] = G[A] => H[A] then we need fmap\_G and cmap\_H
    We define cmap\_F(f)(k: G[B] => H[B]) =
     fmap\_G(f) andThen k andThen cmap\_H(f)
  - If F[A] = G[F[A], A] then we need fmap\_G1 and cmap\_G2
    cmap\_F(f) = fmap\_G1(cmap\_F(f)) andThen cmap\_G2(f)
  - If  $F[A] = [X] \Rightarrow G[A, X]$  then we need cmap\_G1 cmap\_F(f) = k  $\Rightarrow$  [X]  $\Rightarrow$  cmap\_G1(f)(k[X]))

#### Step 1. Detect covariance and contravariance from types

- The same constructions for fmap and cmap except for function types
- The function arrow (=>) swaps covariant and contravariant positions
- In any fully parametric type expression, each type parameter is either in a covariant position or in a contravariant position

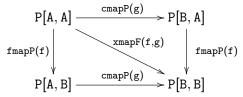
```
type F[A, B] = (A \Rightarrow Either[A, B], A \Rightarrow (B \Rightarrow A) \Rightarrow (A, B))
```

- F[A, B] is covariant w.r.t. B since B is always in covariant positions
  - ▶ But F[A, B] is neither covariant nor contravariant w.r.t. A
  - ▶ We can recognize co(ntra)variance by counting nested function arrows
- Defined in this way, co(ntra)variance is independent of subtyping
- We can generate the code for fmap or cmap mechanically, from types
- A type expression F[A, B, ...] can be analyzed with respect to each
  of the type parameters separately, and found to be covariant,
  contravariant, or neither ("invariant")
- We can write the naturality law for any type signature F[A] => G[A]

### Step 1. "Invariant" type constructors. Profunctors

For "invariant" types, we use a trick: rename contravariant positions

- Example: type F[A] = Either[A => (A, A), (A, A) => A]
- Define type  $P[X, A] = Either[X \Rightarrow (A, A), (X, X) \Rightarrow A]$
- Then F[A] = P[A, A] while P[X, A] is contravariant in X and covariant in A. Such P[X, A] are called profunctors
- We can implement cmap with respect to X and fmap with respect to A def fmapP[X, A, B]: (A => B) => P[X, A] => P[X, B] def cmapP[X, Y, A]: (X => Y) => P[Y, A] => P[X, A]
- Then we can compose cmapP and fmapP to get xmapF: def xmapF[A, B]: (A => B, B => A) => P[A, A] => P[B, B] = (f, g) => cmapP[A, B, A](g) andThen fmapP[B, A, B](f)
- What if we compose in another order? A commutativity law holds:



#### Step 1. Verifying the functor laws

fmap and cmap need to satisfy two functor laws

• Identity law:

```
fmap(identity) = identity
cmap(identity) = identity
```

- Composition law: for any f: A => B and g: B => C,
   fmap(f) andThen fmap(g) = fmap(f andThen g)
   cmap(g) andThen cmap(f) = cmap(f andThen g)
- Go through each case and prove that the laws hold
  - Proofs by induction on the type structure

#### Step 1. Functor laws: composition law for tuples

• We will prove the composition law for fmap in case 3

```
fmap_F(f) = \{ case (ga, ha) \Rightarrow (fmap_G(f)(ga), fmap_H(f)(ha)) \}
For any f: A \Rightarrow B and g: B \Rightarrow C and values ga: G[A], ha: H[A]:

    Apply fmap_F(f) andThen fmap_F(g) to the tuple (ga, ha):

fmap_F(f)((ga, ha)) == (fmap_G(f)(ga), fmap_H(f)(ha))
fmap_F(g)((fmap_G(f)(ga), fmap_H(f)(ha)))
== (fmap_G(g)(fmap_G(f)(ga)), fmap_H(g)(fmap_H(f)(ha)))
== ( (fmap_G(f) andThen fmap_G(g))(ga), (fmap_H(f) andThen
fmap_H(f))(ha) )
```

 Apply fmap\_F(f andThen g) to the tuple (ga, ha): fmap\_F(f andThen g)((ga, ha)) == ( fmap\_G(f andThen g)(ga), fmap\_H(f andThen g)(ha) )

• The law holds for fmap\_F if it already holds for fmap\_G and fmap\_H

#### Step 1. Functor laws: composition law for function types

We will prove the composition law for cmap in case 5
 cmap\_F(f)(k) == fmap\_G(f) andThen k andThen cmap\_H(f)

For any  $f: A \Rightarrow B$  and  $g: B \Rightarrow C$  and  $kc: G[C] \Rightarrow H[C]:$ 

```
Apply cmap_F(g) and Then cmap_F(f) to kc:

cmap_F(g)(kc) == fmap_G(g) and Then kc and Then cmap_H(g)

cmap_F(f)(fmap_G(g) and Then kc and Then cmap_H(g))

== fmap_G(f) and Then fmap_G(g) and Then kc and Then cmap_H(g)
```

This is the same as cmap\_F(f andThen g)(kc)by inductive assumption

== fmap\_G(f andThen g) andThen kc andThen cmap\_H(f andThen g)

• The law holds for cmap\_F if it already holds for fmap\_G and cmap\_H

andThen cmap\_H(f)

#### Step 1. Functor laws: composition law for recursive types

We will prove the composition law for fmap in case 6

```
fmap_F(f) = fmap_G1(fmap_F(f)) and Then fmap_G2(f)
For any f: A \Rightarrow B and g: B \Rightarrow C:
```

```
LHS: fmap_F(f) and fmap_F(g) == fmap_G1(fmap_F(f)) and fmap_G2(f) and fmap_G2(g) and fmap_G2(g)
```

```
RHS: fmap_F(f \text{ andThen } g) == fmap_G1(fmap_F(f \text{ andThen } g)) andThen fmap_G2(f \text{ andThen } g) == fmap_G1(fmap_F(f)) andThen fmap_G2(f) andThen fmap_G2(g) == fmap_G1(fmap_F(f)) andThen fmap_G2(f) andThen fmap_G2(g) andThen fmap_G2(g)
```

- LHS equals RHS if the commutativity law holds for G
- The law holds for fmap\_F if the composition laws and the commutativity law already hold for fmap\_G1 and fmap\_G2

#### Step 1. Summary

- fmap or cmap or xmap follow from a given type expression F[A]
- The code of fmap, cmap, xmap is always fully parametric and lawful
  - ► That is the "standard" code used by all naturality laws
- Consistency of the definition of xmap requires a commutativity law
- Functor laws for recursive types require a commutativity law
  - ▶ Those commutativity laws are naturality laws and will be proved later

## Step 2. Motivation for relational parametricity. I. Papers

Parametricity theorem: any fully parametric function satisfies a certain law "Relational parametricity" is a powerful method for proving the parametricity theorem and for using it to prove other laws

- Main papers: Reynolds (1983) and Wadler "Theorems for free" (1989)
  - ▶ Those papers are limited in scope and hard to understand
- There are few pedagogical tutorials on relational parametricity
  - ▶ "On a relation of functions" by R. Backhouse (1990)
  - ▶ "The algebra of programming" by R. Bird and O. de Moor (1997)
  - ▶ Parametricity tutorial part 1, part 2, part 3 by E. de Vries (2015)
- Here I derive the main results not following any of the above
- I will only explain the minimum necessary knowledge and notation

# Step 2. Motivating relational parametricity. II. The difficulty

Naturality laws are formulated via liftings (fmap, cmap), for example: fmap(f) andThen t == t andThen fmap(f)

Cannot lift  $f: A \Rightarrow B$  to  $F[A] \Rightarrow F[B]$  when  $F[_]$  is not covariant!

- For covariant F[\_] we lift f: A => B to fmap(f): F[A] => F[B]
- For contravariant F[\_] we lift f: A => B to cmap(f): F[B] => F[A]
   In general, F[\_] will be neither covariant nor contravariant

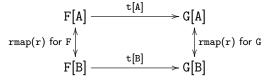
• Example: foldLeft with respect to type parameter A

- def foldLeft[T, A]: List[T] => (T => A => A) => A => A
- This is not of the form F[A] => G[A] with F[\_] and G[\_] being both covariant or both contravariant
  - ▶ Because some occurrences of A are in covariant and contravariant positions together in function arguments, e.g., (T ⇒ A ⇒ A) ⇒ . . .
- What law (similar to a naturality law) does foldLeft obey with respect to the type parameter A?
- We need to formulate a more general naturality law that applies to all type constructors F[A], not necessarily covariant nor contravariant

## Step 2. Motivating relational parametricity. III. The solution

The difficulty is resolved using three nontrivial ideas:

- Generalize functions  $f: A \Rightarrow B$  to binary relations  $r: A \iff B$ 
  - ► The graph relation: (a, b) in graph(f) means f(a) == b
  - Relations are more general than functions, can be many-to-many
  - ▶ Instead of f(a) == b, we will write (a, b) in r
- It is always possible to lift r: A <=> B to rmap(r): F[A] <=> F[B]
- Reformulate the naturality law of t via relations: for any r: A <=> B,



To read the diagram: the starting values are on the left For any  $r: A \iff B$ , for any fa: F[A] and fb: F[B] such that (fa, fb) in rmap\_F(r), we require (t(fa), t(fb)) in rmap\_G(r)The relational naturality law will reduce to the ordinary naturality laws when F[], G[] are both co(ntra)variant and r = graph(f) for any  $f: A \Rightarrow B$ 

## Step 2. Formulating naturality laws via relations

Ordinary naturality law of  $t[A]: F[A] \Rightarrow G[A]$ 

$$\begin{split} F[A] & \xrightarrow{t[A]} & G[A] \\ \text{fmap}_F(f) \middle\downarrow & & \downarrow^{\text{fmap}}_G(f) \\ F[B] & \xrightarrow{t[B]} & G[B] \end{split}$$

 $\forall$  fa: F[A], fb: F[B] if fa.map(f) == fb then t(fa).map(f) == t(fb) Rewrite this via relations: For all fa: F[A], fb: F[B], when (fa, fb) in graph(fmap\_F(f)) then (t(fa), t(fb)) in graph(fmap\_G(f)) We expect: graph(fmap(f)) == rmap(graph(f)), replace graph(f) by r: when (fa, fb) in rmap\_F(graph(f)) then (t(fa), t(fb)) in rmap\_G(graph(f))

when (fa, fb) in  $rmap_F(r)$  then (t(fa), t(fb)) in  $rmap_G(r)$ 

$$\begin{array}{ccc} F[A] & \xrightarrow{t[A]} & G[A] \\ \operatorname{rmap}_F(r) & & & & \\ & f[B] & \xrightarrow{t[B]} & G[B] \end{array}$$

#### Step 3. Definition of relations. Examples

In the terminology of relational databases:

- A relation r: A <=> B is a table with 2 columns (A and B)
- A row (a: A, b: B) means that the value a is related to the value b

Mathematically speaking: a relation  $\mathbf{r}$ : A <=> B is a subset  $r \subset A \times B$ 

• We write (a, b) in r to mean  $a \times b \in r$  where  $a \in A$  and  $b \in B$ 

Relations can be many-to-many while functions  $A \Rightarrow B$  are many-to-one A function  $f: A \Rightarrow B$  generates the **graph** relation  $graph(f): A \iff B$ 

- Two values a: A, b: B are in graph(f) if f(a) == b
- graph(identity: A => A) gives an identity relation id: A <=> A

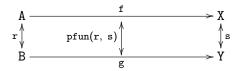
Example of a relation that can be many-to-many: given any f: A => C and
g: B => C, define the pullback relation: pull(f, g): A <=> B;
 (a: A, b: B) in pull(f, g) means f(a) == g(b)

• The pullback relation is *not* the graph of a function A => B or B => A

## Step 3. Relational combinators: pprod, psum, pfun, rev

Given two relations  $r: A \iff B \text{ and } s: X \iff Y$ , we define new relations:

- Pair product: pprod(r, s) of type (A, X) <=> (B, Y)
- ((a, x), (b, y)) in pprod(r, s) means (a, b) in r and (x, y) in s
- Pair co-product: psum(r, s) of type Either[A, X] <=> Either[B, Y]
  (Left(a), Left(b)) in psum(r, s) if (a, b) in r
- (Right(x), Right(y)) in psum(r, s) if (x, y) in s
   Pair function mapper: pfun(r, s) of type (A => X) <=> (B => Y)
- (f, g) in pfun(r, s) means when (a, b) in r then (f(a), g(b)) in s



- Reverse: rev(r) has type B <=> A
- (b, a) in rev(r) means the same as (a, b) in r

## Step 4. The relational lifting (rmap)

For a type constructor F and r: A  $\iff$  B, need rmap\_F(r): F[A]  $\iff$  F[B] Define rmap\_F for F[A] by induction on the type expression of F[A]A fully parametric type F[A] must be built up via these seven cases: •  $F[A] = Unit \text{ or } F[A] = K \text{ (a fixed type): } rmap_F(r) = id$ 

- F[A] = A: define rmap\_F(r) = r
- $\{\}$   $F[A] = (G[A], H[A]): rmap_F(r) = pprod(rmap_G(r), rmap_H(r))$
- F[A] = Either[G[A], H[A]]:  $rmap_F(r) = psum(rmap_G(r), rmap_H(r))$
- Recursive type: F[A] = G[A, F[A]]:
- $rmap_F(r) = rmap_G(r, rmap_F(r)) recursive definition of rmap_F$
- Universally quantified type: F[A] = [X] => G[A, X]:  $rmap_F(r) = \forall (X, Y). \forall (s: X \iff Y). rmap2_G(r, s)$
- The inductive assumption is that liftings to G and H are already defined
- rmap\_F translates the type expression F[A] into relational combinators

We will define rmap2 in a similar way

## Step 4. Simultaneous relational lifting (rmap2)

```
For a type constructor F[\_, \_] and r: A \iff B, s: P \iff Q, we define
rmap2_F(r, s): F[A, P] <=> F[B, Q] by induction on the type F[A, P]
 • F[A, P] = K (a fixed type): rmap2_F(r, s) = id
 2 If F[A, P] = A then rmap2_F(r, s) = r
    If F[A, P] = P then rmap2_F(r, s) = s
 3 F[A, P] = (G[A, P], H[A, P]):
    rmap2_F(r, s) = pprod(rmap2_G(r, s), rmap2_H(r, s))
 \P F[A, P] = Either[G[A, P], H[A, P]]:
    rmap2_F(r, s) = psum(rmap2_G(r, s), rmap2_H(r, s))
 5 F[A, P] = G[A, P] \Rightarrow H[A, P]
    rmap2_F(r, s) = pfun(rmap2_G(r, s), rmap2_H(r, s))
 6 Recursive type: F[A, P] = G[A, P, F[A, P]]:
    rmap2_F(r, s) = rmap3_G(r, s, rmap2_F(r, s))
 Universally quantified type: F[A, P] = [X] => G[A, P, X]:
    rmap2_F(r, s) = \forall (X, Y). \forall (t: X \iff Y). rmap3_G(r, s, t)
  • The inductive assumption is that liftings to G and H are already defined
Actually, we need to define rmap, rmap2, rmap3, rmap4, ..., all at once
```

This is not a problem: F[] is finitely long, so the induction will stop

## Step 4. Example: rmap for a covariant type constructor

```
Consider P[A] = R \Rightarrow (A, A) where R is a fixed type
Compare fmap_P and rmap_P defined via the inductive definitions
Case 5: P[A] = G[A] \Rightarrow H[A] with G[A] = R (case 1), H[A] = (A, A)
Case 3: H[A] = (K[A], L[A]) with K[A] = A, L[A] = A (case 2)
For fmap_P:
fmap_P(f)(p) = cmap_G(f) and Then p and Then fmap_H(f)
fmap_H(f) = \{ case (k, 1) \Rightarrow (fmap_K(f)(k), fmap_L(f)(1)) \}
cmap_G(f) = identity, fmap_K(f) = f, fmap_L(f) = f
fmap_P(f)(p) = p and fmap_P(f)(p) = p an
For rmap_P:
rmap_P(r) = pmap(rmap_G(r), rmap_H(r)) = pmap(id, rmap_H(r))
   = pmap(id, pprod(rmap_K(r), rmap_L(r))) = pmap(id, pprod(r, r))
Two values (p: P[A], q: P[B]) are in rmapP_{(r)} if for \forall x: R, y: R, when
(x, y) in id then (p(x), q(x)) in pprod(r, r) or equivalently:
for any x: R, (p(x)._1, q(x)._1) in r and (p(x)._2, q(x)._2) in r
Choose r = graph(f) and get for any x: R: f(p(x)._1) == q(x)._1 and
f(p(x)._2) == q(x)._2
This is the same as q == fmap_P(f)(p) or (p, q) in graph(fmap_P(f))
```

## Step 4. Example: rmap for function types

```
Compare fmap and rmap for function types: (F[A] = G[A] \Rightarrow H[A])
To rewrite fmap_F via relations, introduce intermediate arguments
Choose any values p: G[A] \Rightarrow H[A] and f: A \Rightarrow B
Define q = fmap_F(f)(p) = (gb: G[B]) \Rightarrow fmap_H(f)(p(cmap_G(f)(gb))
Rewrite this via relations: (p, q) in graph(fmap_F(f)) means:
for all gb: G[B] we must have q(gb) = fmap_H(f)(p(cmap_G(f)(gb)))
Define ga: G[A] = cmap_G(f)(gb), then: q(gb) = fmap_H(f)(p(ga))
But ga = cmap_G(f)(gb) means (ga, gb) in rev(graph(cmap_G(f)))
So, the relational formulation of fmap_F is:
(p, q) in graph(fmap_F(f)) means for all ga: G[A], gb: G[B] when
(ga, gb) in rev(graph(cmap_G(f))) then:
(p(ga), q(gb)) in graph(fmap_H(f))
Replace graph(f) by an arbitrary relation r: A \iff B; replace
graph(fmap_F(f)) by rmap_F(r); rev(graph(cmap_G(f))) by rmap_G(r)
Then we get: (p, q) in rmap(r) means for all ga: G[A], gb: G[B] when
(ga, gb) in rmap_G(r) then (p(ga), q(gb)) in rmap_H(r)
This is the same as (p, q) in pfun(rmap_G(r), rmap_H(r))
```

## Step 4. Example: rmap for non-covariant type constructors

Consider some type constructors of different complexity:

- If F[A] is covariant: rmap(graph(f)) == graph(fmap(f))
- If F[A] is contravariant: rmap(graph(f)) == rev(graph(cmap(f)))
- If G[A] = A => A then (ga, gb) in rmap(graph(f)) means:

```
when (a, b) in graph(f) then (ga(a), gb(b)) in graph(f) or: f(ga(a)) == gb(f(a)) or: ga andThen f == f andThen gb This relation between ga and gb has the form of a pullback
```

- If H[A] = (A => A) => A then (ha, hb) in rmap\_H(graph(f)) is: when (p, q) in rmap\_G(graph(f)) then (ha(p), hb(q)) in graph(f) equivalently: if p andThen f == f andThen q then f(ha(p)) == hb(q) This is not in the form of a pullback relation: cannot express p through q
  - This happens for sufficiently complicated type constructors
  - It is hard to use relations that are neither a graph nor a pullback

#### Example: applying relational naturality to [A] => A => A

Example: def  $t[A]: A \Rightarrow A = \dots$  // Fully parametric.

- The value t has type [A] => A => A
- Denote P[A] = A => A

The relational naturality law says:

• For any types A and B, and for any relation  $r: A \iff B$ , we have:

```
(t[A], t[B]) in rmap_P(r)
For the type P[A] = A => A we have:
rmap_P(r): (A => A) <=> (B => B)
rmap_P(r) = pfun(r, r)
```

• (t[A], t[B]) in pfun(r, r) means: for any a: A, b: B, if (a, b) in r then (t(a), t(b)) in r

Trick: choose r: A <=> A such that (a, b) in r only if a == b == a0

- Whenever a == b == a0 then t(a) == t(b) == a0
- So, t(a0) == a0 for any fixed a0: A
  - ▶ It means that t must be an identity function

## Step 5. Preparing to prove the relational naturality law

Instead of proving relational properties for  $t[A]: P[A] \Rightarrow Q[A]$ , use the function type and the quantified type constructions and get:

Any fully parametric t[A]: F[A] satisfies for any r: A <=> B the relation (t[A], t[B]) in rmap\_F(r)

It is convenient to prove the relational law when t has a free variable:

- Any fully parametric expression t[A](z): Q[A] with z: P[A] satisfies, for any relation r: A <=> B and for any z1: P[A], z2: P[B], the law: if (z1, z2) in rmap\_P(r) then (t[A](z1), t[B](z2)) in rmap\_Q(r)
- Equivalently: (t[A], t[B]) in pfun(rmap\_P(r), rmap\_Q(r))

This applies to expressions containing *one* free variable (z)

Any number of free variables can be grouped into a tuple

## Step 5. Outline of the proof of the relational naturality law

The theorem says that t[A](z) satisfies its relational naturality law Proof goes by induction on the structure of the code of t[A](z) At the top level, t[A](z) must have one of the 9 code constructions Each construction decomposes the code of t[A](z) into sub-expressions The inductive assumption is that the theorem holds for all sub-expressions and for the free variable z In each inductive case, we choose arbitrary z1: P[A], z2: P[B] such that (z1, z2) in  $rmap_P(r)$ 

## Step 5. The first four cases of the proof

- 1 Constant type: t[A](z) = c where c: C has a fixed type C:
  - We have rmap\_P(r) == id and (c, c) in id holds
- 2 Use argument: t[A](z) = z where z and t[A] have type P[A]:
  - If (z1, z2) in rmap\_P(r) then (t(z1), t(z2)) in rmap\_P(r)
- 3 Create function:  $t(z) = h \Rightarrow s(z, h)$  where we assume h: H[A] and s(z, h): S[A]
  - If (z1, z2) in rmap\_P(r) and (h1, h2) in rmap\_H(r) then (s(z1, h1), s(z2, h2)) in rmap\_S(r)
    - ► This is the same as the inductive assumption for s(z, h)
- 4 Use function: t(z) = g(z)(h(z)) where g(z):  $H[A] \Rightarrow Q[A]$  and h(z): H[A] are sub-expressions:
  - If (z1, z2) in rmap\_P(r) then the inductive assumption says: (h(z1), h(z2)) in rmap\_H(r)
  - If (h1, h2) in rmap\_H(r) then the inductive assumption says: (g(h1), g(h2)) in rmap\_Q(r)
  - Therefore (t[A](z1), t[B](z2)) in rmap\_Q(r)

## Step 5. The next three cases of the proof

```
5 Create tuple: t[A](z) = (u(z), v(z)) where u(z): U[A], v(z): V[A] Need (t[A](z1), t[B](z2)) in rmap_Q(r) where Q[A] = (U[A], V[A])
```

- As rmap\_Q(r) = pprod(rmap\_U(r), rmap\_V(r)), we have (t[A](z1),
  t[B](z2)) in rmap\_Q(r) when (u(z1), u(z2)) in rmap\_U(r) and
  (v(z1), v(z2)) in rmap\_V(r), which hold by inductive assumptions
  6 Use tuple: t[A](z) = g[A](z).\_1 with g[A](z): G[A] = (Q[A], R[A])
  - By inductive assumption, (g(z1), g(z2)) in rmap\_G(r) while we have rmap\_G(r) = pprod(rmap\_Q(r), rmap\_R(r)), so we get (g(z1).\_1, g(z2).\_1) in rmap\_Q(r) as required
  - The case  $t[A](z) = g[A](z)._2$  is proved similarly
- 7 Create a co-product: t[A](z) = Left[G[A], H[A]](g[A](z))Here we set Q[A] = Either[G[A], H[A]] and g[A](z) : G[A]By the inductive assumption, (g(z1), g(z2)) in  $rmap_G(r)$  and then: (Left(g(z1)), Left(g(z2))) in  $rmap_Q(r)$ 
  - The case t[A](z) = Left[G[A], H[A]](g[A](z)) is proved similarly

# Step 5. The last two cases of the proof

8 Use a co-product (pattern-matching):

case Left(x)  $\Rightarrow$  u(z)(x)

t(z) = s(z) match {

```
case Right(y) \Rightarrow v(z)(y)
}

    We set S[A] = Either[G[A], H[A]], s(z): S[A], x: G[A], y: H[A],

    u(z): G[A] \Rightarrow Q[A], and v(z): H[A] \Rightarrow Q[A]
  • Inductive assumptions: s(z), u(z), v(z) already satisfy the law
  • if (z1: P[A], z2: P[B]) in rmap_P(r) and (x1: G[A], x2: G[B])
    in rmap_G(r) then u(z1)(x1), u(z2)(x2) in rmap_Q(r)
  • (s[A](z1), s[B](z2)) in rmap_S(r) = psum(rmap_G(r),
    rmap_H(r)) means s(z1), s(z2) are both in Left or both in Right
If s(z1) = Left(x1), s(z2) = Left(x2) then (x1, x2) in rmap_G(r) and
(u(z1)(x1), u(z2)(x2)) in rmap_Q(r)
  • The case when both s(z1), s(z2) are in Right is proved similarly
```

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9 Recursive call: t(z) = f(z)(t(z)) where f(z): Q[A] => Q[A]
 Inductive assumptions: the law holds for f(z) and for the recursive t(z)
 Then t(z) satisfies the law because of the "use function" rule

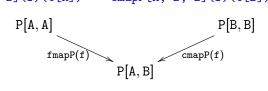
# Step 6. From relational naturality to the wedge law

Based on Bartosz Milewski's blog post: The Free Theorem for Ends (2017) Given:

- a function f: A => B
- a fully parametric profunctor P[X, Y] with methods cmapP and fmapP:
  - ▶  $cmapP[X, Y, B]: (X \Rightarrow Y) \Rightarrow P[Y, B] \Rightarrow P[X, B]$
  - ► fmapP[X, A, B]: (A => B) => P[X, A] => P[X, B]
- a fully parametric value (without free variables) t: [A] => P[A, A]

Then we will prove that the wedge law holds:

• fmapP[A, A, B](f)(t[A]) == cmapP[A, B, B](f)(t[B])



- Expressed via xmapP(f, g) = cmapP(g) andThen fmapP(f): xmapP(f, id)(t[A]) == xmapP(id, f)(t[B])
  - ▶ We do *not* need to assume the commutativity law for xmapP

# Step 6. From relational naturality to the wedge law

```
The relational naturality law holds for xmapP:
xmapP[A, B, X, Y]: (A \Rightarrow B, X \Rightarrow Y) \Rightarrow P[Y, A] \Rightarrow P[X, B]
For any types A, A', B, B', X, X', Y, Y', and for any relations p: A <=> A',
q: B \iff B', r: X \iff X', s: Y \iff Y' and for any values f: A \implies B,
f': A' \Rightarrow B', g: X \Rightarrow Y, g': X' \Rightarrow Y', v: P[Y, A], v': P[Y', A']
such that (f, f') in pfun(p, q) and (g, g') in pfun(r, s) and
(v, v') in rmap2_P(s, p) we will have:
(xmapP(f, g)(v), xmapP(f', g')(v')) in rmap2_P(r, q)
We need to get the equation xmapP(f, id)(t[A]) == xmapP(id, f)(t[B])
This means we need rmap2_P(r, q) to be an identity relation
Choose r = id: X <=> X and q = id: B <=> B (here X' = X, B' = B) and
obtain rmap2_P(r, q) = id (of type P[X, B] \iff P[X, B])
```

- This is a version of the "identity extension lemma" of Reynolds
  - ▶ Prove it by induction over the cases in the definition of rmap2
  - ► Also need to prove that rmap2\_F(r, id) = rmap\_G(r) etc.
- For the case P[X, A] = [Y] => Q[X, A, Y] we need to assume full parametricity for values in the relation rmap2\_P(id, id)

# Step 6. From relational naturality to the wedge law

```
xmapP[A, B, X, Y]: (A => B, X => Y) => P[Y, A] => P[X, B]
We have: xmapP(f, g)(v) == xmapP(f', g')(v')
We need: xmapP(f, id)(t[A]) == xmapP(id, f)(t[B])
Choose values as f' = id, g = id, g' = f, v = t[A], v' = t[B]
Choose types as A' = B = B' = Y', A = X = X' = Y
```

The relational naturality law of xmapP also requires us to have:

- (f, f') in pfun(p, q) this is (f, id) in pfun(p, id) for any
  (x: A, y: B) in p we need f(x) == y this holds if p = graph(f)
- (g, g') in pfun(r, s) this is (id, f) in pfun(id, s) for any
   x: A we need (x, f(x)) in s this holds if s = graph(f)
- (v, v') in rmap2\_P(s, p) this is (t[A], t[B]) in rmap2\_P(s, p)
   when s = p, this is the relational naturality law of t if formulated for the type signature t[A]: P[A, A]
- Need to prove: rmap2\_P(p, p) = rmap\_F(p) where F[A] = P[A, A]
  - ▶ Prove it by induction over the cases in the definition of rmap2
  - ▶ Also need to prove that rmap3(p, p, r) = rmap2(p, r) etc.

With these choices, the relational naturality law reduces to the wedge law

### Step 6. From the wedge law to naturality laws

• For type signatures G[A] => H[A] where both G and H are covariant:

```
Define P[X, Y] = G[X] \Rightarrow H[Y], take any fully parametric t[A] : P[A, A]
The wedge law of t is: fmapP(f)(t[A]) = cmapP(f)(t[B])
For any f: A \Rightarrow B, we have: fmapP(f)(t[A]) = t[A] and fmapH(f) and fmapP(f)(t[B]) = fmapG(f) and fmapH(f) = fmapG(f)
```

This is exactly the naturality law of t

Similarly, the naturality law follows when G and H are both contravariant

### Advanced applications. I. Beyond Yoneda

- Consider the type [A] => (A => A) => Either[E, A]
  - ► The Yoneda identities do not apply to that type signature
  - ▶ P[A] = (A => A) => Either[E, A] does not have naturality laws
  - ▶ The wedge law holds but does not give enough information
- Write the relational naturality law of p[A]: P[A]
- For any relation r: A <=> B, for any p: P[A] and q: P[B], we must have (p, q) in rmap\_P(r)
- The relational lifting: rmap\_P(r) = rfun(rfun(r, r), rsum(id, r))
- For any k: A => A, 1: B => B, if (k, 1) in rfun(r, r) then we must have (p(k), q(1)) in rsum(id, r)
- Compute the liftings for  $r = \emptyset$  (an empty relation of type A <=> B)
- (k, 1) in rfun $(\emptyset, \emptyset)$  means: for any a: A, b: B, if (a, b) in  $\emptyset$  then (k(a), k(b)) in  $\emptyset$
- ullet This holds for all k and 1 because there are no (a, b) in  $\emptyset$
- The law becomes: for any k: A => A, 1: B => B, we must have either p(k) == q(1) == Left(e) with some e: E, or p(k) == Right(x), k(1) == Right(y) and (x, y) in  $\emptyset$
- $\bullet$  p and q must be equal constant functions returning Left(e)

We have proved:  $E \cong [A] \Rightarrow (A \Rightarrow A) \Rightarrow Either[E, A]$ 

- Define recursive types by induction:  $T \cong S[T]$  with covariant  $S[\_]$
- The isomorphism is given by fix:  $S[T] \Rightarrow T$  and unfix:  $T \Rightarrow S[T]$
- ullet fix and Then unfix == identity; unfix and Then fix == identity
- Example: T = List[R], so  $T \cong S[T]$  with S[A] = Option[(R, A)]
- Church encoding: CT = [A] => (S[A] => A) => A (fully parametric)
- With Scala 2 traits: trait CT { def fold[A](fix: S[A] => A): A } Intuition about the types CT and S[A] => A: consider T = List[R]
  - A function of type S[A] => A is equivalent to: {
     case None => (aFixedValue: A)
     case Some((r, a)) => (computeNext(r, a): A)
  - The data in S[A] => A is equivalent to the type (A, (R, A) => A)
  - These are exactly the argument data of the List's foldLeft function foldLeft[A]: (S[A] => A) => A

Intuition: we can create a value of type CT only if we have a list (of type List[R]) that we can then fold using any "fold data" (A, (R, A) => A)

The type CT is the least fixpoint of the equation  $CT \cong S[CT]$ 

• See Wadler's paper "Recursive types for free" (1990)

```
def fix(sct: S[CT]): [A] => (S[A] => A) => A =
        [A] => saa => saa(sct.map(ct => ct[A](saa)))
def unfix(ct: CT): S[CT] = ct[S[CT]](fmap_S(fix))
```

- Relational law of ct: CT is: for any r: A <=> B, p: S[A] => A, q: S[B] => B such that (for any sa: S[A], sb: S[B] if (sa, sb) in rmap\_S(r) then (p(sa), q(sb)) in r) we will have (ct[A](p), ct[B](q)) in r
  - ► Choose r = graph(f) with an arbitrarily chosen f: A => B
  - ► Then the relational law says: for any p: S[A] => A, q: S[B] => B, when p andThen f == fmap\_S(f) andThen q then we will have f(ct[A](p)) == ct[B](q)

$$\begin{array}{ccc} S[A] & \xrightarrow{p} & A \\ \text{fmap}_S(f) & & & \downarrow_f \\ S[B] & \xrightarrow{q} & B \end{array}$$

Can prove the isomorphism directly via that law; instead use a trick

The trick is first to prove the "initial algebra" property: For any "fold data"  $q: S[B] \Rightarrow B$  there is a *unique*  $c(q): CT \Rightarrow B$  such that fix andThen  $c(q) == fmap_S(c(q))$  andThen q

The code:  $def c[B](q: S[B] \Rightarrow B)(ct: CT): B = ct[B](q)$ 

- With that code, c(q) satisfies the diagram: for any sct: S[CT], c(q)(fix(sct)) == q(sct.map(c(q))) ?
   fix(sct)(q) == q(sct.map(ct => ct(q))) by definition of fix
- Use the law with p = fix, f = c(q) to get c(q)(ct(fix)) == ct(q)
  - ▶ Equivalently ct(fix)(q) == ct(q) for any q, so ct(fix) == ct
- Use the law with p = fix and any f to get f(ct(fix)) == ct(q)
  - ▶ So, any f: CT => B satisfies f(ct) == ct(q), so f == c(q)

• To prove the isomorphism properties, use another trick:

Consider fmap\_S(fix): S[S[CT]] => S[CT] as "fold data" for S[CT]

The corresponding unique function u: CT => S[CT] is u(ct) =

ct(fmap\_S(fix)) = unfix(ct) and so unfix satisfies fix andThen unfix

== fmap\_S(unfix) andThen fmap\_S(fix) == fmap\_S(unfix andThen fix)

Then consider fix: S[CT] => CT as "fold data"; the corresponding unique function of type CT => CT is identity since ct(fix) == ct

But we also have a function i = unfix andThen fix of type CT => CT satisfying fix andThen i == fmap\_S(i) andThen fix because:

```
fix andThen unfix andThen fix ==
   fmap_S(unfix andThen fix) andThen fix
By uniqueness, we must have i == identity
It follows that unfix andThen fix == identity and
fix andThen unfix = fmap_S(i) = identity
```

- We proved the isomorphism  $CT \cong S[CT]$ , so CT is a fixpoint
- CT is the "least fixpoint": for any other fixpoint T ≅ S[T] there is a unique map CT ⇒ T that preserves the fixpoint structures of CT and T

- Define type F[K] = [A] => ((A => Option[K]) => A) => A
  - ► This is an attempt to apply the Church encoding to the recursive type definition T ≅ T => Option[K]
  - ▶ That recursive type has the form  $T \cong S[T]$  with a contravariant  $S[\_]$
- We will prove that F[K] ≅ Option[K]
- Define isomorphisms in and out:

```
def in[A](optK: Option[K]): ((A => Option[K]) => A) => A =
   (p: (A => Option[K]) => A) => p(_ => optK)
def out(h: [A] => ((A => Option[K]) => A) => A): Option[K] =
   h[Option[K]] { t: (Option[K] => Option[K]) => t(None) }
```

- We need to prove that out(in(optK)) == optK and in(out(h)) == h
  First: out(in(optK) == out(p => p(\_ => optK)) ==
   (t => t(None))(\_ => optK) == (\_ => optK)(None) == optK
  Second: in(out(h)) == in(h[Option[K]](t => t(None))) ==
   { p => p(\_ => h[Option[K]](t => t(None))) }
  - But we expected  $in(out(h)) == h == \{ p \Rightarrow h(p) \}$  instead of that!
- Need a law for h saying that h(p) must apply p to a constant function:
   h[A](p) == p(\_ => h[Option[K]](t => t(None)))

- Use the naturality law for functions h[A]: G[A] => A where G[A] is defined by G[A] = (A => Option[K]) => A and is covariant in A: for any f: X => Y and gx: G[X]: h[Y](gx.map(f)) == f(h[X](gx))
- Here  $gx.map(f) == (k: Y \Rightarrow Option[K]) \Rightarrow f(gx(f andThen k))$
- Naturality law:  $h[Y](k \Rightarrow f(gx(f \text{ andThen } k))) == f(h[X](gx))$
- We need a law of the form:  $h[A](p) == p(_ => h[Option[K]](...))$
- Choose X = Option[K]; Y = A; f = optK => p(\_ => optK); and
  gx: G[Option[K] = (t: Option[K] => Option[K]) => t(None)
- Then LHS:  $f(h[X](gx)) == p(_ => h[Option[K]](t => t(None)))$
- The LHS is exactly what we need (with arbitrary p: G[A])
- But the RHS is: h[Y](k => f(gx(f andThen k))) ==
   h[A](k => f((f andThen k)(None))) ==
   h[A](k => p(\_ => k(p(\_ => None))))
- Instead of that, we need  $h[A](p) == h[A](k \Rightarrow p(k))$

We must find a more powerful law of h than the naturality law

- Intuition: a function h: ((A => Option[K]) => A) => A must apply
  its argument p: (A => Option[K]) => A to a constant function of
  type A => Option[K]. So, we expect h(p) == h(q) whenever p(k) ==
  q(k) for all constant functions k. It will follow that h(p) = p(k) for
  some constant function k = \_ => optK
- To express this intuition via relations, apply the relational naturality law to an "almost-identity" relation r(a): A <=> A defined for a fixed a: A by: (x: A, y: A) in r(a) means x == y or x == a
- Lift r(a) to the type constructor ((A => Option[K]) => A) => A
- This gives the relational naturality law of h: (h(p) == h(q) or h(p) == a) for all p, q such that (p(k) == q(1) or p(k) == a) for all k, 1 such that { k(x) == 1(y) for all x, y such that x == y or x == a }
  - ► Suppose k(x) == 1(y) for all x, y such that x == y or x == a
  - ▶ It means that k(a) == l(y) for all y: A, so l is a constant function
  - And k(y) == 1(y) for all y != a, so k and 1 are the same function
- The relational law of h is: (h(p) == h(q) or h(p) == a) for all p, q such that (p(k) == q(k) or p(k) == a) for all constant functions k

- Use the relational law of h to prove that, for any p: G[A], we have:  $h[A](p) == h[A](k \Rightarrow p(_ \Rightarrow k(p(_ \Rightarrow None)))$
- The relational law says: h[A](p) == h[A](q) for all p, q such that (...)
- Choose  $q = (k: A \Rightarrow Option[K]) \Rightarrow p(_ \Rightarrow k(p(_ \Rightarrow None)))$
- We find that the precondition holds for these p and q: For any constant function k: A => Option[K] we actually have p(k) == q(k)
  - ► To verify that: Suppose k = { \_ => optK }, then:
     q(k) == p(\_ => k(p(\_ => None))) == p(\_ => optK) == p(k)
- Since the precondition holds, we obtain h(p) == h(q) or h(p) == a
- This holds for any chosen a: A but the definition of q does not depend on a, so we can rewrite the law as  $\forall h \forall p \forall a$  instead of  $\forall h \forall a \forall p$
- When the type A has at least two different values, choose a != h(p)
- The result is h(p) == h(q) as required

This completes the proof of in(out(h)) == h and of the type isomorphism  $Option[K] \cong [A] \Rightarrow ((A \Rightarrow Option[K]) \Rightarrow A) \Rightarrow A$ 

#### Summary

- "Theorems for free" are laws always satisfied by fully parametric code
- Relational parametricity is a powerful proof technique
- Relational parametricity has a steep learning curve
  - ▶ The result may be a relation that is difficult to interpret as code
  - Cannot directly write code that manipulates relations
  - ▶ All calculations need to be done symbolically or with proof assistants
- Naturality laws and the wedge law are shortcuts to "theorems for free"
  - ▶ A few proofs in FP do require the relational naturality law
- More details in the free book https://github.com/winitzki/sofp

