# **Ghosts of Departed Proofs (Functional Pearl)**

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# Abstract

Library authors often are faced with a design choice: should a function with preconditions be implemented as a partial function, or by returning a failure condition on incorrect use? Neither option is ideal. Partial functions lead to frustrating run-time errors. Failure conditions must be checked at the use-site, placing an unfair tax on the users who have ensured that the function's preconditions were correctly met.

In this paper, we introduce an API design concept called "ghosts of departed proofs" based on the following observation: sophisticated preconditions can be encoded in Haskell's type system with no run-time overhead, by using proofs that inhabit phantom type parameters attached to newtype wrappers. The user expresses correctness arguments by constructing proofs to inhabit these phantom types. Critically, this technique allows the library *user* to decide when and how to validate that the API's preconditions are met.

The "ghosts of departed proofs" approach to API design can achieve many of the benefits of dependent types and refinement types, yet only requires some minor and wellunderstood extensions to Haskell 2010. We demonstrate the utility of this approach through a series of case studies, showing how to enforce novel invariants for lists, maps, graphs, shared memory regions, and more.

*CCS Concepts* • Software and its engineering  $\rightarrow$  Formal software verification; *Polymorphism*; Software design tradeoffs; • Theory of computation  $\rightarrow$  *Logic and verification*;

*Keywords* API design, software engineering, formal methods, higher-rank types

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# 1 Introduction

[Rico Mariani] admonished us to think about how we can build platforms that lead developers to write great, high performance code such that developers just fall into doing the "right thing". That concept really resonated with me. It is the key point of good API design. We should build APIs that steer and point developers in the right direction.

# - Brad Abrams [1]

What is the purpose of a powerful type system? One practical perspective is that a type system provides a mechanism for enforcing program invariants at compile time. The desire to encode increasingly sophisticated program invariants has led to a vast expanse of research on more complex type systems, including dependent types [2, 3], refinement types [6], linear types [22], and many more. But despite this menagerie of powerful type systems, workaday Haskell programmers have already been able to encode surprisingly sophisticated invariants using nothing more than a few well-understood extensions to the Damas-Hindley-Milner type system.

An early success story is the ST monad, which allows pure computations to make use of local, mutable state. A phantom type parameter and a clever use of rank-2 types in the ST monad's API gives a compile-time guarantee that the local mutable state is invisible from the outside, and hence the resulting computation really *is* pure. As we will see, this trick is just the tip of a rather large iceberg.

In this paper, we will take the perspective of a library author, writing in Haskell 2010 (plus a few battle-tested language extensions). As a library author, our goal will be to design *safe* APIs that are also *ergonomic* for the end user. "Safe" means that we want to prevent the user from causing a run-time error. "Ergonomic" means that the correct use of our API must not place an undue burden on the user.

#### 1.1 Common Idioms for Handling Pre-conditions

No matter the language, a programmer often has to write functions that place constraints on their input. For example, the venerable head function will extract the first element of a list, but asks its users to only give it a non-empty list to operate on. Now put yourself in the shoes of head's author: how can you ensure that head will be used properly? Let us recount a variety of strategies used in the wild.

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```
(x:_) -> x
```

[] -> error "empty list!"

-- Returning Maybe / Optional values. Safe, but requires -- the caller to pattern-match on the Maybe at every use, -- even when the list is known to be non-empty. Frustrated -- users cannot be blamed for using `fromJust`! headMay :: [a] -> Maybe a headMay xs = case xs of (x:\_) -> **Just** x -> Nothing **F1** safeEndpts = doputStrLn "Enter a non-empty list of integers:" xs <- readLn case headMay xs of Just x -> return (x, fromJust (headMay (reverse xs)) -> safeEndpts -- "Ghosts of Departed Proofs". Safe. Does not return -- an optional value; preconditions are checked early -- and carried by "ghosts" (specialized phantom types). rev\_cons :: Proof (IsCons xs) -> Proof (IsCons (Rev xs)) gdpReverse :: ([a] ~~ xs) -> ([a] ~~ Rev xs) gdpHead :: ([a] ~~ xs ::: IsCons xs) -> a gdpHead xs = head (the xs) -- safe!

```
gdpEndpts = do
```

```
putStrLn "Enter a non-empty list of integers:"
xs <- readLn
name xs $ \xs -> case classify xs of
IsCons proof ->
return (gdpHead (xs ...proof),
    gdpHead (gdpReverse xs ...rev_cons proof))
IsNil proof -> gdpEndpts
```

**Figure 1.** Idioms for implementing the head function, along with usage examples. The gdpHead function can only be invoked by presenting a proof that the list is non-empty, combining the simplicity of the first example with the safety of the second. rev\_cons is a proof combinator exported by the library to help the user prove that the reverse of a non-empty list is also non-empty. See section 5 for details.

**Run-time failure on bad inputs.** The simplest approach is to have a function just fail on malformed inputs. The failure mode can be an immediate run-time error (as in head from Figure 1), an exception, or undefined behavior (as in C++'s std::vector<T>::front()).

**Returning a dummy value.** To avoid run-time errors, some APIs may have a "dummy value" for indicating the result of a failed operation. For example, Common Lisp's car and golang's Front() both return nil when passed an empty list. The caller must explicitly check for this dummy value. Other contortions may be needed if the container is also allowed to hold nil, to disambiguate between "the input list is empty" and "nil is the first element of this list".

**Returning a value with an option type.** A related strategy for languages with stricter typing discipline is to use an "option type," such as Haskell's Maybe or Scala's Option. A value of type Maybe T cannot be used where a value of type T was expected, so the user must explicitly pattern match on the optional value to extract the result and handle the error case. This approach may lead to frustration when the user believes that the error case is not possible, as when headMay is applied to the reverse of a non-empty list in Figure 1.

Modifying input types to exclude bad inputs. Finally, the API designer may select more restrictive types for the inputs in order to make the function total. For example, some Haskell libraries make use of the NonEmpty type for lists that contain at least one element. The head function then becomes total. The user can prove that their list is non-empty by making use of the smart constructor nonEmpty :: [a] -> Maybe (NonEmpty a). The drawbacks include duplication (do we re-implement length for NonEmpty?) and awkwardness when encoding preconditions that relate several inputs (e.g. requiring two lists to have the same length).

# 1.2 Leading the User into Temptation

The "return-an-optional-value" idiom is well-known and popular in the functional programming world. The author of a library function that returns Maybe a can certainly sleep well at night, content in the knowledge that their function will never cause a run-time error.

But what about the *users* of that library? Has the library author helped the user stay on a virtuous path, or have they led the user into temptation?

In fact, the author of the library has merely pushed extra responsibility onto the user. Every time the user applies a function that uses the optional-return idiom, they are obliged to test the return value and handle the error case. Even worse, the user is still asked to handle the error case when they have *correctly* ensured that the function's preconditions have been met! The library author sleeps well, while even the most vigilant users are forced to toil against those impossible error cases.

No wonder so many well-meaning users reach for unsafe functions like fromJust! They have already proved (to their own satisfaction) that the function is being used properly, so they rightly feel justified in ignoring the error case entirely. But now we see how the user has been led into a pit of despair: they have ended up with a program that is exactly as fragile as one where the library author had used the run-time-failure idiom!<sup>1</sup> Even if the user has mentally constructed a proof that this specific use of fromJust is safe *now*, who can say what will happen as the software changes over time? Without tooling to ensure that the user's proof *remains* valid, the software is left in a brittle state.

For example, a recent snapshot of hackage reveals over 2000 instances where the partial function fromJust is applied to the result of Data.Map's lookup. Any one of these instances may be a vignette of a programmer falling into a pit of despair: they had a mental proof that a certain key must be present in the map, but possessed no mechanism for *communicating* that proof to the lookup function. In frustration, they made the pragmatic—but unsafe—decision to introduce partiality.

# 1.3 Who Is to Blame?

It would be easy to lay the blame at the foot of the the user. After all, they were the ones who brought in partial functions! But this perspective misses the point: when we return a Maybe, even a perfect user who has done their due diligence will be forced to handle an error case—exactly the error case that they were so careful to avoid! The real problem is that the conversion from a partial function to a Maybe-returning function is a bit of a cheat on the part of the library author. Instead of adding Nothing to a function's codomain, why not simply restrict the function's domain to the set of valid inputs? The user would still be responsible for ensuring that the inputs are valid but, having done so, they would not be asked to introduce a spurious error handler.

# 1.4 An Alternative: Ghosts of Departed Proofs

In the following sections, we will elaborate a design concept for creating libraries that supports a dialogue between library and user: the library can require that certain conditions are met, and the user can explain how they have met those obligations. The key features of this approach are as follows:

**Properties and proofs are represented in code.** Proofs are concrete entities within the host language, and can be analyzed or audited independently. In the tradition of the Curry-Howard correspondence, propositions are represented by types, and the proof of a proposition will be a value of that type.

**Proofs carried by phantom type parameters.** To ensure that proof-carrying code does not have a run-time cost, proofs will only be used to inhabit types that appear as *phantom type variables* attached to newtype wrappers. The newtype wrapper is erased during compilation, leaving no

run-time cost and no evidence of these proofs in the final executable. The phantom type parameter is only used as a mechanism for transmitting the "ghost of a departed proof" to the library API. The name "ghost proof" is meant to suggest the related concept of *ghost variables* in software verification [10], and to emphasize the idea that the proof is non-corporeal: no artifacts related to the proof should ever be discernible from the compiler's output.

*Library-controlled APIs to create proofs.* Library authors should retain control over how domain-relevant proofs can be created. That is, the library author should be the only one able to introduce new axioms about the behavior of their API. This may mean exporting functions that create values with known properties, or that classify a value into mutually disjoint refinements, or that introduce existentially-quantified properties (name in Figure 2, runSt in Figure 5, or withMap in Figure 8).

**Combinators for manipulating ghost proofs.** Libraries may export a selection of combinators so that the user can mix and match the evidence at hand to produce a satisfactory proof of a safety property. The goal is to enrich the vocabulary of the user, so that they can productively communicate their proofs to the library.

# 1.5 The Structure of This Paper

In this paper, we will use a series of case studies to show how library authors can use ghosts of departed proofs (GDP) to create APIs that are both *safe* and *ergonomic*: the user cannot cause a run-time error when using the API, and incorrect uses of the API will become compile-time errors. But the APIs must be straightforward enough that the user is not tempted to subvert the library's safety guarantees by using unsafe functions. Crucially, we want the user to be able to *communicate* their informal proofs to the library. If the user believes that a precondition has been met, they should be able to explain *why* to the library!

The GDP design concept is relatively simple to implement. Each case study includes example library code, along with usage demonstrations. The examples in this paper are selfcontained, and are bundled together in a project suitable for further experimentation [13]. The proof combinators and other machinery from Section 5 are available as the gdp library on Hackage [14].

# 1.6 A Very Short Tutorial on Safe Coercions

Several of the examples in this paper rely on a basic understanding of *safe coercions*, a relatively recent addition to GHC Haskell [4]. The details of safe coercions are a bit technical, but for the purposes of this paper it suffices to know the following operational facts:

- The types T and newtype N = N T have the same run-time representation.
- coerce :: Coercible a b => a -> b can be used as a zero-cost safe cast from a to b, whenever the Coercible a b constraint is satisfied.

<sup>&</sup>lt;sup>1</sup>In fact, things are slightly *worse*: we have also introduced a little bit of extra allocation and indirection for creating and unpacking the return value in the non-error case.

• If N is a newtype of T, then the constraints Coercible N T and Coercible T N hold in any module where the constructor of N is visible.

We will make repeated use of this last property to help enforce encapsulation. Suppose a library author creates a module that defines N as a newtype of T, but *does not* export the constructor. Then the library author can use coerce to freely cast between T and N, but *users* of that library only see N as an opaque type, and are not able to coerce it to T.

## 2 Case Study #1: Sorted Lists

It is almost inevitable that a programmer will, at some point, be asked to work with lists that have been sorted in one way or another. To ensure correctness, the programmer may need to carefully manage various invariants, such as "all of these lists must have been sorted by the same comparator". For a concrete example, consider these sortBy and mergeBy functions:

```
sortBy :: (a -> a -> Ordering) -> [a] -> [a]
-- Usage constraint: in `mergeBy comp xs ys`, the
-- input lists `xs` and `ys` should also be sorted
-- by the same comparator `comp`.
mergeBy :: (a -> a -> Ordering) -> [a] -> [a] -> [a]
mergeBy comp xs ys = go xs ys
where
  go [] ys' = ys'
  go xs' [] = xs'
  go (x:xs') (y:ys') = case comp x y of
  GT -> y : go (x:xs') ys'
  _ -> x : go xs' (y:ys')
```

This efficient O(n + m) implementation of mergeBy is easy to write, but it comes with a hidden cost to the end user. Anybody who uses mergeBy must ensure that the two input lists have been sorted by the same comparator. If the user accidentally fails to sort the two inputs, or does not sort them in the same way, mergeBy will quietly produce nonsense and introduce a subtle bug.

It would be possible to implement a version of mergeBy that carefully inspected the inputs xs and ys as it proceeded, and only produced a result if the inputs met the sorting requirement. But this would impose a runtime cost on every use of mergeBy, increase the complexity of its implementation, and change the result type to Maybe [a]. And then what? Most users of mergeBy would argue to themselves "This is absurd! I already know that I sorted the input lists properly. This function will never result in Nothing." It would be hard to blame the user when they reach for an unsafe function like fromJust.

Clearly, everybody loses out in the above scenario. The library author is inconvenienced by the increased implementation complexity. The user is inconvenienced by the decreased performance and the need to pattern match on the result, even when they already know the outcome of

**Figure 2.** A module for attaching ghostly names to values. The rank-2 type of name, making use of a polymorphic continuation, is one way to emulate an existential type in Haskell. By hiding the constructor of Named, this module ensures that name is the only way to introduce a name for a value.

that match. No wonder that the status quo is to prominently display a stern warning in the documentation, admonishing any user who tries to mergeBy what they didn't sortBy.

But what if the user really *does* have proof that the input lists have been sorted properly? Can we devise a mechanism that allows the user to communicate this proof to mergeBy?

#### 2.1 Conjuring a Name

name x k = k (coerce x)

The first challenge is how to express the idea of two comparators being "the same". In a language that supports equality tests on functions, you could imagine a solution where the sortBy function returns both the sorted list and a reference to the comparator that was used; mergeBy could then check that the comparators matched. But this has a run-time cost for carrying around the comparator references, and it still would require mergeBy to return Nothing if it was given bogus arguments.

A different solution, in line with the GDP concept, is to introduce a newtype wrapper equipped with a phantom type parameter name. In code, we will write this wrapper as a  $\sim n$ , to be read as "values of type a with name n". To ensure that there is no run-time penalty for using names, a  $\sim n$  is implemented as a newtype around a, with a phantom type parameter n. A simple module for named values can be found in Figure 2; the key feature is the exported name function that expresses the concept "any value can be given a name".

To emulate an existentially-quantified type in Haskell, we will have to jump through a small hoop with name. Instead of directly returning a value with a name attached, name says to the user "tell me what you wanted to do with that named value, and I'll do it for you". This slight-of-hand is responsible for the rank-2 signature of name. The user must hand name a computation that is entirely agnostic about the name that will be chosen. More on this point in section 2.4.

Once we have introduced names, it becomes handy to have a uniform way of stripping names and other phantom

module Sorted (Named, SortedBy, sortBy, mergeBy) where import The

```
import Named
```

```
import
                 Data.Coerce
import qualified Data.List
                                 as L
import qualified Data.List.Utils as U
newtype SortedBy comp a = SortedBy a
instance The (SortedBy comp a) a
sortBy :: ((a -> a -> Ordering) ~~ comp)
       -> [a]
       -> SortedBy comp [a]
sortBy comp xs = coerce (L.sortBy (the comp) xs)
mergeBy :: ((a -> a -> Ordering) ~~ comp)
        -> SortedBy comp [a]
        -> SortedBy comp [a]
        -> SortedBy comp [a]
mergeBy comp xs ys =
```

coerce (U.mergeBy (the comp) (the xs) (the ys))

**Figure 3.** A module for working with lists that have been sorted by an arbitrary comparator. The refinement SortedBy comp is used to denote values that have been sorted by the comparator named comp.

data from a value. We do this with a simple two-parameter typeclass, like so:

```
class The d a | d -> a where
   the :: d -> a
   default the :: Coercible d a => d -> a
   the = coerce
```

By using this default signature for the, most instances of The can be declared with an empty body:

```
instance The (a \sim\sim name) a
```

The default method's use of a safe coercion helps ensure that forgetting a value's name incurs no run-time cost.

# 2.2 Implementing a Safe API for Sorting and Merging

Now that we know how to attach ghostly names to values, we can tackle the design of a safe and ergonomic interface to mergeBy. In Figure 3, we begin by defining a newtype wrapper SortedBy comp that represents the predicate "*x* has been sorted by the comparator named comp". The wrapper's meaning is imbued by the type of sortBy, which takes a *named* comparator and a list, and produces a list that has been SortedBy comp. Note that by *not* exporting SortedBy's constructor, we have ensured that the *only* way to obtain a value of type SortedBy comp [a] is through the sortBy or

```
import Sorted
import Named
main = do
  xs <- readLn :: IO [Int]
  ys <- readLn
  name (comparing Down) $ \gt -> do
  let xs' = sortBy gt xs
    ys' = sortBy gt ys
  print (the (mergeBy gt xs' ys'))
```

**Figure 4.** Using the module developed in Figure 3. For types with an Ord instance, comparing Down produces a comparator for (>) that sorts in the opposite of the usual order.

mergeBy functions. The user is not allowed to assert that a list is SortedBy comp by fiat.

The implementation is straightforward enough: we use the to coerce away the name of the comparator, apply the simpler version of sortBy from Data.List, and then introduce the SortedBy comp predicate by coercing the result. Since the coercions have no run-time effect, the code generated by the compiler for our GDP-style sortBy is simply a call to Data.List's sortBy!

Similarly, the generated code for our mergeBy will just call the "normal" mergeBy. But notice the argument types of the GDP-style mergeBy in Figure 3. The user must hand mergeBy a named comparator, plus two lists that have been sorted by that very same comparator. No stern warnings in the documentation are required: if the user tries to mergeBy what they didn't sortBy, the program will simply fail to compile!

We have successfully developed a safe API for sortBy and mergeBy, but how ergonomic is it? A usage example appears in Figure 4. The program is almost identical to one that uses the standard versions of sortBy and mergeBy, except for the line where we attach a ghostly name to comparing Down. We are asking very little more from the user, yet end up with an API that cannot be used incorrectly.

## 2.3 Applications to User Code

Although the library author retains control over the *introduction* of ghost proofs, the user is still able to leverage these proofs for their own purposes, beyond the library author's original design. For example, the user can write a simple function that extracts the minimal element of a list with respect to a given comparator:

```
minimum_01 :: SortedBy comp [a] -> Maybe a
minimum_01 xs = case the xs of
  [] -> Nothing
  (x:_) -> Just x
```

Thanks to the meaning given to SortedBy comp by the Sorted API, this user-defined function offers a strong guarantee that it can only be called on a sorted list. Despite being user-defined, this function cannot be used incorrectly. Did you forget to sort the list before calling minimum\_01? Then your program will not compile.

## 2.4 Aside: On the Danger of Naming a Ghost

Let us return for a moment to the somewhat unusual type of name in Figure 2. Is all of this business about rank-2 types *really* necessary, or is it merely ivory tower bloviation? You may well wonder, why not just have a function with a simple type like this:

```
any_name :: a -> (a ~~ name)
any_name = coerce
```

At its core, the question is really about *who gets to choose* what name will be. In the signature of any\_name, the *caller* gets to select the types a and name. In particular, they can attach any name they would like! If that still does not sound so bad, consider this code:

#### data Simon

```
up, down :: (Int -> Int -> Ordering) ~~ Simon
up = any_name compare
down = any_name (comparing Down)
list1 = sortBy up [1,2,3]
list2 = sortBy down [1,2,3]
```

```
merged = the (mergeBy up list1 list2) :: [Int]
-- [1,2,3,3,2,1]
```

The user has decided to name two different functions Simon, subverting the guarantees offered by the API of the Sorted module. It is dangerous to name a ghost!

Now compare this to the analogous program, using name instead of any\_name:

```
name compare $ \up ->
name (comparing Down) $ \down ->
let list1 = sortBy up [1,2,3 :: Int]
list2 = sortBy down [1,2,3]
in the (mergeBy up list1 list2)
```

Attempting to compile this program results in a type error:

```
Couldn't match type "name1" with "name"
...
Expected type: SortedBy name [Int]
Actual type: SortedBy name1 [Int]
```

What is the critical difference between these two examples? In the first, a user is allowed to *create* a named value by fiat. In the second, the user is only allowed to *consume* a named value, by providing a polymorphic function that can work with *any* named value. The library's API provides a helper function—in this case, name—for applying the consumer to a normal, unnamed value. In practice, it is as if the library has a secret supply of names, and selects one to use in a manner that is not predictable (or even inspectable!) to the user.

## 3 Case Study #2: Sharing State Threads

The trick for using rank-2 types to conjure names outside of the user's control was inspired by the ST monad and its rank-2 runST :: (forall s. ST s a)  $\rightarrow$  a function [9]. In this brief case-study, we elaborate the connection between the ST monad and GDP-style names. The new perspective suggests novel extensions to the ST API. In Figure 5 we recall the basic ST API [9], writing St to disambiguate our version from the existing type in Control.Monad.ST.

In their safety analysis of the ST monad, Timany *et al.* proposed to think of the s parameter as representing a name attached to a region of the heap [18]. We can think of ST s as acting like some kind of informal State monad over *named regions*, like in this Haskell-ish pseudocode:

```
data Region = Region
type St s a = State (Region ~~ s) a
```

runSt :: (forall s. St s a) -> a
runSt action = name Region (evalState action)

The notion of treating the ST monad's phantom type as a region name immediately leads to ideas for other primitives. Once we can name regions, why not go on to invent more detailed names to describe the minute contours of those regions? For example, let us see what happens if we add a binary type constructor  $\cap$  so that s  $\cap$  s' names the region at the intersection of s and s'. We are quickly led to an API similar to Figure 6 that supports a new capability: individual sub-computations, at their discretion, may decide to share mutable reference cells with other sub-computations.

```
runSt :: (forall s. St s a) \rightarrow a
newRef :: a \rightarrow St s (a \in s)
readRef :: (a \in s) \rightarrow St s a
writeRef :: (a \in s) \rightarrow a \rightarrow St s ()
```

**Figure 5.** The standard "state thread" API. We write  $a \in s$  to denote a reference cell of type a in the memory region named s. In Control.Monad.ST, we would write  $a \in s$  as STRef s a.

```
runSt2 :: (forall s s'. St (s \cap s') a) -> a
liftL :: St s a -> St (s \cap s') a
liftR :: St s' a -> St (s \cap s') a
share :: (a \in s) -> St s (a \in (s \cap s'))
use :: (a \in (s \cap s')) -> (a \in s)
symm :: (a \in (s \cap s')) -> (a \in (s' \cap s))
```

**Figure 6.** Extending the state thread API with shared references.

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```
stSharingDemo :: Bool
stSharingDemo = runSt2 $ do
  -- In the "left" memory region, create and return
 -- two references; one shared, and one not shared.
 (secret, ref) <- liftL $ do
      unshared <- newRef 42
      shared <- share =<< newRef 17</pre>
      return (unshared, shared)
 -- In the "right" memory region, mutate the shared
  -- reference. If we attempt to access the non-shared
  -- reference here, the program will not compile.
 liftR $ do
      let mine = use (symm ref)
      x <- readRef mine</pre>
      writeRef mine (x + 1)
 -- Back in the "left" memory region, verify that the
 -- unshared reference still holds its original value.
 liftL $ do
      check <- readRef secret</pre>
      return (check == 42)
```

**Figure 7.** An ST-style pure computation using local mutable references. Although the secret reference is in scope during the calculation in the "right" region, any attempted access will fail to compile.

In effect, runSt2 lets the user run a computation that makes use of two partially-overlapping memory regions. Within that computation, the user can run sub-computations bound to one or the other memory region. Furthermore, a sub-computation can move any variable that it owns into the common overlap via share. An example is shown in Figure 7, where one sub-computation creates two cells: one private, and the other shared. A second sub-computation has unconstrained access to the shared cell. Yet even though the private reference is also in scope during the second sub-computation, any attempts to access it there will fail to compile.

# 4 Case Study #3: Key-value Lookups

It is not uncommon to find algorithms based around keyvalue maps that rely on certain keys being present at critical moments. For example, an evaluator for well-scoped expressions may maintain a symbol table, subject to the invariant that any symbol found at an expression node should have a corresponding entry in the symbol table. It may be awkward to write "missing symbol" handlers into the expression evaluator—doubly so if the API was designed so that missing symbols are supposed to be impossible.

In this case study, we will see how to use the GDP concept to build an API where the user can express the thought "*this* key must be present in *that* map." In the process, we will vindicate some of those 2000 moments, forever enshrined on Hackage, where a programmer fell into the pit of despair and followed a map lookup by fromJust. Figure 8 gives a small, GDP-style API based on the author's justified-containers package<sup>2</sup>. The key features are:

- A predicate Key ks, meaning "belongs to the key set named ks." A value of type Key ks k is a value of type k, with a ghost proof that it is present in the key set named ks.
- A predicate JMap ks, meaning "has a key set named ks." A value of type JMap ks k v is a Map k v, with a key set named ks.
- The rank-2 withMap function, analogous to name, that attaches a ghostly key set to a map. This function encodes the notion that any map has *some* set of keys, perhaps not known to us at compile time.
- The member function. This function checks if a key is present in a map with key set ks and, if so, produces a ghost proof of that fact using Key ks.
- Finally, the function lookup. This function is total because the key carries a ghost proof that it is present in the map. As a result, lookup can safely return a v instead of a Maybe v, with no fear of run-time failure.

Note that proving a key can be found in a certain map does not mean it can *only* be found in that map! In Figure 9, we see that some evidence can be re-used: we can find the same key in a whole variety of maps.

## 4.1 Designing for the User's State of Knowledge

It is instructive to compare the two lookup types  $k \rightarrow Map k \vee -> Maybe \vee and Key ks k \rightarrow JMap ks k \vee -> \vee. We do not intend to claim that one of these is better than the other. Instead, the claim is much simpler: these two functions$ *reflect different expectations about the user's knowledge*.

If the user legitimately does not know whether or not a key is present, then the Maybe-returning lookup is entirely appropriate. The user's incomplete knowledge about the result of the operation is exactly reflected in the return type, so they will not feel inconvenienced by the need to handle both the Just v (key present) and Nothing (key absent) cases.

On the other hand, if the user already believes the key should be present based on some external evidence, then they will be happier writing a program that does not need to handle the impossible missing-key state. But to ensure safety, they must communicate that evidence to the library somehow; here, via the Key ks predicate.

# 4.2 Application: Well-formed Adjacency Lists

The power of this method becomes more apparent when considering maps where the values are expected to reference the keys in some way. Consider this simple adjacency representation for directed graphs that maps each vertex to its list of immediate neighbors:

## type Digraph v = Map v [v]

<sup>&</sup>lt;sup>2</sup>In fact, the GDP technique was developed in order to generalize the design of justified-containers to other domains, and to add flexibility for the end-user by providing a wider selection proof combinators.

```
newtype JMap ks k v = JMap (Map k v) deriving Functor
newtype Key ks k = Key k
instance The (JMap ks k v) (Map k v)
instance The (Key ks k) k
member :: k -> JMap ks k v -> Maybe (Key ks k)
lookup :: Key ks k -> JMap ks k v -> v
reinsert :: Key ks k -> v -> JMap ks k v -> v
withMap :: Map k v -> (forall ks. JMap ks k v -> t) -> t
```

**Figure 8.** A fragment of the API from justified-containers. The GDP-style predicates Key ks k and JMap ks k v are used to represent "a value of type k belonging to the set ks" and "a map with key set ks", respectively.

Well-formed Digraphs should satisfy the property that every vertex referenced in any neighbor list is also a valid key in the adjacency map.

Traditionally, graph APIs that use adjacency representations require well-formed graphs, but make it the user's responsibility to ensure well-formedness. For example, the Data.Graph API from containers has a constructor that will silently discard edges whose targets do not appear in the node list.

Our GDP-style API for maps gives us a vocabulary for translating the notion "a well-formed adjacency list" into a program invariant that can be checked by the compiler. We simply write what we mean: a well-formed adjacency map should map each vertex to a list of vertices that are keys of that *same* map. In other words:

#### type Digraph vs v = JMap vs v [Key vs v]

With the help of this type, a user can now enforce the invariant "this adjacency map must be well-formed" at compile time. A similar strategy can be used to eliminate a whole class of bugs when using symbol tables, evaluation contexts, database models, and or any other data structure based around a recursive key-value store.

#### 4.3 Changing the Key Set

But what about maps that are related, yet do not have exactly the same key sets? As a concrete example, consider the insert function. Although insert will usually modify the key set of a map, we still know quite a lot about the keys in the updated map. Imagine you were a user, in possession of a key and a proof that it is present in the original map. It would be quite frustrating if we were unable to use that same key freely in the expanded map! The library author, anticipating this need, should provide a proof combinator that converts a proof of "k is a valid key of m" into a proof of "k is a valid key of m."

To support this use-case, justified-containers provides the rank-2 function inserting:

```
test = Map.fromList [ (1, "Hello"), (2, "world!") ]
withMap test $ \table ->
  case member 1 table of
   Nothing -> putStrLn "Missing key!"
   Just key -> do
    let table' = reinsert key "Howdy" table
      table'' = fmap (map upper) table
      putStrLn ("Value in map 1: " ++ lookup key table)
      putStrLn ("Value in map 2: " ++ lookup key table')
      putStrLn ("Value in map 3: " ++ lookup key table')
      putStrLn ("Value in map 3: " ++ lookup key table')
      putStrLn ("Value in map 3: " ++ lookup key table')
```

**Figure 9.** A usage example for the API in Figure 8. The member function is used to check if a key is present in table; within the scope of the Just case, key carries a phantom proof of its presence in table. The same phantom proof can also be used as evidence that key is present certain other maps as well, such as table' (table with a value changed) and table'' (table modified by fmap).

Since insertion results in a map with a new key set, we must introduce the ghost of this new key set inside another forall. But what are the other parameters being passed to the continuation? They form a collection of evidence and proof combinators that the user may need to formulate a safety argument. Concretely, the continuation has access to:

- 1. The updated map, of type JMap ks' k v. The phantom type ks' represents the key set ks, updated with the newly-inserted key.
- 2. A function that represents the inclusion of ks into ks'. The user can apply this function to convert a proof that a certain key belonged to the old map (a value of type Key ks k) into a proof that the key also belongs to the new map (a value of type Key ks' k).
- 3. Evidence that the inserted key is present in the new key set.

The library author must perform a balancing act here. They should give the user an ample supply of evidence and proof combinators to support the user's arguments, but just what and how much? For example, the user may well want to argue that a every key *other* than the new one is also present in the original map, but the API provides no straightforward way to do this. It is also somewhat awkward to introduce yet *another* rank-2 function to the API.

```
-- Type exported, constructor hidden (but see `axiom`)
data Proof p = QED
-- Attaching proofs to values
newtype a ::: p = SuchThat a
(...) :: a -> Proof p -> (a ::: p)
x ...proof = coerce x
-- Logical constants. We can use empty data declarations,
-- because these types are only used as phantoms.
data TRUE
data EALSE
data p && q
data p || q
data p --> q
data Not p
data p == q
-- Natural deduction rules (implementations all
-- ignore parameters and return `QED`)
andIntro
         :: Proof p -> Proof q -> Proof (p && q)
andElimL :: Proof (p && q)
                                  -> Proof p
orIntroL :: Proof p
                                   -> Proof (p || q)
implIntro :: (Proof p -> Proof q) -> Proof (p --> q)
implElim :: Proof (p --> q) -> Proof p -> Proof q
notIntro :: (Proof p -> Proof FALSE) -> Proof (Not p)
contradicts :: Proof p -> Proof (Not p) -> Proof FALSE
absurd
          :: Proof FALSE
                                       -> Proof p
ref]
          :: Proof (x == x)
        -- ... and many more
-- Exported function that allows library authors to
-- assert arbitrary axioms about their API.
axiom :: Proof p
axiom = QED
```

**Figure 10.** Basic constants and functions for building up the "proofs" in "ghosts of departed proofs".

In the final case study, we will investigate how the library author can separate API functions from the lemmas *about* those functions, and in the process remove the need for some of these additional rank-2 functions.

## 5 Case Study #4: Arbitrary Invariants

In the previous case studies, we saw how introducing names and predicates can help us develop safe APIs that allow the user to express correctness proofs. However, there are a few aspects that remained awkward.

First, we have several ways that a name-like entity could be introduced: either via the name operator itself, or through other library-defined rank-2 functions like runSt2, withMap, or inserting. It would be nice if the same mechanism could be used for all of these cases. Second, we made extensive use of ghostly proofs carried by phantom type parameters. But these phantom types needed something to attach to, so we introduced various domainspecific newtype wrappers (SortedBy,  $\in$ , JMap). Each library exported its own idiosyncratic proof combinators for working with its newtype wrappers. It would be better to have a uniform mechanism for expressing, carrying, and manipulating these proofs.

In this case study, we will consider what kind of APIs we could write if we separated type-level names from the constraints we want to place on the named values. For example, let us return to the head function. We want to ensure that the user only calls head on a list xs with outer constructor (:) ("cons"). To express this condition, we introduce one more newtype wrapper, written ::: and pronounced "such that". Altogether, the phrase (a ~~ n ::: p) should be read "a value of type a, named n, such that condition p holds."

We can now write, very explicitly, the requirement that our library places on the user of head: the parameter, called xs, must have outermost constructor (:). So we simply introduce a predicate IsCons using an empty datatype, and write down the definition of a GDP-style head:

```
data IsNil xs
data IsCons xs
head :: ([a] ~~ xs ::: IsCons xs) -> a
```

```
head xs = Prelude.head (the xs)
```

The (:::) type is similar to the Refined type from the refinement library [20], but it gains extra power when used together with names: names are the mechanism that allows us to take predicates about *specific* values and encode them at the type level. The type ([a] ~~ xs ::: IsCons xs) becomes a statement about the particular list being passed to head. The library user is now free to come up with a proof of IsCons xs in whatever way they please.

#### 5.1 Logical Combinators for Ghostly Proofs

We now have a mechanism for encoding arbitrary properties as phantom types. But how will the user create ghostly proofs to inhabit those phantom types? We can begin with a very simple Proof type, sporting a single phantom type parameter and exactly one non-bottom value:

## data Proof p = QED

From this humble beginning, we can encode all of the rules of natural deduction as functions that produce terms of type Proof p. Figure 10 gives a small taste of the basic syntax and encoded deduction rules.

Once we have constructed a proof of type Proof p, we can use the (...) combinator to attach that proof to a value of type a, producing a value of type (a ::: p). Note that p will often be a proof *about* the wrapped value, but that is not required! Any value can carry any proof; the only thing that links value to proof is the use of a common name.

#### 5.2 Naming Library Functions

To help the user create domain-relevant proofs, a library author may wish to export a lemma such as "reversing a list twice gives the original list". To express this idea, it is not sufficient to have a name for "the original list". We must also be able to name some of the library's functions. This observation motivates an extension to the Named module (Figure 2), adding these three items:

```
-- module Named, continued:
data Defn = Defn -- Type exported, constructor hidden.
```

```
-- A constraint synonym that is expected to only be
```

```
-- available in the module where `f` is defined.
```

type Defining f = (Coercible Defn f, Coercible f Defn)

```
-- Allow library authors to define introduction rules for
-- names that they have defined. The coercion is only
-- possible since this function is in the Named module.
defn :: Defining f => a -> (a ~~ f)
defn = coerce
```

The idea is that a library author can introduce a new name X by defining X as a newtype alias of Defn. If the library author does not export the constructor of X, then the constraint Defining X *only* holds in the module where X was defined. It follows that the defn function can be used to attach the name X to an arbitrary value, but *only* in the module where X was defined. By exporting defn with the Defining f constraint, the Named module allows library authors to introduce new names and axioms, while *users* remain safely restrained.

How does the library author use this mechanism to introduce new names and axioms in practice? In the case of the list-reversing lemma, the author can write:

newtype Rev xs = Rev Defn

```
reverse :: ([a] ~~ xs) -> ([a] ~~ Rev xs)
reverse xs = defn (Prelude.reverse (the xs))
```

```
rev_rev :: Proof (Rev (Rev xs) == xs)
rev_rev = axiom
```

Note that, in contrast with inserting from the previous case study, the lemmas *about* a function stand on their own. The library author can add any number of lemmas about reverse without modifying its signature. Furthermore, it also becomes easy to create lemmas that relate multiple functions, such as rev\_length and rev\_cons in Figure 11. A sample of client code for this library appears in Figure 12, where the user defines a dot product function that only can be applied to same-sized lists. The user then supplies evidence to convince the compiler that the dot product of a list with its reverse is legal.

**On the safety of defn** It is instructive to momentarily return to the "Simon" example of Section 2.4. Isn't defn as bad as any\_name? There is certainly a danger, but only for the

```
-- API functions
```

```
reverse :: ([a] ~~ xs) -> ([a] ~~ Rev xs)
reverse xs = defn (Prelude.reverse (the xs))
```

length :: ([a] ~~ xs) -> (Int ~~ Length xs)
length xs = defn (Prelude.length (the xs))

```
zipWith :: (a -> b -> c)
    -> ([a] ~~ xs ::: Length xs == n)
    -> ([b] ~~ ys ::: Length ys == n)
    -> [c]
zipWith f xs ys = Prelude.zipWith f (the xs) (the ys)
```

```
-- Names for API functions
```

newtype Length xs = Length Defn

```
newtype Rev xs = Rev Defn
```

```
classify :: ([a] ~~ xs) -> ListCase a xs
classify xs = case the xs of
  (_:_) -> IsCons axiom
  [] -> IsNil axiom
```

**Figure 11.** A GDP-style module for manipulating and reasoning about lists. A variety of lemmas are exported by the module, to provide the user with a rich set of building blocks for constructing safety proofs.

library *author* who must be very careful indeed about how Simon is introduced. The library *users* are still unable to name arbitrary values "Simon" merely by using defn, because they do not possess the necessary Defining Simon constraint.

#### 5.3 Building Theory Libraries

In both the St and the justified-containers case studies, the library author exported proof combinators that encoded basic facts about the algebra of sets. Such redundancy is undesirable for the library authors, who have to spend more time writing and testing, but also for the end user who has to remember dozens of variations on the same basic proof combinators.

Luckily, it is simple to factor out axioms and deduction rules for specific theories from the libraries that make use of them. For example, we could publish a small library containing basic predicates and deduction rules about sets, such as:

```
dot :: ([Double] ~~ vec1 ::: Length vec1 == n)
    -> ([Double] ~~ vec2 ::: Length vec2 == n)
    -> Double
dot vec1 vec2 = sum (zipWith (*) vec1 vec2)
-- Compute the dot product of a list with its reverse.
dot_rev :: [Double] -> Double
dot_rev xs = name xs $ \vec ->
    dot (vec ...refl) (reverse vec ...rev_length)
```

**Figure 12.** A user-defined dot product function that can only be used on same-sized lists, and a usage example. In the implementation of dot\_rev, the user makes the use of dot well-typed by expressing a proof that vec and reverse vec have the same length. Note that ref1 and rev\_length are effectively axiom schemas, and unification with the type of dot selects the correct instances of these schemas.

```
data xs \subseteq ys
subset_tr :: Proof (a \subseteq b) -> Proof (b \subseteq c) -> Proof (a \subseteq c)
subset_tr _ _ = axiom
```

This same theory library could be used to reason about shared St regions and about key sets for maps, already achieving code reuse within the narrow confines of this paper's examples.

An extra level of confidence can be obtained by splitting the theory library into Assumed and Derived submodules.<sup>3</sup> A small, core set of axioms are placed in the Assumed module and carefully audited for correctness. A larger set of lemmas, derived from these axioms using GDP proof combinators, reside in the Derived submodule. This separation allows the library author to build up a large collection of lemmas from a small—and hopefully easy-to-verify—set of basic axioms.

#### 5.4 Ghosts on the Outside, Proofs on the Inside

Factoring common lemmas into theory modules helps ensure that the module exports give a sound model of the structure they are describing. The author only needs to check the validity of their own theory module; others can then re-use that validation for free.

But how can the author of a theory library be confident that they wrote down the correct lemmas in the first place? To increase confidence, the author of the theory library can apply formal verification tools like Liquid Haskell [19] or hs-to-coq [16], attempting to prove that the library presents a sound API. Note that the tooling is only required by the author of the library; the end-users of the theory library still use plain Haskell. A simple demonstration using Liquid Haskell can be found in this paper's repository [13]. Haskell '18, September 27-28, 2018, St. Louis, MO, USA

proof1, proof2 :: Proof ((p --> q) --> (Not q --> Not p))

```
proof1 =
    implIntro $ \p2q ->
    implIntro $ \notq ->
        notIntro $ \p ->
        (implElim p2q p) `contradicts` notq
```

```
proof2 = tableaux
```

**Figure 13.** Proving the same theorem in two different ways. The first proof uses the proof combinators from Figure 10. The second proof uses a typechecker plugin, exposed through the tableaux function (Section 5.5).

## 5.5 Building Custom Proof Tactics

For simple properties, the task of writing a proof is not too difficult. But for more sophisticated properties, the deployment of *proof tactics* becomes crucial. A proof tactic is a search strategy for proofs, usually targeted at proving one particular class of theorems. For example, the Coq tactic omega is useful for proving theorems about arithmetic, while simpl is useful for simplifying a complex goal.

Tactics are often designed with a specific domain in mind; to be most useful, theory creators (and library authors) should be able to create their own tactics when needed.

One approach to providing custom tactics is to leverage GHC's support for *type-checker plugins*. These plugins hook into GHC's OutsideIn(X) inference algorithm [21], teaching it to solve new kinds of type constraints.

As a proof-of-concept, we developed a simple typechecker plugin that implements proof by analytic tableaux [15] for propositional logic. This tactic can verify the satisfiability of any valid formula of propositional logic; the naïve implementation takes about 60 lines of Haskell, plus 150 lines of glue code to mediate between the tableaux solver and GHC.

To trigger the custom tactic, we introduce an empty injective type family [17]—hidden from the user—and a single exported function tableaux:

```
type family ProofByTableaux p = p' | p' -> p
tableaux :: ProofByTableaux p
tableaux = error "proof by analytic tableaux."
```

Morally, we want to think of ProofByTableaux p as an alias for p. The trick is that our plugin will first get a chance to check that the proposition p is a valid formula of propositional logic. Only then will the plugin allow GHC to replace ProofByTableaux p with p.

For the user, the effect appears to be that tableaux can act as a value of type Proof p whenever p is a valid formula in propositional logic. A glance at Figure 13 demonstrates why proof tactics are so desirable: the user can just wave their hands and say "this is true by basic facts from propositional logic," instead of constructing a tedious proof by hand.

<sup>&</sup>lt;sup>3</sup>We only have "confidence"—not "surety"—because, after all, Haskell's type system *is* inconsistent as a logic. That does not render it useless for the evidence-pushing we need for GDP, however!

```
head :: Fact (IsCons xs) => ([a] ~~ xs) -> a
head xs = Prelude.head (the xs)
```

```
gdpEndpts' = do
putStrLn "Enter a non-empty list of integers:"
xs <- readLn
name xs $ \xs -> case classify' xs of
Cons -> using rev_cons xs $
return (head xs, head (reverse xs))
Nil -> gdpEndpts'
```

**Figure 14.** The original example from Figure 1, using reflection to implicitly propagate Proofs to their use-sites.

#### 5.6 Using Reflection to Pass Implicit Proofs

The reflection library is an implementation of Kiselyov and Shan's functional pearl about implicit configurations [7], allowing the user to pass values implicitly using Haskell's typeclass machinery. We can combine reflection with GDP in order to pass *proofs* implicitly, so they seem to apparate out of thin air just when they are needed. The relevant part of the reflection API consists of two functions: give lets the user make a proof implicit, and given recalls an implicit proof from the current context:

type Fact p = Given (Proof p) -- a useful constraint synonym
give :: Proof a -> (Fact a => t) -> t
given :: Fact a => Proof a

To make this approach practical, we also need some way to apply implications to facts in the current implicit context. Since the implications will generally be name-polymorphic, it can be slightly tricky to apply an implication to a *specific* fact. When the antecedent of the implication is a simple predicate, we can make use of a combinator such as this:

```
using :: Fact (p n) =>
   (Proof (p n) -> Proof q) -> (a ~~ n) -> (Fact q => t) -> t
using impl x = give (impl given)
```

The named parameter  $x :: a \sim n$  is used to help select the right proof from the context.

We now are able to reflect proofs manually, but can we make the process more automatic? For example, could we automatically introduce Fact (IsCons xs) to the implicit context inside the cons branch of a pattern-match? Yes, indeed; pattern-matching on a GADT constructor can bring new constraints into scope:

```
data ListCase' a xs where
  Cons :: Fact (IsCons xs) => ListCase' a xs
  Nil :: Fact (IsNil xs) => ListCase' a xs
  classify' :: forall a xs. ([a] ~~ xs) -> ListCase' a xs
  classify' xs = case the xs of
  (_:_) -> give (axiom :: Proof (IsCons xs)) Cons
  [] -> give (axiom :: Proof (IsNil xs)) Nil
```

Figure 14 combines these simple ingredients to create a reflection-based version of the original GDP example from Figure 1. Comparing the two examples side-by-side, the use of reflection with GDP seems to offer a substantial improvement to user ergonomics. On the other hand, there is a small amount of run-time overhead due to the passing of typeclass dictionaries for Facts, and it is not always easy to extract the right proof from the implicit context without adding type annotations.

# 6 Related Work

Phantom type parameters have several well-known applications in API design, supporting typed embedded domainspecific languages (EDSLs) [12], pointer subtyping [11], and access control policies [5]. Most of these applications rely on monomorphic or universally-quantified phantom type parameters; by contrast, GDP relies on existentially-quantified phantom names, and a rich, extensible set of combinators for building arguments about the named values.

Previous designs that use existentially-quantified phantom types include *lazy state threads* [9] and *lightweight static capabilities* [8]. The GDP approach explicitly separates two orthogonal concerns within these designs: the introduction of existentially-quantified type-level names, and the manipulation of proofs about those named values.

There are a variety of other approaches to checking the correctness of Haskell code. Liquid Haskell works with an SMT solver to verify certain classes of properties about Haskell functions [19]. hs-to-coq converts Haskell code to Coq code, allowing theorems to be proved within the Coq proof assistant [16]. In both cases, the properties and proofs exist outside of (or in parallel to) the existing Haskell code. In the GDP approach, properties and proofs are carried by normal Haskell types and are checked by compilation.

# 7 Summary

Ghosts of Departed Proofs provides a novel approach to safe API design that enables a dialogue between the library and the user. By giving the user a vocabulary for expressing safety arguments, GDP-style APIs avoid the need for partial functions or optional returns. Using this approach, we are able to achieve many of the benefits of dependent types and refinement types, while only requiring mild and well-known extensions to Haskell 2010. You can try it with your own libraries, today!

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