Generalizing Generalized Tries

RALF HINZE

Institut für Informatik III, Universität Bonn Römerstraße 164, 53117 Bonn, Germany (e-mail: ralf@informatik.uni-bonn.de)

Abstract

A trie is a search tree scheme that employs the structure of search keys to organize information. Tries were originally devised as a means to represent a collection of records indexed by strings over a fixed alphabet. Based on work by C.P. Wadsworth and others, R.H. Connelly and F.L. Morris generalized the concept to permit indexing by elements built according to an arbitrary signature. Here we go one step further and define tries and operations on tries generically for arbitrary datatypes of first-order kind, including parameterized and nested datatypes. The derivation employs techniques recently developed in the context of polytypic programming and can be regarded as a comprehensive case study in this new programming paradigm. It is well known that for the implementation of generalized tries nested datatypes and polymorphic recursion are needed. Implementing tries for first-order kinded datatypes places even greater demands on the type system: it requires rank-2 type signatures and second-order nested datatypes. Despite these requirements the definition of tries is surprisingly simple, which is mostly due to the framework of polytypic programming.

All generalizations are dangerous, even this one.

— Alexandre Dumas

1 Introduction

The concept of a trie was introduced by A. Thue in 1912 as a means to represent a set of strings, see D.E. Knuth (1998). In its simplest form a trie is a multiway branching tree where each edge is labelled with a character. For ex-

ample, the set of strings {ear, earl, east, easy, eye} is represented by the trie depicted on the right. Searching in a trie starts at the root and proceeds by traversing the edge that matches the first character, then traversing the edge that matches the second character, and so forth. The search key is a member of the represented set if the search stops in a node that is marked—marked nodes are drawn as filled circles on the right. Tries can also be used to represent finite maps. In this case marked nodes additionally contain values associated with the strings. Interestingly,

the move from sets to finite maps is not a mere variation of the scheme. As we shall see it is essential for the further development.

On a more abstract level a trie itself can be seen as a composition of finite maps. Each collection of edges descending from the same node constitutes a finite map sending a character to a trie. With this interpretation in mind it is relatively straightforward to devise an implementation of string-indexed tries. For concreteness, programs will be given in the functional programming language Haskell 98 (Peyton Jones and Hughes, 1999). If strings are defined by the following datatype

```
\mathbf{data} \ Str = Nil \mid Cons \ Char \ Str,
```

we can represent string-indexed tries with associated values of type v as follows.

```
\mathbf{data} \ \mathit{MapStr} \ v = \mathit{TrieStr} \ (\mathit{Maybe} \ v) \ (\mathit{MapChar} \ (\mathit{MapStr} \ v))
\mathbf{data} \ \mathit{Maybe} \ v = \mathit{Nothing} \mid \mathit{Just} \ v
```

The first component of the constructor TrieStr contains the value associated with Nil. Its type is $Maybe\ v$ instead of v since Nil may not be in the domain of the finite map represented by the trie. In this case the first component equals Nothing. The second component corresponds to the edge map. To keep the example manageable we implement MapChar using association lists (note that in Haskell $List\ t$ is written [t]).

```
\begin{array}{lll} \textbf{type} \; \textit{MapChar} \; v & = \; \textit{List} \; (\textit{Char}, v) \\ lookup\textit{Char} \; & :: \; \; \textit{Char} \; \rightarrow \textit{MapChar} \; v \; \rightarrow v \\ lookup\textit{Char} \; c \; [] \; & = \; \textit{error} \; \text{"not found"} \\ lookup\textit{Char} \; c \; ((c', v) : x) \; & = \; \textbf{if} \; c = = c' \; \textbf{then} \; v \; \textbf{else} \; lookup\textit{Char} \; c \; x \end{array}
```

Building upon lookupChar we can define a look-up function for strings. To lookup the empty string we access the first component of the trie. To lookup a non-empty string, say, $Cons\ c\ s$ we lookup c in the edge map obtaining a trie, which is then recursively searched for s.

If the key is not in the domain of the finite map, a run-time error is raised. This will be remedied later.

Based on work by C.P. Wadsworth and others, R.H. Connelly and F.L. Morris (1995) have generalized the concept of a trie to permit indexing by elements built according to an arbitrary signature, that is, by elements of an arbitrary non-parameterized datatype. The definition of lookupStr already gives a clue what a suitable generalization might look like: the trie TrieStr tn tc contains a finite map for each constructor of the datatype Str; to lookup Cons c s the look-up functions for the components, c and s, are simply composed. Generally, if we have a datatype with k constructors, the corresponding trie has k components. To lookup a con-

structor with n fields, we must select the corresponding finite map and compose n look-up functions of the appropriate types. If a constructor has no fields such as Nil, we extract the associated value using value. Note that a nullary constructor of type T can be viewed as a function of type $() \to T$. Consequently, the type constructor Maybe can be seen as implementing finite maps over the unit datatype () with value as its look-up function.

As a second example, consider the datatype of external search trees.

```
data Bin = Leaf Str | Node Bin Char Bin
```

A trie for external search trees represents a finite map from Bin to some value type v. It is an element of MapBin v given by

```
\mathbf{data} \ \mathit{MapBin} \ v = \ \mathit{TrieBin} \ (\mathit{MapStr} \ v) \\ (\mathit{MapBin} \ (\mathit{MapChar} \ (\mathit{MapBin} \ v))) \ .
```

The type MapBin is an instance of a so-called $nested\ datatype\ (nest\ for\ short)$. The term 'nested datatype' has been coined by R. Bird and L. Meertens (1998) and characterizes parameterized datatypes whose definition involves 'recursive calls'— $MapBin\ (MapChar\ (MapBin\ v))$ in the example above—that are substitution instances of the defined type. Functions operating on nested datatypes are known to require a non-schematic form of recursion, called $polymorphic\ recursion\ (Mycroft, 1984)$. The look-up function on external search trees may serve as an example.

```
\begin{array}{lll} lookupBin & :: & Bin \to MapBin \ v \to v \\ lookupBin \ (Leaf \ s) \ (TrieBin \ tl \ tn) & = \ lookupStr \ s \ tl \\ lookupBin \ (Node \ \ell \ c \ r) \ (TrieBin \ tl \ tn) \\ & = \ (lookupBin \ r \circ lookupChar \ c \circ lookupBin \ \ell) \ tn \end{array}
```

Looking up a node involves two recursive calls. The second, $lookupBin \ \ell$, is of type $Bin \rightarrow MapBin \ (MapChar \ (MapBin \ v)) \rightarrow MapChar \ (MapBin \ v)$, which is a substitution instance of the declared type. Haskell 98 allows polymorphic recursion only if an explicit type signature is provided for the function(s). The rationale behind this restriction is that type inference in the presence of polymorphic recursion is undecidable (Henglein, 1993).

It is absolutely necessary that MapBin and lookupBin are parametric with respect to the codomain of the finite maps. Had we restricted the type of lookupBin to $Bin \to MapBin \ V \to V$ for some fixed type V, the definition would have no longer type-checked. This also explains why the construction does not work for the finite set abstraction.

Remark 1

Looking up a constructed value boils down to composing look-up functions. Interestingly, the order of composition is completely arbitrary: we are free to use either textual order or reverse textual order. For instance, MapStr and lookupStr can

alternatively be defined by

```
\begin{array}{lll} \mathbf{data} \ \mathit{MapStr} \ v & = & \mathit{TrieStr} \ (\mathit{Maybe} \ v) \ (\mathit{MapStr} \ (\mathit{MapChar} \ v)) \\ lookupStr \ \mathit{Nil} \ (\mathit{TrieStr} \ tn \ tc) & = & \mathit{value} \ tn \\ lookupStr \ (\mathit{Cons} \ c \ s) \ (\mathit{TrieStr} \ tn \ tc) & = & (lookupChar \ c \circ lookupStr \ s) \ tc \ . \end{array}
```

These definitions employ reverse textual order—s is looked up first and then c—and correspond to the textual order implementation of tries for 'snoc' strings given by **data** $Rts = Lin \mid Snoc \ Rts \ Char$. That said, it becomes clear that both orders must work equally well. As an aside, note that MapStr is now a nested datatype and lookupStr requires polymorphic recursion.

From the discussion above it should be clear how to define tries for arbitrary non-parameterized datatypes. In this paper we go one step further and show how to generalize the concept to arbitrary datatypes of first-order kind, including parameterized and nested datatypes. Note that a datatype of first-order kind may be parameterized by types but not by type constructors. In the sequel the qualifier 'of first-order kind' will usually be omitted. Now, we are particularly interested in giving a compositional definition of tries. Let us briefly discuss what we mean by 'compositional'. In Haskell strings are represented as lists of characters: $String = List\ Char$. This suggests that tries for strings should be compositionally defined in terms of tries for lists and tries for characters: $MapString = MapList\ MapChar$. Since List is a function on types (a so-called functor), MapList is consequently a function on tries—or rather, on trie types (a so-called higher-order functor). A note on terminology: though MapList is a function, we often refer to MapList simply as a trie just like List is often referred to as a type.

In generalizing tries to type constructors we will answer in particular the intriguing question what the generalized trie of a nested datatype looks like. This question is not only of theoretical but also of practical interest since a number of data structures, such as 2-3 trees or red-black trees, have recently been shown to be expressible by nested declarations. R. Bird and R. Paterson (1999) use a nested datatype for expressing de Bruijn notation. Now, if a look-up structure for de Bruijn terms is required, say, to implement common subexpression elimination, we are confronted with the problem of constructing generalized tries for a nested datatype (the solution to this problem will be presented in Section 5).

To develop generalized tries we will employ the framework of polytypic programming. In fact, the following can be regarded as a comprehensive case study in this new programming paradigm. Briefly, a polytypic or generic function is one that is defined by induction on the structure of types. A simple example for a polytypic function is $encode: T \to [Bit]$, which encodes an element of type T as a bit string. The function encode can sensibly be defined for each type and it is usually a tiresome, routine matter to do so. A polytypic programming language enables the user to program encode once and for all times. The specialization of encode to concrete instances of T is then handled automatically by the system. Polytypic programming can be surprisingly simple. In a companion paper (Hinze, 1999b) we show that it

suffices to define a polytypic function on predefined types, sums, and products. This information is sufficient to specialize a polytypic function to arbitrary datatypes, including mutually recursive, parameterized, and nested datatypes.

Generalized tries make a particularly interesting application of polytypic programming. The central insight is that a trie can be considered as a type-indexed datatype. This makes it possible to define tries and operations on tries generically for arbitrary datatypes. We already have the necessary prerequisites at hand: we know how to define tries for sums and for products. A trie for a sum is a product of tries and a trie for a product is a composition of tries. The extension to arbitrary datatypes is then uniquely defined. Mathematically speaking, generalized tries are based on the following isomorphisms.

$$(k_1 + k_2) \rightarrow_{\text{fin}} v \cong (k_1 \rightarrow_{\text{fin}} v) \times (k_2 \rightarrow_{\text{fin}} v)$$
$$(k_1 \times k_2) \rightarrow_{\text{fin}} v \cong k_1 \rightarrow_{\text{fin}} (k_2 \rightarrow_{\text{fin}} v)$$

Here, $k \to_{\text{fin}} v$ denotes the set of all finite maps from k to v. Note that $k \to_{\text{fin}} v$ is sometimes written $v^{[k]}$, which explains why these equations are also known as the 'laws of exponentials'.

We have seen that nested datatypes and polymorphic recursion are necessary for the implementation of generalized tries. Implementing tries for datatypes of first-order kind, especially nested datatypes, places even greater demands on the type system: it requires rank-2 type signatures (McCracken, 1984), datatypes of second-order kind (Jones, 1995), and second-order nests. Since Haskell 98 does not offer rank-2 types, we will give the examples in an ideal, Haskell-like language. In particular, we will write polymorphic types using explicit universal quantifiers. The simple changes necessary to make the examples run under GHC (GHC Team, 1999) or Hugs 98 (Jones and Peterson, 1999) are given at the end of Section 5.

The rest of this paper is structured as follows. In Section 2 we briefly review the theoretical background of polytypic programming. A more detailed account is given in the companion paper (Hinze, 1999b). Section 3 applies the technique to implement a finite map abstraction based on generalized tries. Section 4 discusses variations on the theme. Generalized tries for de Bruijn terms are presented in Section 5. Finally, Section 6 reviews related work and points out a direction for future work.

2 A polytypic programming primer

2.1 Datatypes

A polytypic function is one that is parameterized by datatype. The polytypic programming primer therefore starts with a brief investigation of the structure of types.

The following definitions will serve as running examples throughout the paper.

The meaning of these datatypes in a nutshell: the first equation defines the ubiquitous datatype of lists; *Bintree* encompasses external binary search trees. The types *Perfect* and *Sequ* are examples for nested datatypes: *Perfect* comprises perfectly balanced, binary leaf trees (Hinze, 1999a) and *Sequ* implements binary random-access lists (Okasaki, 1998). Both definitions make use of the auxiliary datatype *Fork* whose elements may be interpreted as internal nodes.

Haskell's **data** construct combines several features in a single coherent form: sums, products, and recursion. Using more conventional notation ('+' for sums and 'x' for products) and omitting constructor names we obtain the following emaciated recursion equations.

```
List a = 1 + a \times List \ a

Bintree a_1 \ a_2 = a_1 + Bintree \ a_1 \ a_2 \times a_2 \times Bintree \ a_1 \ a_2

Fork a = a \times a

Perfect a = a + Perfect \ (Fork \ a)

Sequ a = 1 + Sequ \ (Fork \ a) + a \times Sequ \ (Fork \ a)
```

In the following we treat 1, '+', and ' \times ' as if they were given by the following datatype declarations (note that in Haskell 1 and ' \times ' have an extra element, \perp , which we simply ignore).

```
data 1 = ()

data a_1 + a_2 = Inl \ a_1 \mid Inr \ a_2

data a_1 \times a_2 = (a_1, a_2)
```

Now, the central idea of polytypic programming is that the set of all types—or rather, the set of all type expressions—itself can be modelled by a datatype. Assuming a fixed set of primitive type constructors $\{1, Int, +, \times\}$ type expressions can be seen as being defined by the following grammar (which is akin to a **data** declaration except that the latter does not allow to use '1', '+', and ' \times ' as constructor names).

$$T ::= 1 \mid Int \mid (T + T) \mid (T \times T)$$

In the sequel we let t range over type expressions and we agree upon that '×' binds more tightly than '+'.

The question remains how recursive types are modelled. The answer probably comes as no surprise to the experienced Haskell programmer: recursive types are modelled by infinite type expressions! Figure 1 displays the infinite type expressions.



Fig. 1. Types interpreted as infinite type expressions.

sions List Int and Perfect Int in a tree-like form. The expressions are obtained by unrolling the equations for List and Perfect ad infinitum. The recursion equations above can be regarded as defining functions over type expressions. Note that List Int is a rational tree while Perfect Int is an algebraic tree. A rational tree is a possibly infinite tree that has only a finite number of subtrees. Algebraic trees are obtained as solutions of so-called algebraic equations (Courcelle, 1983), which are akin to datatype declarations. In general, we obtain rational trees for regular types such as List, Bintree, and Fork and algebraic trees for nested types such as Perfect and Sequ.

2.2 Polytypic definitions

A polytypic value is defined by induction on the structure of type expressions. In general, the definition takes the following form.

```
\begin{array}{cccc} poly\langle a\rangle & :: & \tau\langle a\rangle \\ poly\langle 1\rangle & = & poly_1 \\ poly\langle Int\rangle & = & poly_{Int} \\ poly\langle a_1+a_2\rangle & = & poly_+ \left(poly\langle a_1\rangle, poly\langle a_2\rangle\right) \\ poly\langle a_1\times a_2\rangle & = & poly_\times \left(poly\langle a_1\rangle, poly\langle a_2\rangle\right) \end{array}
```

Here, poly is the name of the polytypic value; a, a_1 , and a_2 are type variables; τ , $poly_1$, $poly_{Int}$, $poly_+$, and $poly_{\times}$ are the ingredients that have to be supplied by the polytypic programmer. The type of $poly\langle a\rangle$ is given by the type scheme $\tau\langle a\rangle$, which may contain function types and universally quantified types. Note that type parameters are always written in angle brackets to distinguish them from ordinary value parameters.

Example 1

List Int

The function $encode\langle a \rangle$, which encodes elements of type a as bit strings implementing a simple form of data compression (Jansson and Jeuring, 1999), can be defined

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as follows.

```
\begin{array}{lll} \mathbf{data} \; Bit & = & 0 \mid 1 \\ encode \langle a \rangle & :: & a \rightarrow [Bit] \\ encode \langle 1 \rangle \; x & = & [] \\ encode \langle Int \rangle \; x & = & encode Int \; x \\ encode \langle a_1 + a_2 \rangle \; (Inl \; x_1) & = & 0 : encode \langle a_1 \rangle \; x_1 \\ encode \langle a_1 + a_2 \rangle \; (Inr \; x_2) & = & 1 : encode \langle a_2 \rangle \; x_2 \\ encode \langle a_1 \times a_2 \rangle \; (x_1, x_2) & = & encode \langle a_1 \rangle \; x_1 \; + \; encode \langle a_2 \rangle \; x_2 \end{array}
```

To encode the single element of the unit type no bits are required. Integers are encoded using the primitive function encodeInt, whose existence we assume. To encode an element of a sum we emit one bit for the constructor followed by the encoding of its argument. Finally, the encoding of a pair is given by the concatenation of the component's encodings. The code above implicitly defines the type scheme $\tau\langle a\rangle = a \rightarrow [Bit]$ and the functions $encode_1$, $encode_{Int}$, $encode_+$, and $encode_\times$.

```
\begin{array}{lll} encode_1 & = & \lambda x \rightarrow [\,] \\ encode_{Int} & = & \lambda x \rightarrow encodeInt \ x \\ encode_+ \ (\varphi_1, \varphi_2) & = & \lambda x \rightarrow \mathbf{case} \ x \ \mathbf{of} \ \{\mathit{Inl} \ x_1 \rightarrow \mathtt{0} : \varphi_1 \ x_1; \mathit{Inr} \ x_2 \rightarrow \mathtt{1} : \varphi_2 \ x_2 \,\} \\ encode_\times \ (\varphi_1, \varphi_2) & = & \lambda x \rightarrow \varphi_1 \ (\mathit{fst} \ x) \ +\!\!\!+ \varphi_2 \ (\mathit{snd} \ x) \ \Box \end{array}
```

The inductive definition of poly induces a unique function $poly\langle t\rangle$ for each type expression t (Courcelle, 1983). Of course, since t may be infinite—and usually is—we require that types are interpreted by complete partial orders and functions by continuous functions between them. Both conditions are met since types and functions are given by Haskell programs, which are interpreted in these domains.

The use of infinite type expressions as index sets for polytypic values distinguishes our approach from previous ones that are based on the initial algebra semantics of datatypes (Jeuring and Jansson, 1996; Jansson and Jeuring, 1997). Briefly, our approach has two major advantages: it is simpler (the programmer must consider fewer cases) and it is more general (it covers all datatypes of first-order kind). As an aside, note that our approach also allows to define polytypic values that are indexed by type constructors rather than types. The archetypical example for such a function is $size\langle f \rangle :: \forall a.f \ a \to Int$, which counts the number of values of type a in a given structure of type f a. Further details can be found in the companion paper (Hinze, 1999b).

2.3 Specializing polytypic definitions

The main purpose of a polytypic programming system is to specialize a polytypic value $poly\langle t\rangle$ for different instances of t. Unfortunately, the specialization cannot be based on the inductive definition of poly—at least, not directly. Consider the following attempt to specialize $encode\langle Perfect\ Int\rangle$:

```
encode\langle Perfect\ Int\rangle
= encode\langle Int + Perfect\ (Fork\ Int)\rangle
```

```
= encode_+ (encode_{Int}, encode\langle Perfect\ (Fork\ Int)\rangle)

= encode_+ (encode_{Int}, encode\langle Fork\ Int + Perfect\ (Fork^2\ Int)\rangle)

= encode_+ (encode_{Int}, encode_+ (encode\langle Fork\ Int\rangle, encode\langle Perfect\ (Fork^2\ Int)\rangle))

=
```

To define $encode\langle Perfect\ Int\rangle$ we require $encode\langle Perfect\ (Fork^n\ Int)\rangle$ for each $n\geqslant 1$. It is probably clear that in general we cannot hope to obtain a *finite* representation of $poly\langle t\rangle$ this way. Instead, we must base the specialization on the representation of types, that is, on the datatype declarations themselves, which are by necessity finite.

To exhibit the structure of datatype declarations more clearly we shall rewrite them as $functor\ equations$. Roughly speaking, a functor can be seen as a function on types. Functor expressions of arity n are given by the following grammar.

$$F^n ::= \Pi_i^n \mid P^n \mid F^k \cdot (F_1^n, \dots, F_k^n)$$

By Π_i^n we denote the *n*-ary projection functor selecting its *i*-th component. For n=1 and n=2 we use the following more familiar names: $Id=\Pi_1^1$, $Fst=\Pi_1^2$, and $Snd=\Pi_2^2$. Elements of P^n are predefined functors of arity n, i.e., $P^0=\{1,Int\}$ —we identify types and nullary functors—and $P^2=\{+,\times\}$. The expression $f\cdot (f_1,\ldots,f_k)$ denotes the composition of a k-ary functor f with functors f_i , all of arity n. We omit parentheses when k=1 and we write Kt instead of $t\cdot ()$ when k=0. Note that in Kt the component t is a type viewed as a nullary functor; Kt is then an n-ary functor. Furthermore, we write f_1+f_2 for $+\cdot (f_1,f_2)$ and similarly $f_1\times f_2$. We agree upon that '·' binds more tightly than '×', which in turn takes precedence over '+'. For instance, $f+g\times h\cdot h$ means $f+(g\times (h\cdot h))$. Finally, we let f,g, and h range over functor expressions and p over primitive functors.

Here are the datatype definitions of Section 2.1 rewritten as functor equations.

```
\begin{array}{lll} List & = & K1 + Id \times List \\ Bintree & = & Fst + Bintree \times Snd \times Bintree \\ Fork & = & Id \times Id \\ Perfect & = & Id + Perfect \cdot Fork \\ Sequ & = & K1 + Sequ \cdot Fork + Id \times Sequ \cdot Fork \end{array}
```

In essence, functor equations are written in a compositional or 'point-free' style while **data** definitions are written in an applicative or 'pointwise' style. A system of functor equations has the general form $x_1 = f_1; \ldots; x_m = f_m$ where the x_i are functor variables (acting as unknowns) and the f_i are functor expressions.

Now, the central idea of the specialization is to mimic the structure of datatypes on the value level. For instance, $encode\langle Perfect\ Int\rangle$ will be compositionally defined in terms of the specializations for the constituent datatypes Perfect and Int. Since Perfect is a function on types, the 'encoder' for Perfect is consequently a function on encoders: it takes an encoder for values of type t and yields an encoder for values of type t and t is, it takes t is t to t in general, we

define, for each functor f of arity n, an n-ary function $poly_n\langle f\rangle$ satisfying

$$poly_n \langle f \rangle \ (poly \langle t_1 \rangle, \dots, poly \langle t_n \rangle) = poly \langle f(t_1, \dots, t_n) \rangle \ ,$$
 (1)

for all type expressions t_1, \ldots, t_n . It can be shown that the following definition satisfies this specification:

```
\begin{array}{rcl} poly_n\langle f\rangle & :: & \forall a_1\dots a_n.\tau\langle a_1\rangle\times\dots\times\tau\langle a_n\rangle\to\tau\langle f\left(a_1,\dots,a_n\right)\rangle\\ poly_n\langle \Pi_i^n\rangle & = & \pi_i^n\\ poly_n\langle p\rangle & = & poly_p\\ poly_n\langle g\cdot(h_1,\dots,h_k)\rangle & = & poly_k\langle g\rangle\star(poly_n\langle h_1\rangle,\dots,poly_n\langle h_k\rangle) \ . \end{array}
```

where $\pi_i^n\left(\varphi_1,\ldots,\varphi_n\right)=\varphi_i$ is the *i*-th projection function and ' \star ' denotes *n*-ary composition defined by $\varphi\star\left(\varphi_1,\ldots,\varphi_n\right)=\lambda v\to\varphi\left(\varphi_1\ v,\ldots,\varphi_n\ v\right)$. Note that $\varphi\star\left(\varphi_1\right)=\varphi\circ\varphi_1$ when n=1. Furthermore, note that the definition of $poly_n\langle f\rangle$ is inductive on the structure of functor expressions. On a more abstract level we can view $poly_n$ as an interpretation of functor expressions: Π_i^n is interpreted by π_i^n , p by $poly_n$, and '·' by ' \star '.

Finally, we can define poly in terms of $poly_0$.

$$poly \langle t \rangle \quad :: \quad \tau \langle t \rangle$$

$$poly \langle t \rangle \quad = \quad poly_0 \langle t \rangle \ ()$$

In the sequel we will identify poly and $poly_0$ just like we identify types and nullary functors.

By now we have the necessary prerequisites at hand to define the specialization of a polytypic value $poly\langle t\rangle$ for a given instance of t. Assume that the type is defined by the system of equations $x_1 = f_1; \ldots; x_m = f_m$ with $t = x_i$ for some i. For each equation $x_i = f_i$, where f_i is a k-ary functor expression, a function definition of the form $poly_k\langle x_i\rangle = poly_k\langle f_i\rangle$ is generated. The expression $poly_k\langle f_i\rangle$ is given by the inductive definition above, additionally setting $poly_k\langle x_i\rangle = poly_-x_i$, where $poly_-x_i$ is a new function symbol.

Example 2

Let us apply the above framework to specialize $encode\langle t \rangle$ for $t=Perfect\ Int$. The specialization proceeds entirely mechanically. Using the original constructor names and abbreviating type names to their first letter we obtain

```
\begin{array}{lll} encodePI & :: & Perfect \ Int \rightarrow [Bit] \\ encodePI \ x & = & encodeP \ encodeInt \ x \\ encodeF & :: & \forall a.(a \rightarrow [Bit]) \rightarrow (Fork \ a \rightarrow [Bit]) \\ encodeF \ enca \ (Fork \ x_1 \ x_2) & = & enca \ x_1 + + enca \ x_2 \\ encodeP & :: & \forall a.(a \rightarrow [Bit]) \rightarrow (Perfect \ a \rightarrow [Bit]) \\ encodeP \ enca \ (Null \ x) & = & 0 : enca \ x \\ encodeP \ enca \ (Succ \ x) & = & 1 : encodeP \ (encodeF \ enca) \ x \end{array}.
```

Encoding a perfect tree operates in two stages: while recursing encodeP constructs

a tailor-made encoding function $encodeF^i$ enca of type $Fork^i$ $a \to [Bit]$, which is eventually applied in the base case. \square

3 Tries generically

In this section we apply the framework of polytypic programming to implement generalized tries generically for all datatypes of first-order kind. We have already mentioned the basic idea that generalized tries can be considered as a type-indexed datatype. To put this idea in concrete terms we will define a scheme for constructing datatypes

$$Map\langle k :: * \rangle :: * \rightarrow *$$
,

which assigns a type constructor of kind $* \to *$ to each key type k of kind *. The kind system of Haskell specifies the 'type' of a type constructor (Jones, 1995). The '*' kind comprises nullary constructors like Int. The kind $k_1 \to k_2$ comprises type constructors that map type constructors of kind k_1 to those of kind k_2 . The order of a kind is given by order(*) = 0 and $order(k_1 \to k_2) = max\{1 + order(k_1), order(k_2)\}$.

The type $Map\langle k \rangle$ v represents the set $k \to_{\text{fin}} v$ of finite maps from k to v. It is worth noting that the two arguments of ' \to_{fin} ' are treated in a different way: the key type k is used as a type index, that is, Map will be defined by induction on the structure of k, whereas v is a type parameter, that is, Map will be parametric in the value type v and the operations on tries will be polymorphic with respect to v.

We will implement the following operations on tries.

```
\begin{array}{lll} empty\langle k \rangle & :: & \forall v. Map \langle k \rangle \ v \\ single \langle k \rangle & :: & \forall v. k \times v \to Map \langle k \rangle \ v \\ lookup \langle k \rangle & :: & \forall v. k \to Map \langle k \rangle \ v \to Maybe \ v \\ insert \langle k \rangle & :: & \forall v. (v \to v \to v) \to k \times v \to (Map \langle k \rangle \ v \to Map \langle k \rangle \ v) \\ merge \langle k \rangle & :: & \forall v. (v \to v \to v) \to (Map \langle k \rangle \ v \to Map \langle k \rangle \ v) \end{array}
```

The signature of $lookup\langle k\rangle$ deviates slightly from the one used in the introduction: the look-up function returns a value of type $Maybe\ v$ instead of v to be able to signal that a key is unbound. The functions $insert\langle k\rangle$ and $merge\langle k\rangle$ take as a first argument a so-called $combining\ function$, which is applied whenever two bindings have the same key. For instance, $\lambda new\ old\ \rightarrow\ new$ is used as the combining function for $insert\langle k\rangle$ if the new binding is to override an old binding with the same key. For finite maps of type $Map\langle k\rangle$ Int addition may also be a sensible choice. Interestingly, we will see that the combining function is not only a convenient feature for the user; it is also necessary for defining $insert\langle k\rangle$ and $merge\langle k\rangle$ generically for all types!

3.1 Type-indexed tries

We have already noted in the introduction that generalized tries are based on the laws of exponentials.

$$\begin{array}{cccc} 1 \to_{\operatorname{fin}} v & \cong & v \\ (k_1 + k_2) \to_{\operatorname{fin}} v & \cong & (k_1 \to_{\operatorname{fin}} v) \times (k_2 \to_{\operatorname{fin}} v) \end{array}$$

$$(k_1 \times k_2) \rightarrow_{\text{fin}} v \cong k_1 \rightarrow_{\text{fin}} (k_2 \rightarrow_{\text{fin}} v)$$

In order to define the notion of finite map it is customary to assume that each value type v contains a distinguished element or base point \perp_v , see R.H. Connelly and F.L. Morris (1995). A finite map is then a function whose value is \perp_v for all but finitely many arguments. For the implementation of tries it is, however, inconvenient to make such a strong assumption (though one could use type classes for this purpose). Instead, we explicitly add when necessary a base point using Maybe. It appears that this is only required for the unit type motivating the following definition of $Map\langle k \rangle$.

```
\begin{array}{lcl} \mathit{Map} \langle 1 \rangle \ v & = & \mathit{Maybe} \ v \\ \mathit{Map} \langle \mathit{Int} \rangle \ v & = & \mathit{Patricia.Dict} \ v \\ \mathit{Map} \langle k_1 + k_2 \rangle \ v & = & \mathit{Map} \langle k_1 \rangle \ v \times \mathit{Map} \langle k_2 \rangle \ v \\ \mathit{Map} \langle k_1 \times k_2 \rangle \ v & = & \mathit{Map} \langle k_1 \rangle \ (\mathit{Map} \langle k_2 \rangle \ v) \end{array}
```

We take for granted the existence of a suitable library implementing finite maps with integer keys. Such a library could be based, for instance, on a data structure known as a *Patricia tree* (Okasaki and Gill, 1998). This data structure fits particularly well in the current setting since Patricia trees are a variety of tries. For clarity, we will use qualified names when referring to entities defined in the hypothetical module *Patricia*.

Note that $Map\langle k \rangle$ is a unary functor. Using the functorial notation of Section 2.3 we can define $Map\langle k \rangle$ more succinctly as

```
\begin{array}{lll} \mathit{Map}\,\langle 1 \rangle & = & \mathit{Maybe} \\ \mathit{Map}\,\langle \mathit{Int} \rangle & = & \mathit{Patricia.Dict} \\ \mathit{Map}\,\langle k_1 + k_2 \rangle & = & \mathit{Map}\,\langle k_1 \rangle \times \mathit{Map}\,\langle k_2 \rangle \\ \mathit{Map}\,\langle k_1 \times k_2 \rangle & = & \mathit{Map}\,\langle k_1 \rangle \cdot \mathit{Map}\,\langle k_2 \rangle \ . \end{array}
```

Since the trie for the unit type is given by Maybe rather than Id, tries for isomorphic types are, in general, not isomorphic. We have, for instance, $1 \cong 1 \times 1$ but $Map\langle 1 \rangle = Maybe \ncong Maybe \cdot Maybe = Map\langle 1 \times 1 \rangle$. The trie type $Maybe \cdot Maybe$ has two different representations of the empty trie: Nothing and $Just\ Nothing$. However, only the first one will be used in our implementation.

Building upon the techniques developed in Section 2.3 we can now specialize $Map\langle k \rangle$ for a given instance of k. That is, for each functor f of arity n we will define an n-ary higher-order functor $Map_n\langle f \rangle$. For n=1 we have, for instance,

$$Map_1\langle f::*\to *\rangle$$
 $::$ $(*\to *)\to (*\to *)$.

The type constructor $Map_1\langle f\rangle$ is the generalized trie of the unary type constructor f. It takes as argument the generalized trie of the base type, say, t and yields the generalized trie of f t. In general, $Map_n\langle f\rangle$ satisfies

$$Map_n\langle f\rangle \ (Map\langle t_1\rangle, \dots, Map\langle t_n\rangle) = Map\langle f(t_1, \dots, t_n)\rangle \ ,$$
 (2)

for all type expressions t_1, \ldots, t_n . It may come as a surprise that the framework for specializing type-indexed values is also applicable to type-indexed datatypes.

The reason is quite simple: the definition of $poly_n\langle f\rangle$ requires only two operations, namely projection and composition, both of which are available in the world of functors and higher-order functors. Consequently, $Map_n\langle f\rangle$ is given by

Let us specialize $Map_n\langle f\rangle$ to the datatypes listed in Section 2.1. As before, we abbreviate type names to their first letter, that is, we write MapL instead of MapList.

```
\begin{array}{lll} \mathit{MapL} \ \mathit{m} & = & \mathit{Maybe} \times \mathit{m} \cdot \mathit{MapL} \ \mathit{m} \\ \mathit{MapB} \ (\mathit{m}_1, \mathit{m}_2) & = & \mathit{m}_1 \times \mathit{MapB} \ (\mathit{m}_1, \mathit{m}_2) \cdot \mathit{m}_2 \cdot \mathit{MapB} \ (\mathit{m}_1, \mathit{m}_2) \\ \mathit{MapF} \ \mathit{m} & = & \mathit{m} \cdot \mathit{m} \\ \mathit{MapP} \ \mathit{m} & = & \mathit{m} \times \mathit{MapP} \ (\mathit{MapF} \ \mathit{m}) \\ \mathit{MapS} \ \mathit{m} & = & \mathit{Maybe} \times \mathit{MapS} \ (\mathit{MapF} \ \mathit{m}) \times \mathit{m} \cdot \mathit{MapS} \ (\mathit{MapF} \ \mathit{m}) \end{array}
```

Since Haskell 98 permits the definition of higher-order kinded datatypes, the second-order functors above can be directly coded as datatypes.¹ All we have to do is to bring the equations into an applicative form.

```
\begin{array}{lll} \mathbf{data} \; \mathit{MapL} \; \mathit{m} \; \mathit{v} & = \; \; \mathit{TrieL} \; (\mathit{Maybe} \; \mathit{v}) \; (\mathit{m} \; (\mathit{MapL} \; \mathit{m} \; \mathit{v})) \\ \mathbf{data} \; \mathit{MapB} \; \mathit{m}_1 \; \mathit{m}_2 \; \mathit{v} & = \; \; \mathit{TrieB} \; (\mathit{m}_1 \; \mathit{v}) \\ & \qquad \qquad (\mathit{MapB} \; \mathit{m}_1 \; \mathit{m}_2 \; (\mathit{m}_2 \; (\mathit{MapB} \; \mathit{m}_1 \; \mathit{m}_2 \; \mathit{v}))) \end{array}
```

These types are the parametric variants of MapStr and MapBin defined in the introduction: we have $MapStr \cong MapL$ MapChar (corresponding to $Str \cong List$ Char) and $MapBin \cong MapB$ MapStr MapChar (corresponding to $Bin \cong Bintree$ Str Char). Things become interesting if we consider nested datatypes.

The generalized trie of a nested datatype is a second-order nested datatype! A nest is termed second-order, if a parameter that is instantiated in a recursive call ranges over type constructors of first-order kind. The tries MapP and MapS are second-order nests since the parameter m of kind $*\to *$ is changed in the recursive calls. By contrast, MapB is a first-order nest since its instantiated parameter v has kind *. It

Note that Miranda (trademark of Research Software Ltd), Standard ML, and previous versions of Haskell (1.2 and before) only have first-order kinded datatypes.

is quite easy to produce generalized tries that are both first- and second-order nests. If we swap the components of Sequ's third constructor— $One\ a\ (Sequ\ (Fork\ a))$ becomes $One\ (Sequ\ (Fork\ a))\ a$ —, then the third component of TrieS has type $MapS\ (MapF\ m)\ (m\ v)$ and since both m and v are instantiated, MapS is consequently both a first- and a second-order nest.

3.2 Empty and singleton tries

The empty trie is defined as follows.

```
\begin{array}{lll} empty \langle k \rangle & :: & \forall v.Map \langle k \rangle \ v \\ empty \langle 1 \rangle & = & Nothing \\ empty \langle Int \rangle & = & Patricia.empty \\ empty \langle k_1 + k_2 \rangle & = & (empty \langle k_1 \rangle, empty \langle k_2 \rangle) \\ empty \langle k_1 \times k_2 \rangle & = & empty \langle k_1 \rangle \end{array}
```

The definition already illustrates several interesting aspects of programming with generalized tries. To begin with the polymorphic type of $empty\langle k\rangle$ is necessary to make the definition work. Consider the last equation: $empty\langle k_1 \times k_2\rangle$, which is of type $\forall v. Map\langle k_1\rangle$ ($Map\langle k_2\rangle$ v), is defined in terms of $empty\langle k_1\rangle$, which is of type $\forall v. Map\langle k_1\rangle$ v. That means that $empty\langle k_1\rangle$ is used polymorphically. In other words, $empty\langle k\rangle$ makes use of polymorphic recursion!

Since $empty\langle k\rangle$ has a polymorphic type, $empty_n\langle f\rangle$ takes polymorphic values to polymorphic values. We have, for instance,

```
empty_1\langle f \rangle :: \forall k. (\forall v. Map \langle k \rangle v) \rightarrow (\forall v. Map \langle f k \rangle v).
```

The type signature contains two occurrences of Map. Of course, if we want to specialize $empty_1\langle f\rangle$ for a given f we must specialize its type signature, as well. In a first step, we use the specification of Map_n , Eq. (2), to replace $Map\langle f k\rangle$ by $Map_1\langle f\rangle$ $(Map\langle k\rangle)$.

```
empty_1\langle f \rangle :: \forall k.(\forall v.Map\langle k \rangle v) \rightarrow (\forall v.Map_1\langle f \rangle (Map\langle k \rangle) v)
```

In a second step, we generalize $Map\langle k \rangle$ to a fresh type variable, say, m.

```
empty_1\langle f \rangle :: \forall m.(\forall v.m \ v) \rightarrow (\forall v.Map_1\langle f \rangle \ m \ v)
```

Note that $empty_1\langle f\rangle$ has a so-called rank-2 type signature (McCracken, 1984). Let us take a look at some examples.

```
\begin{array}{lll} emptyL & :: & \forall m.(\forall v.m \ v) \rightarrow (\forall v.MapL \ m \ v) \\ emptyL \ e & = & TrieL \ Nothing \ e \\ emptyF & :: & \forall m.(\forall v.m \ v) \rightarrow (\forall v.MapF \ m \ v) \\ emptyF \ e & = & TrieF \ e \\ emptyP & :: & \forall m.(\forall v.m \ v) \rightarrow (\forall v.MapP \ m \ v) \\ emptyP \ e & = & TrieP \ e \ (emptyP \ (emptyF \ e)) \end{array}
```

The second function, emptyF, illustrates the polymorphic use of the parameter: e

has type $\forall v.m\ v$ but is used as an element of $m\ (m\ w)$. The last definition employs 'higher-order polymorphic' recursion: the recursive call is of type $(\forall v.MapF\ m\ v) \rightarrow (\forall v.MapP\ (MapF\ m)\ v)$, which is a substitution instance of the declared type. The function emptyP illustrates another point: the implementation of generalized tries relies in an essential way on lazy evaluation. As an example, consider the empty trie for $Perfect\ Int$, which is represented by the infinite tree (abbreviating Patricia.empty to e)

```
TrieP e (TrieP (TrieF e) (TrieP (TrieF (TrieF e)) ...)) .
```

In Section 4.1 we shall discuss a slightly modified representation of generalized tries that avoids this problem.

The singleton trie, which contains only a single binding, is defined as follows.

```
\begin{array}{lll} single\langle k\rangle & :: & \forall v.k \times v \to Map\langle k\rangle \ v \\ single\langle 1\rangle \ ((),v) & = & Just \ v \\ single\langle Int\rangle \ (i,v) & = & Patricia.single \ (i,v) \\ single\langle k_1+k_2\rangle \ (Inl \ i_1,v) & = & (single\langle k_1\rangle \ (i_1,v), empty\langle k_2\rangle) \\ single\langle k_1+k_2\rangle \ (Inr \ i_2,v) & = & (empty\langle k_1\rangle, single\langle k_2\rangle \ (i_2,v)) \\ single\langle k_1\times k_2\rangle \ ((i_1,i_2),v) & = & single\langle k_1\rangle \ (i_1, single\langle k_2\rangle \ (i_2,v)) \end{array}
```

The definition of $single\langle k \rangle$ is interesting because it falls back on $empty\langle k \rangle$ in the third and the fourth equation. This requires a small extension of the theory of Section 2: the specialization $single_n\langle f \rangle$ must be parameterized both with $single\langle k \rangle$ and with $empty\langle k \rangle$. For n=1 we obtain the type signature

```
\begin{aligned} single_1\langle f\rangle & :: & \forall m.(\forall v.m\ v) \rightarrow (\forall v.k \times v \rightarrow m\ v) \\ & \rightarrow (\forall v.f\ k \times v \rightarrow Map_1\langle f\rangle\ m\ v) \enspace . \end{aligned}
```

Let us again specialize the polytypic function to lists and perfect trees.

```
single L
                                         :: \forall m.(\forall v.m \ v) \to (\forall v.k \times v \to m \ v)
                                                      \rightarrow (\forall v. List \ k \times v \rightarrow MapL \ m \ v)
singleL \ e \ s \ (Nil, v)
                                         = TrieL (Just v) e
singleL \ e \ s \ (Cons \ i \ is, v)
                                         = TrieL Nothing (s (i, singleL \ e \ s (is, v)))
                                         :: \forall m.(\forall v.m \ v) \rightarrow (\forall v.k \times v \rightarrow m \ v)
single F
                                                      \rightarrow (\forall v. Fork \ k \times v \rightarrow MapF \ m \ v)
singleF \ e \ s \ (Fork \ i_1 \ i_2, v)
                                        = TrieF(s(i_1, s(i_2, v)))
                                         :: \forall m.(\forall v.m \ v) \to (\forall v.k \times v \to m \ v)
single P
                                                      \rightarrow (\forall v. Perfect \ k \times v \rightarrow MapP \ m \ v)
singleP \ e \ s \ (Null \ i, v)
                                               TrieP(s(i,v)) (emptyP(emptyFe))
singleP \ e \ s \ (Succ \ i, v)
                                         =
                                               TrieP \ e \ (singleP \ (emptyF \ e) \ (singleF \ e \ s) \ (i, v))
```

The function singleF illustrates that the 'mechanically' generated definitions can sometimes be slightly improved. Since the definition of Fork does not involve sums, singleF does not require its first argument, which could be safely removed.

3.3 Lookup

The look-up function implements the scheme discussed in the introduction.

```
\begin{array}{llll} lookup\langle k\rangle & :: & \forall v.k \rightarrow Map\langle k\rangle \ v \rightarrow Maybe \ v \\ lookup\langle 1\rangle \ () \ t & = & t \\ lookup\langle Int\rangle \ i \ t & = & Patricia.lookup \ i \ t \\ lookup\langle k_1 + k_2\rangle \ (Inl \ i_1) \ (t_1,t_2) & = & lookup\langle k_1\rangle \ i_1 \ t_1 \\ lookup\langle k_1 + k_2\rangle \ (Inr \ i_2) \ (t_1,t_2) & = & lookup\langle k_2\rangle \ i_2 \ t_2 \\ lookup\langle k_1 \times k_2\rangle \ (i_1,i_2) \ t_1 & = & (lookup\langle k_1\rangle \ i_1 \ \diamond \ lookup\langle k_2\rangle \ i_2) \ t_1 \end{array}
```

On sums the look-up function selects the appropriate map; on products it 'composes' the look-up functions for the components. Since $lookup\langle k \rangle$ has result type $Maybe\ v$, the composition must take care of the error signal Nothing.

```
(\diamondsuit) :: (a \rightarrow Maybe\ b) \rightarrow (b \rightarrow Maybe\ c) \rightarrow (a \rightarrow Maybe\ c)
(m_1 \diamondsuit m_2)\ a_1 = \mathbf{case}\ m_1\ a_1\ \mathbf{of}\ \{Nothing \rightarrow Nothing;\ Just\ a_2 \rightarrow m_2\ a_2\}
```

The operation (\diamondsuit) amounts to the monad or *Kleisli composition* (Bird, 1998). As an aside, note that the arguments are not in the same order as with functional composition.

Specializing $lookup\langle k \rangle$ to concrete instances of k is by now probably a matter of routine. Here is $lookup_1\langle f \rangle$'s type signature.

```
\begin{array}{cccc} lookup_1\langle f \rangle & :: & \forall m. (\forall v.k \rightarrow m \ v \rightarrow Maybe \ v) \\ & \rightarrow (\forall v.f \ k \rightarrow Map_1\langle f \rangle \ m \ v \rightarrow Maybe \ v) \end{array}
```

For lists and perfect trees we obtain

The function lookupL generalizes lookupStr defined in the introduction to this paper; we have lookupStr $s \cong value \circ lookupL$ lookupChar s. The definition of lookupP employs the same recursion scheme as encodeP: while recursing, lookupP constructs a tailor-made look-up function $lookupF^i$ ℓ of type $\forall v.Fork^i$ $k \to MapF^i$ $v \to Maybe$ v, which is finally applied in the base case.

3.4 Inserting and merging

Insertion is defined in terms of $merge\langle k \rangle$ and $single\langle k \rangle$.

```
\begin{array}{lll} insert \langle k \rangle & :: & \forall v.(v \rightarrow v \rightarrow v) \rightarrow k \times v \rightarrow (Map \langle k \rangle \ v \rightarrow Map \langle k \rangle \ v) \\ insert \langle k \rangle \ c \ (i,v) \ t & = & merge \langle k \rangle \ c \ (single \langle k \rangle \ (i,v)) \ t \end{array}
```

Unfortunately, this is not the most efficient implementation of $insert\langle k \rangle$ since singleton tries are in general given by infinite trees. This implies that the running time of $insert\langle k \rangle$ is not proportional to the size of the inserted key as one would expect. The problem vanishes, however, if we employ the alternative representation of generalized tries to be introduced in Section 4.1.

Merging two tries is surprisingly simple. Given an auxiliary function for combining two values of type $Maybe\ a$

we can define $merge\langle k \rangle$ as follows.

The most interesting equation is the last one. The tries t and t' are of type $Map\langle k_1 \times k_2 \rangle \ v = Map\langle k_1 \rangle \ (Map\langle k_2 \rangle \ v)$. To merge them we can use $merge\langle k_1 \rangle$; we must, however, supply a combining function of type $Map\langle k_2 \rangle \ v \to Map\langle k_2 \rangle \ v$. A moment's reflection reveals that that $merge\langle k_2 \rangle \ c$ is the desired combining function. Using functional composition we can write the last equation quite succinctly as

```
merge\langle k_1 \times k_2 \rangle = merge\langle k_1 \rangle \circ merge\langle k_2 \rangle.
```

The definition of $merge\langle k \rangle$ shows that it is sometimes necessary to implement operations more general than immediately needed. If $merge\langle k \rangle$ had the simplified type $\forall v. Map\langle k \rangle \ v \to Map\langle k \rangle \ v \to Map\langle k \rangle \ v$, then we would not be able to give a defining equation for $k = k_1 \times k_2$.

To complete the picture let us again specialize the merging operation for lists and perfect trees. To begin with here is $merge_1\langle f\rangle$'s type signature.

```
merge_1\langle f \rangle \quad :: \quad \forall m.(\forall v.(v \to v \to v) \to (m \ v \to m \ v \to m \ v)) \\ \quad \to (\forall v.(v \to v \to v) \\ \quad \to (Map_1\langle f \rangle \ m \ v \to Map_1\langle f \rangle \ m \ v \to Map_1\langle f \rangle \ m \ v))
```

The different instances of $merge_1\langle f \rangle$ are surprisingly concise.

```
\begin{array}{lll} mergeL & :: & \forall m. (\forall v. (v \rightarrow v \rightarrow v) \rightarrow (m\ v \rightarrow m\ v \rightarrow m\ v)) \\ & \rightarrow (\forall v. (v \rightarrow v \rightarrow v) \rightarrow (MapL\ m\ v \rightarrow MapL\ m\ v \rightarrow MapL\ m\ v)) \\ mergeL\ m\ c\ (TrieL\ tn\ tc)\ (TrieL\ tn'\ tc') \\ & = & TrieL\ (combine\ c\ tn\ tn')\ (m\ (mergeL\ m\ c)\ tc\ tc') \\ mergeF & :: & \forall m. (\forall v. (v \rightarrow v \rightarrow v) \rightarrow (m\ v \rightarrow m\ v \rightarrow m\ v)) \\ & \rightarrow (\forall v. (v \rightarrow v \rightarrow v) \rightarrow (MapF\ m\ v \rightarrow MapF\ m\ v \rightarrow MapF\ m\ v)) \\ mergeF\ m\ c\ (TrieF\ tf)\ (TrieF\ tf') \\ & = & TrieF\ (m\ (m\ c)\ tf\ tf') \\ mergeP & :: & \forall m. (\forall v. (v \rightarrow v \rightarrow v) \rightarrow (m\ v \rightarrow m\ v \rightarrow m\ v)) \\ & \rightarrow (\forall v. (v \rightarrow v \rightarrow v) \rightarrow (MapP\ m\ v \rightarrow MapP\ m\ v \rightarrow MapP\ m\ v)) \\ mergeP\ m\ c\ (TrieP\ tn\ ts)\ (TrieP\ tn'\ ts') \\ & = & TrieP\ (m\ c\ tn\ tn')\ (mergeP\ (mergeF\ m)\ c\ ts\ ts') \\ \end{array}
```

3.5 Laws

Polytypic functions enjoy polytypic properties. The following laws hold generically for all instances of k and can be proved by fixpoint induction over the structure of type expressions.

```
\begin{array}{rcl} lookup\langle k\rangle \; i \; (empty\langle k\rangle) & = & Nothing \\ lookup\langle k\rangle \; i \; (single\langle k\rangle \; (i_1,v_1)) & = & \textbf{if} \; i == i_1 \; \textbf{then} \; \textit{Just} \; v_1 \; \textbf{else} \; \textit{Nothing} \\ lookup\langle k\rangle \; i \; (merge\langle k\rangle \; c \; t_1 \; t_2) & = & combine \; c \; (lookup\langle k\rangle \; i \; t_1) \; (lookup\langle k\rangle \; i \; t_2) \end{array}
```

The last law, for instance, states that looking up a key in the merge of two tries yields the same result as looking up the key in each trie separately and then combining the results. If the combining form c is associative,

$$c v_1 (c v_2 v_3) = c (c v_1 v_2) v_3$$
,

then $merge\langle k \rangle$ c is associative, as well. Furthermore, $empty\langle k \rangle$ is the left and the right unit of $merge\langle k \rangle$ c:

```
merge\langle k \rangle \ c \ (empty\langle k \rangle) \ t = t merge\langle k \rangle \ c \ t \ (empty\langle k \rangle) = t merge\langle k \rangle \ c \ t_1 \ (merge\langle k \rangle \ c \ t_2 \ t_3) = merge\langle k \rangle \ c \ (merge\langle k \rangle \ c \ t_1 \ t_2) \ t_3 \ .
```

4 Variations on the theme

4.1 Spotted tries

The representation of tries as defined in Section 3.1 has two major drawbacks: (i) it relies in an essential way on lazy evaluation and (ii) it is inefficient. Both disadvantages have their roots in the representation of tries on sums. A trie on $k_1 + k_2$ is a pair of tries irrespective of whether the trie is empty or not. This suggests it would be worth devising a special representation for the empty trie.

Technically, this is achieved using so-called *spot products* (Connelly and Morris, 1995).

data
$$a_1 \times_{\bullet} a_2 = Spot \mid Pair \ a_1 \ a_2$$

Spot products are also known as optional pairs since $a_1 \times_{\bullet} a_2 \cong Maybe$ $(a_1 \times a_2)$. Changing $Map\langle k \rangle$'s definition to

$$Map\langle k_1 + k_2 \rangle = Map\langle k_1 \rangle \times Map\langle k_2 \rangle$$

we can now represent the empty trie in constant space.

$$empty\langle k_1 + k_2 \rangle = Spot$$

To ensure that the representation is unique, we require that the empty trie on sums is always represented by *Spot*. Maintaining this invariant in our implementation is, however, trivial since tries never shrink. The situation would be different if we additionally supplied an operation for removing bindings from a trie.

The remaining operations must be modified accordingly.

```
\begin{array}{llll} single \left\langle k_1 + k_2 \right\rangle \left(Inl \ i_1, v\right) & = & Pair \left(single \left\langle k_1 \right\rangle \left(i_1, v\right)\right) \left(empty \left\langle k_2 \right\rangle\right) \\ single \left\langle k_1 + k_2 \right\rangle \left(Inr \ i_2, v\right) & = & Pair \left(empty \left\langle k_1 \right\rangle\right) \left(single \left\langle k_2 \right\rangle \left(i_2, v\right)\right) \\ lookup \left\langle k_1 + k_2 \right\rangle \left(Spot & = & Nothing \\ lookup \left\langle k_1 + k_2 \right\rangle \left(Inl \ i_1\right) \left(Pair \ t_1 \ t_2\right) & = & lookup \left\langle k_1 \right\rangle i_1 \ t_1 \\ lookup \left\langle k_1 + k_2 \right\rangle \left(Inr \ i_2\right) \left(Pair \ t_1 \ t_2\right) & = & lookup \left\langle k_2 \right\rangle i_2 \ t_2 \\ merge \left\langle k_1 + k_2 \right\rangle c \ Spot \ t' & = & t' \\ merge \left\langle k_1 + k_2 \right\rangle c \ Spot & = & t \\ merge \left\langle k_1 + k_2 \right\rangle c \ (Pair \ t_1 \ t_2) \left(Pair \ t_1' \ t_2'\right) \\ & = & Pair \left(merge \left\langle k_1 \right\rangle c \ t_1 \ t_1'\right) \left(merge \left\langle k_2 \right\rangle c \ t_2 \ t_2'\right) \end{array}
```

4.2 Skinny tries

Extending the idea of the previous section one step further we could additionally devise a special representation for singleton tries.

```
\mathbf{data}\ a_1 \ {}_{\bullet}{\times} {}_{\bullet}\ a_2 \quad = \quad \mathit{None}\ |\ \mathit{Onlyl}\ a_1\ |\ \mathit{Onlyr}\ a_2\ |\ \mathit{Both}\ a_1\ a_2
```

Using $\bullet \times \bullet$ instead of $\times \bullet$ has the advantage that $single \langle k \rangle$ need not refer to $empty \langle k \rangle$.

$$single \langle k_1 + k_2 \rangle \ (Inl \ i_1, v) = Onlyl \ (single \langle k_1 \rangle \ (i_1, v))$$

 $single \langle k_1 + k_2 \rangle \ (Inr \ i_2, v) = Onlyr \ (single \langle k_2 \rangle \ (i_2, v))$

This representation is furthermore a bit more space economical. A potential disadvantage is the increased number of cases one must consider when defining $lookup\langle k\rangle$

and $merge\langle k \rangle$. Here are a few of the cases.

The remaining cases are defined accordingly.

5 A sample application: Generalized tries for de Bruijn terms

As a slightly larger application let us construct generalized tries for de Bruijn terms (de Bruijn, 1972) building upon the representation given in Section 4.1. These tries may be useful for performing common subexpression elimination on lambda terms or for implementing a memoizing interpreter for the lambda calculus. de Bruijn notation is a special encoding of lambda terms where a bound variable is represented by a natural number, giving the number of abstractions lying between the variable and its binding abstraction. For instance, $\lambda x \to x$ is represented by $\lambda 0$ and $\lambda x \to \lambda y \to x$ by $\lambda(\lambda 1)$. Recently, R. Bird and R. Paterson (1999) devised a nested implementation of de Bruijn terms, which nicely captures the 'distance invariant'.

```
\begin{array}{lcl} \mathbf{data} \ \mathit{Term} \ v &=& \mathit{Var} \ v \mid \mathit{App} \ (\mathit{Term} \ v) \ (\mathit{Term} \ v) \mid \mathit{Lam} \ (\mathit{Term} \ (\mathit{Incr} \ v)) \\ \mathbf{data} \ \mathit{Incr} \ v &=& \mathit{Zero} \mid \mathit{Succ} \ v \end{array}
```

Closed de Bruijn terms can be represented as elements of $Term\ Void$ where Void is the empty type. For instance, $\lambda 0$ and $\lambda(\lambda 1)$ are written as $Lam\ (Var\ Zero)$ and $Lam\ (Var\ (Succ\ Zero)))$. Non-closed terms where the free variables are drawn from the type Int are given by elements of $Term\ Int$. For example, $Var\ 0$ and $Lam\ (Var\ (Succ\ (Succ\ 0))))$ correspond to the lambda terms z and $\lambda x \to \lambda y \to z$, in which the variable z appears free.

Figures 2, 3, and 4 contain the complete code for generalized tries on non-closed de Bruijn terms of type $Term\ Int.^2$ Some remarks are appropriate. First of all, the datatype $Map\ T$ in Figure 3 is based on the functor equation

$$MapT \ m = m \times_{\bullet} MapT \ m \cdot MapT \ m \times_{\bullet} MapT \ (MapI \ m)$$
.

For simplicity, we interpret $a_1 \times_{\bullet} a_2 \times_{\bullet} a_3$ as the type of optional triples and not as nested optional pairs.

data
$$a_1 \times_{\bullet} a_2 \times_{\bullet} a_3 = Spot \mid Triple \ a_1 \ a_2 \ a_3$$

² The source code is available from the JFP internet home page (http://www.dcs.gla.ac.uk/-jfp/online/jfpvol?-?/hinze/index.html).

```
data MapI m v
                                                       SpotI \mid TrieI (Maybe v) (m v)
emptyI
                                                       \forall m.(\forall v.Map I \ m \ v)
emptyI
                                                       SpotI
                                                 =
single I
                                                       \forall m.(\forall v.m\ v) \rightarrow (\forall v.k \times v \rightarrow m\ v)
                                                              \rightarrow (\forall v.Incr\ k \times v \rightarrow MapI\ m\ v)
singleI \ e \ s \ (Zero, v)
                                                       TrieI (Just v) e
singleI \ e \ s \ (Succ \ i, v)
                                                       TrieI\ Nothing\ (s\ (i,v))
lookupI
                                                       \forall m.(\forall v.k \rightarrow m \ v \rightarrow Maybe \ v)
                                                               \rightarrow (\forall v.Incr \ k \rightarrow MapI \ m \ v \rightarrow Maybe \ v)
lookupI \ \ell \ i \ SpotI
                                                       Nothing
lookupI \ \ell \ Zero \ (TrieI \ tz \ ts)
                                                 =
                                                       tz
lookupI \ \ell \ (Succ \ i) \ (TrieI \ tz \ ts)
                                                =
                                                      \ell i ts
mergeI
                                                       \forall m.(\forall v.(v \to v \to v) \to (m\ v \to m\ v \to m\ v))
                                                               \rightarrow (\forall v.(v \rightarrow v \rightarrow v))
                                                                         \rightarrow (MapI \ m \ v \rightarrow MapI \ m \ v \rightarrow MapI \ m \ v))
mergeI m c SpotI t'
                                                      t'
mergeI m c t SpotI
                                                      t.
mergeI m c (TrieI tz ts) (TrieI tz' ts')
                                                     TrieI\ (combine\ c\ tz\ tz')\ (m\ c\ ts\ ts')
```

Fig. 2. Generalized tries for variables of type Incr v.

All the definitions with the notable exception of the empty instances have been mechanically derived from the generic definitions given in this and in the previous sections. The definition of emptyI has been simplified by omitting its parameter, which is not required. The same remark applies to emptyT and emptyTI.

Let us stress that the code does not conform to the Haskell 98 standard (Peyton Jones and Hughes, 1999), which neither provides explicit universal quantifiers nor rank-2 type signatures. However, both GHC 4.04 (GHC Team, 1999) and Hugs 98 as of September 1999 (Jones and Peterson, 1999) implement the necessary extensions (Peyton Jones, 1998). We only have to adjust the type signatures. To exemplify, the signature

```
lookupI :: \forall m. (\forall v.k \to m \ v \to Maybe \ v) \to (\forall v.Incr \ k \to MapI \ m \ v \to Maybe \ v)must be changed to
```

```
lookupI :: (\forall v.k \rightarrow m \ v \rightarrow Maybe \ v) \rightarrow (Incr \ k \rightarrow MapI \ m \ w \rightarrow Maybe \ w).
```

The rewrite involves two steps: (i) use $t \to \forall v.u = \forall w.t \to u[v:=w]$ where w is a fresh type variable to push quantifiers to the top-level and (ii) discard top-level quantifiers. Both steps are meaning preserving (recall that every free type variable in a signature is implicitly universally quantified).

6 Related and future work

D.E. Knuth (1998) attributes the idea of a trie to A. Thue who introduced it in a paper about strings that do not contain adjacent repeated substrings (1912). R. de la Briandais recommended tries for computer searching (1959). The generalization

```
SpotT \mid TrieT (m \ v)
\mathbf{data}\ \mathit{Map}\ T\ \mathit{m}\ \mathit{v}
                                                                      (Map T m (Map T m v))
                                                                      (Map T (Map I m) v)
emptyT
                                               \forall m.(\forall v.Map\ T\ m\ v)
emptyT
                                         =
                                               SpotT
single\,T
                                               \forall m.(\forall v.m\ v) \rightarrow (\forall v.k \times v \rightarrow m\ v)
                                                      \rightarrow (\forall v. Term \ k \times v \rightarrow Map \ T \ m \ v)
                                               TrieT(s(i, v)) emptyT emptyT
single T \ e \ s \ (Var \ i, v)
                                               TrieT \ e \ (singleT \ e \ s \ (i_1, singleT \ e \ s \ (i_2, v))) \ emptyT
singleT \ e \ s \ (App \ i_1 \ i_2, v)
                                               TrieT\ e\ emptyT\ (singleT\ emptyI\ (singleI\ e\ s)\ (i,v))
singleT \ e \ s \ (Lam \ i, v)
lookup T
                                               \forall m. (\forall v.k \rightarrow m \ v \rightarrow Maybe \ v)
                                                      \rightarrow (\forall v. Term \ k \rightarrow MapT \ m \ v \rightarrow Maybe \ v)
lookup\ T\ \ell\ i\ Spot\ T
                                               Nothing
lookup\ T\ \ell\ (\ Var\ i)\ (\ Trie\ T\ \ tv\ \ ta\ \ tl)
                                         = \ell i tv
lookup\ T\ \ell\ (App\ i_1\ i_2)\ (\mathit{Trie}\ T\ \mathit{tv}\ \mathit{ta}\ \mathit{tl})
                                         = (lookup T \ell i_1 \diamond lookup T \ell i_2) ta
lookup\ T\ \ell\ (Lam\ i)\ (TrieT\ tv\ ta\ tl)
                                         = lookup T (lookup I \ell) i tl
mergeT
                                         :: \forall m.(\forall v.(v \to v \to v) \to (m \ v \to m \ v \to m \ v))
                                                       \rightarrow (\forall v.(v \rightarrow v \rightarrow v))
                                                                 \rightarrow (Map T m v \rightarrow Map T m v \rightarrow Map T m v))
mergeT \ m \ c \ SpotT \ t'
                                         =
mergeT\ m\ c\ t\ SpotT
                                         =
                                              t.
mergeT \ m \ c \ (\mathit{TrieT} \ tv \ ta \ tl) \ (\mathit{TrieT} \ tv' \ ta' \ tl')
                                         = TrieT (m c tv tv')
                                                          (mergeT \ m \ (mergeT \ m \ c) \ ta \ ta')
                                                         (mergeT (mergeI m) c tl tl')
```

Fig. 3. Generalized tries for de Bruijn terms of type Term v.

```
Map T Patricia. Dict
\mathbf{type}\ \mathit{Map}\,\mathit{TI}
emptyTI
                                    \forall v. Map TI v
emptyTI
                                    emptyT
single\,TI
                              :: \forall v. Term \ Int \times v \rightarrow Map TI \ v
single\,TI
                                    singleT\ Patricia.empty\ Patricia.single
lookup\,TI
                                    \forall v. Term \ Int \rightarrow Map TI \ v \rightarrow Maybe \ v
lookup\,TI
                                    lookup\ T\ Patricia.lookup
insertTI
                                    \forall v.(v \rightarrow v \rightarrow v) \rightarrow \mathit{Term} \; \mathit{Int} \times v \rightarrow (\mathit{MapTI} \; v \rightarrow \mathit{MapTI} \; v)
                              ::
insertTI\ c\ (i,v)\ t\ =
                                    mergeTI \ c \ (singleTI \ (i, v)) \ t
                              \forall v.(v \rightarrow v \rightarrow v) \rightarrow (Map\,TI\,v \rightarrow Map\,TI\,v \rightarrow Map\,TI\,v)
mergeTI
mergeTI
                                    merge\ T\ Patricia.merge
```

Fig. 4. Generalized tries for non-closed de Bruijn terms of type Term Int.

of tries from strings to elements built according to an arbitrary signature was discovered by C.P. Wadsworth (1979) and others independently since. R.H. Connelly and F.L. Morris (1995) formalized the concept of a trie in a categorical setting: they showed that a trie is a functor and that the corresponding look-up function is a natural transformation. Interestingly, despite the framework of category theory they base the development on many-sorted signatures, which makes the definitions somewhat unwieldy. This paper shows that the construction of generalized tries is much simpler if we replace the concept of a many-sorted signature by its categorical counterpart, the concept of a functor.

The first implementation of generalized tries was given by C. Okasaki in his recent textbook on functional data structures (1998). Tries for parameterized types like lists or binary trees are represented as Standard ML functors. While this approach works for regular datatypes, it fails for nested datatypes such as *Perfect* or *Term*. In the latter case datatypes of second-order kind are indispensable.

That said, a direction for future work suggests itself, namely to generalize tries to arbitrary higher-order kinded datatypes. To give an impression of the extensions consider the standard definition of rose trees.

$$\mathbf{data} \ Rose \ k = Branch \ k \ (List \ (Rose \ k))$$

Its trie is given by

```
\mathbf{data} \ \mathit{MapR} \ \mathit{mk} \ \mathit{v} = \mathit{TrieR} \ (\mathit{mk} \ (\mathit{MapL} \ (\mathit{MapR} \ \mathit{mk}) \ \mathit{v})).
```

Now, abstracting the list functor away we obtain the following generalization of rose trees.

```
\mathbf{data} \ GRose \ t \ k = GBranch \ k \ (t \ (GRose \ t \ k))
```

The trie of *Rose* can be generalized in a similar way.

```
\mathbf{data} \ \mathit{MapGR} \ \mathit{mt} \ \mathit{mk} \ \mathit{v} \quad = \quad \mathit{TrieGR} \ (\mathit{mk} \ (\mathit{mt} \ (\mathit{MapGR} \ \mathit{mt} \ \mathit{mk}) \ \mathit{v}))
```

Note that GRose is a type constructor of kind $(* \to *) \to (* \to *)$, while its trie has kind $((* \to *) \to (* \to *)) \to ((* \to *) \to (* \to *))$. Now, the same systematics can be applied to generalize the operations on MapR to operations on MapGR. Currently, the author is working on a suitable extension of the framework that makes it possible to define polytypic values generically for all datatypes expressible in Haskell 98.

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