

“Everything” - as a functional program

or a rambling renaissance man’s guide to data transformations

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Abstract

We explore in this paper, in the form of a literate Haskell program a uniform data centric upper ontology of computational entities, derived from first principles: a *groupoid of isomorphisms* between fundamental data types provides the ability to shift views of a given informational entity at will.

After introducing isomorphisms between elementary data types (natural numbers, sets, multisets, finite functions, graphs, hypergraphs, bitstring and parenthesis languages, etc.) we lift them to hereditarily finite universes through *hylomorphisms* derived from *ranking/unranking* and *pairing/unpairing* operations.

An embedded higher order *combinator language* provides any-to-any encodings automatically.

Applications range from stream iterators on combinatorial objects to self-delimiting codes, succinct data representations and generation of random instances.

Keywords computational mathematics in Haskell, data type transformations, higher order combinators, hylomorphisms, ranking/unranking, Goedel numberings

1. Introduction

Mathematical theories often borrow proof patterns and reasoning techniques across close and sometime not so close fields.

A relatively small number of universal data types are used as basic building blocks in programming languages and their runtime interpreters, corresponding to a few well tested mathematical abstractions like sets, functions, graphs, groups, categories etc.

Compilers convert programs from human centered to machine centered representations. Complexity classes are defined through compilation with limited resources (time or space) to similar problems (Cook 2004).

Clearly, this as part of a more general pattern: analogical/metaphorical thinking routinely shifts entities and operations from a field to another hoping to uncover similarities in representation or use (Lakoff and Johnson 1980).

This might sound somewhat interesting - but it is awfully vague. From where a precise challenge is derived: can we turn the *metaphors we leave by* into well defined data transformation mechanisms?

One can see the “computational universe” - in analogy with its physical or biological counterparts - as being populated by a wide diversity of data types - all fundamentally *different*. Under this view, knowledge appears as accumulation of information about similarities and differences and *abstraction* (i.e. lossy but sufficient approximation) helps managing the otherwise intractable set of attributes and behaviors.

However, this view of the “computational universe” forgets a salient difference: while we have not designed the representations and laws governing the physical or biological world, we have designed their computational counterparts. And ownership has its privileges: we can freely shift the view while fixing the object of the view, if we wish!

This paper is about advocating constructively¹ an exploration of the “computational universe” in which everything *is* everything else, or, for the relativist, everything *can be seen* as everything else.

Under this assumption on the computational *upper ontology*, information can take the *shape* of an arbitrary data type. And one is quickly conduced to accept that the *frame of reference* is unimportant - and that any of these shapes can be seen as the essential shape of an entity, given that *isomorphisms* can faithfully shift it from one shape to another and back without loss of information.

We see these encodings as a first step towards a “theory of everything” joining together the basic building blocks of various computational artifacts, i.e. an executable *upper ontology* of computational entities.

The cognoscenti might observe that this is not very far from what Leibniz, in *La Monadologie* (Leibniz) had already expressed about ... *Monads*:

Now this interconnectedness, or this accommodation of all created things to each, and of each to all the rest, means that each simple substance has relations to all the others, which it expresses. Consequently, it is a permanent living mirror of the universe.

As we shall see, the natural framework to organize such isomorphisms is a *finite groupoid* i.e. a category (Mac Lane 1998) where every morphism is an isomorphism, with objects provided by the data types and morphisms provided by their transformations.

As a practical goal, we hope this can facilitate the refactoring of the enormous ontology exhibited by various computer science and engineering fields, that have resulted over a relatively short period of evolution in unnecessarily steep learning curves limiting communication and synergy between fields.

¹ We really mean it - the paper is executable as a literate Haskell program - the code is available from <http://logic.cse.unt.edu/tarau/research/2009/everything.zip>.

It is important to keep in mind that we must not lose any information if we want to be able to shift views at will. Therefore, the only *morphisms* that matter, in this ontology, are *isomorphisms*.

This brings us into familiar territory: substitution of equals by equals - *referential transparency* - an intrinsic feature of functional programming languages. And it makes Haskell the natural choice for the first iteration of such an effort - while keeping in mind that the frame of reference can be easily shifted to a different programming paradigm.

2. A possible first frame of reference: a ranking/unranking algorithm for finite sequences

One has to start somewhere - and that usually comes with a set of assumptions that are genuinely *a priori* i.e. such that most people have no trouble working with them even outside formal computer science or mathematical training.

In this sense, natural numbers are probably not just the oldest computational abstraction - but also the most widely accepted one as being “built from first principles”. With their usual (second order) Peano axiomatization (Kirby and Paris 1982), natural numbers are also formally well understood - if one cares. We will, therefore, use them as our first data type, providing not only a surprisingly strong structuring mechanism - but also enough expressiveness for hosting universal data and program structures.

DEFINITION 1. A ranking/unranking function defined on a data type is a bijection to/from the set of natural numbers (denoted \mathbb{N} through the paper).

When applied to formulae or proofs, ranking functions are usually called *Gödel numberings* as they have originated in arithmetization techniques used in the proof of Gödel’s incompleteness results. Gödel numberings are typically *one-to-one* but not *onto* i.e. not all natural numbers correspond to valid formulae. Originating in combinatorics, *ranking/unranking* functions are *bijective* as they relate arbitrary combinatorial objects to unique natural numbers.

We start with an unusually simple (but nevertheless *new*) ranking/unranking algorithm for finite sequences of arbitrary (i.e. unbounded size!) natural numbers. Let’s first observe that

PROPOSITION 1. $\forall z \in \mathbb{N} - \{0\}$ the diophantic equation

$$2^x(2y + 1) = z \quad (1)$$

has exactly one solution $x, y \in \mathbb{N}$.

This follows immediately from the unicity of the decomposition of a natural number as a multiset of prime factors.

Given the definitions

```
type N = Integer
cons :: N → N → N
cons x y = (2^x)*(2*y+1)

hd :: N → N
hd n | n>0 = if odd n then 0 else 1+hd (n `div` 2)

tl :: N → N
tl n = n `div` 2^((hd n)+1)

as_ns_n :: N → [N]
as_ns_n 0 = []
as_ns_n n = hd n : as_ns_n (tl n)

as_n_ns :: [N] → N
as_n_ns [] = 0
as_n_ns (x:xs) = cons x (as_n_ns xs)
```

the following holds:

PROPOSITION 2. *as_n_ns* is a bijection from finite sequences of natural numbers to natural numbers and *as_ns_n* is its inverse.

This follows from the fact that *cons* and the pair (*hd*, *tl*) define a bijection between $\mathbb{N} - \{0\}$ and $\mathbb{N} \times \mathbb{N}$ and that the value of *as_n_ns* is uniquely determined by the applications of *tl* and the sequence of values returned by *hd*.

```
*ISO> hd 2008
3
*ISO> tl 2008
125
*ISO> cons 3 125
2008
```

Note also that this isomorphism preserves “list processing” operations i.e. if one defines:

```
append 0 ys = ys
append xs ys = cons (hd xs) (append (tl xs) ys)
```

then the isomorphism commutes with operations like list concatenation:

PROPOSITION 3.

$(as_ns_n\ n) ++ (as_ns_n\ m) \equiv as_ns_n\ (append\ n\ m)$
 $as_n_ns\ (ns ++ ms) \equiv append\ (as_n_ns\ ns)\ (as_n_ns\ ms)$

One might notice at this point that *hd*, *tl*, *cons*, 0 define on \mathbb{N} an algebraic structure isomorphic to the one introduced by *CAR*, *CDR*, *CONS*, *NIL* in John McCarthy’s classic LISP paper (McCarthy 1960)².

3. Connecting the dots with a groupoid of isomorphisms

DEFINITION 2. A category in which every morphism is an isomorphism is called a groupoid.

We represent *isomorphism* pairs like *as_ns_n* and *as_n_ns* as a data type *Iso*, together with the operations *compose*, *itself*, *invert* providing the (finite) *groupoid* structure.

```
data Iso a b = Iso (a → b) (b → a)

compose :: Iso a b → Iso b c → Iso a c
compose (Iso f g) (Iso f' g') = Iso (f' . f) (g . g')

itself = Iso id id

invert (Iso f g) = Iso g f
```

It makes sense at this point to connect everything to a *hub* type – for instance \mathbb{N} – to avoid having to provide $n*(n-1)/2$ isomorphisms. We call such a connector an *Encoder*:

```
type Encoder a = Iso a N
```

We first define a trivial *Encoder*:

```
n :: Encoder N
n = itself
```

and then an *Encoder* from finite sequences of (unbounded) natural numbers to \mathbb{N} :

```
ns :: Encoder [N]
ns = Iso as_n_ns as_ns_n
```

It makes sense to lift the operations *as_ns_n* and *as_n_ns* to route a transformation to/from an arbitrary type through the common *hub* by introducing a new combinator *as*:

² And following John McCarthy’s *eval* construct one can now build relatively easily a LISP interpreter working directly and exclusively through simple arithmetic operations on natural numbers.

```
as :: Encoder a → Encoder b → b → a
as that this x = g x where
  Iso _ g = compose that (invert this)
```

It works as follows:

```
*ISO> as ns n 2009
[0,2,0,1,0,0,0,0]
*ISO> as n ns [0,2,0,1,0,0,0,0]
2009
```

Note that indeed, `as ns n` generalizes `as ns n` in an intuitive way:

```
*ISO> as ns n 2009
[0,2,0,1,0,0,0,0]
*ISO> as n ns [0,2,0,1,0,0,0,0]
2009
```

4. Encoding of some fundamental data types

We will now quickly put the mechanism at work and show that Encoders for some fundamental data types are surprisingly easy to build.

4.1 From finite sequences to finite sets of natural numbers

An encoder of finite sets of natural numbers (assumed ordered) as sequences is obtained by adjusting the encoding of multisets so that 0s are first mapped to 1s - this ensures that all elements are different.

```
set :: Encoder [N]
set = compose (Iso as_ns_set as_set_ns) ns

as_set_ns = (map pred) . as_ms_ns . (map succ)
as_ns_set = (map pred) . as_ns_ms . (map succ)
```

It works as follows:

```
*ISO> as set n 2009
[0,3,4,6,7,8,9,10]
*ISO> as n set it
2009
```

4.2 From sequences to multisets of natural numbers

An encoder of multisets (assumed ordered) as sequences is obtained by “summing up” a sequence with `scanl`.

```
ms :: Encoder [N]
ms = compose (Iso as_ns_ms as_ms_ns) ns

as_ms_ns ns = tail (scanl (+) 0 ns)
as_ns_ms ms = zipWith (-) (ms) (0:ms)
```

It works as follows:

```
*ISO> as ms n 2009
[0,2,2,3,3,3,3,3]
*ISO> as n ms it
2009
```

One can see how this is derived by summing up from:

```
*ISO> as ns n 2009
[0,2,0,1,0,0,0,0]
```

5. Generic unranking and ranking hylomorphisms

The *ranking problem* for a family of combinatorial objects is finding a unique natural number associated to it, called its *rank*. The inverse *unranking problem* consists of generating a unique combinatorial object associated to each natural number.

5.1 Hereditarily finite data types

The unranking operation is seen here as an instance of a generic *anamorphism* (an *unfold* operation), while the ranking operation is seen as an instance of the corresponding catamorphism (a *fold* operation) (Meijer and Hutton 1995; Hutton 1999). Together they form a mixed transformation called *hylomorphism*. We will use such hylomorphisms to *lift* isomorphisms between lists and natural numbers to isomorphisms between a derived tree data type and natural numbers.

The data type representing such *hereditarily finite* structures will be a generic multi-way tree with a single leaf type `[]`.

```
data T = H Ts deriving (Eq,Ord,Read,Show)
type Ts = [T]
```

The two sides of our hylomorphism are parameterized by two transformations `f` and `g` forming an isomorphism `Iso f g`:

```
unrank f n = H (unranks f (f n))
unranks f ns = map (unrank f) ns

rank g (H ts) = g (ranks g ts)
ranks g ts = map (rank g) ts
```

Both combinators can be seen as a form of “structured recursion” that propagates a simpler operation guided by the structure of the data type. We can now combine an anamorphism+catamorphism pair into an isomorphism `hylo` defined with `rank` and `unrank` on the corresponding hereditarily finite data types:

```
hylo :: Iso b [b] → Iso T b
hylo (Iso f g) = Iso (rank g) (unrank f)

hylos :: Iso b [b] → Iso Ts [b]
hylos (Iso f g) = Iso (ranks g) (unranks f)
```

5.1.1 Hereditarily finite sets

Hereditarily finite sets (Takahashi 1976) will be represented as an Encoder for the tree type `T`:

```
hfs :: Encoder T
hfs = hylo (Iso (as set n) (as n set))
```

Otherwise, hylomorphism induced isomorphisms work as usual with our embedded transformation language:

```
*ISO> as hfs n 42
H [H [H []],H [H []],H [H []],H [H []],H [H [H []]]]
```

One can notice that we have just derived as a “free algorithm” Ackermann’s encoding (Ackermann 1937) from hereditarily finite sets to natural numbers:

$$f(x) = \text{if } x = \{\} \text{ then } 0 \text{ else } \sum_{a \in x} 2^{f(a)}$$

together with its inverse

```
ackermann = as n hfs
inverse_ackermann = as hfs n
```

One can represent the action of a hylomorphism unfolding a natural number into a hereditarily finite set as a directed graph with outgoing edges induced by by applying the `inverse_ackermann` function as shown in Fig. 1.

5.2 Hereditarily finite multisets

In a similar way, one can derive an Encoder for hereditarily finite multisets based on the `ms` isomorphism:

```
hfm :: Encoder T
hfm = hylo (Iso (as ms n) (as n ms))
```

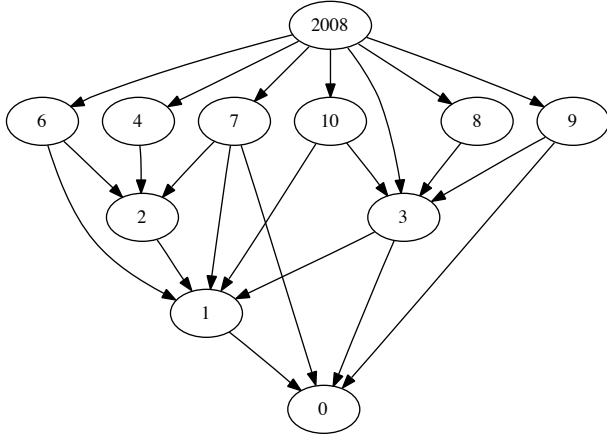


Figure 1. 2008 as a HFS

working as follows:

```
*ISO> as hfm n 2008
H [H [H [],H []],H [H [],H []],
  H [H [H [H []]],H [H [H [H []]]],
  H [H [H [H []]],H [H [H [H [H []]]],H [H [H [H [H []]]]]]
*ISO> as n hfm it
2008
```

5.2.1 Hereditarily finite functions

The same tree data type can host a hylomorphism derived from finite functions instead of finite sets:

```
hff :: Encoder T
hff = hyl (Iso (as ns n) (as n ns))
```

The hff Encoder can be seen as a “free algorithm”, providing data compression/succinct representation for Hereditarily Finite Sets. Note, for instance, the significantly smaller tree size in:

```
*ISO> as hff n 2008
H [H [H [],H []],H [],H [H [H []],H [],H [],H [],H []]
```

One can represent the action of a hylomorphism unfolding a natural number into a hereditarily finite function as a directed ordered multi-graph as shown in Fig. 2. Note that as the mapping `as fun n` generates a sequence where the order of the edges matters, this order is indicated integers starting from 0 labeling the edges.

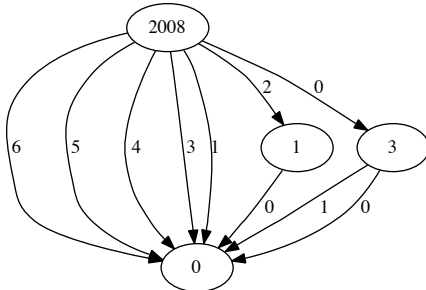


Figure 2. 2008 as a HFF

6. Pairing functions as Encoders

An important type of isomorphism, originating in Cantor’s work of infinite sets connects natural numbers and pairs of natural numbers.

DEFINITION 3. An isomorphism $f : \mathbb{N} \times \mathbb{N} \rightarrow \mathbb{N}$ is called a pairing function and its inverse f^{-1} is called an unpairing function.

Given the definitions:

```
unpair z = (hd (z+1), tl (z+1))
pair (x,y) = (cons x y)-1
```

shifting by 1 turns `hd` and `tl` in total functions on \mathbb{N} such that $unpair\ 0 = (0, 0)$ i.e. the following holds:

PROPOSITION 4.

$unpair : \mathbb{N} \rightarrow \mathbb{N} \times \mathbb{N}$ is a bijection and $pair = unpair^{-1}$.

Note that unlike `hd` and `tl`, `unpair` is defined for all natural numbers:

```
*ISO> map unpair [0..7]
[(0,0),(1,0),(0,1),(2,0),(0,2),(1,1),(0,3),(3,0)]
```

As the cognoscenti might notice, this is in fact a classic *pairing/unpairing function* that has been used, by Pepis, Kalmar and Robinson in some fundamental work on recursion theory, decidability and Hilbert’s Tenth Problem in (Pepis 1938; Kalmar 1939; Robinson 1950, 1968).

Using the functions `pair` and `unpair` we define the Encoder:

```
type N2 = (N,N)
n2 :: Encoder N2
n2 = Iso pair unpair
```

we obtain a pairing/unpairing isomorphism `n2` between and $\mathbb{N} \times \mathbb{N}$ and \mathbb{N} . Another interesting pairing function (Pigeon 2001) can be derived from the Moser-De Bruijn sequence (A000695, (Sloane 2006))

```
inflate = (as n set) . (map (*2)) . (as set n)
```

as follows:

```
bpair (i,j) = inflate i + ((*2) . inflate) j
bunpair k = (deflate xs,deflate ys) where
  (xs,ys) = partition even (as set n k)
  deflate = (as n set) . (map ('div' 2))
```

It works as follows:

```
*ISO> map bunpair [0..7]
[(0,0),(1,0),(0,1),(1,1),(2,0),(3,0),(2,1),(3,1)]
*ISO> map bpair it
[0,1,2,3,4,5,6,7]
```

PROPOSITION 5. `bunpair` creates a pair by separating even and odd bits of a natural number; its inverse `bpair` merges them back.

Together, they provide a pairing/unpairing isomorphism `n2'` between and $\mathbb{N} \times \mathbb{N}$ and \mathbb{N} :

```
n2' :: Encoder N2
n2' = Iso bpair bunpair
```

working as follows

```
*ISO> as n n2' (2008,2009)
4191170
*ISO> as n2' n it
(2008,2009)
```

In a way similar to hereditarily finite trees generated by unfoldings one can apply strictly decreasing³ unpairing functions recursively. Figures 3 and 4 show the directed graphs describing recursive application of `bunpair` and `pepis.unpair`.

Given that unpairing functions are bijections from N to $N \times N$ they will progressively cover all points having natural number coordinates in their range in the plane. Figure 5 shows the curve generated by `bunpair`.

³ except for 0 and 1, typically

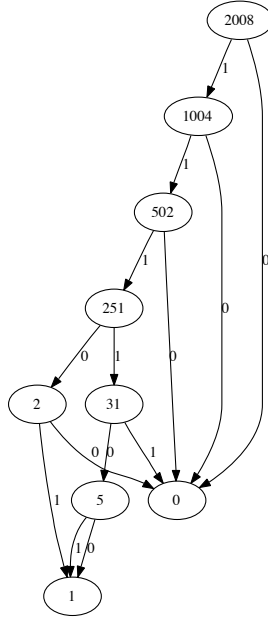


Figure 3. Graph obtained by recursive application of unpair for 2008

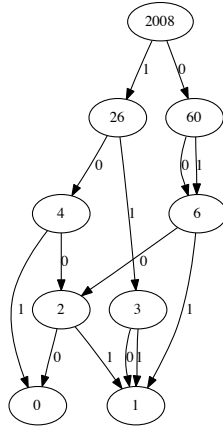


Figure 4. Graph obtained by recursive application of bunpair for 2008

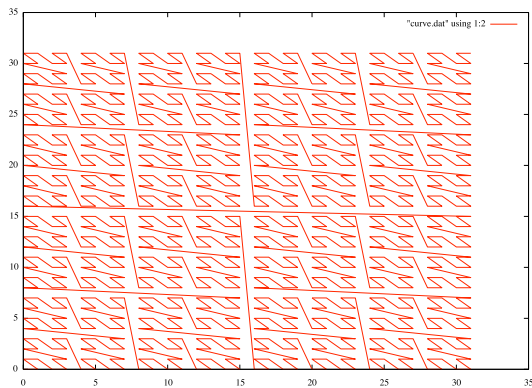


Figure 5. 2D curve connecting values of unpair n for $n \in [0..2^{10} - 1]$

6.1 Encoding unordered pairs

To derive an encoding of unordered pairs, i.e. 2 element sets, one can combine pairing/unpairing with conversion between sequences and sets:

```
pair2unord_pair (x,y) = as set ns [x,y]
unord_pair2pair [a,b] = (x,y) where
  [x,y]=as ns set [a,b]
```

```
unord_unpair = pair2unord_pair . bunpair
unord_pair = bpair . unord_pair2pair
```

We can derive the following Encoder:

```
set2 :: Encoder [N]
set2 = compose (Iso unord_pair unord_unpair) n
```

working as follows:

```
*ISO> as set2' n 2008
[60,87]
*ISO> as n set2' [60,87]
2008
*ISO> as n set2' [87,60]
2008
```

6.2 Encodings multiset pairs

To derive an encoding of 2 element multisets, one can combine pairing/unpairing with conversion between sequences and multisets:

```
pair2mset_pair (x,y) = (a,b) where [a,b]=as ms ns [x,y]
mset_unpair2pair (a,b) = (x,y) where [x,y] = as ns ms [a,b]
```

```
mset_unpair = pair2mset_pair . bunpair
mset_pair = bpair . mset_unpair2pair
```

We can derive the following Encoder:

```
mset2 :: Encoder [N2]
mset2 = compose (Iso mset_unpair2pair pair2mset_pair) n2
```

working as follows:

```
*ISO> as mset2 n 2008
(60,86)
*ISO> as n mset2 it
2008
```

Figure 6 shows the curve generated by mset_unpair covering the lattice of points in its range.

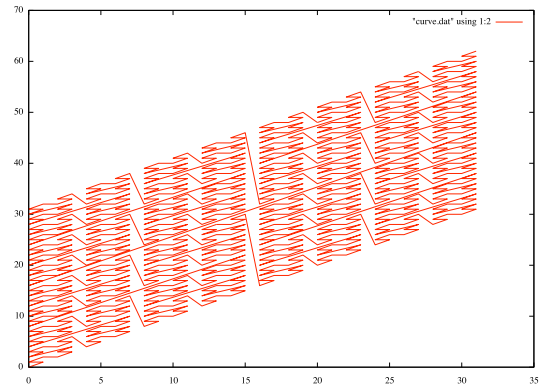


Figure 6. 2D curve connecting values of mset_unpair n for $n \in [0..2^{10} - 1]$

6.3 Encoding signed integers

To encode signed integers one can map positive numbers to even numbers and strictly negative numbers to odd numbers. This gives the Encoder:

```
z :: Encoder Z
z = compose (Iso z2nat nat2z) n

nat2z n = if even n then n `div` 2 else (-n-1) `div` 2
z2nat n = if n<0 then -2*n-1 else 2*n
```

working as follows:

```
*ISO> as set z (-42)
[0,1,4,6]
*ISO> as z set [0,1,4,6]
-42
```

6.4 Extending pairing/unpairing to signed integers

Given the bijection from n to z one can easily extend pairing/unpairing operations to signed integers. We obtain the Encoder:

```
type Z = Integer
type Z2 = (Z,Z)

z2 :: Encoder Z2
z2 = compose (Iso zpair zunpair) n

zpair (x,y) = (nat2z . bpair) (z2nat x,z2nat y)
zunpair z = (nat2z n,nat2z m) where (n,m) = (bunpair . z2nat) z
```

working as follows:

```
*ISO> map zunpair [-5..5]
[(-1,1),(-2,-1),(-2,0),(-1,-1),(-1,0),
 (0,0),(0,-1),(1,0),(1,-1),(0,1),(0,-2)]
*ISO> map zpair it
[-5,-4,-3,-2,-1,0,1,2,3,4,5]

*ISO> as z2 z (-2008)
(63,-26)
*ISO> as z z2 it
-2008
```

Figure 7 shows the curve covering the lattice of integer coordinates generated by the function `zunpair`.

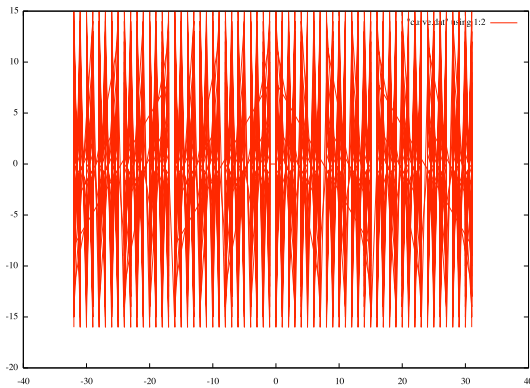


Figure 7. Curve generated by unpairing function on signed integers

The same construction can be extended to multiset pairing functions:

```
mz2 :: Encoder Z2
mz2 = compose (Iso mzpair mzunpair) n
```

```
mzpair (x,y) = (nat2z . mset_pair) (z2nat x,z2nat y)
mzunpair z = (nat2z n,nat2z m) where
  (n,m) = (mset_unpair . z2nat) z
```

working as follows:

```
*ISO> as mz2 z (-42)
(1,-8)
*ISO> as z mz2 it
-42
```

7. Encoding graphs and hypergraphs

We will now show that more complex data types like digraphs and hypergraphs have extremely simple encoders. This shows once more the importance of compositionality in the design of our embedded transformation language.

7.1 Encoding directed graphs

We can find a bijection from directed graphs (with no isolated vertices, corresponding to their view as binary relations), to finite sets by fusing their list of ordered pair representation into finite sets with a pairing function:

```
digraph2set ps = map bpair ps
set2digraph ns = map bunpair ns
```

The resulting Encoder is:

```
digraph :: Encoder [N2]
digraph = compose (Iso digraph2set set2digraph) set
```

It works as follows:

```
*ISO> as digraph n 2008
[(1,1),(2,0),(2,1),(3,1),(0,2),(1,2),(0,3)]
*ISO> as n digraph it
2008
```

Fig. 8 shows the digraph associated to 2008.

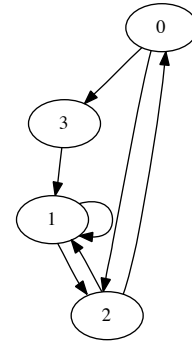


Figure 8. 2008 as a digraph

7.2 Encoding undirected graphs

We can find a bijection from undirected graphs to finite sets by fusing their list of unordered pair representation into finite sets with a pairing function on unordered pairs:

```
graph2set ps = map unord_pair ps
set2graph ns = map unord_unpair ns
```

The resulting Encoder is:

```
graph :: Encoder [[N]]
graph = compose (Iso graph2set set2graph) set
```

working as follows:

```
*ISO> as graph n 2008
[[1,3],[2,3],[2,4],[3,5],[0,3],[1,4],[0,4]]
*ISO> as n graph it
2008
*ISO> as n graph
[[1,3],[3,2],[2,4],[5,3],[0,3],[4,1],[0,4]]
2008
```

Note that, as expected, the result is invariant to changing the order of elements in pairs like [1,4] and [3,5] to [4,1] and [5,3].

7.3 Encoding directed multigraphs

We can find a bijection from directed multigraphs (directed graphs with multiple edges between pairs of vertices) to finite sequences by fusing their list of ordered pair representation into finite sequences with a pairing function. The resulting Encoder is:

```
mdigraph :: Encoder [N2]
mdigraph = compose (Iso digraph2set set2digraph) ns
```

```
*ISO> as mdigraph n 2008
[(1,1),(0,0),(1,0),(0,0),(0,0),(0,0),(0,0)]
*ISO> as n mdigraph it
2008
```

Note that the only change to the digraph Encoder is replacing the composition with `set` by a composition with `ns`.

7.4 Encoding undirected multigraphs

We can find a bijection from undirected multigraphs (undirected graphs with multiple edges between unordered pairs of vertices) to finite sequences by fusing their list of pair representation into finite sequences with a pairing function on unordered pairs:

The resulting Encoder is:

```
mgraph :: Encoder [[N]]
mgraph = compose (Iso graph2set set2graph) ns
```

working as follows:

```
*ISO> as mgraph n 2008
[[1,3],[0,1],[1,2],[0,1],[0,1],[0,1],[0,1]]
*ISO> as n mgraph it
2008
```

Note that the only change to the graph Encoder is replacing the composition with `set` by a composition with `fun`.

7.5 Encoding hypergraphs

A hypergraph (also called *set system*) is a pair $H = (X, E)$ where X is a set and E is a set of non-empty subsets of X .

We can easily derive a bijective encoding of *hypergraphs*, represented as sets of sets:

```
set2hypergraph = map (as set n)
hypergraph2set = map (as n set)
```

The resulting Encoder is:

```
hypergraph :: Encoder [[N]]
hypergraph = compose (Iso hypergraph2set set2hypergraph) set
```

It works as follows

```
*ISO> as hypergraph n 2008
[[0,1],[2],[1,2],[0,1,2],[3],[0,3],[1,3]]
*ISO> as n hypergraph it
2008
```

8. Encoding parenthesis languages

An encoder for a parenthesis language is obtained by combining a parser and writer. As hereditarily finite functions naturally map one-to-one to parenthesis expressions expressed as bitstrings, we will choose them as target of the transformers.

```
hff_pars :: Encoder [N]
hff_pars = compose (Iso pars2hff hff2pars) hff
```

The parser recurses over a bitstring and builds a HFF as follows:

```
pars2hff cs = parse_pars 0 1 cs
```

```
parse_pars l r cs | newcs == [] = t where
  (t,newcs)=pars_expr l r cs
  pars_expr l r (c:cs) | c==1 = ((H ts),newcs) where
    (ts,newcs) = pars_list l r cs
  pars_list l r (c:cs) | c==r = ([],cs)
  pars_list l r (c:cs) = ((t:ts),cs2) where
    (t,cs1)=pars_expr l r (c:cs)
    (ts,cs2)=pars_list l r cs1
```

The writer recurses over a HFF and collects matching “parenthesis” (denoted 0 and 1) pairs:

```
hff2pars = collect_pars 0 1
```

```
collect_pars l r (H ns) =
  [1]++ (concatMap (collect_pars l r) ns)++[r]
```

This transformation maps 42 into the bitstring representation of “((())(())())” as [0,0,0,1,1,0,0,1,1,0,0,1,1,1].

9. Parenthesis encoding of hereditarily finite types as a self-delimiting code

Like the Elias omega code (Elias 1975), a balanced parenthesis representation is obviously *self-delimiting* as proven by the fact that the reader `pars_expr` defined in section 8 will extract a balanced parenthesis expression from a finite or infinite list while returning the part of the list left over. More precisely, the following holds:

PROPOSITION 6. *The hff_pars encoding is a self-delimiting code. If n is a natural number then $\text{hd } n$ equals the code of the first parenthesized subexpression of the code of n and $\text{tl } n$ equals the code of the expression obtained by removing it from the code for n , both of which represent self-delimiting codes.*

One can compute, for comparison purposes, the optimal undelimited bitstring encoding provided by the Encoder `bits`

```
*ISO2> as bits n 2008
[1,0,0,1,1,0,1,1,1,1]
*ISO> as hff_pars n 2008
[0,0,0,1,0,1,1,0,1,0,0,1,1,0,1,0,1,0,1,1]
```

As the last example shows, the information density of a parenthesis representation is lower than the information theoretical optimal representation provided by the (undelimited) `bits` Encoder that maps \mathbb{N} to the regular language $\{0,1\}^*$

There are however cases when the parenthesis language representation is more compact. For instance,

```
*ISO> as n bits (as hff_pars n (2^2^16))
32639
```

while the conventional representation of the same number would have thousands of digits. We refer to (Tarau 2009) for a comparison between this self-delimiting code and Elias omega code.

10. Other encodings

We will sample a few miscellaneous encodings showing the flexibility and expressiveness of our framework.

10.1 Encoding SAT problems

Boolean Satisfiability (SAT) problems are encoded as lists of lists representing conjunctions of disjunctions of positive or negative propositional symbols.

After defining:

```
set2sat = map (set2disj . (as set n)) where
  shift0 z = if (z<0) then z else z+1
  set2disj = map (shift0. nat2z)
```

```
sat2set = map ((as n set) . disj2set) where
  shiftback0 z = if(z<0) then z else z-1
  disj2set = map (z2nat . shiftback0)
```

we obtain the Encoder

```
sat :: Encoder [[Z]]
sat = compose (Iso sat2set set2sat) set
```

working as follows:

```
*ISO> as sat n 2008
[[1,-1],[2],[-1,2],[1,-1,2],[-2],[1,-2],[-1,-2]]
*ISO> as n sat it
2008
```

Clearly this encoding can be used to generate random SAT problems out of easier to generate random natural numbers.

10.2 Encoding strings

Strings can be seen just as a notational equivalent of lists of natural numbers written in base 2^n . Assuming $n=128$, for ASCII strings we obtain an Encoder immediately as:

```
string :: Encoder String
string = Iso string2n n2string
```

```
string2n cs = from_base 128 (map (fromIntegral . ord) cs)
```

```
n2string xs = map (chr . fromIntegral) (to_base 128 xs)
```

```
*ISO> as ns string "hello"
[3,1,0,0,1,2,0,2,0,1,0,2,0,1,0,0,0,0,1,0]
*ISO> as string ns it
"hello"
```

10.3 Functional binary numbers

Church numerals are well known as a functional representation for Peano arithmetic. While benefiting from lazy evaluation, they implement a form of unary arithmetic that uses $O(n)$ space to represent n . This suggests devising a functional representation that mimics binary numbers. We will do this following the model described in subsection 11 to provide an isomorphism between \mathbb{N} and the functional equivalent of the regular language $\{0, 1\}^*$. We will view each bit as a $\mathbb{N} \rightarrow \mathbb{N}$ transformer:

```
b x = pred x -- begin
o x = 2*x+0  -- bit 0
i x = 2*x+1  -- bit 1
e = 1        -- end
```

As the following example shows, composition of functions o and i closely parallels the corresponding bitlists:

```
*ISO> b$1$o$o$1$i$o$1$i$1$i$1$e
2008
*ISO> as bits n 2008
[1,0,0,1,1,0,1,1,1,1]
```

We can follow the same model with an abstract data type:

```
data D = E | O D | I D deriving (Eq,Ord,Show,Read)
data B = B D deriving (Eq,Ord,Show,Read)
```

from which we can generate functional bitstrings as an instance of a *fold* operation:

```
funbits2n :: B → N
funbits2n = bfold b o i e
```

```
bifold fb fo fi fe (B d) = fb (dfold d) where
  dfold E = fe
  dfold (O x) = fo (dfold x)
  dfold (I x) = fi (dfold x)
```

Dually, we can reverse the effect of the functions b, o, i, e as:

```

b' x = succ x
o' x | even x = x 'div' 2
i' x | odd x  = (x-1) 'div' 2
e' = 1

```

and define a generator for our data type as an *unfold* operation:

```
n2funbits :: N → B
n2funbits = bunfold b' o' i' e'
```

```

bunfold fb fo fi fe x = B (dunfold (fb x)) where
  dunfold n | n == fe = E
  dunfold n | even n = 0 (dunfold (fo n))
  dunfold n | odd n = I (dunfold (fi n))

```

The two operations form an isomorphism:

```
*ISO> funbits2n  
      (B $ I $ O $ O $ I $ I $ I $ O $ I $ I $ I $ I $ E)  
2008  
*ISO> n2funbits it  
B (I (O (O (I (I (O (I (I (I (I (E)))))))))
```

We can define our Encoder as follows:

```
funbits :: Encoder B
funbits = compose (Iso funbits2n n2funbits) n
```

Arithmetic operations can now be performed directly on this representation. For instance, one can define a successor function as:

$$\begin{aligned} \text{bsucc } (B \ d) &= B \ (\text{dsucc } d) \text{ where} \\ \text{dsucc } E &= 0 \ E \\ \text{dsucc } (0 \ x) &= I \ x \\ \text{dsucc } (I \ x) &= 0 \ (\text{dsucc } x) \end{aligned}$$

Equivalently, arithmetics can be borrowed from \mathbb{N} :

```

*ISO> bsucc (B $ I $ 0 $ 0 $ I $ I $
              0 $ I $ I $ I $ I $ E)
B (0 (I (0 (I (I (0 (I (I (I (I E))))))))))
*ISO> as n funbits it
2009
*ISO> borrow (with n funbits) succ (B $ I $ 0 $ 0 $ I $
                                      I $ 0 $ I $ I $ I $ I $ E)
B (0 (I (0 (I (I (0 (I (I (I (I E))))))))))
*ISO> as n funbits it
2009

```

While Haskell’s C-based arbitrary length integers are likely to be more efficient for most operations, this representation, like Church numerals, has the benefit of supporting partial or delayed computations through lazy evaluation.

11. An alternative starting point: the regular language $\{0, 1\}^*$

As the reader might guess - this can go on and on - and in fact one can find in (Tarau 2009) a much larger set of encodings covering more than 60 data types as diverse as BDDs, dyadic rationals, Gauss integers, DNA strands, etc.

But an important point we want to make in this paper is that the frame of reference is unimportant. In fact, the frame of reference used in (Tarau 2009) is finite functions while in this paper we picked \mathbb{N} as our *hub*. We will now rebuild \mathbb{N} itself through a more computer oriented - and ultimately a more *information theoretical* view: as arbitrary bitstrings i.e. as elements of the regular language $\{0, 1\}^*$. First we need a decoder/encoder:

```
bits :: Encoder [N]
bits = Iso as_n_bits as_bits_n

as_bits_n = drop_last . (to_base 2) . succ where
  drop_last = reverse . tail . reverse

as_n_bits bs = pred (from_base 2 (bs ++ [1]))

to_base base n =
  d : (if q==0 then [] else (to_base base q)) where
    (q,d) = quotRem n base

from_base base [] = 0
from_base base (x:xs) | x ≥ 0 && x < base =
  x+base*(from_base base xs)
```

It works as follows:

```
*ISO> as bits n 42
[1,1,0,1,0]
*ISO> as n bits [1,1,0,1,0]
42
```

Note that the bit order is from smaller to larger exponents of 2 and that final 1 digits (used as delimiters in conventional computer representations of binary numbers) have been removed. This ensures that every combination of 0 and 1 in $\{0, 1\}^*$ represents a number.

We start with successor/predecessor operations:

```
s [] = [0]
s (0:xs) = 1:xs
s (1:xs) = 0:s xs
```

```
p [0] = []
p (0:xs) = 1:p xs
p (1:xs) = 0:xs
```

working as expected

```
*ISO> as n bits (s (as bits n 42))
43
*ISO> as n bits (p (as bits n 43))
42
```

A new design pattern emerges:

```
nf f = (as n bits) . f . (as bits n)
nf2 f x y = as n bits (f (as bits n x) (as bits n y))
```

It works as follows:

```
*ISO> nf s 42
43
*ISO> nf p 43
42
```

Note that this can be seen as a functor moving operations from a datatype to another. We can further generalize it and define the *isofunctor* `borrow_from`:

```
borrow_from lender borrower f =
  (as borrower lender) . f . (as lender borrower)
```

It works as follows

```
*ISO> borrow_from bits n s 42
43
*ISO> borrow_from bits n p 43
42
```

as well as its 2-argument variant:

```
borrow_from2 lender borrower f x y =
  (as borrower lender)
  (f (as lender borrower x) (as lender borrower y))
```

We will now rebuild various arithmetic operations seen as acting on arbitrary undelimited bitstrings. We start with `db` and `hf` implementing *double* and *half* - the last one truncating toward 0:

```
db = p . (0:)
hf = tail . s
```

Rebuilding `hd` (`h`), `tl` (`t`) and `cons` (`c`) is remarkably easy - we do not need addition or multiplication yet:

```
h :: [N] → [N]
h = h' . p

h' [] = []
h' (1:_) = []
h' (0:xs) = s (h' xs)
```

```
t :: [N] → [N]
t = t' . p
t' = hf . t''
```

```
t'' (0:xs) = t'' xs
t'' xs = xs
```

```
c x ys = s (c' x ys)
c' x xs = c'' x (db xs)
```

```
c'' [] ys = ys
c'' xs ys = 0: c'' (p xs) ys
```

We can try them out directly on numbers using the `borrow_from` functor:

```
*ISO> borrow_from2 bits n c 42 2009
17675748928126976
*ISO> borrow_from bits n h 17675748928126976
42
*ISO> borrow_from bits n t 17675748928126976
2009
```

Addition can be implemented by case analysis - i.e. treating the case when there's a carry-on 0 `sm0` and carry-on 1 `sm1` separately:

```
sm xs ys = p (sm0 xs ys)
```

```
sm0 [] [] = [0]
sm0 [] (0:ys) = 1:ys
sm0 [] (1:ys) = 0:(s ys)
sm0 (0:xs) [] = 1:xs
sm0 (1:xs) [] = 0:(s xs)
sm0 (0:xs) (0:ys) = 0:(sm0 xs ys)
sm0 (0:xs) (1:ys) = 1:(sm0 xs ys)
sm0 (1:xs) (0:ys) = 1:(sm0 xs ys)
sm0 (1:xs) (1:ys) = 0:(sm1 xs ys)
```

```
sm1 xs ys = s (sm0 xs ys)
```

Multiplication needs to handle `[]` (representing 0) as a special case. Otherwise, it just applies the usual algorithm:

```
m [] _ = []
m _ [] = []
m xs ys = s (m1 (p xs) (p ys)) where
  m1 [] ys = ys
  m1 (0:xs) ys = 0:(m1 xs ys)
  m1 (1:xs) ys = sm0 ys (0:(m1 xs ys))
```

Both operations work as expected:

```

*ISO> sm [1,0,1,0] [0,0,1]
[0,0,0,0,0]
*ISO> map (as n bits) [[1,0,1,0],[0,0,1]]
[20,11]
*ISO> 20+11
31
*ISO> as bits n 31
[0,0,0,0,0]
*ISO> borrow_from2 bits n sm 42 13
55
*ISO> borrow_from2 bits n m 5 12
60

```

One can see that after shifting the frame of reference to the the bitstring view of natural numbers we can still work with addition, multiplication etc. as usual.

12. Sketch of a fully arithmetized functional programming language

We have briefly shown that shifting views over data types is quite easy - and we refer to (Tarau 2009) for other such isomorphisms between about 60 different data types. We will now focus on programming constructs. We can start with some simple list operations

```

lst n = cons n 0

len 0 = 0
len xs = succ (len (tl xs))

```

working as follows

```

*ISO> map lst [0..7]
[1,2,4,8,16,32,64,128]
*ISO> as ns n 42
[1,1,1]
*ISO> len 42
3

```

Some well known higher order functions (from the Haskell prelude) are next with names prefixed with *n* to avoid conflicts, when needed:

```

nzipWith _ 0 _ = 0
nzipWith _ _ 0 = 0
nzipWith f xs ys =
  cons (f (hd xs) (hd ys))
    (nzipWith f (tl xs) (tl ys))

```

```

nzip xs ys = nzipWith cons xs ys

```

```

nunzip zs = (xs,ys) where
  xs = nMap hd zs
  ys = nMap tl zs

```

As the following definitions and examples show, more complex data types like associative lists are easily defined “inside” a natural number:

```

getAssoc _ 0 = 0
getAssoc k ps =
  if 0==xy then 0
  else if k==x then y
  else getAssoc k (tl ps) where
    xy=hd ps
    x=hd xy
    y=tl xy

```

```

addAssoc k v ps=cons (cons k v) ps

```

```

*ISO> as n ns [0,1,2]
37
*ISO> as n ns [3,4,5]

```

```

16648
*ISO> nzip 37 16648
2361183241434889715840
*ISO> getAssoc 2 it
5
*ISO> addAssoc 2 1 (addAssoc 1 2 0)
8392704
*ISO> getAssoc 1 8392704
2
*ISO> getAssoc 2 8392704
1
*ISO> getAssoc 3 8392704
0

```

The *fold* family has been shown to be able to express a large class of interesting other functions as shown in (Hutton 1999; Meijer and Hutton 1995). Various fold operations are defined along the lines of their Haskell prelude counterparts:

```

nfoldl _ z 0 = z
nfoldl f z xs = nfoldl f (f z (hd xs)) (tl xs)

```

```

nfoldr f z 0 = z
nfoldr f z xs = f (hd xs) (nfoldr f z (tl xs))

```

```

nscanl _ q 0 = lst q
nscanl f q xs = cons q (nscanl f (f q (hd xs)) (tl xs))

```

They works as follows:

```

*ISO> nfoldl (+) 0 8466
10
*ISO> as ns n (nscanl (+) 0 8466)
[0,1,3,6,10]

```

We can now define the equivalent of *reverse*, *map* and *concat*

```

rev = nfoldl (flip cons) 0

```

```

nMap f ns = nfoldr (\x xs→cons (f x) xs) 0 ns

```

```

nconcat xss = nfoldr append 0 xss

```

```

nconcatMap f xs = nconcat (nMap f xs)

```

working as follows

```

*ISO> as n ns [1,2,3]
274
*ISO> rev 274
328
*ISO> as ns n 328
[3,2,1]
*ISO> nMap (\x→x^2+1) 274
524548
*ISO> as ns n 524548
[2,5,10]

```

Following (McCarthy 1960) one can build a fully arithmetized theory of recursive functions together with a Turing-equivalent *eval* predicate along the lines of (Chaitin 1975). Moreover, our compact bijective encodings are likely to be practical enough for experimenting with various concepts of algorithmic complexity and randomness (Li and Vitányi 1993).

13. A final touch: emulating monadic constructs

We can now emulate monadic constructs (except that we have \mathbb{N} instead of the parametric type *Monad a*) as follows:

```

infixl 1 >>-
m >>- k = nconcatMap k m
nreturn = lst

```

```

nsequence = foldr mcons (nreturn 0) where
  mcons p q = p>>- \x → q >>- \y →nreturn (cons x y)

```

The monadic list operation:

```
*ISO> [0,1] >=> λx→[0,1] >=> λy→ return (x,y)
[(0,0),(0,1),(1,0),(1,1)]
```

is now emulated as:

```
*ISO> as n ns [0,1]
5
*ISO> 5 >>- λx→ 5 >>- λy→ nreturn (cons x y)
33058
```

which, after shifting to a list view (and then to a list of pairs view) becomes:

```
*ISO> as ns n 33058
[1,3,2,6]
*ISO> map (λx→(hd x,tl x)) [1,3,2,6]
[(0,0),(0,1),(1,0),(1,1)]
```

Similarly, `nsequence` emulates Haskell's `sequence` construct as follows:

```
*ISO> nsequence [1,1,2]
2048
*ISO> map (as ns n) [1,1,2]
[[0],[0],[1]]
*ISO> sequence it
[[0,0,1]]
*ISO> as ns n 2048
[11]
*ISO> as ns n 11
[0,0,1]
```

14. Applications

Besides their utility as a uniform basis for a general purpose data conversion library, let us point out some specific applications of our isomorphisms.

14.1 Combinatorial generation

A free combinatorial generation algorithm (providing a constructive proof of recursive enumerability) for a given structure is obtained simply through an isomorphism from *nat*:

```
nth thing = as thing n
nthns thing = map (nth thing)
stream_of thing = nthns thing [0..]
```

```
*ISO> nth set 42
[1,3,5]
```

```
*ISO> nth bits 42
[1,1,0,1,0]
```

```
*ISO> take 3 (stream_of hfs)
[H [],H [H []],H [H [H []]]]
```

14.2 Random generation

Combining `nth` with a random generator for natural numbers provides free algorithms for random generation of complex objects of customizable size:

```
ran thing seed largest =
  head (random_gen thing seed largest 1)

random_gen thing seed largest n = genericTake n
  (nthns thing (rans seed largest))

rans seed largest =
  randomRs (0,largest) (mkStdGen seed)
```

For instance

```
*ISO> random_gen set 11 999 3
[[0,2,5],[0,5,9],[0,1,5,6]]
```

generates a list of 3 random sets.

For instance

```
*ISO> ran digraph 5 (2^31)
[(1,0),(0,1),(2,1),(1,3),(2,2),(3,2),(4,0),(4,1),
 (5,1),(6,0),(6,1),(7,1),(5,3),(6,2),(6,3)]
```

```
*ISO> ran hfs 7 30
H [H [],H [H [],H [H []]],H [H [H [H []]]]]
```

generate a random digraph and a hereditarily finite set, respectively.

Random generators for various data types are useful for further automating test generators in tools like QuickCheck (Claessen and Hughes 2002) by generating customized random tests.

An interesting other application is generating random problems or programs of a given type and size. For instance

```
*ISO> ran sat 8 (2^31)
[[-1],[1,-1],[-1,2],[1,-1,2],[-2],[1,-2],
 [-1,-2],[1,-1,-2],[2,-2],[1,2,-2],[-1,2,-2],
 [3],[1,-1,3],[1,-1,2,3],[1,-2,3],[-1,-2,3],
 [2,-2,3],[1,2,-2,3],[-1,2,-2,3]]
```

generates a random SAT-problem.

14.3 Succinct representations

Depending on the information theoretical density of various data representations as well as on the constant factors involved in various data structures, significant data compression can be achieved by choosing an alternate isomorphic representation, as shown in the following examples:

```
*ISO> as hff hfs (H [H [H []],H [H [],
  H [H []]],H [H [],H [H [H []]]])
H [H [H []],H [H []],H [H [H []]]]
*ISO> as n hff (H [H [H []],H [H []],H [H [H []]]])
42
*ISO> as ns bits [0,1,0,0,0,0,0,0,0,0,0]
[0,10]
```

In particular, mapping to efficient arbitrary length integer implementations (usually C-based libraries), can provide more compact representations or improved performance for isomorphic higher level data representations. Alternatively, lazy representations as provided by functional binary numbers for very large integers encapsulating results of some computations might turn out to be more effective space-wise or time-wise.

Using our groupoid of isomorphisms one can compare representations sharing a common datatype and make interesting conjectures about their asymptotic information density, as shown in (Tarau 2009).

15. Related work

The closest reference on encapsulating bijections as a Haskell data type is (Alimarine et al. 2005) and Conal Elliott's composable bijections module (Conal Elliott), where, in a more complex setting, Arrows (Hughes) are used as the underlying abstractions. While our `Iso` data type is similar to the *Bij* data type in (Conal Elliott) and *BiArrow* concept of (Alimarine et al. 2005), the techniques for using such isomorphisms as building blocks of an embedded composition language centered around encodings as natural numbers are new.

Ranking functions can be traced back to Gödel numberings (Gödel 1931; Hartmanis and Baker 1974) associated to formulae. Together with their inverse *unranking* functions they are also used

in combinatorial generation algorithms (Martinez and Molinero 2003; Knuth 2006). However the generic view of such transformations as hylomorphisms obtained compositionally from simpler isomorphisms, as described in this paper, is new. Note also that Gödel numberings are typically injective but not *onto* applications, and can only be turned into bijections by exhaustive enumeration of their range. By contrast our ranking/unranking functions are designed to be “genuinely” bijective, usually with computational effort linear in the size of the data types.

Pairing functions have been used in work on decision problems as early as (Robinson 1950, 1968). A typical use in the foundations of mathematics is (Cégielski and Richard 2001). An extensive study of various pairing functions and their computational properties is presented in (Rosenberg 2003).

Natural number encodings of hereditarily finite sets have triggered the interest of researchers in fields ranging from Axiomatic Set Theory and Foundations of Logic to Complexity Theory and Combinatorics (Takahashi 1976; Kaye and Wong 2007; Kirby 2007). Contrary to the well known hereditarily finite sets, the concepts of hereditarily finite multisets and functions as well as their encodings, are likely to be new, given that our sustained search efforts have not lead so far to anything similar.

16. Conclusion

We have described encodings for various data types in a uniform framework as data type isomorphisms with a groupoid structure. The framework has been extended with hylomorphisms providing generic mechanisms for encoding hereditarily finite sets, multisets and functions. In addition, by using pairing/unpairing functions we have also derived unusually simple encodings for graphs, digraphs and hypergraphs.

While we have focused on the connected groupoid providing isomorphisms to/from natural numbers, similar techniques can be used to organize bijective transformations in fields ranging from compilation and complexity theory to data compression and cryptography.

We refer to (Tarau 2009) for implementations of a number of other encoders as well as various applications.

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