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DEPT. OF INFORMATION AND COMPUTING SCIENCES

Thesis title

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Declaration

Thanks to family, supervisor, friends and hops!

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Introduction

1.1 INTRODUCTION

A common way of asserting a program's correctness is by defining properties that should universally hold, and asserting these properties over a range of random inputs. This technique is commonly referred to as *property based testing*, and generally consists of a two-step process. Defining properties that universally hold on all inputs, and defining *generators* that sample random values from the space of possible inputs. *QuickCheck* [?] is likely the most well known tool for performing property based tests on Haskell programs.

Although coming up with a set of properties that properly captures a program's behavior might initially seem to be the most involved part of the process, defining suitable generators for complex input data is actually quite difficult as well. Questions such as how to handle datatypes that are inhabited by an infinite number of values arise, or how to deal with constrained input data. The answers to these questions are reasonably well understood for *Algebraic datatypes (ADT's)*, but no general solution exists when more complex input data is required. In particular, little is known about enumerating and generating inhabitants of *Indexed datatypes*.

1.1.1 PROBLEM STATEMENT

Let us consider an example property in the context of *QuickCheck*:

$$\begin{aligned} \text{reverse_preserves_length} &:: [a] \rightarrow \text{Bool} \\ \text{reverse_preserves_length } xs &= \text{length } xs \equiv \text{length } (\text{reverse } xs) \end{aligned}$$

We can *check* this property by taking a collection of lists, and asserting that *reverse_preserves_length* is *true* on all test inputs. Note that any inhabitant of the type $[a]$ can be used test data for *reverse_preserves_length*. However, a problem occurs when we want to test a conditional property:

$$\begin{aligned} \text{insert_preserves_sorted} &:: \text{Int} \rightarrow [\text{Int}] \rightarrow \text{Property} \\ \text{insert_preserves_sorted } x \text{ } xs &= (\text{sorted } xs) \implies \text{sorted } (\text{insert}' x \text{ } xs) \end{aligned}$$

If we invoke *QuickCheck* on (*quickCheck insert_preserves_sorted*), we get the following output:

```
Test.QuickCheck> quickCheck prop_insertPreservesSorted
*** Gave up! Passed only 70 tests; 1000 discarded tests.
```

In essence, two things go wrong here. The obvious problem is that *QuickCheck* is unable to generate a sufficient amount of relevant testcases due to the sparseness of the precondition. The second and

perhaps more subtle problem is that the generated test data for which the precondition holds almost exclusively consists of small values (that is, lists of 0, 1 or 2 elements). These problems make testing both inefficient (in terms of computational power required), as well as ineffective. Obviously, things will only get worse once we require more complex test data.

Data invariants, such as sortedness, can often be represented as an indexed datatype:

```
data Sorted {  $\ell$  } : List N  $\rightarrow$  Set  $\ell$  where
  nil  : Sorted []
  single :  $\forall \{ n : N \} \rightarrow$  Sorted (n :: [])
  step :  $\forall \{ n\ m : N \} \{ xs : List\ N \} \rightarrow n \leq m$ 
         $\rightarrow$  Sorted {  $\ell$  } (m :: xs)  $\rightarrow$  Sorted {  $\ell$  } (n :: m :: xs)
```

This means we can generate test data for properties with a precondition by generating values of a suitable indexed datatype. Or in this case, enumerating all indices for which the datatype is inhabited. A good understanding of how to generate inhabitants of indexed datatypes might aid in the generation of many types of complex test data, such as well-typed program terms.

1.1.2 RESEARCH QUESTIONS AND CONTRIBUTIONS

The general aim of this thesis is to work towards an answer to the following question:

How can we generically enumerate and/or sample values of indexed datatypes?

Obviously, this is quite a broad question, and as such answering it in its entirety is not realistic. Some subproblems worth considering are:

- We know that enumeration and sampling is possible for regular datatypes. QuickCheck [?] and SmallCheck [?] do this to generically derive test data generators. However, the question remains for which universes of indexed datatypes we can do the same.
- For more complex datatypes (such as ASTs or lambda terms), the number of values grows *extremely* fast with their size: there are only a few lambda terms (up to α -equivalence) with depth 1 or 2, but for depth 50 there are a little under 10^{66} [?] distinct terms. How can we efficiently sample or enumerate larger values of such datatypes? Can we apply techniques such as memoization to extend our reach?
- How can insights gained into the enumeration and sampling of indexed datatypes aid in efficient generation of program terms?
- What guarantees about enumeration or sampling can we give? Can we exhaustively enumerate all datatypes, or are there some classes for which this is not possible (if not, why)?

INTENDED RESEARCH CONTRIBUTIONS automatic derivation of generators for at least a subset of indexed datatypes and an implementation in Haskell showing how such derivations can be applied to practical problems.

1.1.3 METHODOLOGY

We use the programming language/proof assistant Agda [?] as our vehicle of choice, with the intention to eventually backport our development to Haskell in order to be able to investigate the practical applications of our insights in the context of program term generation.

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Conclusion

2.1 ONE SECTION

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$$f(n) = \begin{cases} n/2 & , \text{ if } n \text{ is even} \\ 3n + 1 & \text{ otherwise} \end{cases}$$

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$$\sum_{x=1}^j \sqrt{\frac{x+1}{\mathcal{A}}}$$

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By the way ...

3.1 TESTING LITERATE AGDA

3.1.1 DESCRIBING WELL-TYPED Λ TERMS

The following inductive relation can be used to describe all well-typed terms under a certain context, given a goal type:

data $_ \vdash _$ ($\Gamma : Ctx$) : $Ty \rightarrow Set$ **where**

- $[Var] : \forall \{ \tau \} \rightarrow \Gamma \ni \tau \rightarrow \Gamma \vdash \tau$
- $[Abs] : \forall \{ \alpha \tau \sigma \} \rightarrow \Gamma, \alpha : \sigma \vdash \tau \rightarrow \Gamma \vdash \sigma \Rightarrow \tau$
- $[App] : \forall \{ \tau \sigma \} \rightarrow \Gamma \vdash \sigma \Rightarrow \tau \rightarrow \Gamma \vdash \sigma \rightarrow \Gamma \vdash \tau$



Some Formulas

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