# Type-Based Reasoning and Imprecise Errors 

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## Polymorphic Types: An Example in Haskell

A standard function:

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\operatorname{map} f(a: a s) & =(f a):(\operatorname{map} f a s)
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\text { map not }[1,2,3] & \& \text { rejected at compile-time }
\end{array}
$$

## Another Example

```
takeWhile :: (\alpha B Bool) }->[\alpha]->[\alpha
takeWhile p[] = []
takeWhile p (a:as) | pa= =a:(takeWhile pas)
otherwise = []
```


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For every choice of $p, f$, and $I$ :

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\text { takeWhile } p(\operatorname{map} f I)=\operatorname{map} f(\text { takeWhile }(p \circ f) I)
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Provable by induction.

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\text { takeWhile } p(\operatorname{map} f l) & =\operatorname{map} f(\text { takeWhile }(p \circ f) I) \\
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& \text { g }::[\alpha] \\
&(\alpha\rightarrow \text { Bool })
\end{aligned} \rightarrow[\alpha] \rightarrow[\alpha] .[\alpha]
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- That is what was claimed!


## Automatic Generation of Free Theorems

## At http://linux.tcs.inf.tu-dresden.de/~voigt/ft:

This tool allows to generate free theorems for sublanguages of Haskell as described here.
The source code of the underlying library and a shell-based application using it is available here and here.

Please enter a (polymorphic) type, e.g. "(a -> Bool) -> [a] -> [a]" or simply "filter":
|g :: (a -> Bool) -> [a] -> [a]
Please choose a sublanguage of Haskell:

- no bottoms (hence no general recursion and no selective strictness)
© general recursion but no selective strictness
$\bullet$ general recursion and selective strictness
Please choose a theorem style (without effect in the sublanguage with no bottoms):
- equational
$\odot$ inequational
Generate


## Automatic Generation of Free Theorems

## The theorem generated for functions of the type

```
g :: forall a . (a -> Bool) -> [a] -> [a]
```

in the sublanguage of Haskell with no bottoms is:

```
forall t1,t2 in TYPES, R in REL(t1,t2).
    forall p :: t1 -> Bool.
    forall q :: t2 -> Bool.
        (forall (x, y) in R. p x = q y)
        ==> (forall (z, v) in lift{[]}(R).
            (g p z,g q v) in lift{[]}(R))
```

The structural lifting occurring therein is defined as follows:

```
lift{[]}(R)
    ={([], [])}
    u {(x: xs, y : ys) |
        ((x, y) in R) && ((xs, ys) in lift{[]}(R))}
```

Reducing all permissible relation variables to functions yields:

```
forall t1,t2 in TYPES, f :: t1 -> t2.
    forall p :: t1 -> Bool.
        forall q :: t2 -> Bool.
        (forall x :: tl. p x = q (f x))
        ==> (forall y :: [tl]. map f (g p y) =g q (map f y))
```


## DFG-Project VO 1512/1-1



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## Revising Free Theorems

[Wadler, FPCA'89] : for every $\mathrm{g}::(\alpha \rightarrow$ Bool $) \rightarrow[\alpha] \rightarrow[\alpha]$,

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[Johann \& V., POPL'04] : in Haskell only provable if:

- $p \neq \perp$,
- $f$ strict $(f \perp=\perp)$, and
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[Johann \& V., I\&C'09] : taking finite failures into account
[Stenger \& V., TR] : taking imprecise error semantics into account


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- let average $I=\operatorname{div}(\operatorname{sum} /)$ (length $/$ ) in average []


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Traditionally, all error causes subsumed under $\perp$.
Better, explicit distinction. Like:
Ok v : nonerroneous
Bad "..." : finitely failing
$\perp$ : nonterminating

## Propagation of Errors

- tail $[1 / 0,2.5] \rightsquigarrow$ Ok [Ok 2.5]


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Dependence on evaluation order leads to considerably less freedom for implementors to rearrange computations, to optimise!

## Imprecise Error Semantics [Peyton Jones et al., PLDI'99]

Basic idea:
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- $3+(\operatorname{error} s) \rightsquigarrow B a d\{s\}$
- loop $+($ error $s) \rightsquigarrow \perp$
- (error $\left.s_{1}\right)\left(\right.$ error $\left.s_{2}\right) \rightsquigarrow B \operatorname{Bad}\left\{s_{1}, s_{2}\right\}$


## Imprecise Error Semantics [Peyton Jones et al., PLDI'99]

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- case (error $s_{1}$ ) of $\left\{(x, y) \rightarrow\right.$ error $\left.s_{2}\right\} \rightsquigarrow \operatorname{Bad}\left\{s_{1}, s_{2}\right\}$


## Impact on Program Equivalence

"Normally":
takeWhile $p(\operatorname{map} f I)=\operatorname{map} f($ takeWhile $(p \circ f) I)$
where:

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\begin{aligned}
& \text { takeWhile }::(\alpha \rightarrow \text { Bool }) \rightarrow[\alpha] \rightarrow[\alpha] \\
& \text { takeWhile } p[]=[] \\
& \text { takeWhile } p(a: a s) \left\lvert\, \begin{array}{ll}
p a r & =a:(\text { takeWhile } p \text { as }) \\
& \text { otherwise }
\end{array}=[]\right.
\end{aligned}
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Now, imagine this in the following program context:

$$
\begin{aligned}
& \text { catchJust errorCalls (evaluate } \cdots \text { ) } \\
& \qquad \begin{array}{r}
(\lambda s \rightarrow \text { if } s==\text { "empty list" } \\
\text { then return [[42]] } \\
\text { else return []) }
\end{array}
\end{aligned}
$$

## How to Revise Free Theorems?

[Wadler, FPCA'89] : for every $\mathrm{g}::(\alpha \rightarrow$ Bool $) \rightarrow[\alpha] \rightarrow[\alpha]$,

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[Johann \& V., POPL'04]: in Haskell only provable if:

- $p \neq \perp$,
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What are corresponding conditions "in real"?


## Sweat and Tears ...

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(...similarly for "asymmetric" scenarios as well)
... Application to takeWhile
For every $\mathrm{g}::(\alpha \rightarrow$ Bool $) \rightarrow[\alpha] \rightarrow[\alpha]$,

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provided

- $p$ and $f$ are nonerroneous,

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- $p$ and $f$ are nonerroneous,
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- $f$ maps nonerroneous values to nonerroneous values.



## Summary and Outlook

Types:

- constrain the behaviour of programs


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On the programming language side:

- push towards full programming languages
- strive for more expressive type systems

On the practical side:

- efficiency-improving program transformations
- applications in specific domains


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