

Contract Inference for the Ask-Elle Programming Tutor

Master thesis defense under the supervision of Johan Jeuring

Beerend Lauwers

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1. The Ask-Elle programming tutor



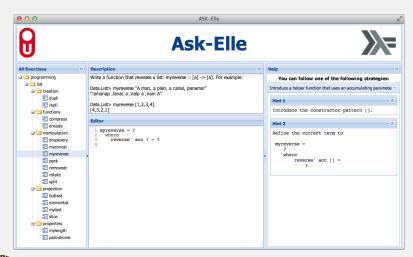


- ► A web-based programming tutor for Haskell
- Developed by Alex Gerdes for his PhD
- Aims to help first-year CS students

How it works:

- A student selects an exercise and Ask-Elle describes the goal
- ► Student writes the program incrementally, leaving holes
- Ask-Elle understands the student's progress and can provide feedback
- Student can ask for hints







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- ► To define an exercise, a teacher provides model solutions.
- Using strategies, Ask-Elle compares a student's code against these model solutions
- ► If a student's code can be reduced to a model solution, Ask-Elle can provide detailed feedback and hints
- ▶ What happens when the student *doesn't* follow a model solution?

No model solution fits the student's solution? QuickCheck!

"Wrong solution: range 4 6 provides a counterexample."

Can we provide richer feedback and offer a more precise location of the programming error?

No model solution fits the student's solution? QuickCheck!

```
"Wrong solution: range 4 6 provides a counterexample."
```

Can we provide richer feedback and offer a more precise location of the programming error? Yes, with contracts!

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2. Contracts



Just like its real-world counterpart, a programming contract stipulates prerequisites and guarantees between two parties:

- ► The function being called (the callee)
- ► The function receiving the result (the caller)

Simple example: the function must only accept natural numbers (a prerequisite) and will always return natural numbers (a guarantee).

And just like in real life, these contracts can be violated.

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Contract violations and blame assignment

When a contract violation occurs, blame must be assigned:

- ▶ Prerequisite violation → blame is on the caller.
- ▶ Guarantee violation \rightarrow blame is on the callee.

Adding contracts to your code:

- Aids in debugging
- Provides automated runtime enforcement of constraints and invariants

We use the typed-contracts contract library by Hinze et al.





2.1 The typed-contracts library





typed-contracts uses a GADT:

```
\mathsf{Prop} \; :: \; \big( \mathsf{a} \; \to \; \boldsymbol{\mathsf{Bool}} \big) \; \to \; \mathsf{Contract} \; \; \mathsf{a}
```

- ▶ Lift a function to a contract
- Defines a constraint or property on a type





Constructing a contract - Function constructor §2.1

Function :: Contract a
$$\rightarrow$$
 (a \rightarrow Contract b) \rightarrow Contract (a \rightarrow b)

- Defines a dependent function contract
- Note the →





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Pair :: Contract a
$$\rightarrow$$
 (a \rightarrow Contract b) \rightarrow Contract (a, b)

- ► Defines a dependent pair
- ▶ Not used in this presentation





```
List :: Contract a \rightarrow Contract [a]
```

▶ Lifts contracts to the list level



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```
Functor :: Functor f \Rightarrow Contract a \rightarrow Contract (f a)
```

- ▶ A container type that can house types of kind $* \rightarrow *$
- ► Examples: Maybe, Just



Constructing a contract - Bifunctor constructor §2.1

- ▶ A container type that can house types of kind $* \rightarrow * \rightarrow *$
- ► Examples: Either, 2-tuple





```
And :: Contract a \rightarrow Contract a
```

- ► Chains contracts together
- ▶ All contracts are asserted when a value is provided





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- ightharpoonup c₁ ightharpoonup c₂ defines a non-dependent function contract
- and <00 use c1 as a contract that must hold on the container in its entirety: an outer contract.</p>
- ► Example: an ordered list

Fundamental contracts:

```
true, false :: Contract a true = Prop (\lambda_- \to True) false = Prop (\lambda_- \to False)
```

A contract that only allows natural numbers:

To attach a contract to a function, we use assert:

```
assert :: \mathbf{String} \rightarrow \mathsf{Contract} \ \mathsf{a} \rightarrow \mathsf{a} \rightarrow \mathsf{a}
```

assert acts as a partial identity function: in the case of a contract violation, an exception is thrown. Otherwise, it acts as identity.

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```
assert :: String \rightarrow Contract a \rightarrow a \rightarrow a
```

```
inc :: Int 
ightarrow Int inc = assert "inc" (nat 
ightarrow nat) (fun (\lambdan 
ightarrow 1 + n))
```

- ▶ (nat → nat) is of type Contract (Int → Int)
- ▶ So, a must be of type (Int \rightarrow Int)
- ▶ fun lifts a single argument to the contract level:

```
\mathsf{fun} \ :: \ (\mathsf{a} \ \to \ \mathsf{b}) \ \to \ (\mathsf{a} \ \to \ \mathsf{b})
```

```
inc :: Int \rightarrow Int inc = assert "inc" (nat \rightarrow nat) (fun (\lambda n \rightarrow 1 + n))
```

We use app to apply values to a contracted function such as inc:

```
app :: (a \rightarrow b) \rightarrow Int \rightarrow a \rightarrow b
```

It also labels the application with a number, used in feedback:

- > app inc 1 5
- > 5
- > app inc 1 (-5)
- > *** Exception: contract failed: the expression labeled '1' is to blame.



3. Contract inference





- ▶ Jurriën Stutterheim describes a way to infer contracts for the components of a function in his thesis.
- ▶ Developed a contract inference algorithm: Algorithm CW
- ightharpoonup Based on Algorithm ${\mathcal W}$ by Damas and Milner
- ► Works on a small let-polymorphic lambda calculus

Three requirements for contract inference:

- Infer a well-typed contract for every component of a program
- Inferred contracts must allow a (non-strict) subset of the values allowed by the types
- ► The most general inferred contract must never fail an assertion



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- ► Contract grammar is library-agnostic
- ▶ They must be translated to a contract library of choice
- ► Instead of fresh type variables, you have fresh *contract* variables



- ▶ Function: id :: $a \rightarrow a$
- ► Contract: $true_1 \rightarrow true_1$
- ▶ Function: const :: $a \rightarrow b \rightarrow a$
- ▶ Contract: $true_1 \rightarrow true_2 \rightarrow true_1$
- ▶ Function: map :: $(a \rightarrow b) \rightarrow [a] \rightarrow [b]$
- ► Contract: $(true_1 \rightarrow true_2) \rightarrow (list_1 < \textcircled{0} true_1) \rightarrow (list_2 < \textcircled{0} true_2)$

Stutterheim's goal: superior feedback in Ask-Elle §3

- ▶ If a student's code does not follow a model solution, the only feedback possible is a QuickCheck counterexample
- ► Stutterheim wanted to express the QuickCheck properties as a contract for the main function
- ► Then use contract inference to infer contracts for the rest of the code
- Generate code that annotates all function applications with contract assertations
- Finally, apply the counterexample to the annotated code
- ► A contract violation occurs and offers a more precise location for the programming error



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4. Expanding on Stutterheim's work





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Limitations present in Stutterheim's system

We address:

- ▶ A system for code generation is left implicit
- Substitutions generated by Algorithm CW are placed in a global set, which may result in generating an inferred contract that causes a violation during assertion

We do not address:

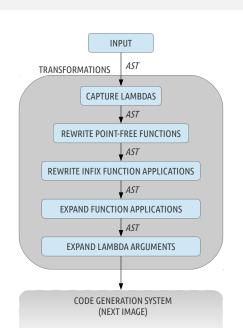
- lacktriangleright Inability of Algorithm \mathcal{CW} to handle dependent contracts
- ► Lack of constant expression contracts
- ► Full integration with the Ask-Elle programming tutor



- ► We extend the contract inference algorithm to the Ask-Elle syntax, based on Helium, producing Algorithm CHW
- ▶ Before performing contract inference, we perform AST transformations to simplify contract inference
- We generate initial contracts that simplify contract inference even further, especially in the case of mutually recursive functions
- Substitutions are divided into two lists: global and local, avoiding the aforementioned contract violation problem
- We provide a system to generate code for the typed-contracts library

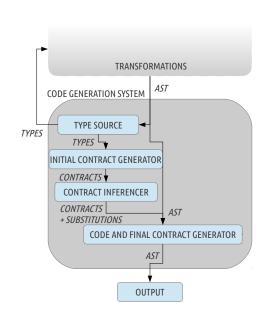
4.1 Framework overview







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4.2 **AST** transformations



- ▶ Anonymous functions cannot be contracted: need a name
- ► Solution: bind all lambda functions to unique identifiers
- ▶ Referential transparency allows this

$$f = \lambda x \rightarrow x$$

is transformed into

$$f = __lam0$$

where
 $__lam0 = \lambda x \rightarrow x$



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- typed-contracts does not support asserting partially applied functions
- all function arguments are made available on the LHS and applied to the RHS
- η-abstraction

```
\begin{array}{ll} f = \ \_ lam0 \\ \textbf{where} \\ \ \_ lam0 = \lambda x \ \rightarrow \ x \end{array}
```

is now transformed into

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- ► Convert infix function applications to regular ones
- Prevent duplicate code for contract inference and code generation
- Removal of syntactic sugar





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- ► Split up function applications with multiple arguments into nested function applications
- ▶ Keeps the contract inference algorithm simple

$$f g \times y z = g \times y z$$

is transformed into

$$| f g \times y z = ((g \times) y) z$$

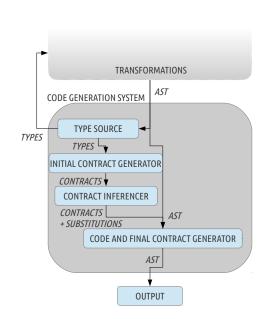
AST transformations - Expand lambda arguments §4.2

- ▶ Split up lambdas with multiple arguments into nested ones
- ► Again, keeps the contract inference algorithm simple

$$f = \lambda g \times y z \rightarrow g \times y z$$

is transformed into

$$f = \lambda g \rightarrow (\lambda x \rightarrow (\lambda y \rightarrow (\lambda z \rightarrow g \times y z)))$$





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4.3 Type source



- ► A type source Ξ is a data structure that may hold information about the type of a node in an AST
- ▶ A node can query the type source for its type with $\Xi(x)$
- ► Types are available for the following AST nodes: Expr, GuardedExpr, Pat, Alt, FunBind and Rhs
- Type information is needed for some AST transformations
- Also useful for generating initial contracts



- ▶ Used to simplify contract inference and code generation
- ► Captures relations between (mutually recursive) functions

Definition:

- Generalized version of the most specific contract for that identifier
- Asserting contract is equal to identity

Stutterheim posits a conjecture:

- ► Any inferred contract in algorithm CW is also the most specific
- Contracts are represented as sets of values they allow
- ► Contract inferred for an expression *e* is a subset of any other contract that is valid (=acts as identity) for *e*

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A generalized most-specific contract:

- ► Every contract variable maps to a $true_i$ contract (so no concrete contracts like nat)
- Relations present in an identifier or expression's type are also present in its contract
- ► We call them initial contracts because they seed the contract environment of Algorithm CHW

Generalized most-specific contracts - Examples §4.3

Initial contracts for id and map:

$$\begin{array}{|c|c|c|c|}\hline ctrt_id = c_0 \rightarrow c_0 \\ ctrt_map = (c_1 \rightarrow c_2) \rightarrow (c_3 <\!\!\! @> c_1) \rightarrow (c_4 <\!\!\! @> c_2) \\ \hline \end{array}$$

Not initial contracts:

$$\begin{array}{ll} \mathsf{ctrt_id} = \mathsf{c}_0 \to \mathsf{c}_1 \\ \mathsf{ctrt_map} = \left(\mathsf{c}_1 \to \mathsf{c}_2\right) \to \left(\mathsf{c}_3 <\!\!@\!\!> \mathsf{c}_4\right) \to \left(\mathsf{c}_5 <\!\!@\!\!> \mathsf{c}_6\right) \end{array}$$

Why?

- ▶ id: relation between input and output is missing
- ▶ map: relation between function, list input and result missing

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4.4 Contract inference



- ▶ Based on Algorithm CW(so also on Algorithm W)
- Works on Ask-Elle syntax
- ▶ Intermediate contract grammar is trimmed: $literal_i$
- Contract variables are implicitly universally quantified
- ▶ Definition of contract environment Γ is the same
- ▶ Use of type source Ξ to seed Γ
- Requirements remain the same (well-typed, subset of type inhabitants, inferred = identity)

- In type inference, Γ is updated with fresh type variables during inference
- ► These variables are later unified to infer the final type
- We need to infer contracts
- ▶ By taking initial contracts as starting point, we can focus on the inference uniquely required by contracts:

$$\mathsf{ctrt}_{\mathsf{-}}\mathsf{map} = (\mathsf{c}_1 \to \mathsf{c}_2) \to (\mathsf{c}_3 < \! \! \otimes \mathsf{c}_1) \to (\mathsf{c}_4 < \! \! \! \otimes \mathsf{c}_2)$$

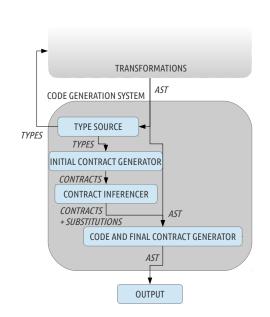
- ightharpoonup Perhaps c_3 and c_4 are the same?
- Cannot derive this from the type, need inference

- lacktriangle Seed Γ with contracts for patterns and function identifiers
- When new identifiers come into scope, these are added as well, shadowing previous ones
- Described in seeding rules





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4.5 Code generation



- ► Library-agnostic code generation system
- ▶ We can generate code for the typed-contracts library
- ► For each function X, we generate three new functions:
 - final_X
 - ___app_X
 - ___contracted_X
- ▶ We will look at an example of each

- ► Transformed copy of the original function definition
- ► Every function application is replaced by its contracted equivalent, the ___app_X template
- Adds position information from code for richer feedback
- ▶ Entry point for all other generated functions

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```
\begin{bmatrix}
f & x = g & x \\
g & x = [x]
\end{bmatrix}
```

Generated code for f x = g x:

```
\begin{array}{lll} -\_final\_f & :: & a \rightarrow & [a] \\ -\_final\_f & x = & \_\_app\_g & ctrt & posg & (posx,x) \end{array}
```

Placeholders:

- ctrt: contract used to assert original function (g, in our case)
- ightharpoonup position of application of g
- posx: Tuple of line and column position of x



- Wraps arguments with a variation of app named appParam
- Passes them to the ___contracted_X template
- ► A fixed template with placeholders that are filled in:

```
\verb|--app_X| ctrt posinfo (argument patterns) = (applied arguments)
```

Placeholders:

- ► (argument patterns): for each pattern p of function X, make a tuple (posp,p)
- ► (applied arguments): wrap arguments with appParam and pass them to ___contracted_X template

Generated code for function definition f x = g x:

```
type LC = Maybe (Int,Int)

__app_f :: Contract (a \rightarrow [a]) \rightarrow LC \rightarrow (LC,a) \rightarrow [a]

__app_f ctrt posinfo (posx,x) =

appParam (__contracted_f ctrt posinfo) (show x ++

generatePositionData posx) x
```

app takes an integer as a position label to use in feedback, appParam takes a string:

```
 \begin{array}{|c|c|c|c|c|c|c|}\hline app :: (a \rightarrow b) \rightarrow Int \rightarrow a \rightarrow b \\ app Param :: (a \rightarrow b) \rightarrow String \rightarrow a \rightarrow b \\ \hline \end{array}
```

- ► Constructs an assertion with the contract provided
- ▶ A fixed template with placeholders that are filled in:

Placeholders:

- function info: String identifying the function responsible for the violation, for feedback purposes
- contracted function definition: Using fun, the function is lifted to a contracted version

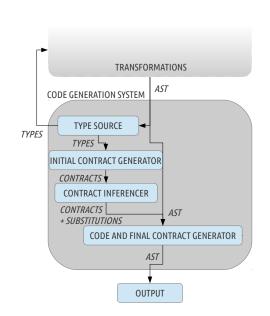


Generated code for function definition f x = g x:

```
__contracted_f :: Contract (a \rightarrow b) \rightarrow LC \rightarrow (a \rightarrow a) __contracted_f ctrt posinfo = assertPos "f" (generatePositionData posinfo) ctrt funs where funs = fun (\lambda x \rightarrow \_\_final\_f x)
```

- assertPos takes position information for more precise feedback
- Remember that ___final_f calls ___app_g

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4.6 Generation of final contracts

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Contract translation and substitution application §4.6

- Remember, inferred contracts are written in an intermediate contract language
- ► Translation to a target library required
- ► First, an example: typed-contracts
- ▶ Then: How substitutions are applied
- ► Translation occurs after substitutions



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Intermediate contract language is inspired by *typed-contracts*' notation, so translation is easy:

- $ightharpoonup true_i
 ightarrow {
 m true}_i$
- $ightharpoonup false_i
 ightarrow ext{false}_i$
- \blacktriangleright (\multimap), (\multimap) and (\multimap) translate directly
- ▶ $literal_i \rightarrow \texttt{true}$ (future work)
- ho_{α} : α is just a string that is printed during code generation

Substitutions in Stutterheim's proof-of-concept §4.6

- ► All substitutions are placed in a global set
- ► In some circumstances, may violate the "inferred = identity" requirement

```
\begin{bmatrix} g \times = [\times] \\ z = (g 'a', g 5) \end{bmatrix}
```

```
\Gamma(z) = true_0 \iff (true_1 \iff isChar, true_2 \iff isNum)
```

During inference:

```
\begin{array}{lll} \Gamma(\mathbf{x}) &=& \mathsf{true}_4 \\ \Gamma(\mathbf{g}) &=& \mathsf{true}_4 \, \rightarrow \, (\mathsf{true}_3 < \!\!\! @ \!\!\! > \, \mathsf{true}_4) \\ \Gamma(\, 'a\, ') &=& \mathsf{true}_5 \\ \Gamma(5) &=& \mathsf{true}_6 \end{array}
```

```
— Unification of first argument of g with 'a' unify (true_4) (true_5)
```

— Unification of first argument of g with 5 unify (true₄) (true₆)



```
    Unification of first argument of g with 'a' unify (true<sub>4</sub>) (true<sub>5</sub>)
    Unification of first argument of g with 5 unify (true<sub>4</sub>) (true<sub>6</sub>)
```

Resulting substitutions: $\mathtt{true}_4 \mapsto \mathtt{true}_5$, $\mathtt{true}_4 \mapsto \mathtt{true}_6$

Apply substitutions to RHS of z, which has contract (true₇ <00> (true₃ <0> true₄)):

- ▶ left-to-right: (true₇ <⑩> (true₃ <⑪> true₅, true₃ <⑪> true₅))
- ▶ right-to-left: (true₇ <</pre>

 (true₃ <</pre>
 true₆))

Unify with contract of z:

```
\begin{array}{c} \text{unify (true}_0 <\!\!@>\!\!@> (true}_1 <\!\!@>\!\!\!> \text{isChar, true}_2 <\!\!@>\!\!\!> \text{isNum))} \\ \text{(true}_7 <\!\!@>\!\!\!> (true}_3 <\!\!@>\!\!\!> \text{true}_5, \text{true}_3 <\!\!@>\!\!\!> \text{true}_5)) \end{array}
```

Relevant substitutions: $\mathtt{true}_5 \mapsto \mathtt{isChar}, \mathtt{true}_5 \mapsto \mathtt{isNum}$

```
\begin{array}{c} \text{unify (true}_0 <\!\!@\!\!> (\text{true}_1 <\!\!@\!\!> \text{isChar}\,, \; \text{true}_2 <\!\!@\!\!> \text{isNum})) \\ \text{(true}_7 <\!\!@\!\!> (\text{true}_3 <\!\!@\!\!> \text{true}_6\,, \; \text{true}_3 <\!\!@\!\!> \text{true}_6)) \end{array}
```

Relevant substitutions: $\mathtt{true}_6 \mapsto \mathtt{isChar}, \mathtt{true}_6 \mapsto \mathtt{isNum}$

Applying these substitutions always results in an incorrect contract:

- ▶ left-to-right: contract of g 5 is (true₁ <⑩> isChar)
- ▶ right-to-left: contract of g 'a' is (true₁ <</p>
 isNum)

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- ► Contract variables are given a flavour of global or local
- $ightharpoonup true_i$ contracts are global
- Concrete contracts (like nat) are local
- Whenever unification takes place, split substitutions into two groups
- lacktriangle Global group: all substitutions from global ightarrow global
- ▶ Local group: all substitutions from global \rightarrow local and local \rightarrow local
- Global group is added to global list (up the AST)
- ► Local group is kept in the node where unification took place, also passed down to children (down the AST)

- ► First, apply globals, then update locals, then apply locals
- ► Applying these substitutions statically presents a problem:

```
f \times = g \times 

g \times = [x] 

z = (f 'a', f 5)
```

- ► The local substitutions that made the contract passed to __app_f more specific, are not utilized by __app_g
- ► Solution: Pass around and apply local substitutions at [Faculty of Science University type] [Faculty of Science University type] [Faculty of Science Information and Computing Sciences]

- ▶ Substitutions only work on intermediate contract language
- ▶ But generated code expects contracts of targeted library!
- Runtime translation of intermediate contract language and target library is required
- typed-contracts contract is defined as a GADT with a phantom type for type-level representation of the contract
- ► Intermediate contract language is a UUAGC-generated regular data type
- ▶ Need a way to recover the extra type information
- Explored several avenues, left as future work

5. Results



- ► The feedback we generate is at least as informative as that of Ask-Elle
- Can't do much if code does not contain any function applications:

```
 \begin{array}{lll} \text{myreverse} & [] &= [] \\ \text{myreverse} & [x,y] &= [x,y] \\ \text{myreverse} & xs &= ? \end{array}
```

Automatically translating QuickCheck properties to contracts is often suboptimal, if doable at all:

```
prop_Main = \lambda xs n \rightarrow n > 0 \Longrightarrow concatMap (replicate n ) xs \Longrightarrow repli xs n
```

Custom contracts offer better feedback capabilities



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The following QuickCheck property is checked, and fails:

```
prop_Main = \lambda xs \rightarrow whenFail (putStrLn "The list elements must be in ascending order.") (isOrdered xs)
```

QuickCheck reports a counterexample of [0,1]



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Our custom contract:

```
\begin{array}{lll} \text{isort\_ctrt} = \big(\text{true} & @> \text{true}\big) \; \mapsto \big(\text{ord} & @> \text{true}\big) \\ \text{where ord} = & \text{PropInfo} \; \big(\lambda x \; \to \; \text{isOrdered} \; x\big) \; \big(\lambda p \; \to \; \\ \text{mkErrorMsg} \; p \; " \; \text{the list elements must be in ascending order."} \big) \end{array}
```

Code is generated, and we apply ___final_isort to [0,1]...

A part of your code, or a supplied argument to a function, does not fulfill a required property. This occurred at the application of the function 'insert' at line number 10, column number 19. The result of this function does not fulfill the following property: the list elements must be in ascending order.

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- ► The issue lies with insert
- Cut down search space a little
- ▶ In bigger programs, search space will be cut down by a lot more

Let's rectify the error (it should be z : z' : zs')...

Let's rectify the error (it should be z : z, z, z, ...

And introduce another by changing z <= z' to z' <= z:

And introduce another by changing z <= z' to z' <= z:

Let's apply the counterexample again...

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A part of your code, or a supplied argument to a function, does not fulfill a required property. This occurred at the application of the function ':' at line number 4, column number 45. The result of this function does not fulfill the following property: the list elements must be in ascending order.

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- ► Something is wrong with z': zs': one of the elements is causing the list to no longer be ordered
- We cannot get closer to the problem: the contract of (<=) is (true → (true → true))</p>
- ▶ Still, far more detailed feedback than Ask-Elle

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6. Future work



- ► Full integration with Ask-Elle
 - Capture QuickCheck counterexamples and make them available to framework
 - Modify exercise configuration files to contain contracts
 - ► Run Prelude through the framework
- Decoupling from Ask-Elle: framework is only tightly bound to Helium for the type source
- ► Initial contract generation algorithm does not support user-defined data types
- ▶ Runtime translation of intermediate contract language
- ▶ Improve algorithm for finding final contracts
- Add support for partially applied function arguments to higher-order functions in code generation
- ▶ Use paramorphisms to tackle dependent contracts



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7. Conclusions



Main objectives:

- Extend Stutterheim's contract inference algorithm to Ask-Elle syntax
- Construct a code generation system

Implementation:

- Constructed a framework coupling contract inference and code generation
- lacktriangle Algorithm \mathcal{CHW} builds upon Algorithm \mathcal{CW}
- Library-agnostic code generation system, little code duplication required
- ► Example implementation for typed-contracts library
- Substitution problem was largely solved





Questions?

