Refinement Types for Elm

Master Thesis Report

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Topics of this Talk

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 - Defining Liquid types
 - Liquid Type Inference
 - The Inference Algorithm for Liquid Types
 - Revisiting the Max Function

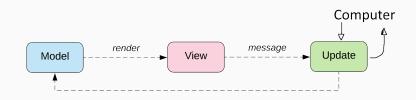
Background: Elm Programming Language

- Invented by Evan Czaplicki as his master-thesis in 2012.
- Goal: Bring Function Programming to Web-Development
- Side-Goal: Learning-friendly design decisions
- Website: elm-lang.org

Characteristics

- Pure Functional Language (immutable, no side effect, everything is a function)
- Compiles to JavaScript (in the future also to WebAssembly)
- ML-like Syntax (we say fun a b c for fun(a, b, c))
- Simpler than Haskell (no Type classes, no Monads, only one way to do a given thing)
- "No Runtimes errors" (running out of memory, function equality and non-terminating functions still give runtime errors.)

Background: The Elm Architecture



Background: Refinement Types

Restricts the values of an existing type using a predicate.

Initial paper in 1991 by Tim Freeman and Frank Pfenning

- Initial concept was done in ML.
- Allows predicates with only $\land, \lor, =$, constants and basic pattern matching.
- Operates over algebraic types.
- Needed to specify explicitly all possible Values.

Example

```
\{a: (Bool, Bool) \mid a = (True, False) \lor a = (False, True)\}\forall t. \{a: List \ t | a = Cons \ (b:t) \ (c: List \ t) \land c = Cons \ (d:t) \ [\ ]\}
```

Background: Liquid Types

Liquid Types (Logically Quantified Data Types) introduced in 2008

- Invented by Patrick Rondan, Ming Kawaguchi and Ranji Jhala
- Initial concept done in OCaml. Later also C, Haskell and TypeScript.
- Operates over Integers and Booleans. Later also Tuples and Functions.
- Allows predicates with logical operators, comparisons and addition.

Example

$$a: \{Bool \mid True\} \rightarrow \{\nu : Bool \mid (a \lor \nu) \land \neg(a \land \nu)\}$$
$$a: \{\nu : Int \mid 0 \le a\} \rightarrow b: \{\nu : Int \mid 0 \le b\}$$
$$\rightarrow \{\nu : Int \mid 0 \le \nu \land a - b \le \nu \land b - a \le \nu\}$$

Goals of Thesis

- 1. Formal language similar to Elm
 - 1.1 A formal syntax
 - 1.2 A formal type system
 - 1.3 A denotational semantic
 - 1.4 A small step semantic (using K Framework) for rapid prototyping the language
 - 1.5 Proof that the type system is valid with respect to the semantics.
- 2. Extension of the formal language with Liquid Types
 - 2.1 Extending the formal syntax, formal type system and denotational semantic
 - 2.2 Proof that the extension infers the correct types.
 - 2.3 A Implementation (of the core algorithm) written in Elm for Elm.

Theory: Formalization of the Elm Type System

We will use the Hindley-Milner type system (used in ML, Haskell and Elm)

We say

T is a mono type : \Leftrightarrow T is a type variable

 \vee T is a type application

 \lor T is a algebraic type

 \vee T is a product type

 \lor T is a function type

T is a poly type : $\Leftrightarrow T = \forall a.T'$

where T' is a mono type or poly type and a is a symbol

T is a type : $\Leftrightarrow T$ is a mono type $\vee T$ is a poly type.

Theory: Formalization of the Elm Type System

Example

- 1. *Nat* ::= μ *C*.1 | *Succ C*
- 2. List = $\forall a.\mu C.Empty \mid Cons \ a \ C$
- 3. splitAt : $\forall a.Nat \rightarrow List \ a \rightarrow (List \ a, List \ a)$

Theory: Formalization of the Elm Type System

The values of a type is the set corresponding to the type:

```
\mathsf{values}(\mathit{Nat}) = \{1, \mathit{Succ}\ 1, \mathit{Succ}\ \mathsf{Succ}\ 1, \dots\} \mathsf{values}(\mathit{List}\ \mathit{Nat}) = \bigcup_{n \in \mathbb{N}} \mathsf{values}_n(\mathit{List}\ \mathit{Nat}) \mathsf{values}_0(\mathit{List}\ \mathit{Nat}) = \{[\ ]\} \mathsf{values}_n(\mathit{List}\ \mathit{Nat}) = \{[\ ]\} \cup \{\mathit{Cons}\ a\ b | a \in \mathsf{values}(\mathit{Nat}), b \in \mathsf{values}_{n-1}(\mathit{List}\ \mathit{Nat})\}
```

Introduction To Elm: Hindley-Milner Type System

The values of a type is the set corresponding to the type:

```
\mathsf{values}(\mathit{Nat}) = \{1, \mathit{Succ}\ 1, \mathit{Succ}\ \mathsf{Succ}\ 1, \dots\}
\mathsf{values}(\mathit{List}\ \mathit{Nat}) = \bigcup_{n \in \mathbb{N}} \mathsf{values}_n(\mathit{List}\ \mathit{Nat})
\mathsf{values}_0(\mathit{List}\ \mathit{Nat}) = \{[\ ]\}
\mathsf{values}_n(\mathit{List}\ \mathit{Nat}) = \{\mathit{Cons}\ a\ b | a \in \mathsf{values}(\mathit{Nat}), b \in \mathsf{values}_{n-1}(\mathit{List}\ \mathit{Nat})\}
```

Introduction To Elm: Order of Types

Let $n, m \in \mathbb{N}$, $T_1, T_2 \in \mathcal{T}$, a_i for all $i \in \mathbb{N}_0^n$ and $b_i \in \mathcal{V}$ for all $i \in \mathbb{N}_0^m$.

We define the partial order \sqsubseteq on poly types as

$$\forall a_1 \dots \forall a_n. T_1 \sqsubseteq \forall b_1 \dots \forall b_m. T_2 :\Leftrightarrow$$

$$\exists \Theta = \{(a_i, S_i) \mid i \in \mathbb{N}_1^n \land a_i \in \mathcal{V} \land S_i \in \mathcal{T}\}.$$

$$T_2 = [T_1]_{\Theta} \land \forall i \in \mathbb{N}_0^m. b_i \notin \text{free}(\forall a_1 \dots \forall a_n. T_1)$$

Example: $\forall a.a \sqsubseteq \forall a.List \ a \sqsubseteq List \ Nat$

Most General Type

$$\begin{split} \overline{\Gamma}:&\Gamma\to\mathcal{T}\\ \overline{\Gamma}(T):=&\forall a_1\dots\forall a_n.\,T_0\\ &\text{such that }\{a_1,\dots,a_n\}=\mathsf{free}(T')\setminus\{a\mid (a,\underline{\ \ \ })\in\Gamma\}\\ &\text{where }a_i\in\mathcal{V}\text{ for }i\in\mathbb{N}_0^n\text{ and }T_0\text{ is the mono type of }T. \end{split}$$

We say $\overline{\Gamma}(T)$ is the most general type of T.

```
max : Int -> Int -> Int;
max =
    \a -> \b ->
    if
        (<) a b
    then
        b
    else
        a</pre>
```

$$\frac{(a,\overline{\Gamma}(T))\in\Delta}{\Gamma,\Delta\vdash a:T}$$

New rules:

$$\overline{\Gamma, \Delta \cup \{(a, \overline{\Gamma}(T))\} \vdash a : T} \quad \overline{\Gamma, \Delta \cup \{(b, \overline{\Gamma}(T))\} \vdash b : T}$$

```
max : Int -> Int -> Int;
max =
  \a -> \b ->
    if
      (<) a b
    then
                           --> a1
      b
    else
                            --> a2
      а
```

$$\frac{\Gamma, \Delta \vdash "(<)" : Int \to Int \to Bool}{\Gamma, \Delta \vdash e_1 : T_1 \to T_2 \quad \Gamma, \Delta \vdash e_2 : T_1}{\Gamma, \Delta \vdash e_1 : T_2}$$

New rule:

$$\frac{\Gamma, \Delta \vdash e_1 : \mathit{Int} \quad \Gamma, \Delta \vdash e_2 : \mathit{Int}}{\Gamma, \Delta \vdash "(<)" \ e_1 \ e_2 : \mathit{Bool}}$$

The most general type of Int is Int

New rule:

$$\Gamma, \Delta \cup \{(\mathtt{a}, \mathit{Int}), (\mathtt{b}, \mathit{Int})\} \vdash "(<) \ \mathtt{a} \ \mathtt{b}" : \mathit{Bool}$$

```
max : Int -> Int -> Int;
max =
  \a -> \b ->
    if
      (<) a b
                            --> Bool
    then
                            --> Int
      b
    else
                            --> Int
      а
```

$$\overline{\Gamma, \Delta \cup \{(a, Int), (b, Int)\}} \vdash "(<)" \ e_1 \ e_2 : Bool$$

$$\underline{\Gamma, \Delta \vdash e_1 : Bool \quad \Gamma, \Delta \vdash e_2 : T \quad \Gamma, \Delta \vdash e_3 : T}_{\Gamma, \Delta \vdash \text{ "if" } e_1 \text{ "then" } e_2 \text{ "else" } e_3 : T}$$

New rule:

$$\overline{\Gamma, \Delta \cup \{(a, Int), (b, Int)\}} \vdash \text{"if}(<) \text{ a b then b else a"} : Int$$

```
max : Int -> Int -> Int;
max =
  \a -> \b ->
    if
                            --> Int
      (<) a b
    then
      b
                            --> Int
    else
                            --> Int
      а
```

$$\frac{\Gamma, \Delta \cup \{(a, \overline{\Gamma}(T_1))\} \vdash e : T_2}{\Gamma, \Delta \vdash " \backslash " \ a " - > " \ e : T_1 \to T_2}$$

The most general type of Int is Int

Therefore we conclude

$$\overline{\Gamma, \Delta \cup \{(a, \mathit{Int})\}} \vdash "ackslash b - \mathsf{sif}\ (<) \ \mathtt{a}\ \mathtt{b}\ \mathtt{then}\ \mathtt{b}\ \mathtt{else}\ \mathtt{a}" : \mathit{Int} o \mathit{Int}$$

$$\Gamma, \Delta \vdash \text{``} \backslash \text{a-} > \backslash \text{b-} > \text{if (<)} \text{ a b then b else a''} : \textit{Int} \to \textit{Int} \to \textit{Int}$$

K Framework

- Created in 2003 by Grigore Rosu
- Maintained and developed by the research groups FSL (Illinois, USA) and FMSE (Lasi, Romania).
- Framework for designing and formalizing programming languages.
- Based on Rewriting systems.

K Framework - K File

```
require "unification.k"
require "elm-syntax.k"
module ELM-TYPESYSTEM
  imports DOMAINS
  imports ELM-SYNTAX
  configuration <k> $PGM:Exp </k>
                <tenv> .Map </tenv>
  //..
  syntax KResult ::= Type
endmodule
```

K Framework - Syntax

syntax denotes a syntax

- strict Evaluate the inner expression first
- right/left Evaluate left/right expression first
- bracket Notation for Brackets

```
syntax Type
  ::= "bool"
    | "int"
    | "{}Type"
    | "{" ListTypeFields "}Type" [strict]
    | Type "->" Type
                           [strict, right]
    | LowerVar
    | "(" Type ")"
                                 [bracket]
```

K Framework - Rules

- rules will be executed top to bottom
- rule . => . denotes a rewriting rule
- . ~> . denotes a concatenation of two processes(KItems)
- . denotes the empty process (rule . ~> A => A)
- requires denotes a precondition to the rule
- ?T denotes an existentially quantified variable

Example for Formally Inferring the Type

```
let
   model = []
in
((::) 1) model
                0. \Gamma := \varnothing, \Delta := \varnothing
      [List] 1. \Gamma, \Delta \vdash [] : \forall a.List a
   [LetIn] 2. \Delta := \Delta \cup (model \mapsto \forall a.List a)
       [Int] 3. \Gamma, \Delta \vdash 1 : Int
     [Call] 4. \Gamma, \Delta \vdash (::) 1 : List Int \rightarrow List Int
[Variable] 5. \Gamma, \Delta \vdash model : \forall a.List a
     [Call] 6. \Gamma, \Delta \vdash ((::) 1) model : List Int
```

Formal Inference Rules - List

```
rule []Exp => list ?A:Type
<k>
let
  model = list ?A0:Type
in
((::) (intExp 1)) (variable model)
</k>
<tenv> .Map </tenv>
```

Formal Inference Rules - LetIn

```
rule <k> let X = T:Type in E => E ~> setTenv(TEnv)
  ...</k>
  <tenv> TEnv
    => TEnv [ X
      <- forall
        (#metaKVariables(T)
          -Set #metaKVariables(setTenv(TEnv)))
        ( #freezeKVariables(T, setTenv(TEnv)):>Type)
  </tenv>
<k>((::) (intExp 1)) (variable model)</k>
<tenv> [model <- forall A0 . (list (#freeze(A0))]</tenv>
```

Formal Inference Rules - Cons, Int

```
rule (::) => ?A:Type -> ( list ?A ) -> ( list ?A )
rule intExp I:Int => int
<k>
((?A1:Type -> ( list ?A1 ) -> ( list ?A1 )) int)
  (variable model)
</k>
<tenv>
  [model <- forall A0 . (list (#freeze(A0))]</pre>
</tenv>
```

Formal Inference Rules - Apply

```
rule E1:Type E2:Type => E1 =Type (E2 -> ?T:Type) ~> ?T

<k>
  (( list int ) -> ( list int )) (variable model)
  </k>
  <tenv>
    [model <- forall A0 . (list (#freeze(A0))]
  </tenv>
```

Formal Inference Rules - Variable

```
rule <k> variable X:Id => #renameMetaKVariables(T, Tvs)
    ...</k>
    <tenv>... X |-> forall Tvs . T
    ...</tenv>
<k>
(( list int ) -> ( list int )) (list ?A2)
</k>
<tenv>
  [model <- forall A0 . (list (#freeze(A0))]</pre>
</tenv>
```

Formal Inference Rules - Apply

```
<k>
list int
</k>
</tenv>
  [model <- forall A0 . (list (#freeze(A0))]
</tenv>
```

Introduction to Liquid Types: Refinement Types

Restricts the values of an existing type using a predicate.

Initial paper in 1991 by Tim Freeman and Frank Pfenning

- Initial concept was done in ML.
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```

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- Operates over Integers and Booleans. Later also Tuples and Functions.
- Allows predicates with logical operators, comparisons and addition.

Example

$$\begin{aligned} \textbf{a}: \textit{Bool} \rightarrow \textbf{b}: \textit{Bool} \rightarrow \{\nu: \textit{Bool} | \nu = (\textbf{a} \lor \textbf{b}) \land \neg (\textbf{a} \land \textbf{b})\} \\ \textbf{a}: \textit{Int} \rightarrow \textbf{b}: \textit{Int} \rightarrow \{\nu: \textit{Int} \\ & | (\nu = \textbf{a} \land \nu > \textbf{b}) \\ & \lor (\nu = \textbf{b} \land \nu > \textbf{a}) \\ & \lor (\nu = \textbf{a} \land \nu = \textbf{b})\} \end{aligned}$$

$$(/): \textit{Int} \rightarrow \{\nu: \textit{Int} | \neg (\nu = \textbf{0})\} \rightarrow \textit{Int}$$

Introduction to Liquid Types: Logical Qualifier Expressions

```
IntExp ::= \mathbb{Z}
             | IntExp + IntExp |
              | IntExp \cdot \mathbb{Z} |
      Q ::= True
              False
             | IntExp < V
             |\mathcal{V}| < IntExp
             | \mathcal{V} = IntExp
             |Q \wedge Q|
              10,40
              |\neg Q|
```

Introduction to Liquid Types: Defining Liquid Types

```
T is a liquid type :\Leftrightarrow T is of form \{a: Int \mid r\} where T_0 is a type, a is a symbol, r \in \mathcal{Q}, Nat := \mu C.1 \mid Succ \ C and Int := \mu \_.0 \mid Pos \ Nat \mid Neg \ Nat. \lor T is of form a : \{b : Int \mid r\} \to \hat{T} where a, b are symbols, r \in \mathcal{Q}, \hat{T} and \hat{T}_1 are liquid types.
```

The Inference Algorithm: Definitions

Subtyping Condition

We say c is a Subtyping Condition : $\Leftrightarrow c$ is of form $\hat{T}_1 <:_{\Theta,\Lambda} \hat{T}_2$ where \hat{T}_1, \hat{T}_2 are a liquid types or templates, Θ is a type variable context and $\Lambda \subset \mathcal{Q}$.

```
max : a: { v:Int|True } -> b: { v:Int|True }
  -> { v:Int | (||) ((&&) ((=) v a) ((>) v b))
              ((||))((\&\&)((=) \lor b)((>) \lor a))
                     ((\&\&) ((=) v a) ((=) v b))
              ) };
max =
  a -> b ->
   if
      (<) a b
    then
      b
    else
      а
```

$$\begin{cases} \{\nu: \hat{T} | \ \nu = a\} <:_{\Theta, \Lambda} \{\nu: \hat{T} | \ r\} \\ \\ \frac{\left(a, \{\nu: \hat{T} | \ r\}\right) \in \Delta \quad \left(a, \{\nu: \hat{T} | \ r\}\right) \in \Theta}{\Gamma, \Delta, \Theta, \Lambda \vdash a: \{\nu: \hat{T} | \ \nu = a\} }$$

New rule:

$$\{\nu: \hat{T} | \ \nu = \mathbf{a}\} <:_{\Theta, \Lambda} \{\nu: \hat{T} | \ r\}$$

$$\underline{(\mathbf{a}, \{\nu: \hat{T} | \ r\}) \in \Delta \quad (\mathbf{a}, \{\nu: \hat{T} | \ r\}) \in \Theta}$$

$$\Gamma, \Delta, \Theta, \Lambda \vdash \mathbf{a}: \{\nu: \hat{T} | \ \nu = \mathbf{a}\}$$

$$\{\nu: \hat{T} | \ \nu = \mathbf{b}\} <:_{\Theta, \Lambda} \{\nu: \hat{T} | \ r\}$$

$$\underline{(\mathbf{b}, \{\nu: \hat{T} | \ r\}) \in \Delta \quad (\mathbf{b}, \{\nu: \hat{T} | \ r\}) \in \Theta}$$

$$\Gamma, \Delta, \Theta, \Lambda \vdash \mathbf{b}: \{\nu: \hat{T} | \ \nu = \mathbf{b}\}$$

```
max : a: { v:Int|True } -> b: { v:Int|True }
  -> { v:Int | (||) ((&&) ((=) v a) ((>) v b))
              ((||))((\&\&)((=) \lor b)((>) \lor a))
                      ((\&\&) ((=) \lor a) ((=) \lor b))
              ) }:
max =
  \a -> \b ->
    if
      (<) a b
    then
               --> {v:Int| True }
      b
    else
               --> {v:Int| True }
      а
```

```
max : a: { v:Int|True } -> b: { v:Int|True }
  -> { v:Int | (||) ((&&) ((=) v a) ((>) v b))
              ((||))((\&\&)((=) \lor b)((>) \lor a))
                      ((\&\&) ((=) \lor a) ((=) \lor b))
              ) }:
max =
  \a -> \b ->
    if
      (<) a b --> Bool
    then
              --> {v:Int| True }
      b
    else
               --> {v:Int| True }
      а
```

New rule:

$$\begin{split} & \{ (a,\{\nu:Int|r_0\}), (b,\{\nu:Int|r_1\}) \} \in \Delta \\ & \Gamma, \Delta, \Theta, \Lambda \cup \{a < b\} \vdash b: \{\nu:Int|r_2\} \\ & \Gamma, \Delta, \Theta, \Lambda \cup \{\neg(a < b)\} \vdash a: \{\nu:Int|r_2\} \\ \hline & \Gamma, \Delta, \Theta, \Lambda \vdash \text{"if" a < b "then"b "else" a: } \{\nu:Int|r_2\} \end{split}$$

$$\{\nu: \hat{T} | \ \nu = a\} <:_{\Theta, \Lambda} \{\nu: \hat{T} | \ r\}$$

$$\underline{ \left(a, \{\nu: \hat{T} | \ r\} \right) \in \Delta \quad \left(a, \{\nu: \hat{T} | \ r\} \right) \in \Theta }$$

$$\overline{ \Gamma, \Delta, \Theta, \Lambda \vdash a: \{\nu: \hat{T} | \ \nu = a\} }$$

$$\{\nu: \hat{T} | \ \nu = b\} <:_{\Theta, \Lambda} \{\nu: \hat{T} | \ r\}$$

$$\underline{ \left(b, \{\nu: \hat{T} | \ r\} \right) \in \Delta \quad \left(b, \{\nu: \hat{T} | \ r\} \right) \in \Theta }$$

$$\overline{ \Gamma, \Delta, \Theta, \Lambda \vdash b: \{\nu: \hat{T} | \ \nu = b\} }$$

$$\{ (a, \{\nu: Int | r_0\}), (b, \{\nu: Int | r_1\}) \} \in \Delta$$

$$\overline{ \Gamma, \Delta, \Theta, \Lambda \cup \{a < b\} \vdash b: \{\nu: Int | r_2\} }$$

$$\overline{ \Gamma, \Delta, \Theta, \Lambda \vdash \text{``if''} \ a < b\text{'`then''} b\text{''else''} \ a: \{\nu: Int | r_2\} }$$

$$\overline{ \Gamma, \Delta, \Theta, \Lambda \vdash \text{``if''} \ a < b\text{'`then''} b\text{''else''} \ a: \{\nu: Int | r_2\} }$$

Subtyping Rule

$$\begin{split} \frac{\Gamma, \Delta, \Theta, \Lambda \vdash e : \hat{T}_1 \quad \hat{T}_1 <_{:\Theta, \Lambda} \quad \hat{T}_2 \quad \text{wellFormed}(\hat{T}_2, \Theta)}{\Gamma, \Delta, \Theta, \Lambda \vdash e : \hat{T}_2} \\ \{a_1 : Int | r_1\} <_{:\Theta, \Lambda} \{a_2 : Int | r_2\} \quad \Leftrightarrow \\ \text{Let } \{(b_1, T_1), \dots, (b_n, T_n)\} = \Theta \text{ in } \\ \forall k_1 \in \text{value}_{\Gamma}(T_1), \dots \forall k_n \in \text{value}_{\Gamma}(T_n), \\ \forall n \in \mathbb{N}. \forall e \in \Lambda. \\ [[e]]_{\{(a_1, n), (b_1, k_1), \dots, (b_n, k_n)\}} \\ \wedge [[r_1]]_{\{(a_2, n), (b_1, k_1), \dots, (b_n, k_n)\}} \\ \Rightarrow [[r_2]]_{\{(a_2, n), (b_1, k_1), \dots, (b_n, k_n)\}} \end{split}$$

Find $r_2 \in \mathcal{Q}$ such that

$$[[((a < b) \land \nu = b) \Rightarrow r_2]]_{\{(a, \{\nu: Int | r_0\}), (b, \{\nu: Int | r_1\})\}}$$

and

$$[[(\neg(a < b) \land \nu = a) \Rightarrow r_2]]_{\{(a,\{\nu:Int|r_0\}),(b,\{\nu:Int|r_1\})\}}$$

are valid.

Use SMT-Solver to find a solution.

Sharpest solution: $r_2 := ((a < \nu \land \nu = b) \lor (\neg(\nu < b) \land \nu = a))$

Template

We say \hat{T} is a $template :\Leftrightarrow \hat{T}$ is of form $\{\nu : Int \mid [k]_S\}$ where $k \in K$ and $S : \mathcal{V} \to \mathcal{O}$

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The Inference Algorithm

$$\begin{split} \mathsf{Infer} &: \mathcal{P}(\mathcal{C}) \to \ (\mathcal{K} \nrightarrow \mathcal{Q}) \\ \mathsf{Infer}(\mathcal{C}) &= \\ \mathsf{Let} \ \ V &:= \bigcup_{\hat{T}_1 <:_{\Theta, \Lambda} \hat{T}_2 \in \mathcal{C}} \{ a \mid (a, \underline{\ \ \ }) \in \Theta \} \\ Q_0 &:= \mathit{Init}(V), \\ A_0 &:= \{ (\kappa, Q_0) \mid \kappa \in \bigcup_{c \in \mathcal{C}} \mathsf{Var}(c) \}, \\ A &:= \mathsf{Solve}(\bigcup_{c \in \mathcal{C}} \mathsf{Split}(c), A_0) \\ &\text{in} \ \{ (\kappa, \bigwedge \mathcal{Q}) \mid (\kappa, \mathcal{Q}) \in A \} \end{split}$$

The Inference Algorithm: Step 1 (Split)

```
Split : \mathcal{C} \nrightarrow \mathcal{P}(\mathcal{C}^-)
\mathsf{Split}(a: \{\nu: \mathsf{Int}|q_1\} \to \hat{T}_2 <:_{\Theta,\Lambda} a: \{\nu: \mathsf{Int}|q_3\} \to \hat{T}_4) =
          \{\{\nu : Int|q_3\} < :_{\Theta,\Lambda} \{\nu : Int|q_1\}\} \cup Split(\hat{T}_2 < :_{\Theta\cup\{\{a,g_2\}\},\Lambda} \hat{T}_4\})
Split(\{\nu : Int|q_1\} <: \Theta. \land \{\nu : Int|q_2\}) =
          \{\{\nu : Int|g_1\} < :_{\Theta \Lambda} \{\nu : Int|g_2\}\}
\mathcal{C} := \{c \mid c \text{ is a subtyping condition}\}\
     C^- := \{ \{ \nu : Int | q_1 \} < :_{\Theta, \Lambda} \{ \nu : Int | q_2 \} \}
                   (q_1 \in \mathcal{Q} \vee q_1 = [k_1]_{S_1} \text{ for } k_1 \in \mathcal{K}, S_1 \in \mathcal{V} \nrightarrow IntExp)
                  \land (q_2 \in \mathcal{Q} \lor q_2 = [k_2]_{S_2} \text{ for } k_2 \in \mathcal{K}, S_2 \in \mathcal{V} \rightarrow IntExp) \}.
```

The Inference Algorithm: Step 2 (Solve)

```
Init : \mathcal{P}(\mathcal{V}) \rightarrow \mathcal{P}(\mathcal{Q})
      Init(V) ::= \{0 < \nu\}
                        \cup \{a < \nu \mid a \in V\}
                        \cup \{ \nu < 0 \}
                        \cup \{ \nu < a \mid a \in V \}
                        \cup \{ \nu = a \mid a \in V \}
                        \cup \{ \nu = 0 \}
                        \cup \{a < \nu \lor \nu = a \mid a \in V\}
                        \cup \{ \nu < a \lor \nu = a \mid a \in V \}
                        \cup \{0 < \nu \lor \nu = 0\}
                        \cup \{ \nu < 0 \lor \nu = 0 \}
                        \cup \{\neg(\nu = a) \mid a \in V\}
                        \cup \{ \neg (\nu = 0) \}
```

The Inference Algorithm: Step 2 (Solve)

Solve :
$$\mathcal{P}(\mathcal{C}^-) \times (\mathcal{K} \to \mathcal{P}(\mathcal{Q})) \to (\mathcal{K} \to \mathcal{P}(\mathcal{Q}))$$

Solve $(C, A) =$
Let $S := \{(k, \bigwedge Q) \mid (k, Q) \in A\}$.
If there exists $(\{\nu : Int \mid q_1\} <:_{\Theta, \Lambda} \{\nu : Int \mid [k_2]_{S_2}\}) \in C$ such that $\neg (\forall z \in \mathbb{Z}. \forall i_1 \in \text{value}_{\Gamma}(\{\nu : Int \mid r'_1\})... \forall i_n \in \text{value}_{\Gamma}(\{\nu : Int \mid r'_n\}).$
 $[[r_1 \land p]]_{\{(\nu, z), (b_1, i_1), ..., (b_n, i_n)\}} \Rightarrow [[r_2]]_{\{(\nu, z), (b_1, i_1), ..., (b_n, i_n)\}})$
then Solve $(C, \text{Weaken}(c, A))$ else A

SMT statement:

$$\left(\left(\bigwedge_{j=0}^{n} [r'_{j}]_{\{(\nu,b_{j})\}}\right) \wedge r_{1} \wedge p\right) \wedge \neg r_{2}$$

with free variables $\nu \in \mathbb{Z}$ and $b_i \in \mathbb{Z}$ for $i \in \mathbb{N}_1^n$.

The Inference Algorithm: Step 3 (Weaken)

SMT statement:

$$\neg((\bigwedge_{i=0}^{n} [r'_{j}]_{\{(\nu,b_{j})\}}) \wedge r_{1} \wedge p) \vee r_{2}$$

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with free variables $\nu \in \mathbb{Z}$ and $b_i \in \mathbb{Z}$ for $i \in \mathbb{N}_1^n$ and $r_2 := [q]_{S_2}$.

Current State

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