

InSynth: Complete Completion using Types and Weights

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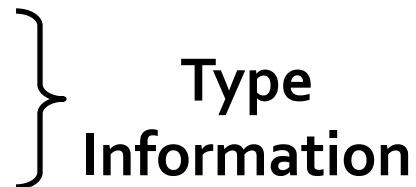
Introduction

- Libraries and APIs - the biggest assets for today's software developers:
 - large number of classes and methods
- Difficult to start using such APIs productively, even for simple tasks
- IDE (Eclipse and IntelliJ):
 - list declarations for a given receiver object
- IntelliJ - compose simple method sequences
- Need to improve modern IDEs

Introduction

- Observation:
 - the developer often has the type of a desired object in mind (backward-directed completion)
 - val a:**InputStream** = new File(name).getInputStream()
- We do not want developer to indicate a starting value (e.g. “new File(name)” as receiver)
- We want to use:
 - All declarations in the current scope
 - Desired type
- Generate full expression:
 - Methods/fields/locals sequence
 - All arguments (e.g. receiver)

InSynth

- Implemented for Scala language
 - Input:
 - Partial Scala program – visible declarations
 - Program point – desired type
 - Output:
 - Code snippets – expression with desired type
 - Runs synthesis algorithm based on resolution to find candidate snippets
 - Handles ground and function types
- 
- Type
Information

Demo

Type Inhabitation Problem

- Given a set of types T and a set of variables A , a type environment is a set

$$\Gamma = \{a_1 : \tau_1, a_2 : \tau_2, \dots, a_n : \tau_n\}$$

where τ_i in T and a_i in A

Type Inhabitation Problem

Given a type environment Γ , a type τ and some calculus, is there are an expression e such that $\Gamma \vdash e : \tau$

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Desired type = List[Int]

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Desired type = List[Int]

List[Int] ?

Succinct Types - Motivation

`m1():Int`

`m2(s: String):Boolean`

`m3(a: Boolean):Int`

`m4(x1: Int, x2: Int, x3: Int):List[Int]`

Desired type = `List[Int]`

`List[Int] ?`

With “ $\tau ?$ ” we denote we search for an expression with type τ .

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Desired type = List[Int]

m4(Int?, Int?, Int?)

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Desired type = List[Int]

m4(m3(Boolean?), Int?, Int?)

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Desired type = List[Int]

m4(m3(m2(String?)), Int?, Int?)

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Desired type = List[Int]

Wrong path!

m4(m3(m2(String?)), Int?, Int?)

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Desired type = List[Int]

m4(Int?, Int?, Int?)

We backtrack!

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Desired type = List[Int]

m4(m1(), Int?, Int?)

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Desired type = List[Int]

m4(m1(), m3(m2(String?)), Int?)

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Desired type = List[Int]

m4(m1(), m3(m2(String?), Int?))

Again, wrong path!

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Desired type = List[Int]

m4(m1(), m1(), Int?)

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Desired type = List[Int]

m4(m1(), m1(), m3(m2(String?)))

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Desired type = List[Int]

Yet again, wrong path!

m4(m1(), m1(), m3(m2(String?)))

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Desired type = List[Int]

m4(m1(), m1(), m1())

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Desired type = List[Int]

m4(m1(), m1(), m1())

We succeed but...

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Desired type = List[Int]

m4(m1(), m1(), m1())

m3(m2(String?))
Explored 3 times!

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Desired type = List[Int]

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Int

{String} → Boolean

{Boolean} → Int

{Int} → List[Int]

Desired type = List[Int]

List[Int]

List[Int] ?

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Int

{String} → Boolean

{Boolean} → Int

{Int} → List[Int]

Desired type = List[Int]

List[Int]

m4{Int?}

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Int

{String} → Boolean

{Boolean} → Int

{Int} → List[Int]

Desired type = List[Int]

List[Int]

m4{m3{Boolean?}}

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Int

{String} → Boolean

{Boolean} → Int

{Int} → List[Int]

Desired type = List[Int]

List[Int]

m4{m3{m2{String?}}}

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Int

{String} → Boolean

{Boolean} → Int

{Int} → List[Int]

Desired type = List[Int]

List[Int]

m4{m3{m2{String?}}}

Wrong path!

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Int

{String} → Boolean

{Boolean} → Int

{Int} → List[Int]

Desired type = List[Int]

List[Int]

m4{Int?}

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Int

{String} → Boolean

{Boolean} → Int

{Int} → List[Int]

Desired type = List[Int]

List[Int]

m4{m1}

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Int

{String} → Boolean

{Boolean} → Int

{Int} → List[Int]

Desired type = List[Int]

List[Int]

m4{m1}

Enough info to construct expression

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Int

{String} → Boolean

{Boolean} → Int

{Int} → List[Int]

Desired type = List[Int]

List[Int]

m4(m1(), m1(), m1())

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Int

{String} → Boolean

{Boolean} → Int

{Int} → List[Int]

Desired type = List[Int]

List[Int]

m4(m1(), m1(), m1())

We succeed and...

Succinct Types - Motivation

m1():Int

m2(s: String):Boolean

m3(a: Boolean):Int

m4(x1: Int, x2: Int, x3: Int):List[Int]

Int

{String} → Boolean

{Boolean} → Int

{Int} → List[Int]

Desired type = List[Int]

List[Int]

m4(m1(), m1(), m1())

m3(m2(String?))

Explored **only once!**

Succinct Types - Definition

- Let B be a set of basic types (Int, Boolean, String, List(Int), and etc)
- Set of Scala/lambda types $\tau(B)$ is defined by grammar:

$$\tau ::= \tau \rightarrow \tau \mid v \qquad v \in B$$

- Set of all **succinct** types $t_s(B)$ is defined by grammar:

$$T_g ::= \{T_g, \dots, T_g\} \rightarrow v \quad v \in B$$

Translation

- With σ we denote the function that converts Scala/lambda into succinct types:

$$\sigma(v) = v$$

$$\sigma(t_1 \rightarrow \dots \rightarrow t_n \rightarrow v) = \{\sigma(t_1), \dots, \sigma(t_n)\} \rightarrow v$$

where $v \in B$ and t_1, \dots, t_n are Scala/lambda types

SCALA DECLARATIONS	SUCCINCT TYPE
<code>val l: List[Int]</code>	<code>List(Int)</code>
<code>def iTs(a: Int, b:Int): String</code>	<code>{Int} → String</code>
<code>def q(g : Int, f: Int=>Boolean): String</code>	<code>{Int, {Int} → Boolean} → String</code>
<code>class A extends B</code>	<code>{A} → B</code>

Translation

- Scala/lambda type environment:

$$\Gamma_0 = \{a_1 : \tau_1, a_2 : \tau_2, \dots, a_n : \tau_n\}$$

- $a : \tau$ - Scala/lambda type declaration
- Translated into succinct type:

$$\sigma(a : \tau) = \sigma(\tau)$$

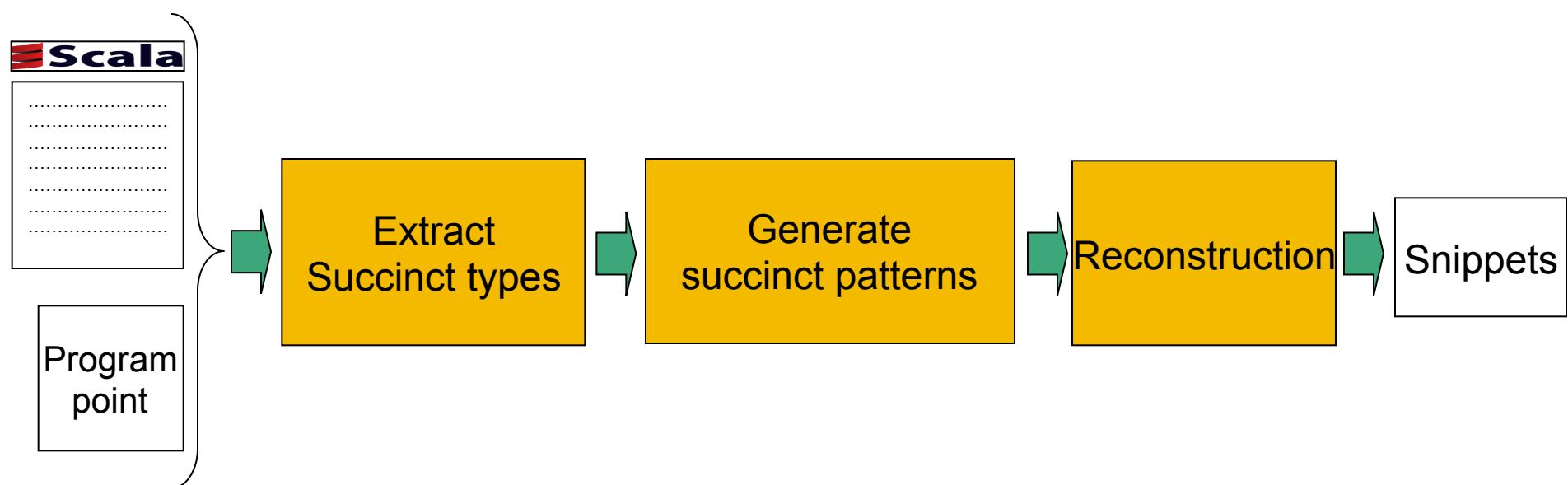
- Then, succinct type environment is:

$$\Gamma = \sigma(\Gamma_0) = \{\sigma(\tau_1), \sigma(\tau_2), \dots, \sigma(\tau_n)\}$$

Succinct Pattern

- Γ - succinct environment
- t_1, \dots, t_n, t are succinct types, and t in B
- Then succinct pattern is:
$$\Gamma @ \{t_1, \dots, t_n\} : t$$
- Records information on *how* t is inhabited in Γ :
 - There is a type $\{t_1, \dots, t_n\} \rightarrow t$ in Γ , where t_1, \dots, t_n are inhabited in Γ

Algorithm



Pattern Generation

Γ_o

m1:Int

m2:Int

m3(c: Char):Boolean

m4(a: Int, f: Char => Boolean):String

m5(d: Double):Long

m6:Double

Desired type = String

Pattern Generation

Translation

Γ_o

m1:Int

m2:Int

m3(c: Char):Boolean

m4(a: Int, f: Char => Boolean):String

m5(d: Double):Long

m6:Double

Int

{Char} → Boolean

{Int, {Char} → Boolean} → String

{Double} → Long

Double

Desired type = String

Desired type = String

Pattern Generation

Γ

Int
 $\{\text{Char}\} \rightarrow \text{Boolean}$
 $\{\text{Int}, \{\text{Char}\} \rightarrow \text{Boolean}\} \rightarrow \text{String}$
 $\{\text{Double}\} \rightarrow \text{Long}$
Double

Desired type = String

Pattern Generation

Patterns

Γ

Int

{Char} → Boolean

{Int, {Char} → Boolean} → String

{Double} → Long

Double



Desired type = String

Pattern Generation

Backward search

Patterns

Γ

Int

{Char} → Boolean

{Int, {Char} → Boolean} → String

{Double} → Long

Double



String?

Desired type = String

Pattern Generation

Backward search

Patterns

Γ

$\Gamma @ \{$

?

$\} : \text{String}$

Int

$\{\text{Char}\} \rightarrow \text{Boolean}$

$\{\text{Int}, \{\text{Char}\} \rightarrow \text{Boolean}\} \rightarrow \text{String}$

$\{\text{Double}\} \rightarrow \text{Long}$

Double

String?

Desired type = String

Pattern Generation

Use type to guess pattern

Patterns

Γ

$\Gamma @ \{$

?

$\} : \text{String}$

Int

$\{\text{Char}\} \rightarrow \text{Boolean}$

$\{\text{Int}, \{\text{Char}\} \rightarrow \text{Boolean}\} \rightarrow \text{String}$

$\{\text{Double}\} \rightarrow \text{Long}$

Double

String?

Desired type = String

Pattern Generation

Patterns

Γ

$\Gamma @ \{ \text{Int}?, (\{\text{Char}\} \rightarrow \text{Boolean})? \}: \text{String}$

Int

$\{\text{Char}\} \rightarrow \text{Boolean}$

$\{\text{Int}, \{\text{Char}\} \rightarrow \text{Boolean}\} \rightarrow \text{String}$

$\{\text{Double}\} \rightarrow \text{Long}$

Double

String?

Desired type = String

Pattern Generation

Patterns

Γ

$\Gamma @ \{ ? \} : \text{Int}$

$\Gamma @ \{ \text{Int}?, (\{\text{Char}\} \rightarrow \text{Boolean})? \} : \text{String}$

Int

$\{\text{Char}\} \rightarrow \text{Boolean}$

$\{\text{Int}, \{\text{Char}\} \rightarrow \text{Boolean}\} \rightarrow \text{String}$

$\{\text{Double}\} \rightarrow \text{Long}$

Double

String?

Desired type = String

Pattern Generation

Patterns

Γ

$\Gamma@\{ \}: \text{Int}$

$\Gamma@\{ \text{Int?}, (\{\text{Char}\} \rightarrow \text{Boolean})? \}: \text{String}$

Int

$\{\text{Char}\} \rightarrow \text{Boolean}$

$\{\text{Int}, \{\text{Char}\} \rightarrow \text{Boolean}\} \rightarrow \text{String}$

$\{\text{Double}\} \rightarrow \text{Long}$

Double

String?

Desired type = String

Pattern Generation

Function type

Patterns

Γ

$\Gamma @ \{ \} : \text{Int}$

$\Gamma @ \{ \text{Int}, (\{\text{Char}\} \rightarrow \text{Boolean})? \} : \text{String}$

Int

$\{\text{Char}\} \rightarrow \text{Boolean}$

$\{\text{Int}, \{\text{Char}\} \rightarrow \text{Boolean}\} \rightarrow \text{String}$

$\{\text{Double}\} \rightarrow \text{Long}$

Double

String?

Desired type = String

Pattern Generation

Extend environment and
search for Boolean expression

Patterns

Γ

$\Gamma@{}\text{:Int}$

$\Gamma@\{\text{Int, }\{\text{Char}\} \rightarrow (\text{Boolean})?\text{:String}}$

Int

$\{\text{Char}\} \rightarrow \text{Boolean}$

$\{\text{Int, }\{\text{Char}\} \rightarrow \text{Boolean}\} \rightarrow \text{String}$

$\{\text{Double}\} \rightarrow \text{Long}$

Double

String?

Desired type = String

Pattern Generation

Extend environment

Patterns

Γ

$\Gamma @ \{ \} : \text{Int}$

$\Gamma @ \{ \} : \text{Int}$, $\{ \text{Char} \} \rightarrow (\text{Boolean})? \} : \text{String}$

Int

$\{ \text{Char} \} \rightarrow \text{Boolean}$

$\{ \text{Int}, \{ \text{Char} \} \rightarrow \text{Boolean} \} \rightarrow \text{String}$

$\{ \text{Double} \} \rightarrow \text{Long}$

Double

String?

Desired type = String

Pattern Generation

Extend environment

Patterns

Γ

$\Gamma @ \{ \} : \text{Int}$

$(\Gamma \cup \{\text{Char}\})$

$\Gamma @ \{ \text{Int}, \{\text{Char}\} \rightarrow (\text{Boolean})? \} : \text{String}$

Int

$\{\text{Char}\} \rightarrow \text{Boolean}$

$\{\text{Int}, \{\text{Char}\} \rightarrow \text{Boolean}\} \rightarrow \text{String}$

$\{\text{Double}\} \rightarrow \text{Long}$

Double

String?

Desired type = String

Pattern Generation

Search for Boolean expression

Patterns

Γ

$\Gamma @ \{ \} : \text{Int}$

$(\Gamma \cup \{\text{Char}\}) @ \{ ? \} : \text{Boolean}$

$\Gamma @ \{ \text{Int}, \{\text{Char}\} \rightarrow (\text{Boolean})? \} : \text{String}$

Int

$\{\text{Char}\} \rightarrow \text{Boolean}$

$\{\text{Int}, \{\text{Char}\} \rightarrow \text{Boolean}\} \rightarrow \text{String}$

$\{\text{Double}\} \rightarrow \text{Long}$

Double

String?

Desired type = String

Pattern Generation

Patterns

Γ

$\Gamma @ \{ \} : \text{Int}$

$(\Gamma \cup \{\text{Char}\}) @ \{\text{Char?}\} : \text{Boolean}$

$\Gamma @ \{ \text{Int}, \{\text{Char}\} \rightarrow (\text{Boolean})? \} : \text{String}$

Int

$\{\text{Char}\} \rightarrow \text{Boolean}$

$\{\text{Int}, \{\text{Char}\} \rightarrow \text{Boolean}\} \rightarrow \text{String}$

$\{\text{Double}\} \rightarrow \text{Long}$

Double

String?

Desired type = String

Pattern Generation

Patterns

$\Gamma @ \{ \} : \text{Int}$

$(\Gamma \cup \{\text{Char}\}) @ \{ ? \} : \text{Char}$

$(\Gamma \cup \{\text{Char}\}) @ \{\text{Char}? \} : \text{Boolean}$

$\Gamma @ \{ \text{Int}, \{\text{Char}\} \rightarrow (\text{Boolean})? \} : \text{String}$

Γ

Int

$\{\text{Char}\} \rightarrow \text{Boolean}$

$\{\text{Int}, \{\text{Char}\} \rightarrow \text{Boolean}\} \rightarrow \text{String}$

$\{\text{Double}\} \rightarrow \text{Long}$

Double

String?

Desired type = String

Pattern Generation

Patterns

$\Gamma @ \{ \} : \text{Int}$
 $(\Gamma \cup \{\text{Char}\}) @ \{ \} : \text{Char}$
 $(\Gamma \cup \{\text{Char}\}) @ \{\text{Char?}\} : \text{Boolean}$
 $\Gamma @ \{ \text{Int}, \{\text{Char}\} \rightarrow (\text{Boolean})? \} : \text{String}$

Int
 $\{\text{Char}\} \rightarrow \text{Boolean}$
 $\{\text{Int}, \{\text{Char}\} \rightarrow \text{Boolean}\} \rightarrow \text{String}$
 $\{\text{Double}\} \rightarrow \text{Long}$
Double



String?

Desired type = String

Pattern Generation

Patterns

$\Gamma @ \{ \} : \text{Int}$

$(\Gamma \cup \{\text{Char}\}) @ \{ \} : \text{Char}$

$(\Gamma \cup \{\text{Char}\}) @ \{\text{Char}\} : \text{Boolean}$

$\Gamma @ \{ \text{Int}, \{\text{Char}\} \rightarrow (\text{Boolean})? \} : \text{String}$

Γ

Int

$\{\text{Char}\} \rightarrow \text{Boolean}$

$\{\text{Int}, \{\text{Char}\} \rightarrow \text{Boolean}\} \rightarrow \text{String}$

$\{\text{Double}\} \rightarrow \text{Long}$

Double

String?

Desired type = String

Pattern Generation

Patterns

$\Gamma @ \{ \} : \text{Int}$
 $(\Gamma \cup \{\text{Char}\}) @ \{ \} : \text{Char}$
 $(\Gamma \cup \{\text{Char}\}) @ \{\text{Char}\} : \text{Boolean}$
 $\Gamma @ \{ \text{Int}, \{\text{Char}\} \rightarrow \text{Boolean} \} : \text{String}$

Γ

Int
 $\{\text{Char}\} \rightarrow \text{Boolean}$
 $\{\text{Int}, \{\text{Char}\} \rightarrow \text{Boolean}\} \rightarrow \text{String}$
 $\{\text{Double}\} \rightarrow \text{Long}$
Double

String?

Desired type = String

Pattern Generation

Patterns

$\Gamma @ \{ \} : \text{Int}$
 $(\Gamma \cup \{\text{Char}\}) @ \{ \} : \text{Char}$
 $(\Gamma \cup \{\text{Char}\}) @ \{\text{Char}\} : \text{Boolean}$
 $\Gamma @ \{ \text{Int}, \{\text{Char}\} \rightarrow \text{Boolean} \} : \text{String}$

Γ

Int
 $\{\text{Char}\} \rightarrow \text{Boolean}$
 $\{\text{Int}, \{\text{Char}\} \rightarrow \text{Boolean}\} \rightarrow \text{String}$
 $\{\text{Double}\} \rightarrow \text{Long}$
Double

Success! We can synthesize
a snippet with type String.

Desired type = String

Pattern Generation

Patterns

$\Gamma @ \{ \} : \text{Int}$
 $(\Gamma \cup \{\text{Char}\}) @ \{ \} : \text{Char}$
 $(\Gamma \cup \{\text{Char}\}) @ \{\text{Char}\} : \text{Boolean}$
 $\Gamma @ \{ \text{Int}, \{\text{Char}\} \rightarrow \text{Boolean} \} : \text{String}$

Γ

Int
 $\{\text{Char}\} \rightarrow \text{Boolean}$
 $\{\text{Int}, \{\text{Char}\} \rightarrow \text{Boolean}\} \rightarrow \text{String}$
 $\{\text{Double}\} \rightarrow \text{Long}$
Double

Backward search benefit!

Desired type = String

Reconstruction

Patterns

$\Gamma @ \{ \} : \text{Int}$
 $(\Gamma \cup \{\text{Char}\}) @ \{ \} : \text{Char}$
 $(\Gamma \cup \{\text{Char}\}) @ \{\text{Char}\} : \text{Boolean}$
 $\Gamma @ \{ \text{Int}, \{\text{Char}\} \rightarrow \text{Boolean} \} : \text{String}$

Partial expressions

Γ_0



$m1 : \text{Int}$
 $m2 : \text{Int}$
 $m3(c : \text{Char}) : \text{Boolean}$
 $m4(a : \text{Int}, f : \text{Char} \Rightarrow \text{Boolean}) : \text{String}$
 $m5(d : \text{Double}) : \text{Long}$
 $m6 : \text{Double}$

Desired type = String

Reconstruction

Patterns

$\Gamma @ \{ \} : \text{Int}$
 $(\Gamma \cup \{\text{Char}\}) @ \{ \} : \text{Char}$
 $(\Gamma \cup \{\text{Char}\}) @ \{\text{Char}\} : \text{Boolean}$
 $\Gamma @ \{\text{Int}, \{\text{Char}\} \rightarrow \text{Boolean} \} : \text{String}$

Partial expressions

Γ_0

m1:Int
m2:Int
m3(c: Char):Boolean
m4(a: Int, f: Char \Rightarrow Boolean):String
m5(d: Double):Long
m6:Double



[]:String

HOLE

Desired type = String

Reconstruction

Patterns

$\Gamma @ \{ \} : \text{Int}$

$(\Gamma \cup \{\text{Char}\}) @ \{ \} : \text{Char}$

$(\Gamma \cup \{\text{Char}\}) @ \{\text{Char}\} : \text{Boolean}$

$\Gamma @ \{\text{Int}, \{\text{Char}\} \rightarrow \text{Boolean} \} : \text{String}$

Partial expressions

Γ_0



$[] : \text{String}$

$m1 : \text{Int}$

$m2 : \text{Int}$

$m3(c : \text{Char}) : \text{Boolean}$

$m4(a : \text{Int}, f : \text{Char} \Rightarrow \text{Boolean}) : \text{String}$

$m5(d : \text{Double}) : \text{Long}$

$m6 : \text{Double}$

Desired type = String

Reconstruction

Patterns

$\Gamma @ \{ \} : \text{Int}$

$(\Gamma \cup \{\text{Char}\}) @ \{ \} : \text{Char}$

$(\Gamma \cup \{\text{Char}\}) @ \{\text{Char}\} : \text{Boolean}$

$\Gamma @ \{\text{Int}, \{\text{Char}\} \rightarrow \text{Boolean} \} : \text{String}$

Partial expressions

Γ_0



$[] : \text{String}$

$m1 : \text{Int}$

$m2 : \text{Int}$

$m3(c : \text{Char}) : \text{Boolean}$

$m4(a : \text{Int}, f : \text{Char} \Rightarrow \text{Boolean}) : \text{String}$

$m5(d : \text{Double}) : \text{Long}$

$m6 : \text{Double}$

Desired type = String

Reconstruction

Patterns

$\Gamma @ \{ \} : \text{Int}$

$(\Gamma \cup \{\text{Char}\}) @ \{ \} : \text{Char}$

$(\Gamma \cup \{\text{Char}\}) @ \{\text{Char}\} : \text{Boolean}$

$\Gamma @ \{ \text{Int}, \{\text{Char}\} \rightarrow \text{Boolean} \} : \text{String}$

Partial expressions

Γ_0

$m1 : \text{Int}$

$m2 : \text{Int}$

$m3(c : \text{Char}) : \text{Boolean}$

$m4(a : \text{Int}, f : \text{Char} \Rightarrow \text{Boolean}) : \text{String}$

$m5(d : \text{Double}) : \text{Long}$

$m6 : \text{Double}$



$m4([] : \text{Int}, [] : \text{Char} \Rightarrow \text{Boolean})$

Desired type = String

Reconstruction

Patterns

$\Gamma @ \{ \} : \text{Int}$

$(\Gamma \cup \{\text{Char}\}) @ \{ \} : \text{Char}$

$(\Gamma \cup \{\text{Char}\}) @ \{\text{Char}\} : \text{Boolean}$

$\Gamma @ \{\text{Int}, \{\text{Char}\} \rightarrow \text{Boolean} \} : \text{String}$

Partial expressions

Γ_0

$m1 : \text{Int}$

$m2 : \text{Int}$

$m3(c : \text{Char}) : \text{Boolean}$

$m4(a : \text{Int}, f : \text{Char} \Rightarrow \text{Boolean}) : \text{String}$

$m5(d : \text{Double}) : \text{Long}$

$m6 : \text{Double}$



$m4([] : \text{Int}, [] : \text{Char} \Rightarrow \text{Boolean})$

Desired type = String

Reconstruction

Patterns

$\Gamma @ \{ \} : \text{Int}$

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$(\Gamma \cup \{\text{Char}\}) @ \{\text{Char}\} : \text{Boolean}$

$\Gamma @ \{\text{Int}, \{\text{Char}\} \rightarrow \text{Boolean} \} : \text{String}$

Partial expressions

Γ_0



$m1 : \text{Int}$

$m2 : \text{Int}$

$m3(c : \text{Char}) : \text{Boolean}$

$m4(a : \text{Int}, f : \text{Char} \Rightarrow \text{Boolean}) : \text{String}$

$m5(d : \text{Double}) : \text{Long}$

$m6 : \text{Double}$

$m4([] : \text{Int}, [] : \text{Char} \Rightarrow \text{Boolean})$

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$m6 : \text{Double}$



Partial expressions

$m4(m1, [] : \text{Char} \Rightarrow \text{Boolean})$

$m4(m2, [] : \text{Char} \Rightarrow \text{Boolean})$

Desired type = String

Reconstruction

Patterns

$\Gamma @ \{ \} : \text{Int}$
 $(\Gamma \cup \{\text{Char}\}) @ \{ \} : \text{Char}$
 $(\Gamma \cup \{\text{Char}\}) @ \{\text{Char}\} : \text{Boolean}$
 $\Gamma @ \{ \text{Int}, \{\text{Char}\} \rightarrow \text{Boolean} \} : \text{String}$

Partial expressions

$m4(m1, [] : \text{Char} \Rightarrow \text{Boolean})$

Γ_o



$m1 : \text{Int}$
 $m2 : \text{Int}$
 $m3(c : \text{Char}) : \text{Boolean}$
 $m4(a : \text{Int}, f : \text{Char} \Rightarrow \text{Boolean}) : \text{String}$
 $m5(d : \text{Double}) : \text{Long}$
 $m6 : \text{Double}$

$m4(m2, [] : \text{Char} \Rightarrow \text{Boolean})$

Desired type = String

Reconstruction

Patterns

$\Gamma @ \{ \} : \text{Int}$
 $(\Gamma \cup \{\text{Char}\}) @ \{ \} : \text{Char}$
 $(\Gamma \cup \{\text{Char}\}) @ \{\text{Char}\} : \text{Boolean}$
 $\Gamma @ \{ \text{Int}, \{\text{Char}\} \rightarrow \text{Boolean} \} : \text{String}$

Partial expressions

$m4(m1, (x: \text{Char}) \Rightarrow [] : \text{Boolean})$

Γ_0



$m1 : \text{Int}$
 $m2 : \text{Int}$
 $m3(c: \text{Char}) : \text{Boolean}$
 $m4(a: \text{Int}, f: \text{Char} \Rightarrow \text{Boolean}) : \text{String}$
 $m5(d: \text{Double}) : \text{Long}$
 $m6 : \text{Double}$

$m4(m2, (x: \text{Char}) \Rightarrow [] : \text{Boolean})$

Desired type = String

Reconstruction

Patterns

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$(\Gamma \cup \{\text{Char}\}) @ \{\text{Char}\} : \text{Boolean}$

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$m4(a : \text{Int}, f : \text{Char} \Rightarrow \text{Boolean}) : \text{String}$

$m5(d : \text{Double}) : \text{Long}$

$m6 : \text{Double}$



Partial expressions

$m4(m1, (x : \text{Char}) \Rightarrow [] : \text{Boolean})$

$m4(m2, (x : \text{Char}) \Rightarrow [] : \text{Boolean})$

Desired type = String

Reconstruction

Patterns

$\Gamma @ \{ \} : \text{Int}$

$(\Gamma \cup \{\text{Char}\}) @ \{ \} : \text{Char}$

$(\Gamma \cup \{\text{Char}\}) @ \{\text{Char}\} : \text{Boolean}$

$\Gamma @ \{\text{Int}, \{\text{Char}\} \rightarrow \text{Boolean} \} : \text{String}$

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$m2 : \text{Int}$

$m3(c : \text{Char}) : \text{Boolean}$

$m4(a : \text{Int}, f : \text{Char} \Rightarrow \text{Boolean}) : \text{String}$

$m5(d : \text{Double}) : \text{Long}$

$m6 : \text{Double}$

Desired type = String

Partial expressions

$m4(m1, (x : \text{Char}) \Rightarrow [] : \text{Boolean})$



$m4(m2, (x : \text{Char}) \Rightarrow [] : \text{Boolean})$

Reconstruction

Patterns

$\Gamma @ \{ \} : \text{Int}$

$(\Gamma \cup \{\text{Char}\}) @ \{ \} : \text{Char}$

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$m1 : \text{Int}$

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$m3(c : \text{Char}) : \text{Boolean}$

$m4(a : \text{Int}, f : \text{Char} \Rightarrow \text{Boolean}) : \text{String}$

$m5(d : \text{Double}) : \text{Long}$

$m6 : \text{Double}$



Partial expressions

$m4(m1, (x : \text{Char}) \Rightarrow m3([: \text{Char}))$

$m4(m2, (x : \text{Char}) \Rightarrow m3([: \text{Char}))$

Desired type = String

Reconstruction

Patterns

$\Gamma @ \{ \} : \text{Int}$
 $(\Gamma \cup \{\text{Char}\}) @ \{ \} : \text{Char}$
 $(\Gamma \cup \{\text{Char}\}) @ \{\text{Char}\} : \text{Boolean}$
 $\Gamma @ \{ \text{Int}, \{\text{Char}\} \rightarrow \text{Boolean} \} : \text{String}$

Partial expressions

$m4(m1, (x: \text{Char}) \Rightarrow m3([\] : \text{Char}))$

Γ_0



$m1 : \text{Int}$
 $m2 : \text{Int}$
 $m3(c: \text{Char}) : \text{Boolean}$
 $m4(a: \text{Int}, f: \text{Char} \Rightarrow \text{Boolean}) : \text{String}$
 $m5(d: \text{Double}) : \text{Long}$
 $m6 : \text{Double}$

$m4(m2, (x: \text{Char}) \Rightarrow m3([\] : \text{Char}))$

Desired type = String

Reconstruction

Patterns

$\Gamma @ \{ \} : \text{Int}$

$(\Gamma \cup \{\text{Char}\}) @ \{ \} : \text{Char}$

$(\Gamma \cup \{\text{Char}\}) @ \{\text{Char}\} : \text{Boolean}$

$\Gamma @ \{ \text{Int}, \{\text{Char}\} \rightarrow \text{Boolean} \} : \text{String}$

Partial expressions

$m4(m1, (x: \text{Char}) \Rightarrow m3([] : \text{Char}))$

Γ_0



$m1 : \text{Int}$

$m2 : \text{Int}$

$m3(c : \text{Char}) : \text{Boolean}$

$m4(a : \text{Int}, f : \text{Char} \Rightarrow \text{Boolean}) : \text{String}$

$m5(d : \text{Double}) : \text{Long}$

$m6 : \text{Double}$

$m4(m2, (x : \text{Char}) \Rightarrow m3([] : \text{Char}))$

Desired type = String

Reconstruction

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$\Gamma @ \{ \} : \text{Int}$

$(\Gamma \cup \{\text{Char}\}) @ \{ \} : \text{Char}$

$(\Gamma \cup \{\text{Char}\}) @ \{\text{Char}\} : \text{Boolean}$

$\Gamma @ \{ \text{Int}, \{\text{Char}\} \rightarrow \text{Boolean} \} : \text{String}$

Γ_0

$m1 : \text{Int}$

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$m4(a : \text{Int}, f : \text{Char} \Rightarrow \text{Boolean}) : \text{String}$

$m5(d : \text{Double}) : \text{Long}$

$m6 : \text{Double}$

Desired type = String

Partial expressions

$m4(m1, (x : \text{Char}) \Rightarrow m3([: \text{Char}))$



$m4(m2, (x : \text{Char}) \Rightarrow m3([: \text{Char}))$

Reconstruction

Patterns

$\Gamma @ \{ \} : \text{Int}$

$(\Gamma \cup \{\text{Char}\}) @ \{ \} : \text{Char}$

$(\Gamma \cup \{\text{Char}\}) @ \{\text{Char}\} : \text{Boolean}$

$\Gamma @ \{ \text{Int}, \{\text{Char}\} \rightarrow \text{Boolean} \} : \text{String}$

Γ_0

$m1 : \text{Int}$

$m2 : \text{Int}$

$m3(c : \text{Char}) : \text{Boolean}$

$m4(a : \text{Int}, f : \text{Char} \Rightarrow \text{Boolean}) : \text{String}$

$m5(d : \text{Double}) : \text{Long}$

$m6 : \text{Double}$

Partial expressions

$m4(m1, (x : \text{Char}) \Rightarrow m3(x))$



$m4(m2, (x : \text{Char}) \Rightarrow m3(x))$

Desired type = String

Reconstruction

Patterns

$\Gamma @ \{ \} : \text{Int}$
 $(\Gamma \cup \{\text{Char}\}) @ \{ \} : \text{Char}$
 $(\Gamma \cup \{\text{Char}\}) @ \{\text{Char}\} : \text{Boolean}$
 $\Gamma @ \{\text{Int}, \{\text{Char}\} \rightarrow \text{Boolean} \} : \text{String}$

Expressions

$m4(m1, (x: \text{Char}) \Rightarrow m3(x))$

Γ_0



$m1 : \text{Int}$
 $m2 : \text{Int}$
 $m3(c: \text{Char}) : \text{Boolean}$
 $m4(a: \text{Int}, f: \text{Char} \Rightarrow \text{Boolean}) : \text{String}$
 $m5(d: \text{Double}) : \text{Long}$
 $m6 : \text{Double}$

$m4(m2, (x: \text{Char}) \Rightarrow m3(x))$

Desired type = String

Completeness and Complexity

Type Inhabitation [Statman, 1979]

- the problem is PSPACE-complete

Theorem

The type inhabitation in ground applicative calculus without generating lambda expressions can be solved in polynomial time.

- For the case when we generate lambda expressions as well, we implemented a complete algorithm

Quantitative Type Inhabitation Problem

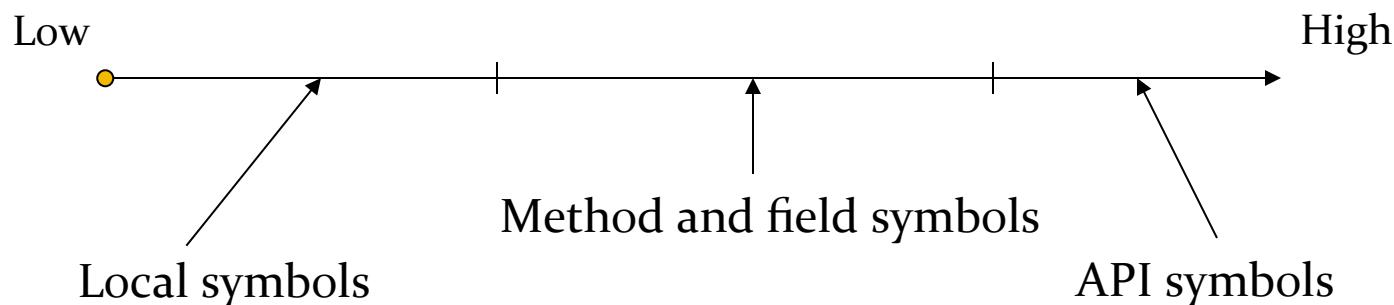
Quantitative Type Inhabitation Problem

Given a type environment Γ , a type τ and some calculus, is there are an expression e such that $\Gamma \vdash e : \tau$, and such that e is the “best possible”

- to all type assumptions we assign the weight
- a lower the weight indicates a more relevant term
- weight of a term or a type is computed as the sum of the weights of all symbols

System of Weights

- Symbol weights – used for ranking solution and for directing the search
- Weight of a term is computed based on
 - precomputed term weights - frequency
 - proximity to the program point where the tool is invoked



Evaluation

- 50 benchmarks
- Expected expressions appears
- Among top 10 snippet in 96%
- As a top snippet in 64%
- Average execution time 145ms
- Weights drastically improve the results

Conclusion

- **InSynth** - the interactively deployed synthesis tool in Eclipse for Scala:
 - Ground and function types
 - Weights indicating preferences
- New succinct representation
- Soundness and relative completeness
- We have found to be fast enough and helpful in synthesizing meaningful code fragments

<http://lara.epfl.ch/w/insynth>

Thank you
