Type Checking Heterogeneous Sequences

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Overview

History

Regular Type Expressions by Example

Implementation Challenges

RTE Representation in Scala

DFA Construction

Embedding a Type System

Determinism

Efficiency: Redundant Type Checks

Conclusion

History



History

- Regular Type Expressions (RTEs) were introduced at 2016 European Lisp Conference, implemented in Common Lisp. https://www.lrde.epita.fr/wiki/Publications/newton.16.els
- ➤ See PhD Thesis 2018 for theoretical, implementation, and performance details https://www.lrde.epita.fr/wiki/Publications/newton.18.phd
- RTE Available:

```
Scala https://github.com/jimka2001/scala-rte
Clojure https://github.com/jimka2001/clojure-rte
Python https://github.com/jimka2001/python-rte
Common Lisp https://github.com/jimka2001/cl-rte
```

Goal

- ▶ Efficiently recognize patterns in heterogeneously typed sequences.
- ► Supported in Scala as Seq[Any].

Regular Type Expressions (RTEs)



We'd like to recognize sequences with *regular patterns*.

[1, 2, 2.3, 9.3, 3, 1.5F, 6.5, 4.8F, 2, 2.3]

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What's the pattern?

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[1, 2, 2.3, 9.3, 3, 1.5F, 6.5, 4.8F, 2, 2.3]

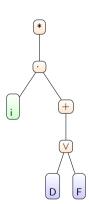
What's the pattern?

integer integer
$$3$$
, $2.3, 9.3$, 3 , $1.5F, 6.5, 4.8F$, 2 , 2.3 [loating points]

We'd like to recognize sequences with regular patterns.

String-based regular expressions

- Match strings like: "iDDiFDFiD",
- ▶ ... representing expression: $(i \cdot (D \lor F)^+)^*$,



We'd like to recognize sequences with regular patterns.

[1, 2.3, 9.3, 3, 1.5F, 6.5, 4.8F, 2, 2.3]

String-based regular expressions

- Match strings like: "iDDiFDFiD",
- ... we use surface syntax: "(i(D|F)+)*".
- ▶ ... representing expression: $(i \cdot (D \lor F)^+)^*$,

We propose Rational Type Expressions (RTEs)

- ▶ Rational type expression: $(Int \cdot (Double \cup Float)^+)^*$
- ► Challenge №1: We need a surface syntax for Scala.

How does a pattern predicate work?

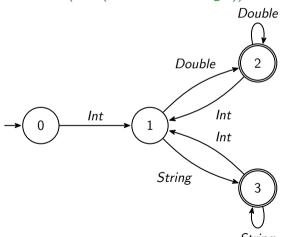
```
[13 2.0 6.0 4 "a" "an" "the" -5 2.0 3.0 4.0 7 8.0] Does the sequence follow the pattern? (Int \cdot (Double^+ \vee String^+))^+
```

How does a pattern predicate work?

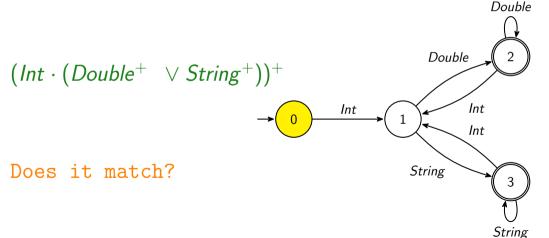
[13 2.0 6.0 4 "a" "an" "the" -5 2.0 3.0 4.0 7 8.0] Does the sequence follow the pattern? $(Int \cdot (Double^+ \vee String^+))^+$

We construct a deterministic finite automaton (DFA).

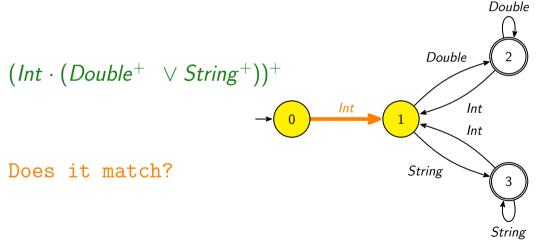
Challenge #2: How to construct a DFA from an RTE?



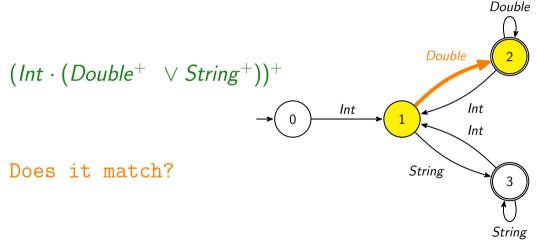
How does a pattern predicate work?



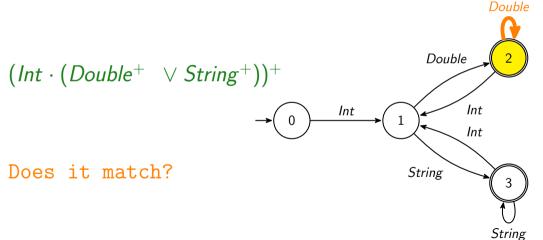
How does a pattern predicate work?



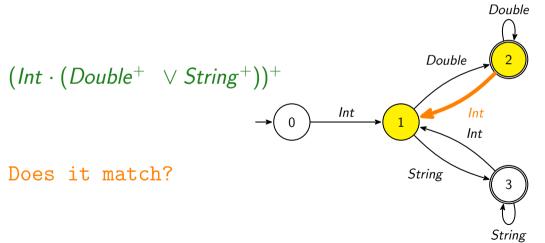
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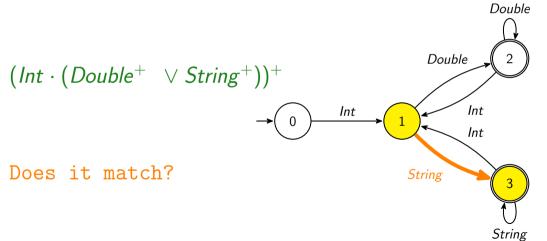
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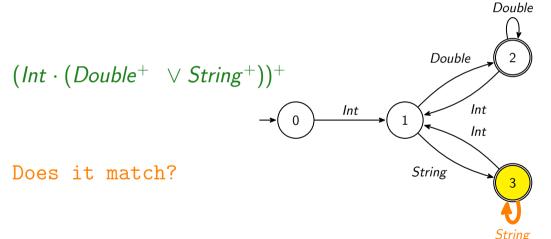
How does a pattern predicate work?



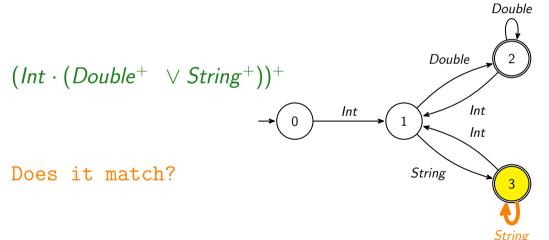
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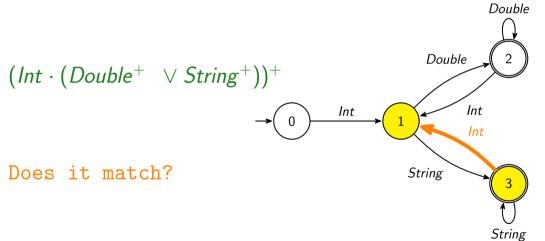
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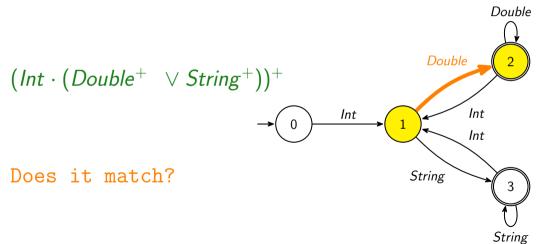
How does a pattern predicate work?



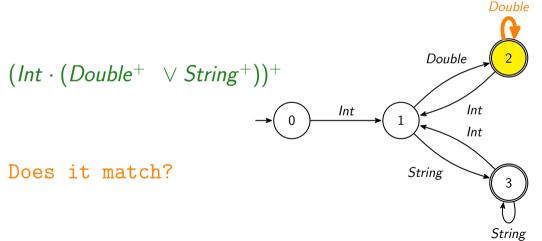
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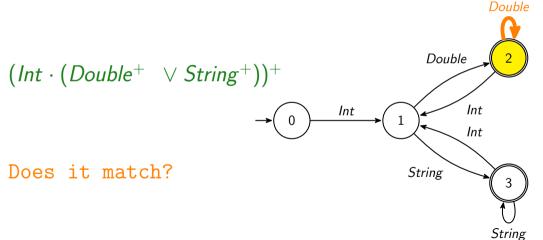
How does a pattern predicate work?



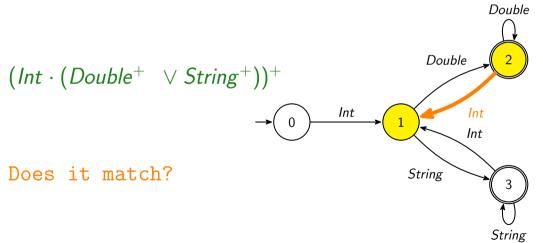
How does a pattern predicate work?



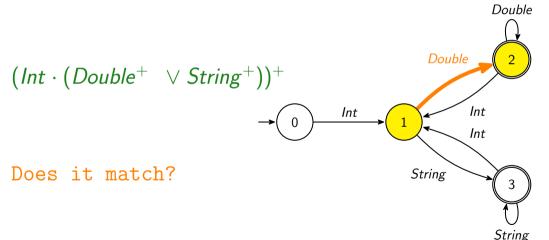
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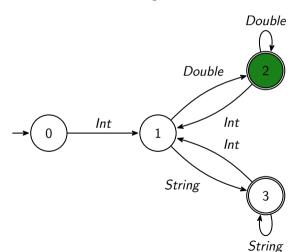
How does a pattern predicate work?



How does a pattern predicate work?

[13 2.0 6.0 4 "a" "an" "the" -5 2.0 3.0 4.0 7 8.0]

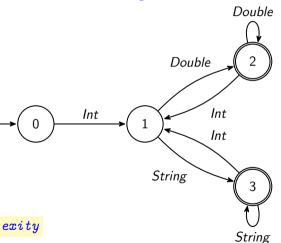
Yes, it's a match!



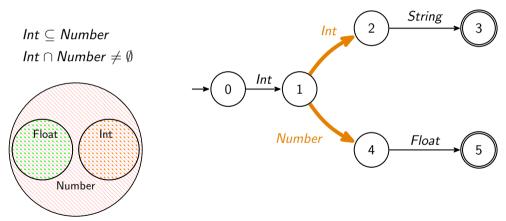
How does a pattern predicate work?



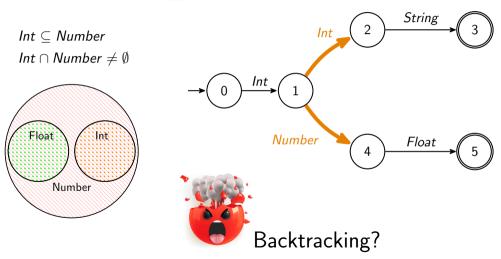
Decision procedure is O(n), independent of syntactical complexity of the RTE.



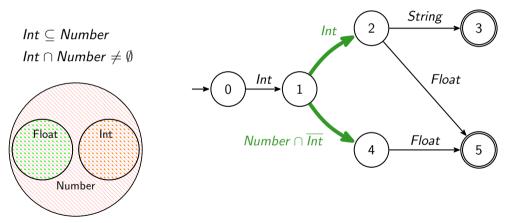
Suppose sequence = [2, 3, 5.6F]



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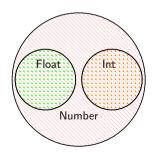


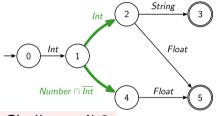
Suppose sequence = [2, 3, 5.6F]



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 $\mathit{Int} \subseteq \mathit{Number}$ $\mathit{Int} \cap \mathit{Number} \neq \emptyset$

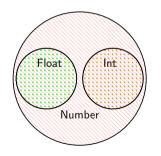


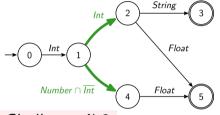


Challenge №3: How to support Int \(\cap \overline{Number}\) in Scala?

Suppose sequence = [2, 3, 5.6F]

 $Int \subseteq Number$ $Int \cap Number \neq \emptyset$





Challenge №3: How to support Int \(\cap \overline{Number}\) in Scala?

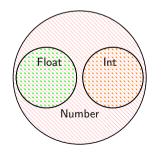
Challenge №4: How to partition types?

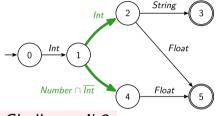
E.g., type decomposition

 $\{\mathit{String}, \mathit{Int}, \mathit{Number}\} \rightarrow \{\mathit{String}, \mathit{Int}, \mathit{Number} \cap \overline{\mathit{Int}}\}$

Suppose sequence = [2, 3, 5.6F]

 $\begin{array}{l} \mathit{Int} \subseteq \mathit{Number} \\ \mathit{Int} \cap \mathit{Number} \neq \emptyset \end{array}$





Challenge №3: How to support Int \(\cap \overline{Number}\) in Scala?

Challenge №4: How to partition types?

Challenge №5: How to avoid duplicate type checks?

Challenges of the Project

- ► Challenge № 1: RTE Representation: Representing an RTE in Scala?
- ► Challenge № 2: DFA Construction: Constucting from RTE?
- ➤ Challenge № 3: Type Lattice: Union, intersection, complement types?
- ► Challenge № 4: Determinism: Type partitioning?
- ► Challenge № 5: Efficiency: Avoiding redundant type checks at run-time?

Challenge №1: RTE Representation

How to represent an RTE in Scala?

- ► Surface syntax: declarative, expressive, composable
- ▶ Programmatic interface: reflective, algebraic manipulation

RTFs

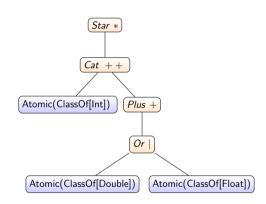
What are Regular Type Expressions?

- Mathematical notation: (Int · (Double ∪ Float)⁺)*
- Scala notation: AST

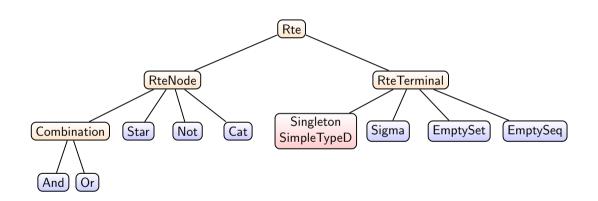
```
val I:Rte = Atomic(classOf[Int])
val F:Rte = Atomic(classOf[Float])
val D:Rte = Atomic(classOf[Double])

val re:Rte = (I ++ (D | F).+).*
```

► Leaf nodes interface to Scala Type System



Rte class quasi-ADT

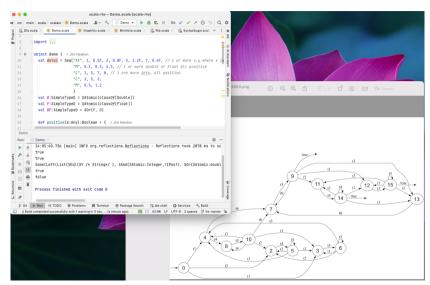


Challenge №2: DFA Construction

Given an RTE, generate a finite automaton.

- Well-known techniques exists to construct DFAs from RE
- Adapt them to work with RTEs
- Enforce determinism

Demo Sample Flow



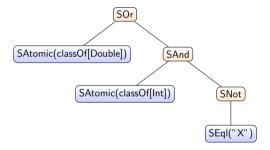
Challenge №3: Type Lattice

How to support types like $Int \cap \overline{Number}$ in Scala?

- Support type lattice
- Embed a dynamic type system into an existing programming language.
- Answer type membership and subtype questions.

Example SimpleTypeD Expression Tree: AST

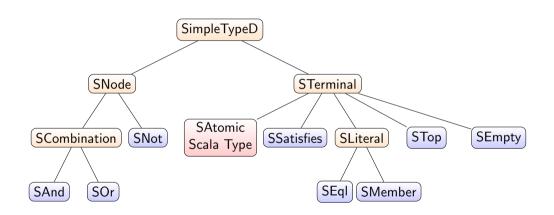
```
val Int = SAtomic(classOf[Int])
val Double = SAtomic(classOf[Double])
val td:SimpleTypeD = SOr(Double, SAnd(Int, SNot(SEql("X"))))
```



- ▶ A type designator is an expression tree (AST).
- ► Leaf nodes interface to Scala classes via SAtomic(...).
- ...and to literal Scala values via SEq1(...)
- ...and to predicate functions via SSatisfies(...)



SimpleTypeD class quasi-ADT



Type Membership Predicate

Boolean type membership question is always answerable.

```
SAtomic(classOf[Int]).typep(-42) // returns true
   // returns true
   (SAtomic(classOf[String]) || SAtomic(classOf[Int])).typep(7)
   // define predicate
   def oddp(a:Any):Boolean = {
     a match
9
       case a: Int => a % 2 != 0
10
       case _ => false
11
12
13
   SSatisfies(oddp).typep(36) // returns false
14
```

Subtype Predicate

Semi-Boolean Subtype predicate sometimes unanswerable.

```
val Str:SimpleTypeD = SAtomic(classOf[String])
val Int:SimpleTypeD = SAtomic(classOf[Int])
val Num:SimpleTypeD = SAtomic(classOf[Number])
val odd:SimpleTypeD = SSatisfies(oddp, "oddp")

Str.subtypep(Int) // returns Some(false)
Int.subtypep(Num) // returns Some(true)
SSatisfies(oddp).subtypep(Int) // returns None
```

Unanswerable because:

- ▶ Impossible to compute, *e.g.* SSatisfies.
- Code is incomplete.
- ▶ JVM supports run-time loaded classes.
- No dependable way of finding subtypes in JVM > 8.x.

Simple Embedded Type System

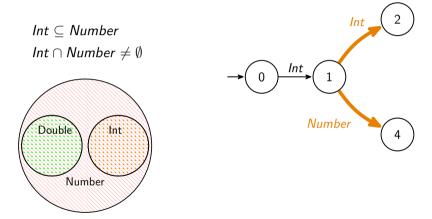
At the point, what have we done?

- Wrapped the Scala type system
- ... with a simple type system
- ... which supports a complemented type lattice
- ... with membership Boolean predicate
- ... with subtype semi-Boolean predicate
- ... which supports reflection

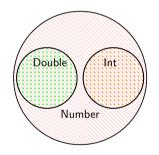
Challenge №4: Deterministic State Machines

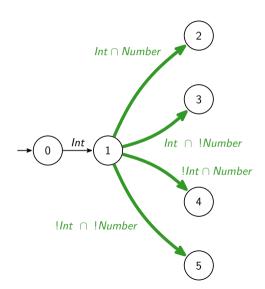
How to assure DFAs are deterministic by construction?

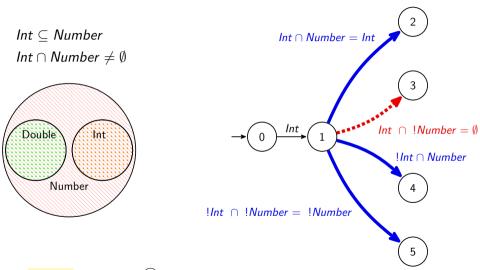
- Compute a partition of a given set of type designators,
- ... even (especially) when subtype relation is unknown.



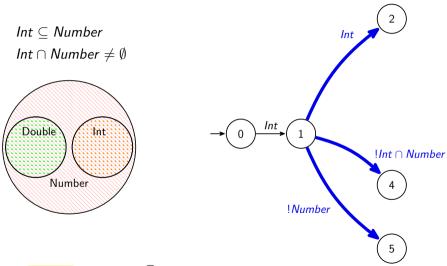
 $\textit{Int} \subseteq \textit{Number}$ $\textit{Int} \cap \textit{Number} \neq \emptyset$







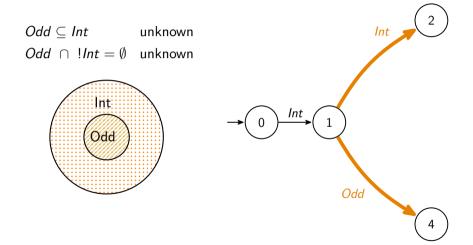
We can **decide** that state ③ is unreachable.



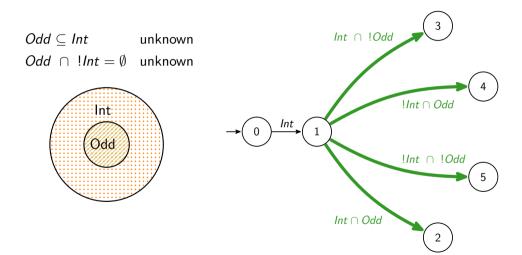
We can $\frac{\text{decide}}{\text{decide}}$ that state 3 is unreachable.



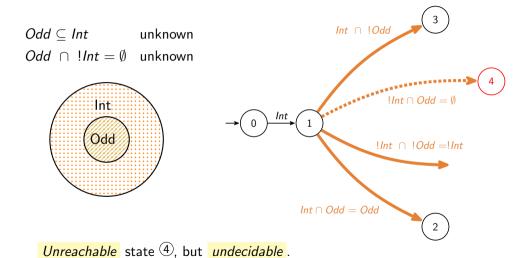
Non-determinism by SSatisfies



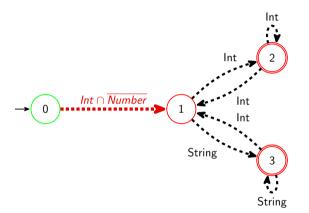
Non-determinism by SSatisfies



Non-determinism by SSatisfies

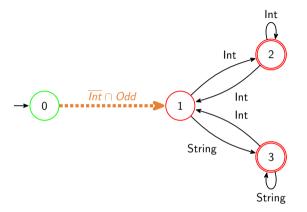


Unsatisfiable Transitions



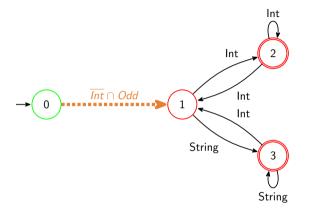
- If we determine a type is empty, then the transistion is *unsatifiable*.
- Thus we can eliminate the transition and unreachable states.

Indeterminant Transitions



- If we cannot determine a type is empty, the transition may *still be unsatisfiable*.
- ▶ However, we *cannot eliminate* the transition and unreachable states.

Indeterminant Transitions



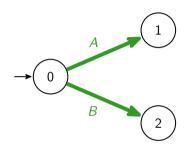
- ► We can always determine type membership.
- ▶ DFAs with indeterminant transitions *correctly* match sequences in O(n).

```
final class A() {}
final class B() {}

class C() {}
trait D() {}

abstract class E() {}
trait F {}

class G() extends E with F {}
```



$$A \cap B = \emptyset$$

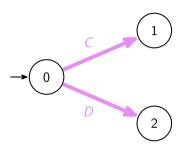
Both are final; they have no common *inhabited* subclass.

```
final class A() {}
final class B() {}

class C() {}
trait D() {}

abstract class E() {}
trait F {}

class G() extends E with F {}
```



$$C \cap D = unknown$$

Is there *somewhere* some class inherits from both.

Even if no, JVM might run-time load a library creating a common subclass.

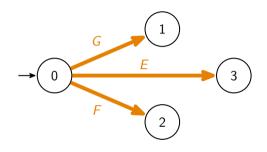
```
final class A() {}
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class G() extends E with F {}
```

Explicit subtype relation.



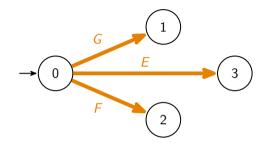
$$G \subset E \implies G \cap E \neq \emptyset$$

```
final class A() {}
final class B() {}

class C() {}
trait D() {}

abstract class E() {}
trait F {}

class G() extends E with F {}
```



$$E \cap F \neq \emptyset$$

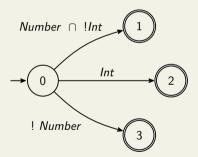
G inherits from E and F.

Java > 8.x, cannot compute subclasses.

github.com/ronmamo/reflections no longer maintained.

Challenge №5: Redundant Type Check

Select correct transition, avoiding *redundant type checks*.



Sequential Type Check

A DFA state may have several disjoint transitions, each with its own type label.

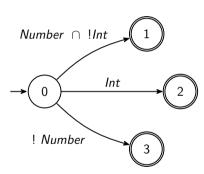
```
val N = SAtomic(classOf[Number])
val I = SAtomic(classOf[Int])

if (N & !I).typep(x)

Some(1)
else if I.typep(x)

Some(2)
else if (!N).typep(x)

Some(3)
else
None
```



Some types may be checked multiple times. We can rewrite the code to *eliminate redundant checks* .

Decision Tree Structure

We programmatically manipulate if ... else ... using a lazy, Ite (if/then/else) data structure similar to the following.

For this presentation, we represent the decision tree as **human readable** Scala code.

Decision Tree, Before and After

```
Introduce if N.typep(x) ... else ...
val N = SAtomic(classOf[Number])
val I = SAtomic(classOf[Int])
  if (N & !I).typep(x)
    Some(1)
  else if I.typep(x)
    Some(2)
  else if (!N).typep(x)
    Some(3)
  else
```

None

```
Introduce if N.typep(x) ... else ...
val N = SAtomic(classOf[Number])
val I = SAtomic(classOf[Int])
  if (N & !I).typep(x)
                                           1 if N.typep(x) {
    Some(1)
                                           2 ... original code ...
  else if I.typep(x)
                                           3 } ELSE {
    Some(2)
                                           4 ... original code ...
                                           5 }
8 else if (!N).tvpep(x)
    Some(3)
  else
    None
```

```
Rewrite: 1 \rightarrow 2 \rightarrow 3 \rightarrow 4 \rightarrow 5 \rightarrow 6 \rightarrow 7 \rightarrow 8 \rightarrow 9 \rightarrow 10
Introduce if N.typep(x) ... else ...
```

```
1 if N.typep(x) {
                                                    if (N & !I).typep(x)
                                                      Some(1)
val N = SAtomic(classOf[Number])
                                                    else if I.typep(x)
                                                      Some(2)
val I = SAtomic(classOf[Int])
                                                    else if (!N).typep(x)
   if (N & !I).typep(x)
                                                      Some(3)
     Some(1)
                                                    else
                                                             None
   else if I.typep(x)
                                                  } ELSE {
     Some(2)
                                                    if (N & !I).tvpep(x)
                                                      Some(1)
   else if (!N).typep(x)
                                               11
     Some(3)
                                                    else if I.typep(x)
                                                      Some(2)
   else
                                               13
     None
                                                    else if (!N).typep(x)
11
                                               14
                                                      Some(3)
                                               15
                                                             None
                                                    else
                                               16
                                               17
```

```
Rewrite: 1 \rightarrow 2 \rightarrow 3 \rightarrow 4 \rightarrow 5 \rightarrow 6 \rightarrow 7 \rightarrow 8 \rightarrow 9 \rightarrow 10
```

Introduce if N.typep(x) ... else ...

```
if N.typep(x) {
     if (N & !I).typep(x)
       Some(1)
     else if I.typep(x)
       Some(2)
     else if (!N).typep(x)
       Some(3)
     else None
   } else {
     if (N & !I).typep(x)
       Some(1)
11
     else if I.typep(x)
       Some(2)
13
     else if (!N).typep(x)
14
       Some(3)
15
     else None
16
17
```

```
Rewrite: 1 \rightarrow 2 \rightarrow 3 \rightarrow 4 \rightarrow 5 \rightarrow 6 \rightarrow 7 \rightarrow 8 \rightarrow 9 \rightarrow 10
      Introduce if N.typep(x) ... else ...
    if N.typep(x) {
      if (N & !I).typep(x)
        Some(1)
      else if I.typep(x)
        Some(2)
      else if (!N).typep(x)
        Some(3)
      else
                 None
    } else {
      if (N & !I).typep(x)
10
        Some(1)
11
      else if I.typep(x)
12
        Some(2)
13
      else if (!N).typep(x)
14
        Some(3)
15
      else
                 None
16
```

17

```
Rewrite: 1 \rightarrow 2 \rightarrow 3 \rightarrow 4 \rightarrow 5 \rightarrow 6 \rightarrow 7 \rightarrow 8 \rightarrow 9 \rightarrow 10
      Introduce if N.typep(x) ... else ...
    if N.typep(x) {
      if (N & !I).typep(x)
        Some(1)
      else if I.typep(x)
        Some(2)
      else if (!N).typep(x)
        Some(3)
      else
                 None
    } else {
      if (N & !I).tvpep(x)
10
```

Some(1)

Some(3)

Some(2)

else

else if I.typep(x)

else if (!N).typep(x)

None

11

12

13

14

15

16 17 In then part: Supertypes of N o STop . In else part: Subtypes of N o SEmpty .

```
if N.typep(x) {
     if (N & !I).typep(x)
       Some(1)
     else if I.tvpep(x)
       Some (2)
     else if (!N).typep(x)
       Some(3)
     else
          None
   } else {
     if (N & !I).tvpep(x)
10
       Some(1)
11
     else if I.typep(x)
12
    Some(2)
13
     else if (!N).typep(x)
14
       Some(3)
15
     else
           None
16
17
```

In then part: Supertypes of $\mathbb{N} \to \mathtt{STop}$. In else part: Subtypes of $\mathbb{N} \to \mathtt{SEmpty}$.

```
if N.typep(x) {
   if N.typep(x) {
     if (N & !I).typep(x)
                                                    if (STop & !I).typep(x)
       Some(1)
                                                      Some(1)
     else if I.tvpep(x)
                                                    else if I.typep(x)
                                                      Some(2)
       Some (2)
     else if (!N).typep(x)
                                                    else if (!STop).typep(x)
       Some(3)
                                                      Some(3)
     else None
                                                    else None
   } else {
                                                   } else {
     if (N & !I).tvpep(x)
                                                    if (SEmptv & !SEmptv).tvpep(x)
10
                                               10
       Some(1)
                                                      Some(1)
11
                                               11
     else if I.typep(x)
                                                    else if SEmptv.tvpep(x)
12
       Some(2)
                                                      Some(2)
13
                                               13
     else if (!N).typep(x)
                                                    else if (!SEmpty).typep(x)
14
                                               14
       Some(3)
                                                      Some(3)
15
                                               15
     else
           None
                                                    else None
16
                                               17 }
17
```

In then part: Supertypes of $\mathbb{N} \to STop$. In else part: Subtypes of $\mathbb{N} \to SEmpty$.

```
if N.typep(x) {
     if (STop & !I).typep(x)
       Some(1)
     else if I.typep(x)
       Some(2)
     else if (!STop).typep(x)
       Some(3)
     else None
   } else {
     if (SEmpty & !SEmpty).typep(x)
10
       Some(1)
11
     else if SEmptv.tvpep(x)
12
       Some(2)
13
     else if (!SEmpty).typep(x)
14
       Some(3)
15
     else None
16
17 }
```

In then part: Supertypes of N o STop . In else part: Subtypes of N o SEmpty .

```
if N.typep(x) {
     if (STop & !I).typep(x)
       Some(1)
     else if I.tvpep(x)
       Some(2)
     else if (!STop).typep(x)
       Some(3)
     else
               None
    } else {
     if (SEmptv & !SEmptv).tvpep(x)
10
       Some(1)
11
     else if SEmpty.typep(x)
12
       Some(2)
13
     else if (!SEmpty).typep(x)
14
       Some(3)
15
     else None
16
17
```

In then part: Supertypes of N o STop . In else part: Subtypes of N o SEmpty .

```
if N.typep(x) {
     if (STop & !I).typep(x)
       Some(1)
     else if I.tvpep(x)
       Some (2)
     else if (!STop).typep(x)
       Some(3)
     else
              None
    } else {
     if (SEmptv & !SEmptv).tvpep(x)
10
       Some(1)
11
     else if SEmpty.typep(x)
12
       Some(2)
13
     else if (!SEmpty).typep(x)
14
       Some(3)
15
     else None
16
17
```

```
Rewrite: 1 \rightarrow 2 \rightarrow

ightarrow 4 
ightarrow 5 
ightarrow 6 
ightarrow 7 
ightarrow 8 
ightarrow 9 
ightarrow 10
         (STop \& x) \rightarrow x (SEmpty \& x) \rightarrow SEmpty
         !STop \rightarrow SEmpty
                                  !SEmpty \rightarrow STop
    if N.typep(x) {
      if (STop & !I).typep(x)
        Some(1)
      else if I.typep(x)
        Some(2)
      else if (!STop).typep(x)
        Some(3)
      else
                 None
    } else {
      if (SEmpty & !SEmpty).typep(x)
        Some(1)
      else if SEmpty.typep(x)
        Some(2)
13
      else if (!SEmpty).typep(x)
        Some(3)
      else None
16
17
```

11

12

14

```
Rewrite: 1 \rightarrow 2 \rightarrow
                                  \rightarrow 4 \rightarrow 5 \rightarrow 6 \rightarrow 7 \rightarrow 8 \rightarrow 9 \rightarrow 10
        (STop \& x) \rightarrow x (SEmpty \& x) \rightarrow SEmpty
         !STop → SEmpty
                                !SEmptv \rightarrow STop
    if N.typep(x) {
                                                          if N.typep(x) {
      if (STop & !I).typep(x)
                                                            if (!I).typep(x)
        Some(1)
                                                              Some(1)
      else if I.typep(x)
                                                            else if I.typep(x)
        Some(2)
                                                              Some(2)
      else if (!STop).typep(x)
                                                            else if SEmpty.typep(x)
        Some(3)
                                                              Some(3)
      else
                None
                                                            else None
    } else {
                                                          } else {
      if (SEmpty & !SEmpty).typep(x)
                                                            if SEmpty.typep(x)
        Some(1)
                                                              Some(1)
                                                      11
      else if SEmpty.typep(x)
                                                            else if SEmpty.typep(x)
        Some(2)
                                                              Some(2)
                                                      13
      else if (!SEmpty).typep(x)
                                                            else if STop.typep(x)
                                                      14
        Some(3)
                                                              Some(3)
                                                      15
      else None
                                                            else None
                                                      16
17
                                                      17
                                                                                4 D > 4 B > 4 B > 4 B > 9 Q P
```

11

12

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14

15

```
Rewrite: 1 \rightarrow 2 \rightarrow 3 \rightarrow 4 \rightarrow 5 \rightarrow 6 \rightarrow 7 \rightarrow 8 \rightarrow 9 \rightarrow 10
(STop & x) \rightarrow x
(SEmpty & x) \rightarrow SEmpty
!SEmpty \rightarrow STop
```

```
if N.typep(x) {
     if (!I).typep(x)
       Some(1)
     else if I.typep(x)
       Some(2)
     else if SEmpty.typep(x)
       Some(3)
     else None
   } else {
     if SEmpty.typep(x)
10
       Some(1)
11
     else if SEmpty.typep(x)
12
       Some(2)
13
14
     else if STop.typep(x)
       Some(3)
15
     else None
16
17
                        4 D > 4 D > 4 E > 4 E > 9 Q P
```

```
Rewrite: 1 \rightarrow 2 \rightarrow 3
                                     \rightarrow 4 \rightarrow 5 \rightarrow 6 \rightarrow 7 \rightarrow 8 \rightarrow 9 \rightarrow 10
         (STop \& x) \rightarrow x (SEmpty \& x) \rightarrow SEmpty
                                  !SEmpty \rightarrow STop
         !STop \rightarrow SEmpty
    if N.typep(x) {
      if (!I).typep(x)
        Some(1)
      else if I.typep(x)
        Some(2)
      else if SEmpty.typep(x)
        Some(3)
      else None
    } else {
      if SEmpty.typep(x)
        Some(1)
      else if SEmpty.typep(x)
        Some(2)
      else if STop.typep(x)
        Some(3)
      else None
17
                                                                                      4 D > 4 B > 4 B > 4 B > 9 Q P
```

11

12

13 14

15

```
\rightarrow 4 \rightarrow 5 \rightarrow 6 \rightarrow 7 \rightarrow 8 \rightarrow 9 \rightarrow 10
         (STop \& x) \rightarrow x (SEmpty \& x) \rightarrow SEmpty
         !STop \rightarrow SEmpty
                                 !SEmpty \rightarrow STop
    if N.typep(x) {
      if (!I).typep(x)
        Some(1)
      else if I.typep(x)
        Some(2)
      else if SEmpty.typep(x)
        Some(3)
      else None
    } else {
      if SEmpty.typep(x)
        Some(1)
      else if SEmpty.typep(x)
        Some(2)
      else if STop.typep(x)
        Some(3)
      else None
16
17
                                                                                    ◆□▶ ◆□▶ ◆■▶ ◆■▶ ● 900
```

11

12

13 14

```
Rewrite: 1 \rightarrow 2 \rightarrow 3 \rightarrow 4 \rightarrow 5 \rightarrow 6 \rightarrow 7 \rightarrow 8 \rightarrow 9 \rightarrow 10
         SEmpty.typep(x) \rightarrow false
                                                STop.typep(x) \rightarrow true
    if N.typep(x) {
      if (!I).typep(x)
        Some(1)
      else if I.typep(x)
        Some(2)
      else if SEmpty.typep(x)
        Some(3)
      else None
    } else {
      if SEmpty.typep(x)
10
        Some(1)
11
      else if SEmpty.typep(x)
12
```

Some(2)

Some(3)

else None

else if STop.typep(x)

13

14

15

```
Rewrite: 1 \rightarrow 2 \rightarrow 3 \rightarrow 4 \rightarrow 5 \rightarrow 6 \rightarrow 7 \rightarrow 8 \rightarrow 9 \rightarrow 10
                                           STop.typep(x) \rightarrow true
       SEmpty.typep(x) \rightarrow false
  if N.typep(x) {
                                                         if N.typep(x) {
    if (!I).typep(x)
                                                           if (!I).typep(x)
      Some(1)
                                                             Some(1)
    else if I.tvpep(x)
                                                           else if I.typep(x)
      Some(2)
                                                             Some(2)
                                                           else if FALSE
    else if SEmpty.typep(x)
      Some(3)
                                                             Some(3)
    else None
                                                           else
                                                                      None
                                                         } else {
  } else {
    if SEmpty.typep(x)
                                                           if false
                                                     10
      Some(1)
                                                             Some(1)
                                                     11
    else if SEmpty.typep(x)
                                                           else if FALSE
      Some(2)
                                                             Some(2)
                                                     13
    else if STop.typep(x)
                                                           else if TRUE
                                                     14
      Some(3)
                                                             Some(3)
                                                     15
    else None
                                                           else
                                                                      None
```

10

11

12

13

14

15

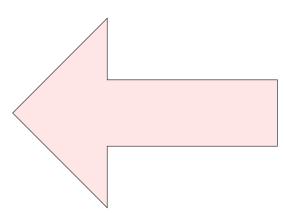
 $SEmpty.typep(x) \rightarrow false$

 $STop.typep(x) \rightarrow true$

```
if N.typep(x) {
     if (!I).typep(x)
       Some(1)
     else if I.typep(x)
       Some(2)
     else if FALSE
       Some(3)
     else
               None
   } else {
     if false
10
       Some(1)
11
     else if FALSE
       Some(2)
13
     else if TRUE
14
       Some(3)
15
     else
               None
16
17
```

```
Rewrite: 1 \rightarrow 2 \rightarrow 3 \rightarrow 4 \rightarrow 5 \rightarrow 6 \rightarrow 7 \rightarrow 8 \rightarrow 9 \rightarrow 10
SEmpty.typep(x) \rightarrow false
STop.typep(x) \rightarrow true
```

```
if N.typep(x) {
     if (!I).typep(x)
       Some(1)
     else if I.typep(x)
       Some(2)
     else if FALSE
       Some(3)
     else
               None
    } else {
     if false
10
       Some(1)
11
     else if FALSE
12
       Some(2)
13
     else if TRUE
14
       Some(3)
15
     else
               None
16
17
```



```
Rewrite: 1 \rightarrow 2 \rightarrow 3 \rightarrow 4 \rightarrow 5 \rightarrow 6 \rightarrow 7 \rightarrow 8 \rightarrow 9 \rightarrow 10
         SEmpty.typep(x) \rightarrow false
                                                 STop.typep(x) \rightarrow true
    if N.typep(x) {
      if (!I).typep(x)
         Some(1)
      else if I.typep(x)
         Some(2)
      else if false
        Some(3)
      else
                  None
    } else {
      if false
10
        Some(1)
11
```

else if false

Some(2)

Some(3)

else

else if true

None

12

13

14

15

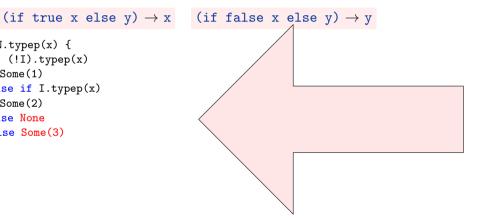
```
Rewrite: 1 \rightarrow 2 \rightarrow 3 \rightarrow 4 \rightarrow 5 \rightarrow 6 \rightarrow 7 \rightarrow 8 \rightarrow 9 \rightarrow 10
         (if true x else y) \rightarrow x (if false x else y) \rightarrow y
    if N.typep(x) {
      if (!I).typep(x)
        Some(1)
      else if I.typep(x)
        Some(2)
      else if false
        Some(3)
      else
                 None
    } else {
      if false
10
        Some(1)
11
      else if false
12
      Some(2)
13
      else if true
14
        Some(3)
15
      else
                 None
16
17
```

```
Rewrite: 1 \rightarrow 2 \rightarrow 3 \rightarrow 4 \rightarrow 5 \rightarrow 6 \rightarrow 7 \rightarrow 8 \rightarrow 9 \rightarrow 10
         (if true x else y) \rightarrow x (if false x else y) \rightarrow y
    if N.typep(x) {
      if (!I).typep(x)
        Some(1)
      else if I.typep(x)
        Some(2)
      else if false
                                                            if N.typep(x) {
        Some(3)
                                                              if (!I).typep(x)
                                                                Some(1)
      else
                 None
                                                              else if I.typep(x)
    } else {
      if false
                                                                Some(2)
10
        Some(1)
                                                              else None
11
      else if false
                                                            } else Some(3)
12
      Some(2)
13
      else if true
14
        Some(3)
15
      else
                 None
16
17
```

```
(if true x else y) \rightarrow x (if false x else y) \rightarrow y

1 if N.typep(x) {
2 if (!I).typep(x)
3 Some(1)
4 else if I.typep(x)
5 Some(2)
6 else None
7 } else Some(3)
```

```
if N.typep(x) {
  if (!I).typep(x)
   Some(1)
  else if I.typep(x)
   Some(2)
 else None
} else Some(3)
```



```
(if true x else y) → x

(if false x else y) → y

if N.typep(x) {
   if (!I).typep(x)
      Some(1)
   else if I.typep(x)
      Some(2)
   else None
   } else Some(3)
```

```
Introduce if I.typep(x) ... else ...

if N.typep(x) {
   if (!I).typep(x)
      Some(1)
   else if I.typep(x)
      Some(2)
   else      None
} else Some(3)
```

```
Introduce if I.typep(x) ... else ...
```

```
if N.typep(x) {
                                                  if I.typep(x) {
                                                    if (!I).typep(x)
                                                     Some(1)
if N.typep(x) {
                                                    else if I.typep(x)
 if (!I).typep(x)
                                                     Some(2)
   Some(1)
                                                    else None
 else if I.typep(x)
                                                 } ELSE {
   Some(2)
                                                    if (!I).tvpep(x)
 else
           None
                                                     Some(1)
                                            10
} else Some(3)
                                                    else if I.typep(x)
                                            11
                                            12
                                                     Some(2)
                                            13
                                                    else
                                                             None
                                            14
                                                } else Some(3)
```

Introduce if I.typep(x) ... else ...

```
if N.typep(x) {
     if I.typep(x) {
       if (!I).typep(x)
     Some(1)
       else if I.typep(x)
       Some(2)
       else None
    } else {
       if (!I).tvpep(x)
        Some(1)
10
       else if I.typep(x)
11
     Some(2)
12
13
      else None
14
   } else Some(3)
```

```
Introduce if I.typep(x) ... else ...
```

```
if N.typep(x) {
     if I.typep(x) {
       if (!I).typep(x)
         Some(1)
       else if I.typep(x)
         Some(2)
       else None
     } else {
       if (!I).typep(x)
         Some(1)
10
       else if I.typep(x)
11
         Some(2)
12
       else
                None
13
14
   } else Some(3)
```

In then part: Supertypes of I \rightarrow STop . In else part: Subtypes of I \rightarrow SEmpty .

```
if N.typep(x) {
     if I.typep(x) {
       if (!I).typep(x)
        Some(1)
       else if I.typep(x)
        Some(2)
       else None
     } else {
       if (!I).typep(x)
     Some(1)
10
       else if I.typep(x)
11
      Some(2)
12
       else
                None
13
14
   } else Some(3)
15
```

11

12

13

14

15

Some(2)

None

else

} else Some(3)

In then part: Supertypes of $I \rightarrow STop$. In else part: Subtypes of $I \rightarrow SEmpty$. if N.typep(x) { if N.typep(x) { if I.typep(x) { if I.typep(x) { if (!I).typep(x) if (!STop).typep(x) Some(1) Some(1) else if I.typep(x) else if STop.typep(x) Some(2) Some(2) else None else None } else { } else { if (!I).typep(x) if (!SEmpty).typep(x) Some(1) Some(1) 10 else if I.typep(x) else if SEmpty.typep(x) 11

13

Some(2)

else None

} else Some(3)

In then part: Supertypes of $I \rightarrow STop$.

In else part: Subtypes of $I \rightarrow SEmpty$.

```
if N.typep(x) {
     if I.typep(x) {
       if (!STop).typep(x)
         Some(1)
       else if STop.typep(x)
         Some(2)
       else None
     } else {
       if (!SEmpty).typep(x)
         Some(1)
10
11
       else if SEmpty.typep(x)
         Some(2)
12
       else None
13
14
   } else Some(3)
```

In then part: Supertypes of $I \to STop$. In else part: Subtypes of $I \to SEmpty$.

```
if N.typep(x) {
     if I.typep(x) {
       if (!STop).typep(x)
         Some(1)
       else if STop.typep(x)
         Some(2)
       else None
     } else {
       if (!SEmpty).typep(x)
         Some(1)
10
11
       else if SEmpty.typep(x)
         Some(2)
12
       else None
13
14
    } else Some(3)
15
```

In then part: Supertypes of I \rightarrow STop . In else part: Subtypes of I \rightarrow SEmpty .

```
if N.typep(x) {
     if I.typep(x) {
       if (!STop).typep(x)
         Some(1)
       else if STop.typep(x)
         Some(2)
       else None
     } else {
       if (!SEmpty).typep(x)
        Some(1)
10
11
       else if SEmpty.typep(x)
         Some(2)
12
       else None
13
14
   } else Some(3)
15
```

 $!SEmpty \rightarrow STop$

```
if N.typep(x) {
     if I.typep(x) {
       if (!STop).typep(x)
         Some(1)
       else if STop.typep(x)
         Some(2)
       else None
     } else {
       if (!SEmpty).typep(x)
         Some(1)
10
       else if SEmpty.typep(x)
11
         Some(2)
12
       else None
13
14
   } else Some(3)
```

 $!STop \rightarrow SEmpty$

```
!STop → SEmpty
                             !SEmpty \rightarrow STop
   if N.typep(x) {
                                                    if N.typep(x) {
     if I.typep(x) {
                                                      if I.typep(x) {
       if (!STop).typep(x)
                                                        if SEmpty.typep(x)
         Some(1)
                                                          Some(1)
       else if STop.typep(x)
                                                        else if STop.typep(x)
         Some(2)
                                                          Some(2)
       else None
                                                        else
                                                                 None
     } else {
                                                      } else {
       if (!SEmpty).typep(x)
                                                        if STop.typep(x)
         Some(1)
                                                          Some(1)
10
                                                10
       else if SEmpty.typep(x)
                                                        else if SEmpty.typep(x)
11
                                                11
         Some(2)
                                                          Some(2)
12
                                                12
       else None
                                                        else
                                                                 None
13
                                                13
14
                                                14
                                                    } else Some(3)
   } else Some(3)
```

 $!\mathtt{STop} \to \mathtt{SEmpty}$

 $\texttt{!SEmpty} \to \texttt{STop}$

```
if N.typep(x) {
     if I.typep(x) {
       if SEmpty.typep(x)
        Some(1)
       else if STop.typep(x)
         Some(2)
       else
                None
     } else {
       if STop.typep(x)
        Some(1)
10
       else if SEmpty.typep(x)
11
        Some(2)
12
       else
              None
13
14
   } else Some(3)
```

```
!STop \rightarrow SEmpty
                              !SEmpty \rightarrow STop
   if N.typep(x) {
      if I.typep(x) {
       if SEmpty.typep(x)
         Some(1)
       else if STop.typep(x)
         Some(2)
       else
                 None
     } else {
       if STop.typep(x)
         Some(1)
10
       else if SEmpty.typep(x)
11
         Some(2)
12
       else
                 None
13
    } else Some(3)
```

 $!SEmpty \rightarrow STop$

```
if N.typep(x) {
     if I.typep(x) {
       if SEmpty.typep(x)
         Some(1)
       else if STop.typep(x)
         Some(2)
       else
                None
     } else {
       if STop.typep(x)
        Some(1)
10
       else if SEmpty.typep(x)
11
         Some(2)
12
       else
                None
13
14
   } else Some(3)
```

!STop → SEmpty

```
if N.typep(x) {
     if I.typep(x) {
       if SEmpty.typep(x)
         Some(1)
       else if STop.typep(x)
         Some(2)
                None
       else
     } else {
       if STop.typep(x)
        Some(1)
10
11
       else if SEmpty.typep(x)
         Some(2)
12
       else
                None
13
14
   } else Some(3)
15
```

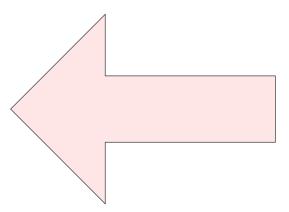
 $SEmpty.typep(x) \rightarrow false$

```
SEmpty.typep(x) \rightarrow false
                                        STop.typep(x) \rightarrow true
   if N.typep(x) {
                                                    if N.typep(x) {
     if I.typep(x) {
                                                      if I.typep(x) {
       if SEmpty.typep(x)
                                                        if FALSE
         Some(1)
                                                          Some(1)
       else if STop.typep(x)
                                                        else if TRUE
         Some(2)
                                                        Some(2)
                None
                                                                 None
       else
                                                        else
     } else {
                                                      } else {
       if STop.typep(x)
                                                        if true
        Some(1)
                                                          Some(1)
10
11
       else if SEmpty.typep(x)
                                                        else if FALSE
         Some(2)
                                                          Some(2)
12
       else
                None
                                                        else
                                                                 None
13
                                                13
14
                                                14
   } else Some(3)
                                                    } else Some(3)
```

```
SEmpty.typep(x) \rightarrow false
```

```
if N.typep(x) {
    if I.typep(x) {
     if FALSE
4 Some(1)
  else if TRUE
    Some(2)
7 else None
    } else {
   if true
  Some(1)
   else if FALSE
11
  Some(2)
13 else
         None
14
  } else Some(3)
```

```
SEmpty.typep(x) \rightarrow false
   if N.typep(x) {
     if I.typep(x) {
       if false
         Some(1)
       else if true
        Some(2)
       else
                None
     } else {
       if true
      Some(1)
10
       else if false
11
      Some(2)
12
       else
                None
13
   } else Some(3)
```



```
SEmpty.typep(x) \rightarrow false
   if N.typep(x) {
    if I.typep(x) {
      if false
     Some(1)
    else if true
      Some(2)
   else
              None
    } else {
  if true
    Some(1)
10
   else if false
11
    Some(2)
12
   else
              None
13
14
   } else Some(3)
```

```
(if true x else y) \rightarrow x (if false x else y) \rightarrow y
   if N.typep(x) {
    if I.typep(x) {
    if false
    Some(1)
   else if true
     Some(2)
7 else
              None
  } else {
 if true
   Some(1)
10
   else if false
11
    Some(2)
12
  else
           None
13
14
   } else Some(3)
```

```
(if true x else y) \rightarrow x (if false x else y) \rightarrow y
   if N.typep(x) {
     if I.typep(x) {
       if false
        Some(1)
       else if true
                                                  if N.tvpep(x) {
       Some(2)
                                                    if I.typep(x)
                None
    else
                                                     Some(2)
     } else {
                                                   else
    if true
                                                     Some(1)
     Some(1)
10
                                                  } else Some(3)
    else if false
11
     Some(2)
12
       else
                None
13
14
   } else Some(3)
```

```
(if true x else y) \rightarrow x (if false x else y) \rightarrow y

1 if N.typep(x) {
2 if I.typep(x)
3 Some(2)
4 else
5 Some(1)
6 } else Some(3)
```

```
(if true x else y) \rightarrow x
                                        (if false x \emptysetlse \forall) \rightarrow \forall
if N.typep(x) {
  if I.typep(x)
    Some(2)
  else
    Some(1)
} else Some(3)
```

```
(if true x else y) → x

(if false x else y) → y

if N.typep(x) {
   if I.typep(x)
      Some(2)
   else
      Some(1)
  } else Some(3)
```

Rewrite: Summary

Code has been rewritten so that any type check occurs no more than once.

```
val N = SAtomic(classOf[Number])
val I = SAtomic(classOf[Int])
                                                  if N.typep(x) {
  if (N & !I).typep(x)
                                                   if I.typep(x)
    Some(1)
                                                     Some(2)
  else if I.typep(x)
                                                   else
    Some(2)
                                                     Some(1)
  else if (!N).typep(x)
                                                  } else Some(3)
    Some(3)
  else
    None
```

And it is clear the the code never returns None.

Challenges of the Project

- ► Challenge № 1: RTE Representation: Representing an RTE in Scala?
- ► Challenge № 2: DFA Construction: Constucting from RTE?
- ➤ Challenge № 3: Type Lattice: Union, intersection, complement types?
- ► Challenge № 4: Determinism: Type partitioning?
- ► Challenge № 5: Efficiency: Avoiding redundant type checks at run-time?

Summary

- Regular Type Expressions in Scala
- ... using symbolic finite automata
- ... extending the Scala type system
- Demo of sequence pattern matching
- Several theoretical interesting problems:
- Type partitioning
- ... Efficient elimination of redundant type checks

Perspectives

- ▶ Improve predicate satisfaction heuristics.
- Open/Closed world-view of Java types/classes
- Publish a summary of our techniques and results.
- ► Move away from Scala 2
- ▶ Find replacement for abandoned library: github.com/ronmamo/reflections

Conclusion

- ▶ An implementation of efficient pattern recognition for heterogeneous sequences
- ► In reflective programming languages
- ... notably in Scala
- Available here:

```
Scala https://github.com/jimka2001/scala-rte
Clojure https://github.com/jimka2001/clojure-rte
Python https://github.com/jimka2001/python-rte
Common Lisp https://github.com/jimka2001/cl-rte
```

Questions and Answers