

# Automated Termination Analysis of JAVA BYTECODE by Term Rewriting

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# Termination Analysis for TRSs

$$\begin{array}{lll} \mathcal{R} : & \text{plus}(x, 0) & \rightarrow x \\ & \text{plus}(x, s(y)) & \rightarrow s(\text{plus}(x, y)) \end{array}$$

$\mathcal{R}$  is *terminating* iff there is no infinite evaluation  $t_1 \rightarrow_{\mathcal{R}} t_2 \rightarrow_{\mathcal{R}} \dots$

**Computation of “2 + 1”:**  $\text{plus}(s(s(0)), s(0)) \rightarrow_{\mathcal{R}} s(\text{plus}(s(s(0)), 0))$   
 $\qquad\qquad\qquad \rightarrow_{\mathcal{R}} s(s(s(0)))$

- easier / more general than for programs
- suitable for automation
- **But:** halting problem is undecidable!  
⇒ automated termination proofs do not always succeed

# Termination Analysis for TRSs

$$\mathcal{P}ol(\text{plus}(0, y)) > \mathcal{P}ol(y)$$

$$\mathcal{P}ol(\text{plus}(\text{s}(x), y)) > \mathcal{P}ol(\text{s}(\text{plus}(x, y)))$$

$\mathcal{R}$  is *terminating* iff there is no infinite evaluation  $t_1 \rightarrow_{\mathcal{R}} t_2 \rightarrow_{\mathcal{R}} \dots$

- **Goal:** Find order  $\succ$  such that  $\ell \succ r$  for all rules  $\ell \rightarrow r \in \mathcal{R}$
- **Polynomial Order:**  $\ell \succ r$  iff  $\mathcal{P}ol(\ell) > \mathcal{P}ol(r)$

$$\mathcal{P}ol(0) = 1$$

$$\mathcal{P}ol(\text{s}(t)) = 1 + \mathcal{P}ol(t)$$

$$\mathcal{P}ol(\text{plus}(t_1, t_2)) = 2 \mathcal{P}ol(t_1) + \mathcal{P}ol(t_2)$$

# Termination Analysis for TRSs

$$2 + \mathcal{P}ol(y) > \mathcal{P}ol(y)$$

$$2(1 + \mathcal{P}ol(x)) + \mathcal{P}ol(y) > 1 + 2\mathcal{P}ol(x) + \mathcal{P}ol(y)$$

$\mathcal{R}$  is *terminating* iff there is no infinite evaluation  $t_1 \rightarrow_{\mathcal{R}} t_2 \rightarrow_{\mathcal{R}} \dots$

- **Goal:** Find order  $\succ$  such that  $\ell \succ r$  for all rules  $\ell \rightarrow r \in \mathcal{R}$
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$$\mathcal{P}ol(\text{plus}(t_1, t_2)) = 2\mathcal{P}ol(t_1) + \mathcal{P}ol(t_2)$$

- can be generated automatically by SAT solving ([SAT '07](#))

# Automated Termination Analysis for TRSs

- Classical Techniques (simplification orders)
  - Knuth–Bendix Order (*Knuth & Bendix, 70*)
  - Polynomial Order (*Lankford, 79*)
  - Lexicographic Path Order (*Kamin & Lévy, 80*)
  - Recursive Path Order (*Dershowitz, 82*)
- Recent Techniques (beyond simplification orders)
  - Transformation Order (*Bellegarde & Lescanne, 87*)
  - Semantic Labelling (*Zantema, 95*)
  - Dependency Pairs (*Arts & Giesl, 96*)
  - Monotonic Semantic Path Order (*Borralleras, Ferreira, Rubio, 00*)
  - Match-Bounds (*Geser, Hofbauer, Waldmann, 03*)
  - Matrix Order (*Endrullis, Hofbauer, Waldmann, Zantema, 06*)
- Active area of research: *International Workshop on Termination*

# Integer Term Rewriting

## Termination of Term Rewriting

- powerful for algorithms on user-defined data structures  
(automatic generation of orders to compare arbitrary terms)
- naive handling of pre-defined data structures  
(represent data objects by terms)

### Representing integers

$$0 \equiv \text{pos}(0) \equiv \text{neg}(0)$$

$$1 \equiv \text{pos}(\text{s}(0))$$

$$-1 \equiv \text{neg}(\text{s}(0))$$

$$1000 \equiv \text{pos}(\text{s}(\text{s}(\dots \text{s}(0) \dots)))$$

### Rules for pre-defined operations

$$\text{pos}(x) + \text{neg}(y) \rightarrow \text{minus}(x, y)$$

$$\text{neg}(x) + \text{pos}(y) \rightarrow \text{minus}(y, x)$$

$$\text{pos}(x) + \text{pos}(y) \rightarrow \text{pos}(\text{plus}(x, y))$$

$$\text{neg}(x) + \text{neg}(y) \rightarrow \text{neg}(\text{plus}(x, y))$$

$$\text{minus}(x, 0) \rightarrow \text{pos}(x)$$

$$\text{minus}(0, y) \rightarrow \text{neg}(y)$$

$$\text{minus}(\text{s}(x), \text{s}(y)) \rightarrow \text{minus}(x, y)$$

# Integer Term Rewriting

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(automatic generation of orders to compare arbitrary terms)
- naive handling of pre-defined data structures  
(represent data objects by terms)

## Integer Term Rewriting (RTA '09)

- integrated pre-defined data structures like  $\mathbb{Z}$  into term rewriting
- adapted techniques to prove termination of integer TRSs
- for algorithms on integers: as powerful as direct techniques
- for user-defined data structures: as powerful as before

# Integer Term Rewriting

- $\mathcal{F}_{int}$ : pre-defined symbols
    - $\mathbb{Z} = \{0, 1, -1, 2, -2, \dots\}$
    - $\mathbb{B} = \{\text{true}, \text{false}\}$
    - $+, -, *, /, \%$
    - $>, \geq, <, \leq, ==, !=$
    - $\neg, \wedge, \vee, \Rightarrow, \Leftrightarrow$
  - ITRS  $\mathcal{R}$ : finite TRS
    - no pre-defined symbols except  $\mathbb{Z}$  and  $\mathbb{B}$  in lhs
    - $\text{lhs} \notin \mathbb{Z} \cup \mathbb{B}$
    - rewrite relation defined w.r.t.  $\mathcal{R} \cup \mathcal{PD}$   
(innermost rewriting)
  - $\mathcal{PD}$ : pre-defined rules
    - $2 * 21 \rightarrow 42$
    - $42 \geq 23 \rightarrow \text{true}$
    - $\text{true} \wedge \text{false} \rightarrow \text{false}$
    - ...
- ⇒ pre-defined operations only evaluated if all arguments are from  $\mathbb{Z}$  or  $\mathbb{B}$
- Example ITRS computing  $\sum_{i=y}^x i$

$\text{sum}(x, y) \rightarrow \text{sif}(x \geq y, x, y)$
$\text{sif}(\text{true}, x, y) \rightarrow y + \text{sum}(x, y + 1)$
$\text{sif}(\text{false}, x, y) \rightarrow 0$

# Integer Term Rewriting

$$\begin{array}{llll} \underline{\text{sum}(1, 1)} & \xrightarrow{\mathcal{R}} & \text{sif}(\underline{1 \geq 1}, 1, 1) & \xrightarrow{\mathcal{R}} \underline{\text{sif}(\text{true}, 1, 1)} \\ & \xrightarrow{\mathcal{R}} & 1 + \text{sum}(\underline{1}, \underline{1 + 1}) & \xrightarrow{\mathcal{R}} \underline{1 + \text{sum}(1, 2)} \\ & \xrightarrow{\mathcal{R}} & 1 + \text{sif}(\underline{1 \geq 2}, 1, 2) & \xrightarrow{\mathcal{R}} \underline{1 + \text{sif}(\text{false}, 1, 2)} \\ & \xrightarrow{\mathcal{R}} & \underline{1 + 0} & \xrightarrow{\mathcal{R}} 1 \end{array}$$

- **ITRS  $\mathcal{R}$ :** finite TRS
  - no pre-defined symbols except  $\mathbb{Z}$  and  $\mathbb{B}$  in lhs
  - $\text{lhs} \notin \mathbb{Z} \cup \mathbb{B}$
  - **rewrite relation** defined w.r.t.  $\mathcal{R} \cup \mathcal{PD}$   
(innermost rewriting)

Example ITRS computing  $\sum_{i=y}^x i$

$$\begin{array}{ll} \text{sum}(x, y) & \rightarrow \text{sif}(x \geq y, x, y) \\ \text{sif}(\text{true}, x, y) & \rightarrow y + \text{sum}(x, y + 1) \\ \text{sif}(\text{false}, x, y) & \rightarrow 0 \end{array}$$

# Automated Termination Tools for TRSs

- AProVE (*Aachen*)
  - CARIBOO (*Nancy*)
  - CiME (*Orsay*)
  - Jambox (*Amsterdam*)
  - Matchbox (*Leipzig*)
  - MU-TERM (*Valencia*)
  - MultumNonMultia (*Kassel*)
  - TEPARLA (*Eindhoven*)
  - Temptation (*Barcelona*)
  - TORPA (*Eindhoven*)
  - TPA (*Eindhoven*)
  - TTT (*Innsbruck*)
  - VMTL (*Vienna*)
- Annual *International Competition of Termination Tools*
  - well-developed field
  - active research
  - powerful techniques & tools
- **But:**  
What about application in practice?

# Termination of Programming Languages

## Functional Languages

- first-order languages with strict evaluation strategy  
*(Walther, 94), (Giesl, 95), (Lee, Jones, Ben-Amram, 01)*
  - ensuring termination (e.g., by typing)  
*(Telford & Turner, 00), (Xi, 02), (Abel, 04), (Barthe et al, 04) etc.*
  - outermost termination of untyped first-order rewriting  
*(Fissoore, Gnaedig, Kirchner, 02), (Endrullis & Hendriks, 09),  
(Raffelsieper & Zantema, 09), (Thiemann, 09)*
  - automated technique for small HASKELL-like language  
*(Panitz & Schmidt-Schauss, 97)*
- 
- do **not** work on full existing languages
  - no use of TRS-techniques (stand-alone methods)

# Termination of Programming Languages

## Functional Languages

- using TRS-techniques for HASKELL is challenging
  - HASKELL has a **lazy evaluation strategy**.  
For TRSs, one proves termination of *all* reductions.
  - HASKELL's equations are handled from **top to bottom**.  
For TRSs, *any* rule may be used for rewriting.
  - HASKELL has **polymorphic types**.  
TRSs are *untyped*.
  - In HASKELL-programs, often only **some** functions terminate.  
TRS-methods try to prove termination of *all* terms.
  - HASKELL is a **higher-order language**.  
Most automatic TRS-methods only handle *first-order* rewriting.

# Termination of Programming Languages

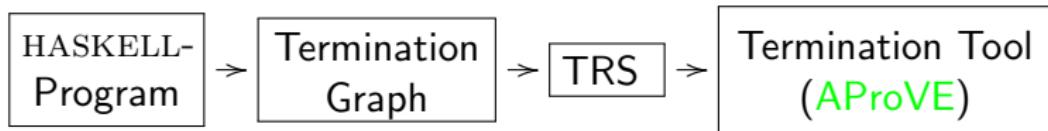
## Functional Languages

- using TRS-techniques for HASKELL is challenging
- **New approach** (RTA '06),(TOPLAS '10)
  - Frontend
    - evaluate HASKELL a few steps ⇒ **termination graph**  
termination graph captures evaluation strategy, types, etc.
    - transform **termination graph** ⇒ TRS
  - Backend
    - prove termination of the resulting TRS  
(using existing techniques & tools)
- implemented in **AProVE**
  - accepts full **HASKELL 98** language
  - successfully evaluated with standard HASKELL-libraries  
(succeeds on approx. 80 % of the functions in standard libraries)

# Termination of Programming Languages

## Functional Languages

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# Termination of Programming Languages

## Logic Languages

- well-developed field (*De Schreye & Decorte, 94*) etc.
- **direct approaches:** work directly on the logic program
  - cTI (*Mesnard et al*)
  - TerminWeb (*Codish et al*)
  - TermiLog (*Lindenstrauß et al*)
  - Polytool (*Nguyen, De Schreye, Giesl, Schneider-Kamp*)

TRS-techniques can be adapted to work *directly* on the LP

- **transformational approaches:** transform LP to TRS
  - TALP (*Ohlebusch et al*)
  - AProVE (*Giesl et al*)
- only for *definite* LP (without cut)
- not for real PROLOG

# Termination of Programming Languages

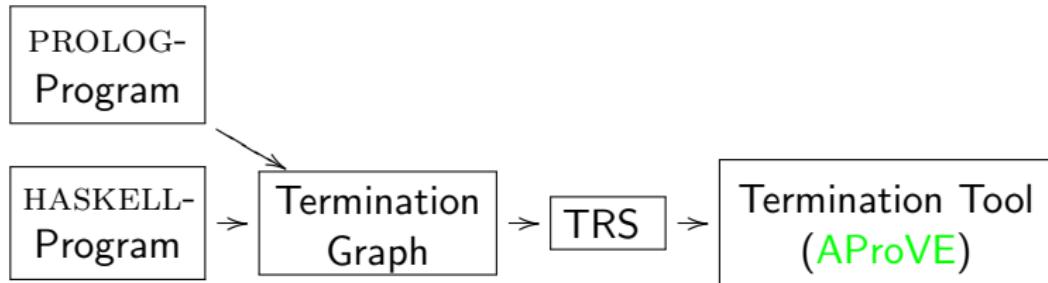
## Logic Languages

- analyzing PROLOG is challenging due to cuts etc.
- **New approach (ICLP '10)**
  - Frontend
    - evaluate PROLOG a few steps ⇒ termination graph  
termination graph captures evaluation strategy due to cuts etc.
    - transform termination graph ⇒ TRS
  - Backend
    - prove termination of the resulting TRS  
(using existing techniques & tools)
- implemented in **AProVE**
  - successfully evaluated on PROLOG-collections with cuts
  - most powerful termination tool for PROLOG  
(winner of the international *termination competition* for PROLOG)

# Termination of Programming Languages

## Logic Languages

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# Termination of Programming Languages

## Imperative Languages

- Synthesis of Linear Ranking Functions  
*(Colon & Sipma, 01), (Podelski & Rybalchenko, 04)*
- Terminator: Termination Analysis by Abstraction & Model Checking  
*(Cook, Podelski, Rybalchenko et al., since 05)*
- Julia & COSTA: Termination Analysis of JAVA BYTECODE  
*(Spoto, Mesnard, Payet, 10),  
(Albert, Arenas, Codish, Genaim, Puebla, Zanardini, 08)*
- ...

- used at Microsoft for verifying Windows device drivers
- no use of TRS-techniques (stand-alone methods)

# Termination of Programming Languages

## Imperative Languages

- analyze JAVA BYTECODE (JBC) instead of JAVA
- using TRS-techniques for JBC is challenging
  - sharing and aliasing
  - side effects
  - cyclic data objects
  - object-orientation
  - ...

# Termination of Programming Languages

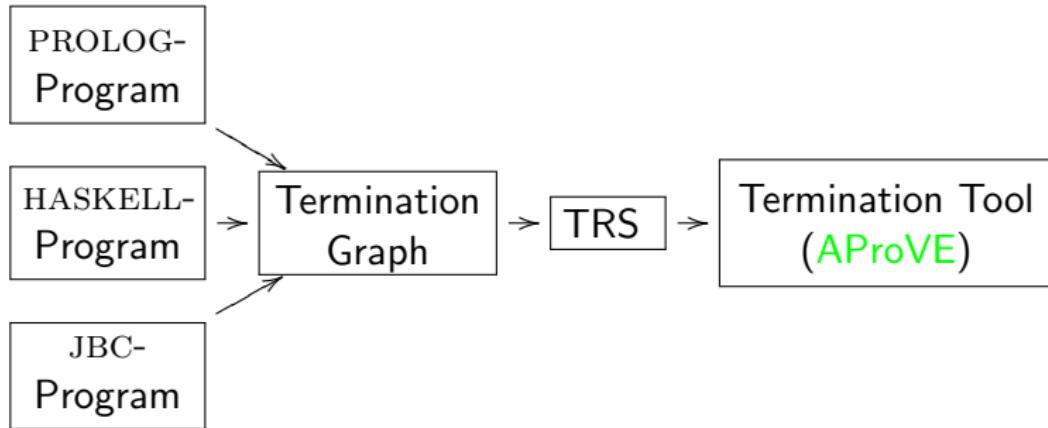
## Imperative Languages

- using TRS-techniques for JBC is challenging
- **New approach** (RTA '10)
  - Frontend
    - evaluate JBC a few steps ⇒ **termination graph**  
termination graph captures side effects, sharing, cyclic data objects etc.
    - transform **termination graph** ⇒ TRS
  - Backend
    - prove termination of the resulting TRS  
(using existing techniques & tools)
- implemented in **AProVE**
  - successfully evaluated on JBC-collection
  - most powerful termination tool for JBC  
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# Termination of Programming Languages

## Imperative Languages

- using TRS-techniques for JBC is challenging



- implemented in **AProVE**
  - successfully evaluated on JBC-collection
  - most powerful termination tool for JBC  
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# Termination of Programming Languages

- other techniques:

abstract objects to numbers

- IntList-object representing [0, 1, 2]  
is abstracted to length 3

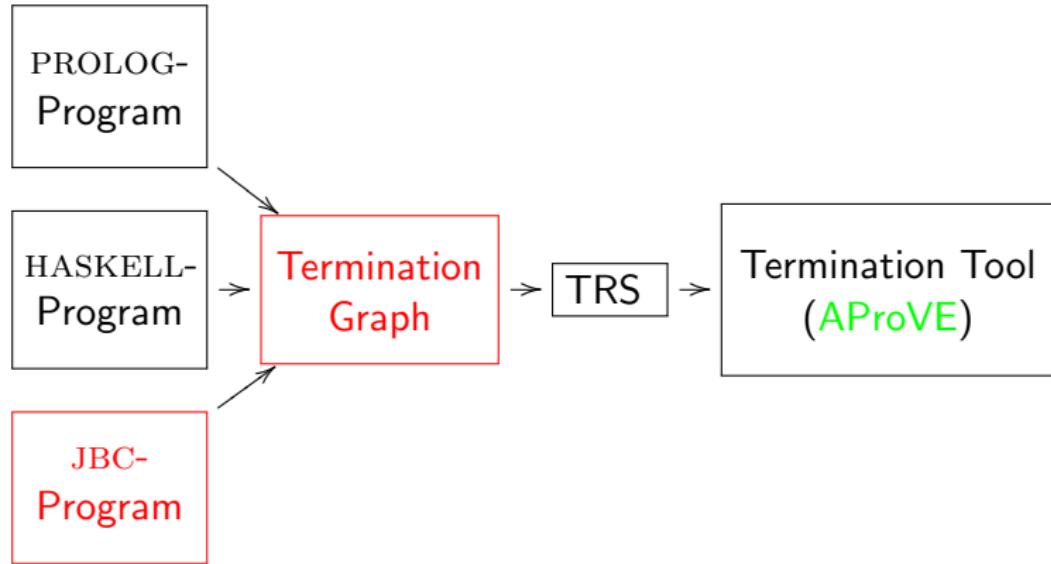
```
public class IntList {  
    int value;  
    IntList next;  
}
```

- our technique:

abstract objects to terms

- introduce function symbol for every class
- IntList-object representing [0, 1, 2]  
is abstracted to term: IntList(0, IntList(1, IntList(2, null)))
- TRS-techniques generate suitable orders to compare arbitrary terms
- particularly powerful on user-defined data types
- powerful on pre-defined data types by using Integer TRSs

# From JBC to Termination Graphs



# Example

```
00: aload_0      // load num to opstack
01: ifnull 8     // jump to line 8 if top
               // of opstack is null
04: aload_1      // load limit
05: ifnonnull 9  // jump if not null
08: return
09: aload_0      // load num
10: astore_2      // store into copy
11: aload_0      // load num
12: getfield val // load field val
15: aload_1      // load limit
16: getfield val // load field val
19: if_icmpge 35 // jump if
               // num.val >= limit.val
22: aload_2      // load copy
23: aload_2      // load copy
24: getfield val // load field val
27: iconst_1     // load constant 1
28: iadd         // add copy.val and 1
29: putfield val // store into copy.val
32: goto 11
35: return
```

```
public class Int {
    // only wrap a primitive int
    private int val;

    // count up to the value
    // in "limit"
    public static void count(
        Int num, Int limit) {

        if (num == null
            || limit == null) {
            return;
        }

        // introduce sharing
        Int copy = num;

        while (num.val < limit.val) {
            copy.val++;
        }
    }
}
```

# Abstract States of the JVM

```
00: aload_0      // load num to opstack
01: ifnull 8     // jump to line 8 if top
           // of opstack is null
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28: iadd         // add copy.val and 1
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35: return
```

ifnull 8 | n: $o_1$ , l: $o_2$  |  $o_1$   
 $o_1 = \text{Int}(\text{val} = i_1)$     $i_1 = (-\infty, \infty)$   
 $o_2 = \text{Int}(?)$

## 4 components

- ① next program instruction
- ② values of local variables  
(value of num is *reference*  $o_1$ )
- ③ values on the operand stack
- ④ information about the heap
  - object at address  $o_2$  is null or of type Int
  - object at  $o_1$  has type Int, val-field has value  $i_1$
  - $i_1$  is an arbitrary integer
  - no sharing

# From JBC to Termination Graphs

```
00: aload_0
01: ifnull 8
04: aload_1
    :
19: if_icmpge 35
    :
27: iconst_1
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35: return
```

aload\_0 | n: $o_1$ , l: $o_2$  |  $\varepsilon$   
 $o_1 = \text{Int}(?)$   $o_2 = \text{Int}(?)$

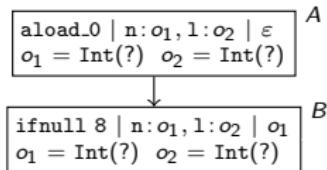
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## State A:

- do all calls of count terminate?
- num and limit are arbitrary, but distinct Int-objects

# From JBC to Termination Graphs

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00: aload_0
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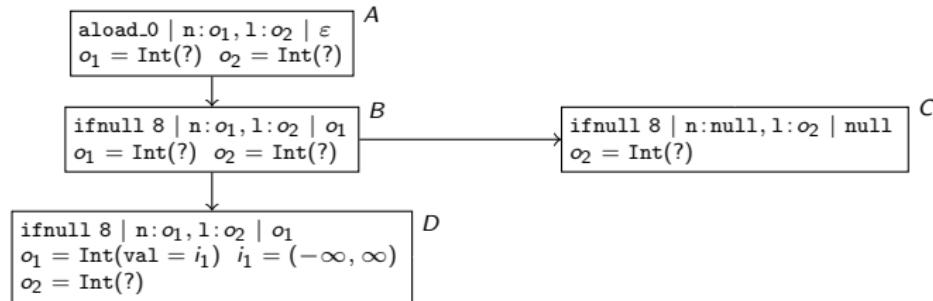


## State B:

- “`aload_0`” loads value of `num` on operand stack
- $A$  connected to  $B$  by *evaluation edge*

# From JBC to Termination Graphs

```
00: aload_0  
01: ifnull 8  
04: aload_1  
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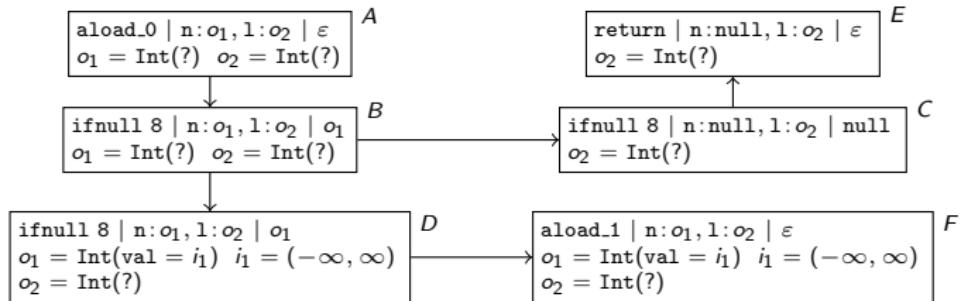


## States *C* and *D*:

- “`ifnull 8`” needs to know whether  $o_1$  is null
- *refine* information about heap (*refinement edges*)

# From JBC to Termination Graphs

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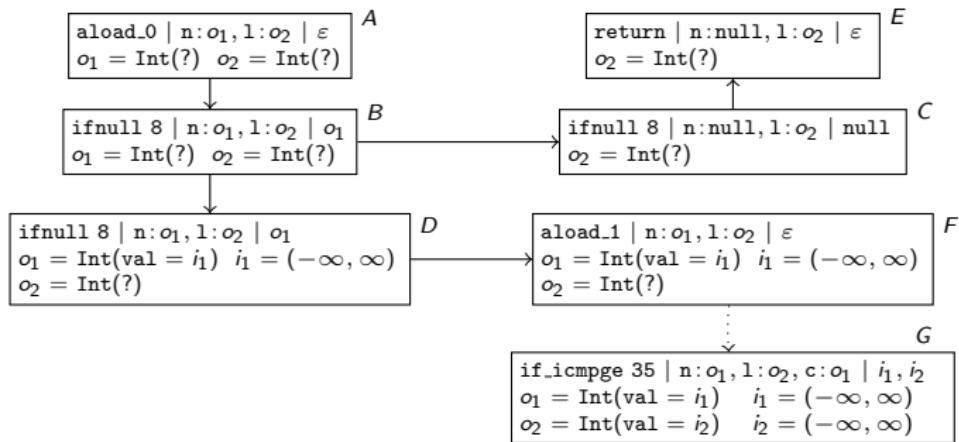


## States *E* and *F*:

- evaluate “`ifnull 8`” in *C* and *D*
- *evaluation edges*

# From JBC to Termination Graphs

```
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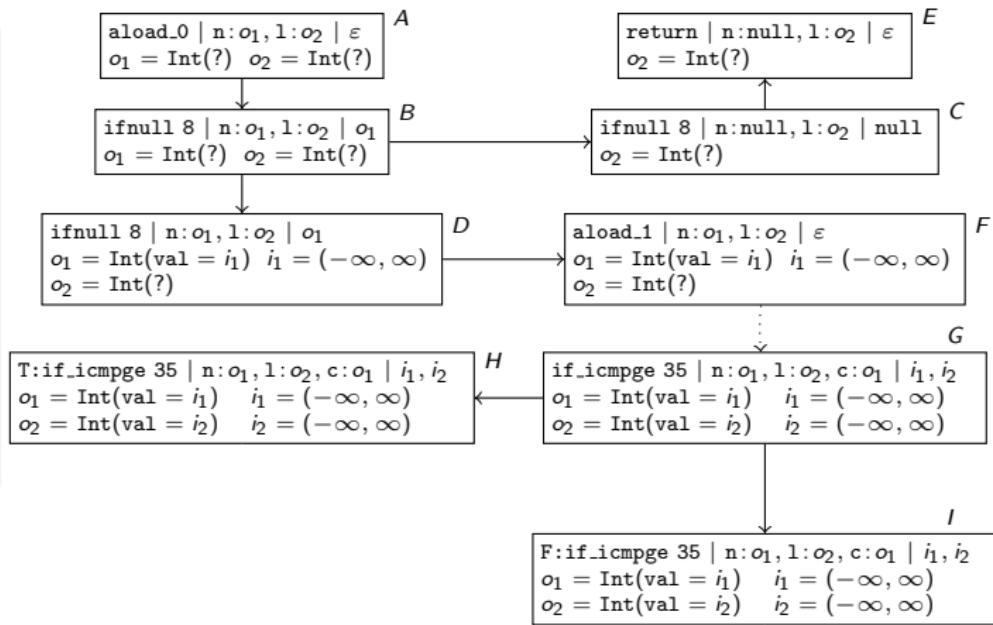
## State G:

- in state  $F$ , check if limit is null analogously
- aliasing in  $G$ : num and copy point to the same address  $o_1$
- val-fields of num and limit pushed on operand stack

# From JBC to Termination Graphs

```

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35: return
    
```



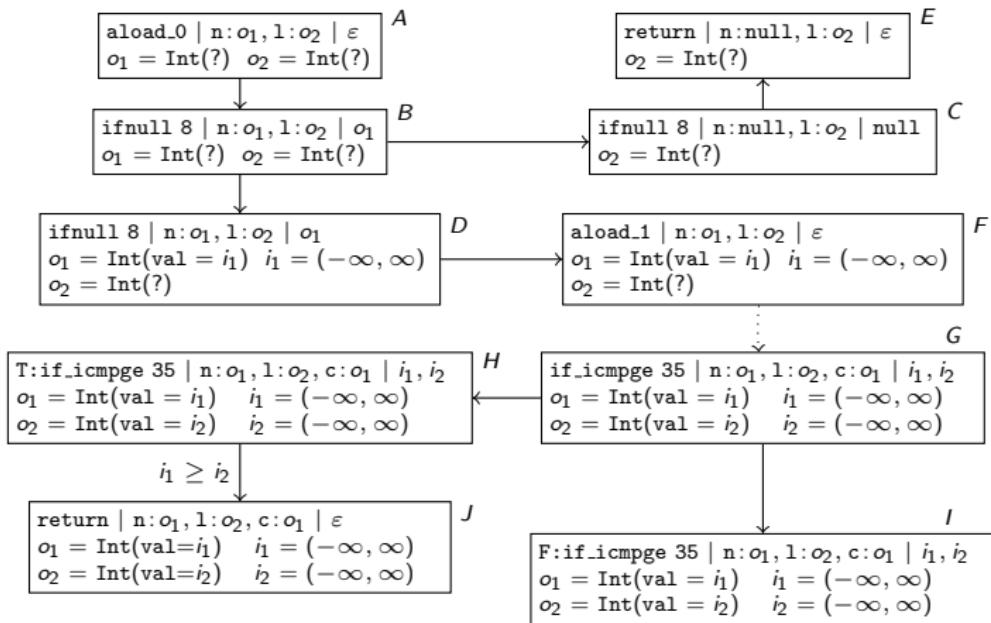
## States H and I:

- “`if_icmpge 35`” needs to know whether  $i_1 \geq i_2$
- refine information about heap (*refinement edges*)

# From JBC to Termination Graphs

```

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01: ifnull 8
04: aload_1
:
19: if_icmpge 35
:
27: iconst_1
28: iadd
29: putfield val
32: goto 11
35: return
    
```



## States J and K:

- evaluate “if\_icmpge 35” in *H* and *I*
- label *evaluation edge* by the condition
- val-field of copy and integer variable with value 1 on operand stack

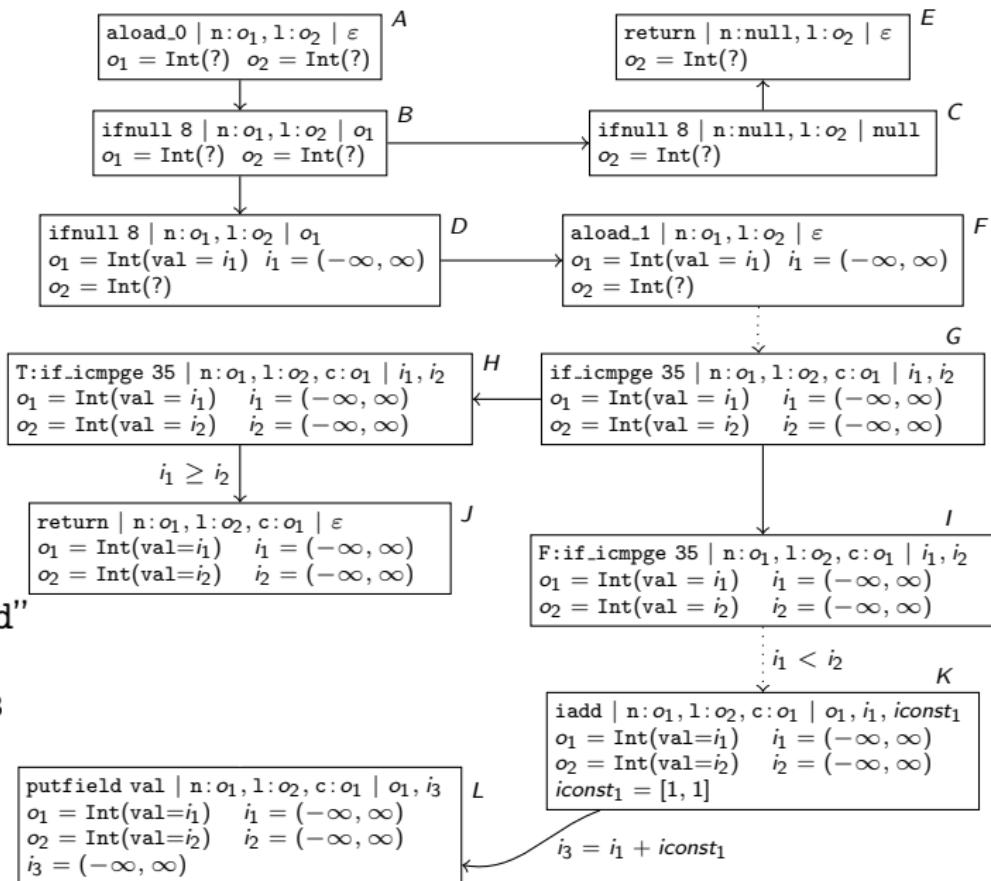
# From JBC to Termination Graphs

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04: aload_1
:
19: if_icmpge 35
:
27: iconst_1
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29: putfield val
32: goto 11
35: return
    
```

## State L:

- evaluate “iadd”
- new variable  $i_3$
- label edge by connection



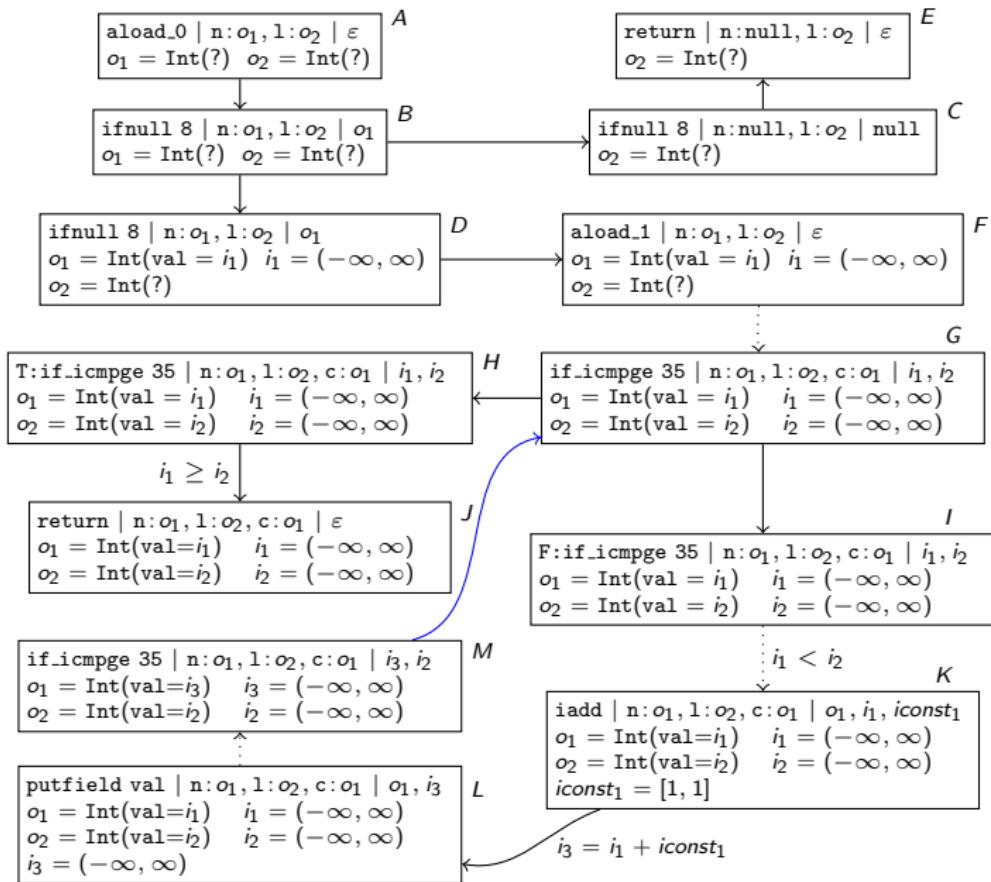
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```

## State M:

- again reaches "if\_icmpge"
- $M$  instance of  $G$
- instantiation edge



# From JBC to Termination Graphs

## Termination Graphs

- expand nodes until all leaves correspond to program ends
- by appropriate generalization steps,  
one always reaches a *finite* termination graph
- state  $s_1$  is *instance* of  $s_2$  iff  
every concrete state described by  $s_1$  is also described by  $s_2$

## Using Termination Graphs for Termination Proofs

- every JBC-computation of concrete states  
corresponds to a *computation path* in the termination graph
- termination graph is called *terminating* iff  
it has no infinite computation path

# Example with User-Defined Data Type

```
public class Flatten {
    public static IntList
        flatten(TreeList list) {
        TreeList cur = list;
        IntList result = null;

        while (cur != null) {
            Tree tree = cur.value;
            if (tree != null) {
                IntList oldIntList = result;
                result = new IntList();
                result.value = tree.value;
                result.next = oldIntList;
                TreeList oldCur = cur;
                cur = new TreeList();
                cur.value = tree.left;
                cur.next = oldCur;
                oldCur.value = tree.right;
            } else cur = cur.next;
        }
        return result;
    }
}
```

```
public class Tree {
    int value;
    Tree left;
    Tree right;
}

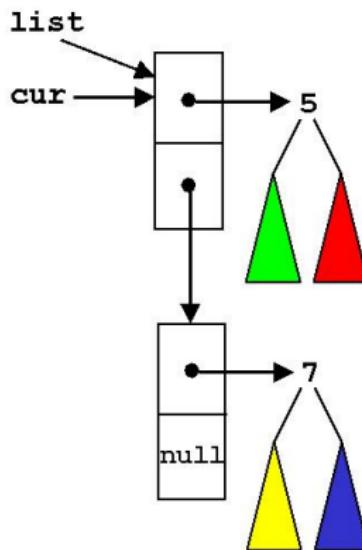
public class TreeList {
    Tree value;
    TreeList next;
}

public class IntList {
    int value;
    IntList next;
}
```

# Example with User-Defined Data Type

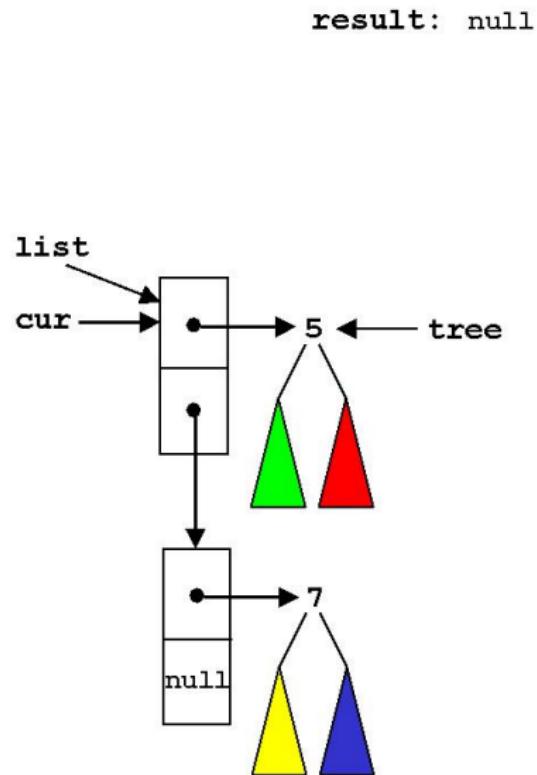
```
public class Flatten {  
    public static IntList  
        flatten(TreeList list) {  
        TreeList cur = list;  
        IntList result = null;  
  
        while (cur != null) {  
            Tree tree = cur.value;  
            if (tree != null) {  
                IntList oldIntList = result;  
                result = new IntList();  
                result.value = tree.value;  
                result.next = oldIntList;  
                TreeList oldCur = cur;  
                cur = new TreeList();  
                cur.value = tree.left;  
                cur.next = oldCur;  
                oldCur.value = tree.right;  
            } else cur = cur.next;  
        }  
        return result;  
    }  
}
```

**result:** null



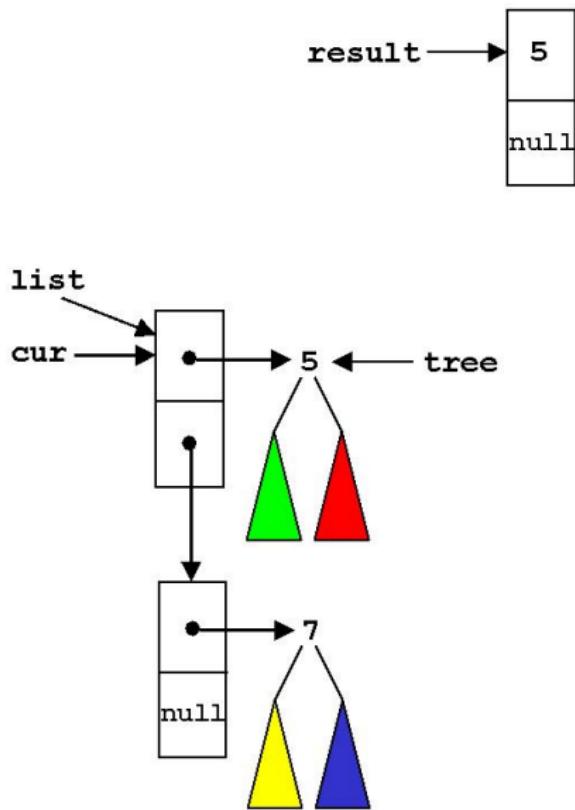
# Example with User-Defined Data Type

```
public class Flatten {  
    public static IntList  
        flatten(TreeList list) {  
        TreeList cur = list;  
        IntList result = null;  
  
        while (cur != null) {  
            Tree tree = cur.value;  
            if (tree != null) {  
                IntList oldIntList = result;  
                result = new IntList();  
                result.value = tree.value;  
                result.next = oldIntList;  
                TreeList oldCur = cur;  
                cur = new TreeList();  
                cur.value = tree.left;  
                cur.next = oldCur;  
                oldCur.value = tree.right;  
            } else cur = cur.next;  
        }  
        return result;  
    }  
}
```



# Example with User-Defined Data Type

```
public class Flatten {  
    public static IntList  
        flatten(TreeList list) {  
        TreeList cur = list;  
        IntList result = null;  
  
        while (cur != null) {  
            Tree tree = cur.value;  
            if (tree != null) {  
                IntList oldIntList = result;  
                result = new IntList();  
                result.value = tree.value;  
                result.next = oldIntList;  
                TreeList oldCur = cur;  
                cur = new TreeList();  
                cur.value = tree.left;  
                cur.next = oldCur;  
                oldCur.value = tree.right;  
            } else cur = cur.next;  
        }  
        return result;  
    }  
}
```



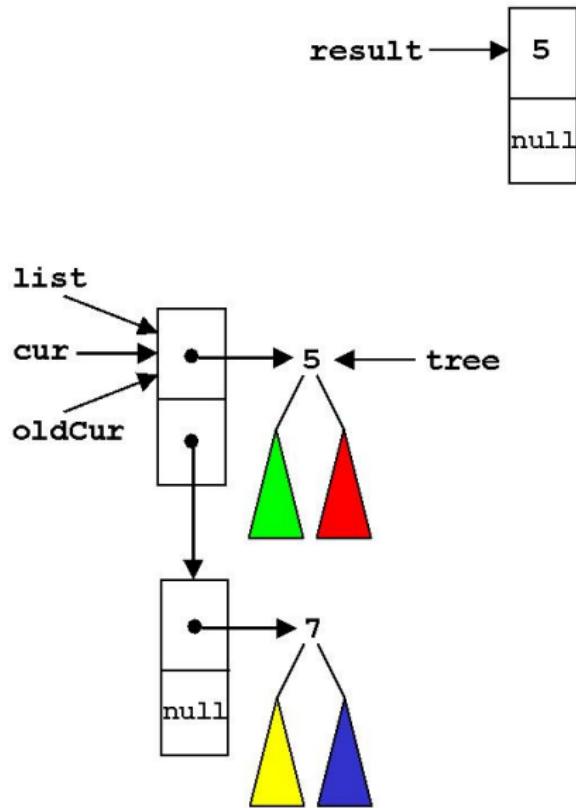
## Example with User-Defined Data Type

```

public class Flatten {
    public static IntList
        flatten(TreeList list) {
    TreeList cur = list;
    IntList result = null;

    while (cur != null) {
        Tree tree = cur.value;
        if (tree != null) {
            IntList oldIntList = result;
            result = new IntList();
            result.value = tree.value;
            result.next = oldIntList;
            TreeList oldCur = cur;
            cur = new TreeList();
            cur.value = tree.left;
            cur.next = oldCur;
            oldCur.value = tree.right;
        } else cur = cur.next;
    }
    return result;
}

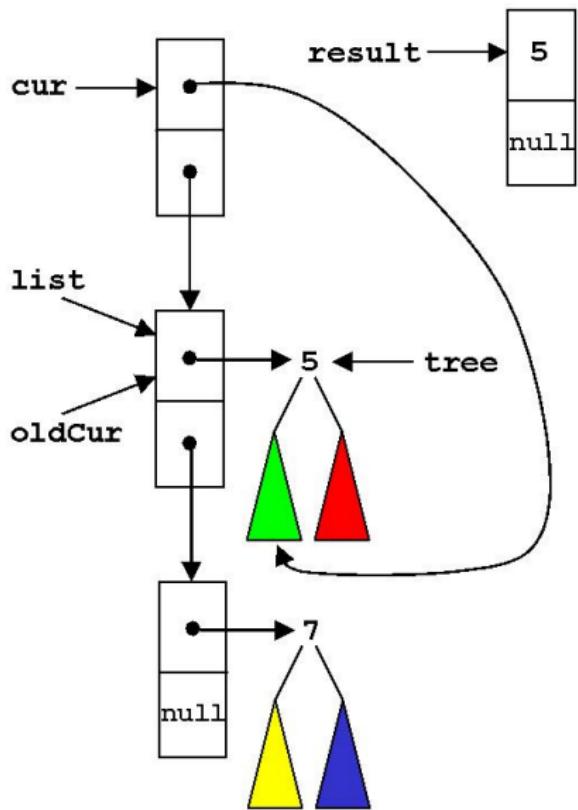
```



# Example with User-Defined Data Type

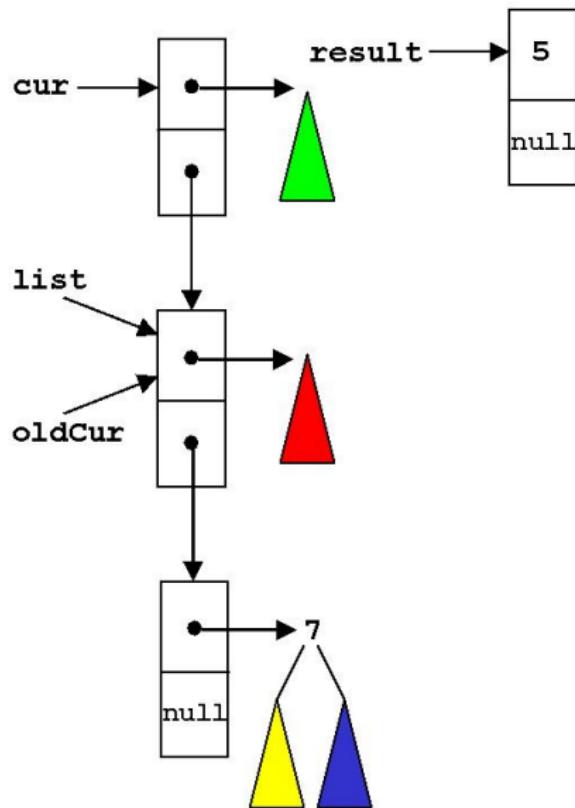
```
public class Flatten {
    public static IntList
        flatten(TreeList list) {
        TreeList cur = list;
        IntList result = null;

        while (cur != null) {
            Tree tree = cur.value;
            if (tree != null) {
                IntList oldIntList = result;
                result = new IntList();
                result.value = tree.value;
                result.next = oldIntList;
                TreeList oldCur = cur;
                cur = new TreeList();
                cur.value = tree.left;
                cur.next = oldCur;
                oldCur.value = tree.right;
            } else cur = cur.next;
        }
        return result;
    }
}
```



# Example with User-Defined Data Type

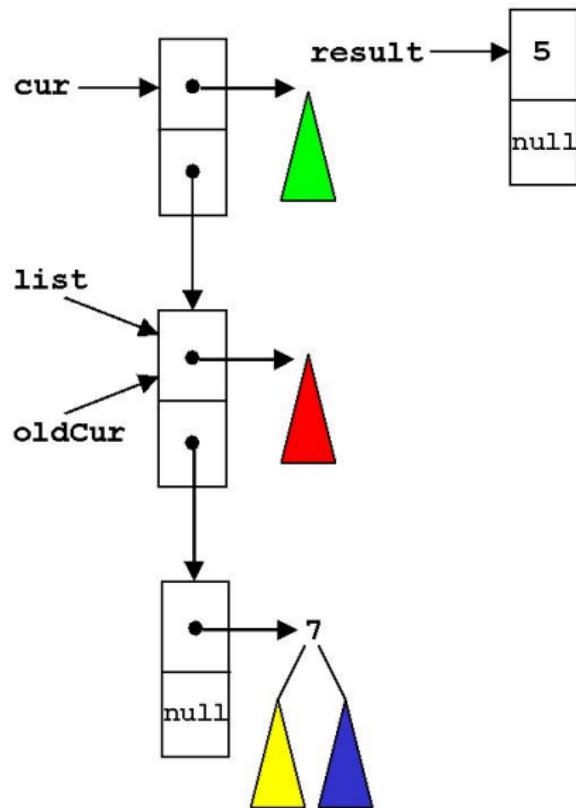
```
public class Flatten {  
    public static IntList  
        flatten(TreeList list) {  
        TreeList cur = list;  
        IntList result = null;  
  
        while (cur != null) {  
            Tree tree = cur.value;  
            if (tree != null) {  
                IntList oldIntList = result;  
                result = new IntList();  
                result.value = tree.value;  
                result.next = oldIntList;  
                TreeList oldCur = cur;  
                cur = new TreeList();  
                cur.value = tree.left;  
                cur.next = oldCur;  
                oldCur.value = tree.right;  
            } else cur = cur.next;  
        }  
        return result;  
    }  
}
```



no termination by *path length*

# Example with User-Defined Data Type

```
public class Flatten {  
    public static IntList  
        flatten(TreeList list) {  
        TreeList cur = list;  
        IntList result = null;  
  
        while (cur != null) {  
            Tree tree = cur.value;  
            if (tree != null) {  
                IntList oldIntList = result;  
                result = new IntList();  
                result.value = tree.value;  
                result.next = oldIntList;  
                TreeList oldCur = cur;  
                cur = new TreeList();  
                cur.value = tree.left;  
                cur.next = oldCur;  
                oldCur.value = tree.right;  
            } else cur = cur.next;  
        }  
        return result;  
    }  
}
```



cur and list can be *sharing*

# Example with User-Defined Data Type

```
public class Flatten {  
    public static IntList  
        flatten(TreeList list) {  
        TreeList cur = list;  
        IntList result = null;  
  
        while (cur != null) {  
            Tree tree = cur.value;  
            if (tree != null) {  
                IntList oldIntList = result;  
                result = new IntList();  
                result.value = tree.value;  
                result.next = oldIntList;  
                TreeList oldCur = cur;  
                cur = new TreeList();  
                cur.value = tree.left;  
                cur.next = oldCur;  
                oldCur.value = tree.right;  
            } else cur = cur.next;  
        }  
        return result;  
    }  
}
```

## General state at beginning of loop body

```
aload_1 | l:o1, c:o2, r:o3 | ε  
o1 = TreeList(?) o2 = TreeList(?)  
o3 = IntList(?)  
o1 =? o2      o1 \wedge o2
```

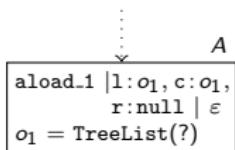
## Annotations

- $o_1 =? o_2$ :  $o_1$  and  $o_2$  may be equal
- $o_1 \wedge o_2$ :  $o_1$  and  $o_2$  may join
  - $o \rightarrow o'$  iff object at address  $o$  has a field with value  $o'$
- $o_1 \wedge o_2$ :  $o_1 \rightarrow^* o \leftarrow^+ o_2$  or  $o_1 \rightarrow^+ o \leftarrow^* o_2$
- $o!$ :  $o$  does not have to be a tree

# Example with User-Defined Data Type

```
public class Flatten {
    public static IntList
        flatten(TreeList list) {
        TreeList cur = list;
        IntList result = null;

        while (cur != null) {
            Tree tree = cur.value;
            if (tree != null) {
                IntList oldIntList = result;
                result = new IntList();
                result.value = tree.value;
                result.next = oldIntList;
                TreeList oldCur = cur;
                cur = new TreeList();
                cur.value = tree.left;
                cur.next = oldCur;
                oldCur.value = tree.right;
            } else cur = cur.next;
        }
        return result;
    }
}
```

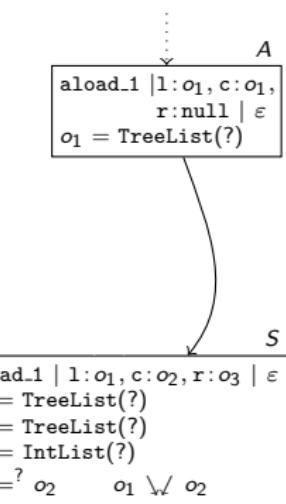


## State A:

- reaches loop condition  
“`cur != null`”  
for the first time
- `list` and `cur (o1)` are equal

# Example with User-Defined Data Type

```
public class Flatten {  
    public static IntList  
        flatten(TreeList list) {  
        TreeList cur = list;  
        IntList result = null;  
  
        while (cur != null) {  
            Tree tree = cur.value;  
            if (tree != null) {  
                IntList oldIntList = result;  
                result = new IntList();  
                result.value = tree.value;  
                result.next = oldIntList;  
                TreeList oldCur = cur;  
                cur = new TreeList();  
                cur.value = tree.left;  
                cur.next = oldCur;  
                oldCur.value = tree.right;  
            } else cur = cur.next;  
        }  
        return result;  
    }  
}
```

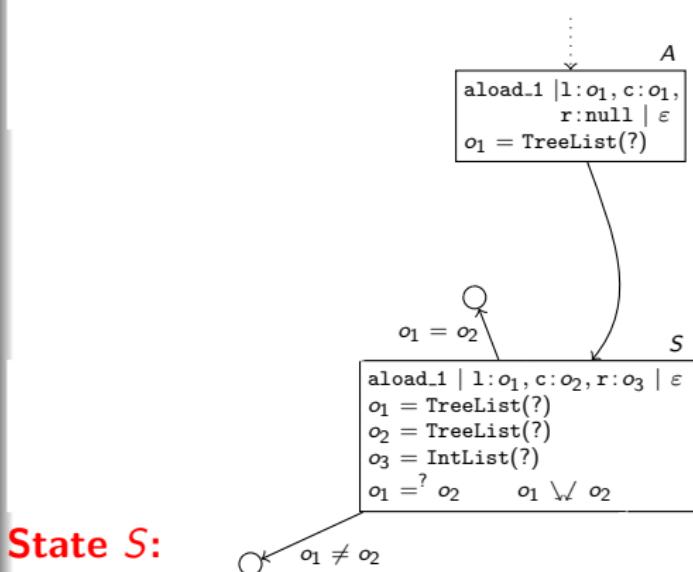


## State S:

- generalize A to obtain finite termination graph
- list ( $o_1$ ) and cur ( $o_2$ ) may be equal and may join

# Example with User-Defined Data Type

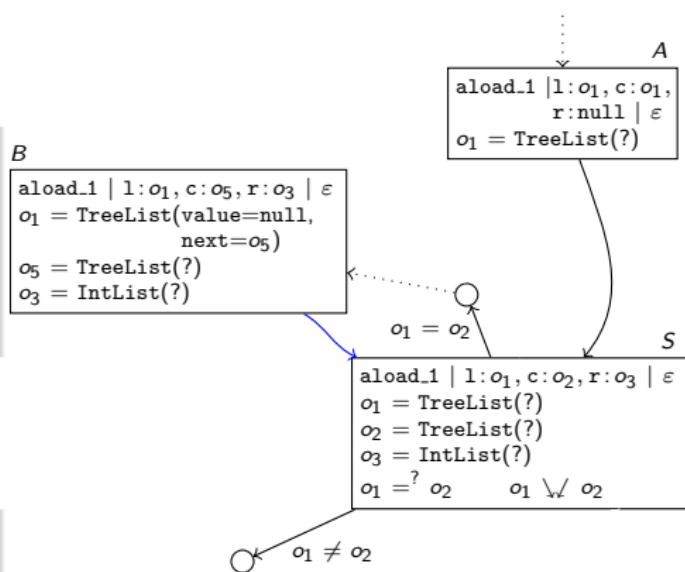
```
public class Flatten {  
    public static IntList  
        flatten(TreeList list) {  
        TreeList cur = list;  
        IntList result = null;  
  
        while (cur != null) {  
            Tree tree = cur.value;  
            if (tree != null) {  
                IntList oldIntList = result;  
                result = new IntList();  
                result.value = tree.value;  
                result.next = oldIntList;  
                TreeList oldCur = cur;  
                cur = new TreeList();  
                cur.value = tree.left;  
                cur.next = oldCur;  
                oldCur.value = tree.right;  
            } else cur = cur.next;  
        }  
        return result;  
    }  
}
```



- *refinement of annotation  $o1 =? o2$*

# Example with User-Defined Data Type

```
public class Flatten {  
    public static IntList  
        flatten(TreeList list) {  
        TreeList cur = list;  
        IntList result = null;  
  
        while (cur != null) {  
            Tree tree = cur.value;  
            if (tree != null) {  
                IntList oldIntList = result;  
                result = new IntList();  
                result.value = tree.value;  
                result.next = oldIntList;  
                TreeList oldCur = cur;  
                cur = new TreeList();  
                cur.value = tree.left;  
                cur.next = oldCur;  
                oldCur.value = tree.right;  
            } else cur = cur.next;  
        }  
        return result;  
    }  
}
```

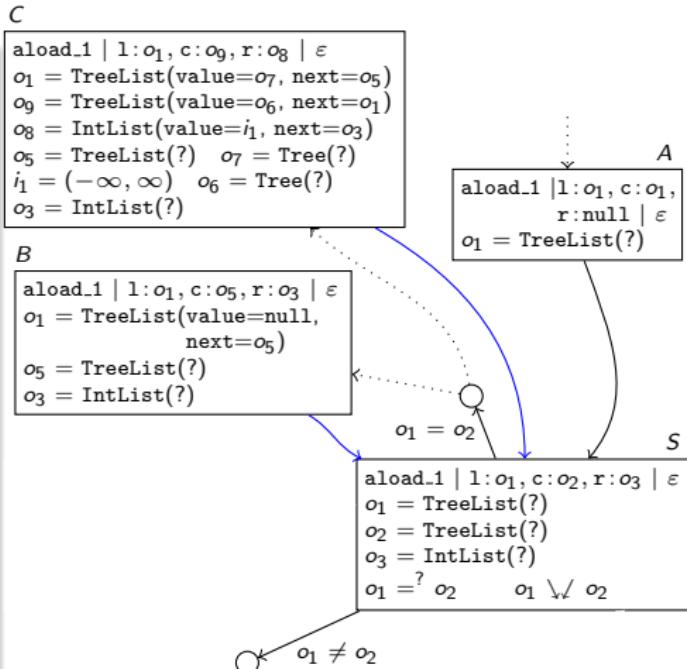


## State B:

- reach loop condition if `tree == null`
- $\text{list} \rightarrow^+ o \leftarrow^* \text{cur}$
- $B$  is *instance* of  $S$

# Example with User-Defined Data Type

```
public class Flatten {  
    public static IntList  
        flatten(TreeList list) {  
        TreeList cur = list;  
        IntList result = null;  
  
        while (cur != null) {  
            Tree tree = cur.value;  
            if (tree != null) {  
                IntList oldIntList = result;  
                result = new IntList();  
                result.value = tree.value;  
                result.next = oldIntList;  
                TreeList oldCur = cur;  
                cur = new TreeList();  
                cur.value = tree.left;  
                cur.next = oldCur;  
                oldCur.value = tree.right;  
            } else cur = cur.next;  
        }  
        return result;  
    }  
}
```

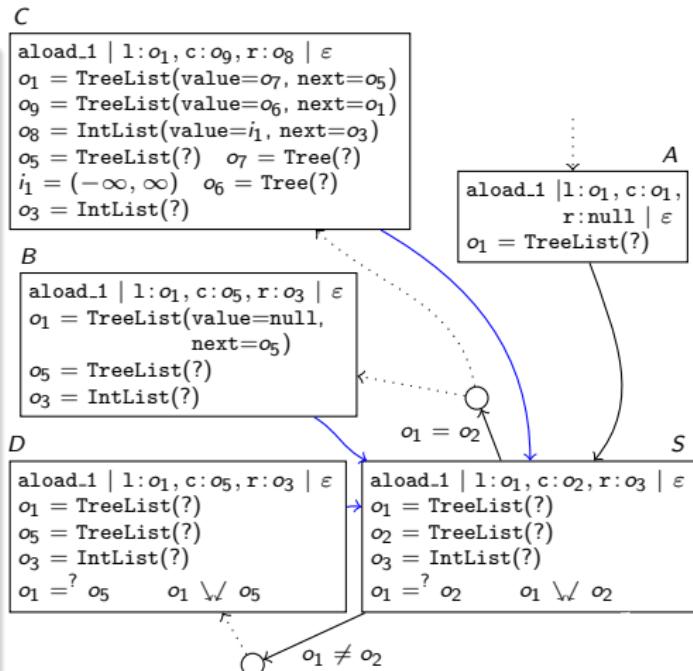


## State C:

- $\text{Tree}(\text{value} = i_1, \text{left} = o_6, \text{right} = o_7)$
- $\text{list} \rightarrow^* o \leftarrow^+ \text{cur}$
- C is *instance* of S

# Example with User-Defined Data Type

```
public class Flatten {  
    public static IntList  
        flatten(TreeList list) {  
        TreeList cur = list;  
        IntList result = null;  
  
        while (cur != null) {  
            Tree tree = cur.value;  
            if (tree != null) {  
                IntList oldIntList = result;  
                result = new IntList();  
                result.value = tree.value;  
                result.next = oldIntList;  
                TreeList oldCur = cur;  
                cur = new TreeList();  
                cur.value = tree.left;  
                cur.next = oldCur;  
                oldCur.value = tree.right;  
            } else cur = cur.next;  
        }  
        return result;  
    }  
}
```

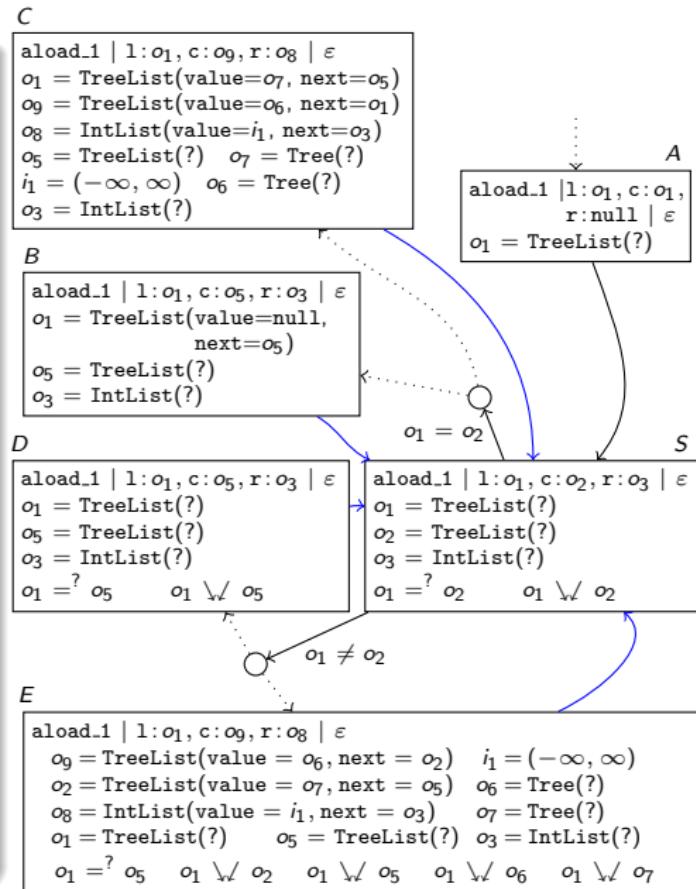


## State D:

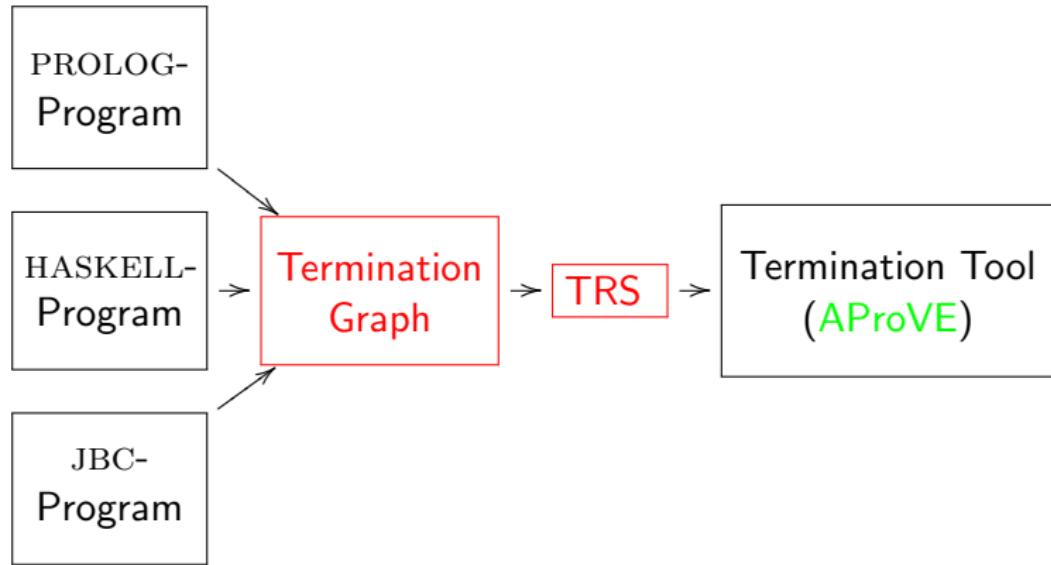
- $o_2 = \text{TreeList}(\text{value}=o_4, \text{next}=o_5)$
- tree ( $o_4$ ) is null
- $D$  is *instance* of  $S$

# Example with User-Defined Data Type

```
public class Flatten {  
    public static IntList  
        flatten(TreeList list) {  
        TreeList cur = list;  
        IntList result = null;  
  
        while (cur != null) {  
            Tree tree = cur.value;  
            if (tree != null) {  
                IntList oldIntList = result;  
                result = new IntList();  
                result.value = tree.value;  
                result.next = oldIntList;  
                TreeList oldCur = cur;  
                cur = new TreeList();  
                cur.value = tree.left;  
                cur.next = oldCur;  
                oldCur.value = tree.right;  
            } else cur = cur.next;  
        }  
        return result;  
    }  
}
```



# From Termination Graphs to TRSs



# Transforming Objects to Terms

```
aload_1 | l:o1, c:o9, r:o8 | ε
o9 = TreeList(value = o6, next = o2)    i1 = (-∞, ∞)
o2 = TreeList(value = o7, next = o5)    o6 = Tree(?)  

o8 = IntList(value = i1, next = o3)    o7 = Tree(?)  

o1 = TreeList(?)    o5 = TreeList(?)  o3 = IntList(?)  

o1 =?? o5    o1 ↴ o2    o1 ↴ o5    o1 ↴ o6    o1 ↴ o7
```

For every class C with  $n$  fields,  
introduce function symbol C with  $n$  arguments

- term for  $o_1$ :  $o_1$

# Transforming Objects to Terms

```
aload_1 | l: o1, c: o9, r: o8 | ε
o9 = TreeList(value = o6, next = o2)    i1 = (-∞, ∞)
o2 = TreeList(value = o7, next = o5)    o6 = Tree(?) 
o8 = IntList(value = i1, next = o3)    o7 = Tree(?) 
o1 = TreeList(?)    o5 = TreeList(?)    o3 = IntList(?)
o1 = ? o5    o1 ↴ o2    o1 ↴ o5    o1 ↴ o6    o1 ↴ o7
```

For every class C with  $n$  fields,  
introduce function symbol C with  $n$  arguments

- term for  $o_1$ :  $o_1$
- term for  $o_2$ :  $\text{TL}(o_7, o_5)$

# Transforming Objects to Terms

```
aload_1 | l:o1, c:o9, r:o8 | ε
o9 = TreeList(value = o6, next = o2)    i1 = (-∞, ∞)
o2 = TreeList(value = o7, next = o5)    o6 = Tree(?)
o8 = IntList(value = i1, next = o3)    o7 = Tree(?)
o1 = TreeList(?)    o5 = TreeList(?)    o3 = IntList(?)
o1 = ? o5    o1 \wedge o2    o1 \wedge o5    o1 \wedge o6    o1 \wedge o7
```

For every class C with  $n$  fields,  
introduce function symbol C with  $n$  arguments

- term for  $o_1$ :  $o_1$
- term for  $o_2$ :  $\text{TL}(o_7, o_5)$
- term for  $o_9$ :  $\text{TL}(o_6, \text{TL}(o_7, o_5))$

# Transforming Objects to Terms

```
aload_1 | l: o1, c: o9, r: o8 | ε
o9 = TreeList(value = o6, next = o2)    i1 = (-∞, ∞)
o2 = TreeList(value = o7, next = o5)    o6 = Tree(?)
o8 = IntList(value = i1, next = o3)    o7 = Tree(?)
o1 = TreeList(?)    o5 = TreeList(?)    o3 = IntList(?)
o1 = ? o5    o1 \wedge o2    o1 \wedge o5    o1 \wedge o6    o1 \wedge o7
```

For every class C with  $n$  fields,  
introduce function symbol C with  $n$  arguments

- term for  $o_1$ :  $o_1$
- term for  $o_2$ :  $\text{TL}(o_7, o_5)$
- term for  $o_9$ :  $\text{TL}(o_6, \text{TL}(o_7, o_5))$
- term for  $o_8$ :  $\text{IL}(i_1, o_3)$

# Transforming Objects to Terms

## Class Hierarchy

- for every class C with  $n$  fields,  
introduce function symbol C with  $n + 1$  arguments
- first argument: part of the object corresponding to subclasses of C

```
public class A {  
    int a;  
}
```

```
A x = new A();  
x.a = 1;
```

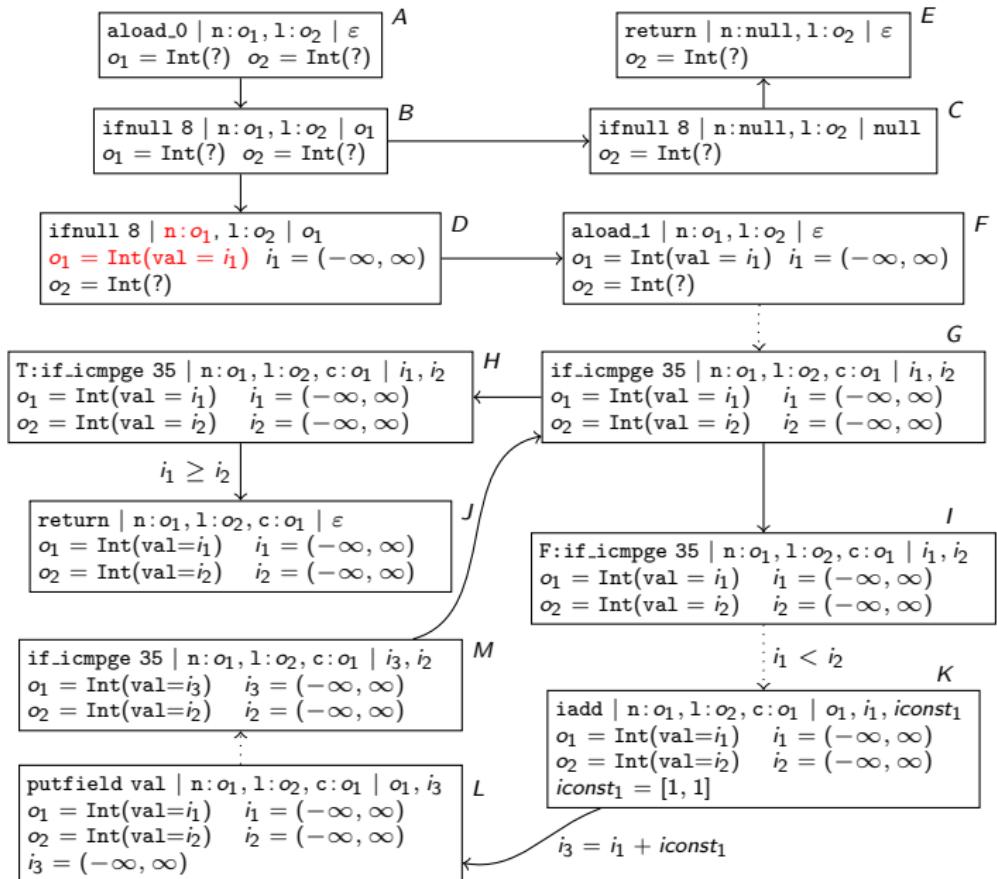
```
public class B extends A {  
    int b;  
}
```

```
B y = new B();  
y.a = 2;  
y.b = 3;
```

- term for x:  $\text{jIO}(A(\text{eoc}, 1))$  (eoc for “end of class”)
- term for y:  $\text{jIO}(A(B(\text{eoc}, 3), 2))$  ( $\text{jIO}$  for “`java.lang.Object`”)

# Transforming States to Tuples of Terms

Transforming  $D$   
 $j\mid O(\text{Int}(\text{eoc}, i_1))$

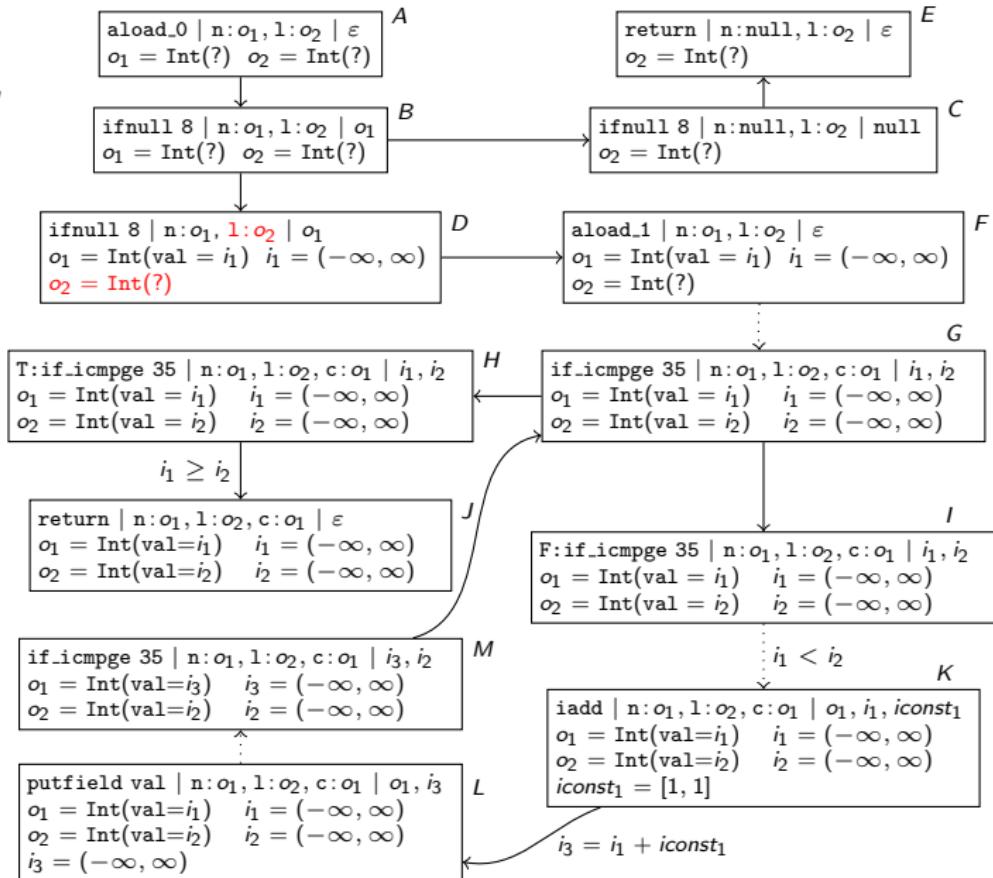


# Transforming States to Tuples of Terms

Transforming  $D$

$j\mid O(\text{Int}(\text{eoc}, i_1))$ ,

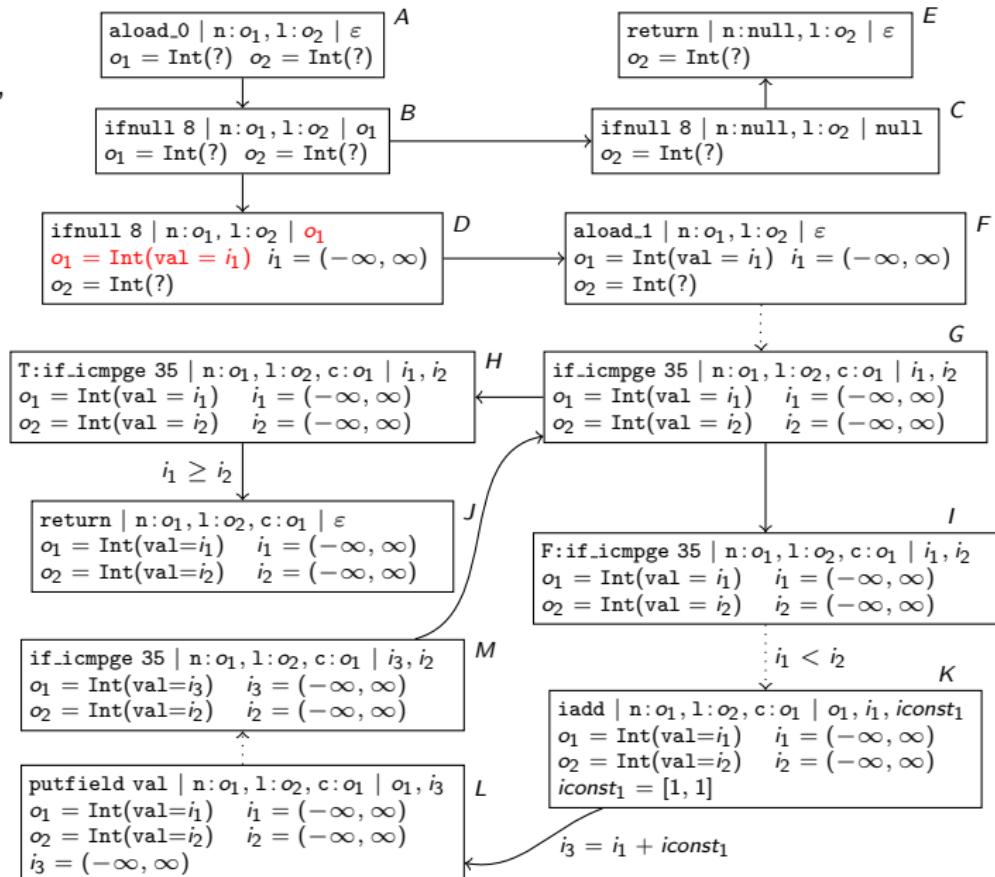
$o_2$



# Transforming States to Tuples of Terms

## Transforming $D$

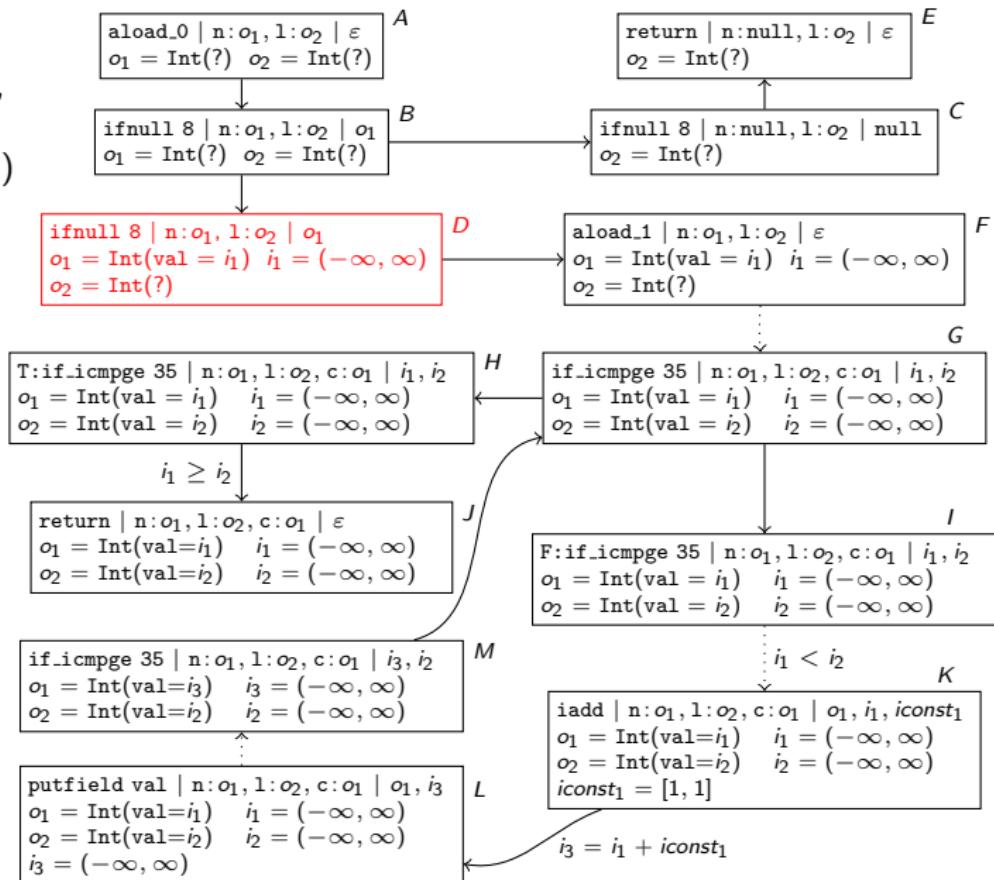
$j\text{IO}(\text{Int}(\text{eoc}, i_1))$ ,  
 $o_2$ ,  
 $j\text{IO}(\text{Int}(\text{eoc}, i_1))$



# Transforming States to Tuples of Terms

Transforming  $D$

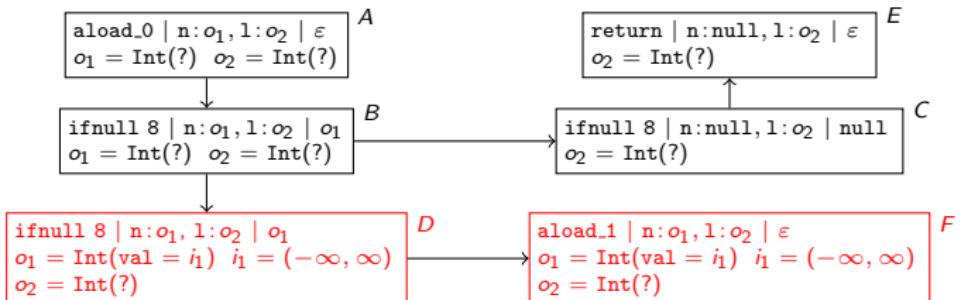
$f_D(jlO(\text{Int}(eoc, } i_1)),$   
 $o_2,$   
 $jlO(\text{Int}(eoc, } i_1))$



# Transforming States to Tuples of Terms

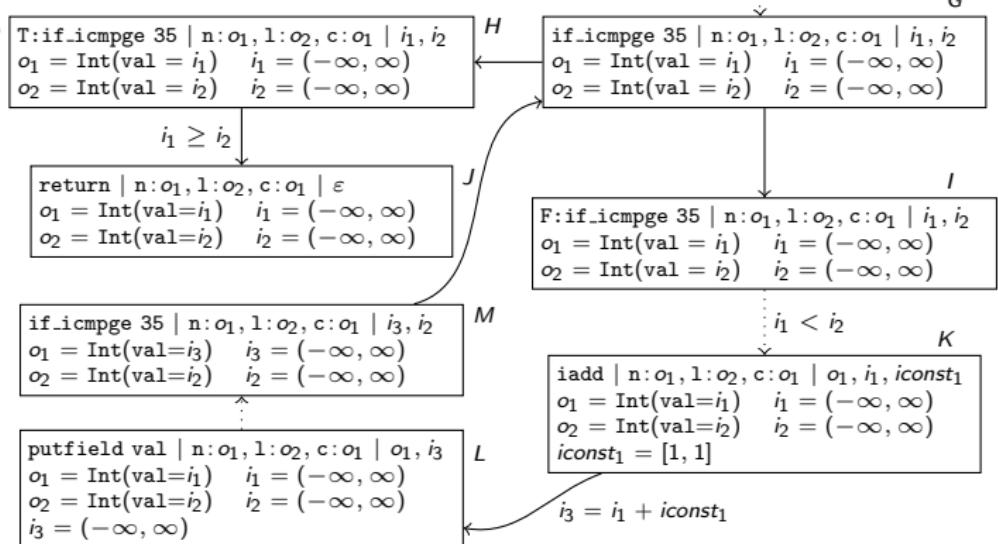
## Transforming $D$

$f_D(jlO(\text{Int}(eoc, } i_1),$   
 $o_2,$   
 $jlO(\text{Int}(eoc, } i_1))$

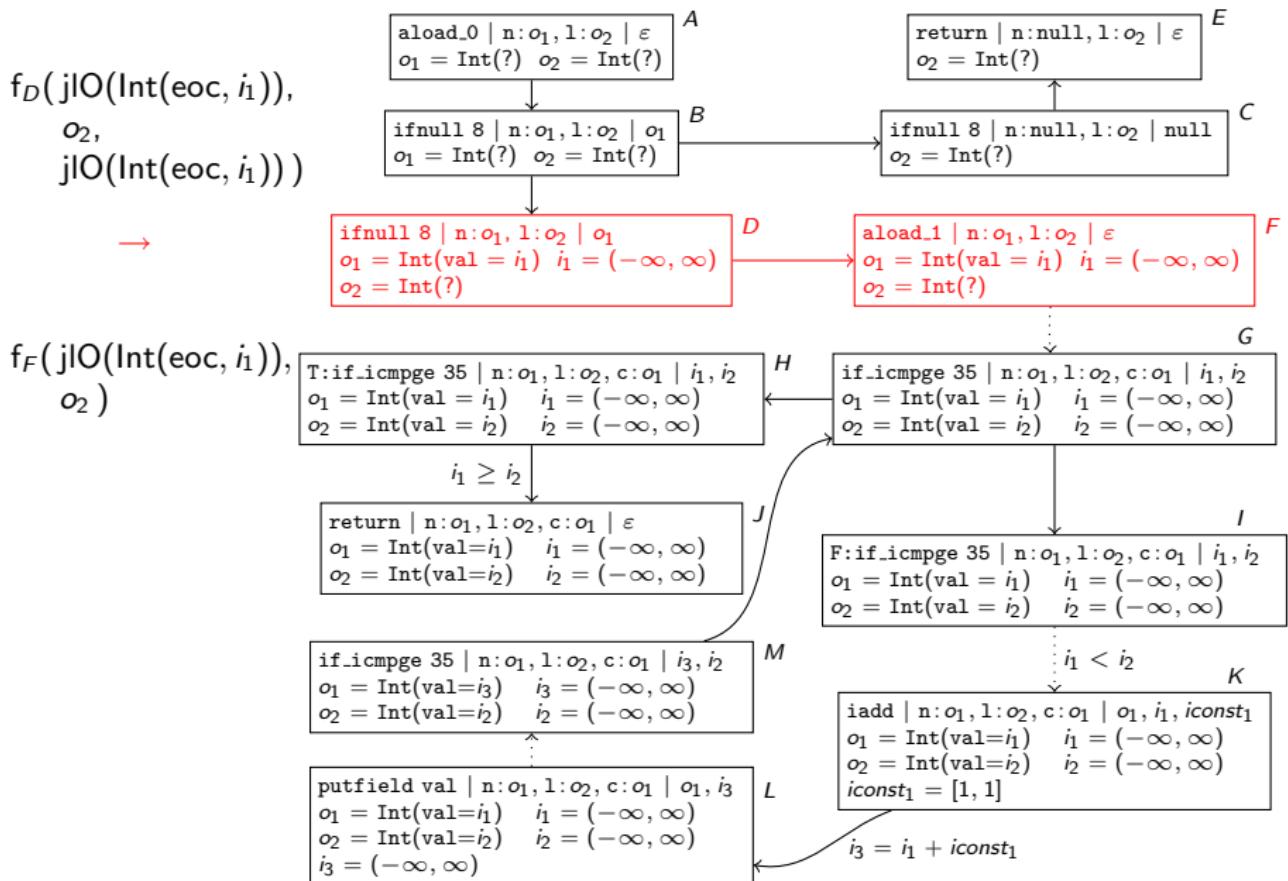


## Transforming $F$

$f_F(jlO(\text{Int}(eoc, } i_1),$   
 $o_2)$



# Transforming Edges to Rewrite Rules



# Transforming Edges to Rewrite Rules

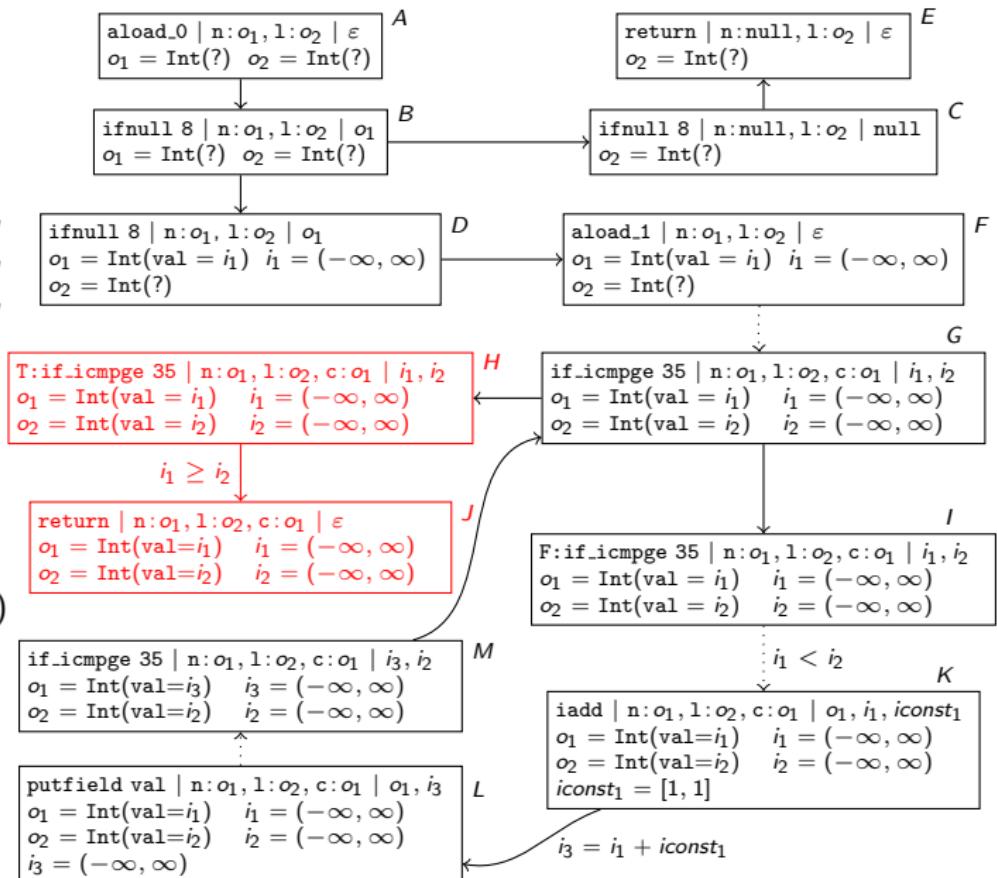
## Transforming Evaluation Edges with Conditions

$f_H(jlO(\text{Int}(eoc, } i_1),$   
 $jlO(\text{Int}(eoc, } i_2),$   
 $jlO(\text{Int}(eoc, } i_1),$   
 $i_1,$   
 $i_2)$

→

$f_J(jlO(\text{Int}(eoc, } i_1),$   
 $jlO(\text{Int}(eoc, } i_2),$   
 $jlO(\text{Int}(eoc, } i_1))$

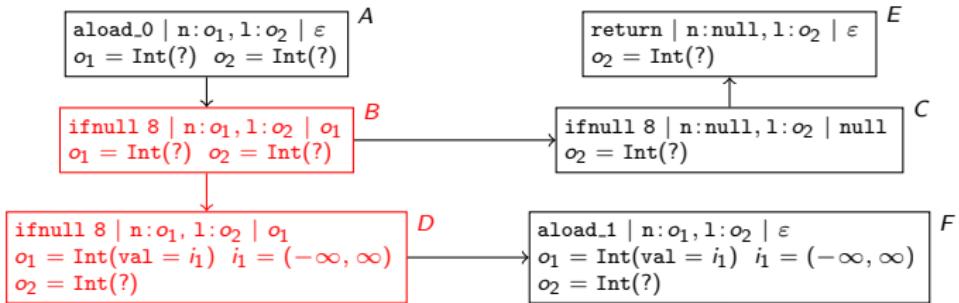
|  $i_1 \geq i_2$



# Transforming Edges to Rewrite Rules

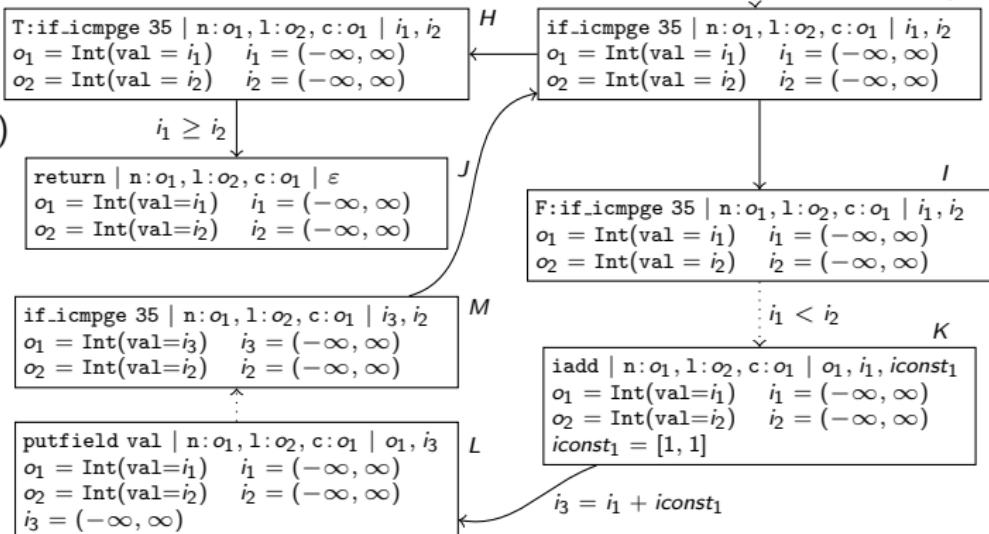
## Transforming Refinement Edges

$f_B(jlO(\text{Int}(eoc, } i_1)),$   
 $o_2,$   
 $jlO(\text{Int}(eoc, } i_1))$



→

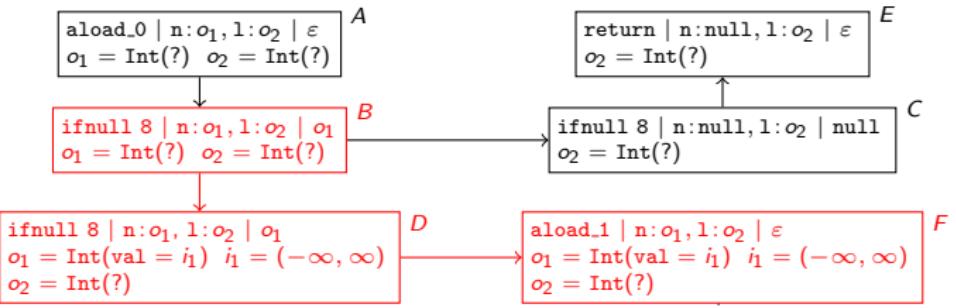
$f_D(jlO(\text{Int}(eoc, } i_1)),$   
 $o_2,$   
 $jlO(\text{Int}(eoc, } i_1))$



# Transforming Edges to Rewrite Rules

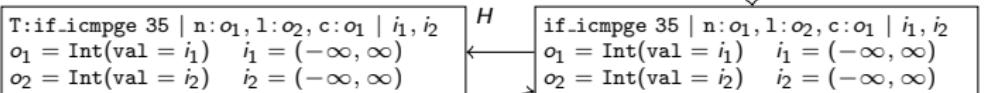
## Merging Rewrite Rules

$f_B(jlO(\text{Int}(eoc, } i_1)),$   
 $o_2,$   
 $jlO(\text{Int}(eoc, } i_1))$



→

$f_D(jlO(\text{Int}(eoc, } i_1)),$   
 $o_2,$   
 $jlO(\text{Int}(eoc, } i_1))$

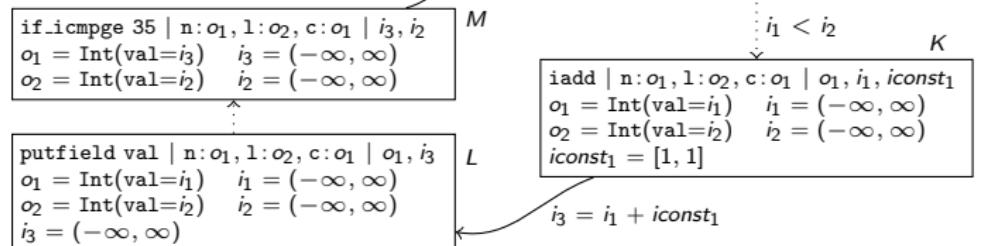


$i_1 \geq i_2$

$f_F(jlO(\text{Int}(eoc, } i_1)),$   
 $o_2)$



$i_1 < i_2$



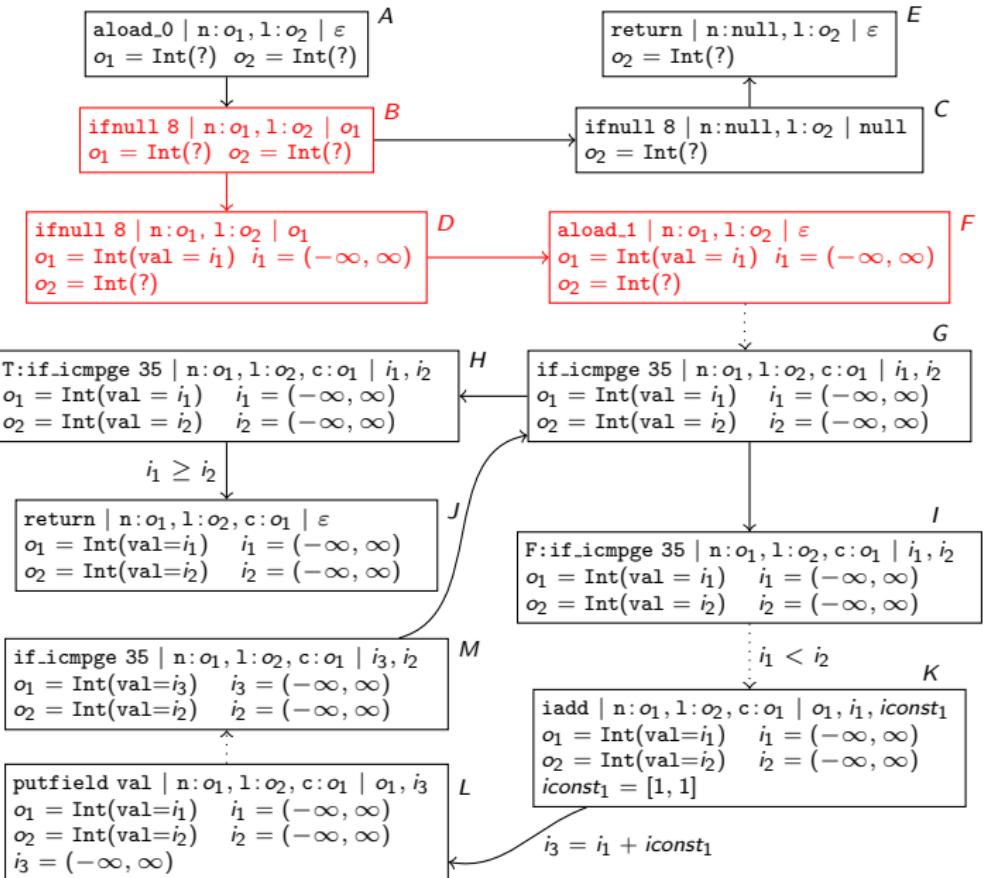
# Transforming Edges to Rewrite Rules

## Merging Rewrite Rules

$f_B(jlO(\text{Int}(eoc, } i_1),$   
 $o_2,$   
 $jlO(\text{Int}(eoc, } i_1))$

$\rightarrow$

$f_F(jlO(\text{Int}(eoc, } i_1),$   
 $o_2)$



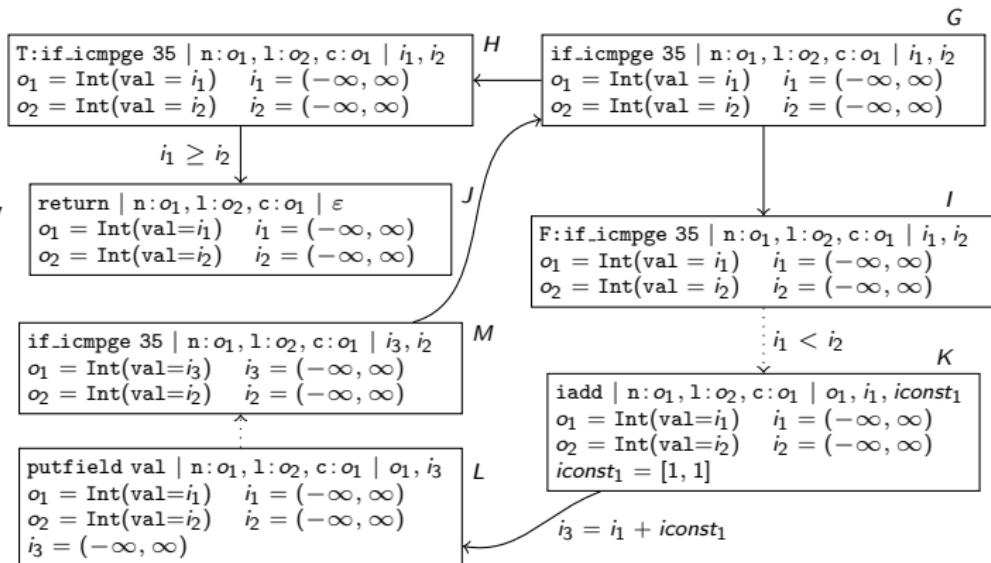
# Transforming Edges to Rewrite Rules

## TRS for count

$$\begin{array}{lll} f_G(jlO(\text{Int}(eoc, i_1)), & jlO(\text{Int}(eoc, i_2)), & jlO(\text{Int}(eoc, i_1)), \\ f_G(jlO(\text{Int}(eoc, i_1 + 1)), & jlO(\text{Int}(eoc, i_2)), & jlO(\text{Int}(eoc, i_1 + 1)), \end{array} \quad \begin{array}{c} i_1, \\ | \\ i_1 + 1, \end{array} \quad \begin{array}{c} i_2) \\ | \\ i_2 \end{array} \rightarrow \begin{array}{c} i_1, \\ | \\ i_1 + 1, \end{array} \quad i_1 < i_2$$

TRS is  
“natural”

termination easy  
to prove  
automatically



# From Termination Graphs to TRSs

## TRS for count

$$\begin{array}{c} f_G(jIO(Int(eoc, i_1)), jIO(Int(eoc, i_2)), jIO(Int(eoc, i_1)), i_1, i_2) \rightarrow \\ f_G(jIO(Int(eoc, i_1 + 1)), jIO(Int(eoc, i_2)), jIO(Int(eoc, i_1 + 1)), i_1 + 1, i_2) \mid i_1 < i_2 \end{array}$$

- every JBC-computation of concrete states corresponds to a *computation path* in the termination graph
- termination graph is called *terminating* iff it has no infinite computation path
- every computation path corresponds to rewrite sequence in TRS

## Theorem

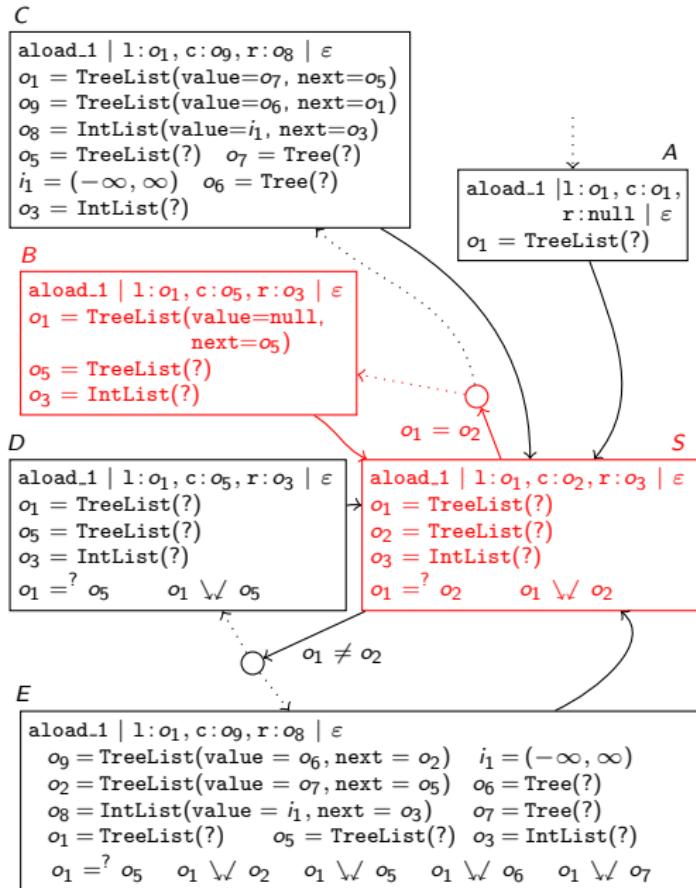
TRS corresponding to termination graph is terminating  $\Rightarrow$

termination graph is terminating  $\Rightarrow$

JBC-program terminating for all states represented in termination graph

# From Termination Graphs to TRSs

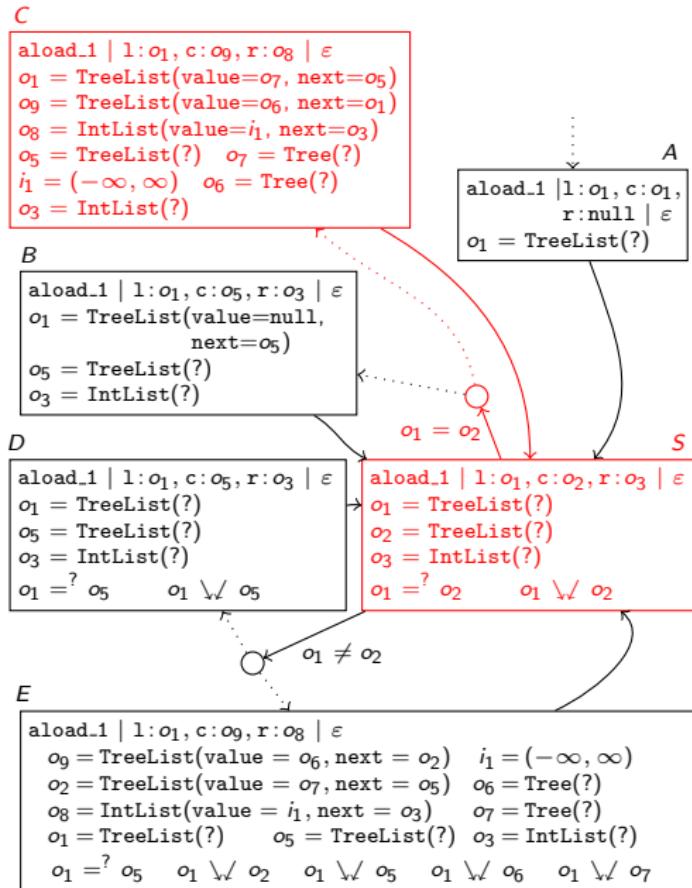
$f_S(\text{TL}(\text{null}, o_5), \text{TL}(\text{null}, o_5), o_3) \rightarrow f_S(\text{TL}(\text{null}, o_5), o_5, o_3)$



# From Termination Graphs to TRSs

$f_S(TL(null, o_5), TL(null, o_5), o_3) \rightarrow f_S(TL(null, o_5), o_5, o_3)$

$f_S(\dots, TL(T(i_1, o_6, o_7), o_5), o_3) \rightarrow f_S(\dots, TL(o_6, TL(o_7, o_5)), IL(i_1, o_3))$

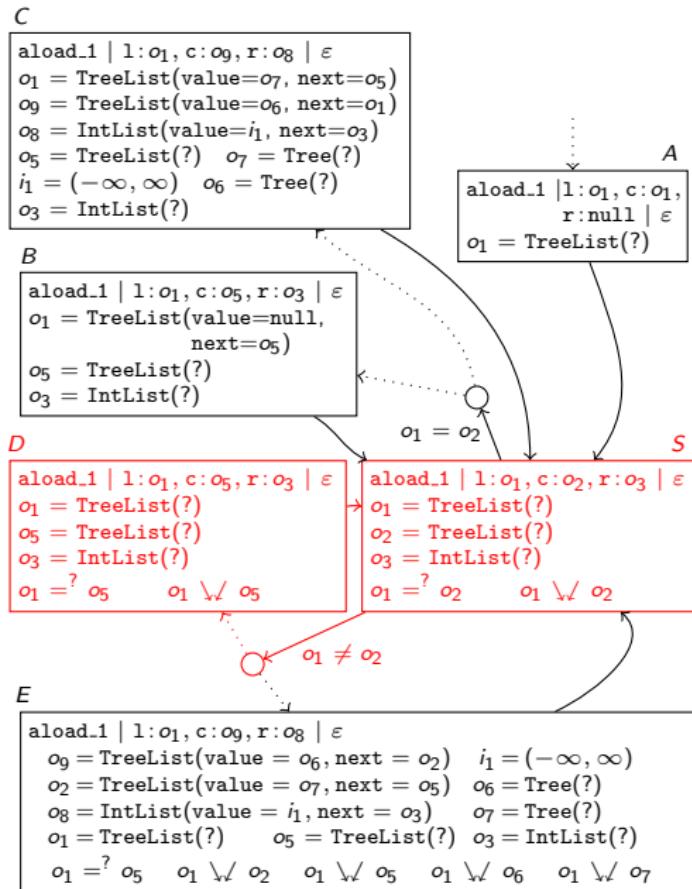


# From Termination Graphs to TRSs

$f_S(TL(null, o_5), TL(null, o_5), o_3) \rightarrow$   
 $f_S(TL(null, o_5), o_5, o_3)$

$f_S(\dots, TL(T(i_1, o_6, o_7), o_5), o_3) \rightarrow$   
 $f_S(\dots, TL(o_6, TL(o_7, o_5)), IL(i_1, o_3))$

$f_S(o_1, TL(null, o_5), o_3) \rightarrow$   
 $f_S(o_1, o_5, o_3)$



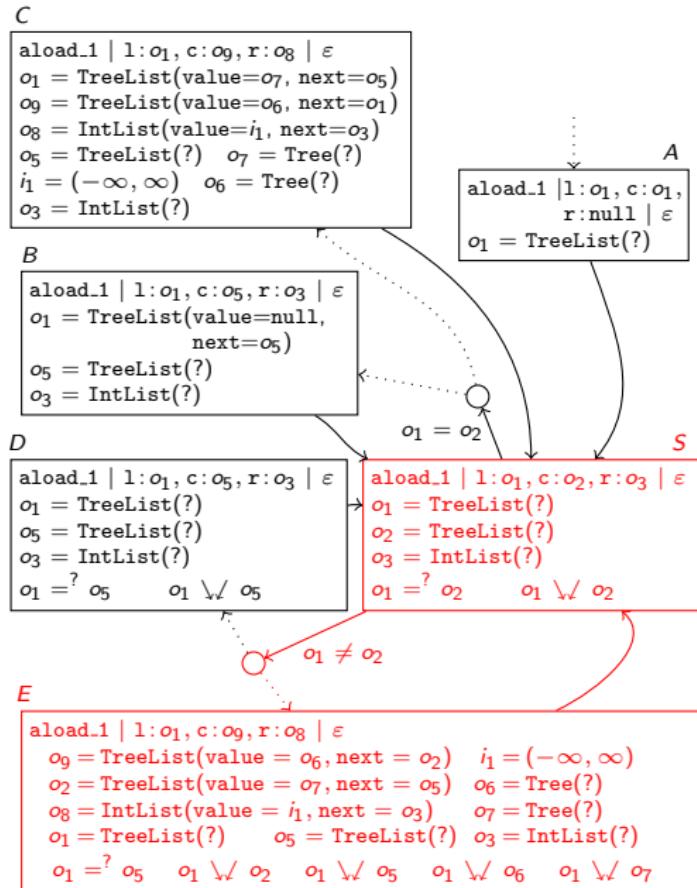
# From Termination Graphs to TRSs

$f_S(TL(null, o_5), TL(null, o_5), o_3) \rightarrow$   
 $f_S(TL(null, o_5), o_5, o_3)$

$f_S(\dots, TL(T(i_1, o_6, o_7), o_5), o_3) \rightarrow$   
 $f_S(\dots, TL(o_6, TL(o_7, o_5)), IL(i_1, o_3))$

$f_S(o_1, TL(null, o_5), o_3) \rightarrow$   
 $f_S(o_1, o_5, o_3)$

$f_S(o_1, TL(T(i_1, o_6, o_7), o_5), o_3) \rightarrow$   
 $f_S(o'_1, TL(o_6, TL(o_7, o_5)), IL(i_1, o_3))$



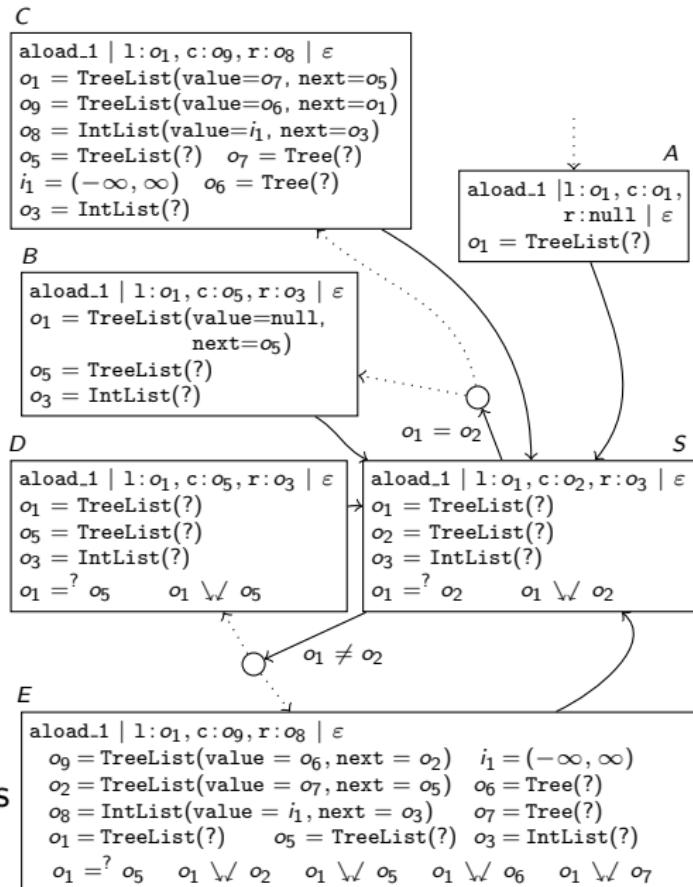
# From Termination Graphs to TRSs

$f_S(TL(null, o_5), TL(null, o_5), o_3) \rightarrow$   
 $f_S(TL(null, o_5), o_5, o_3)$

$f_S(\dots, TL(T(i_1, o_6, o_7), o_5), o_3) \rightarrow$   
 $f_S(\dots, TL(o_6, TL(o_7, o_5)), IL(i_1, o_3))$

$f_S(o_1, TL(null, o_5), o_3) \rightarrow$   
 $f_S(o_1, o_5, o_3)$

$f_S(o_1, TL(T(i_1, o_6, o_7), o_5), o_3) \rightarrow$   
 $f_S(o'_1, TL(o_6, TL(o_7, o_5)), IL(i_1, o_3))$



## Rewrite Rules & Annotations

- when writing to a field of  $o_2$  with  $o_1 \swarrow o_2$ :  
 $o_1$  on lhs, fresh variable  $o'_1$  on rhs
- cyclic objects: fresh variable on rhs

# From Termination Graphs to TRSs

$f_S(TL(null, o_5), TL(null, o_5), o_3) \rightarrow$

$f_S(TL(null, o_5), o_5, o_3)$

$f_S(\dots, TL(T(i_1, o_6, o_7), o_5), o_3) \rightarrow$

$f_S(\dots, TL(o_6, TL(o_7, o_5)), IL(i_1, o_3))$

$f_S(o_1, TL(null, o_5), o_3) \rightarrow$

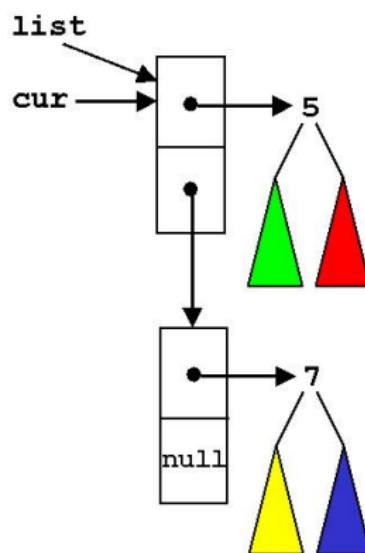
$f_S(o_1, o_5, o_3)$

$f_S(o_1, TL(T(5, o_6, o_7), o_5), null) \rightarrow$

$f_S(o'_1, TL(o_6, TL(o_7, o_5)), IL(5, null))$

TRS is “natural”

**result:** null



# From Termination Graphs to TRSs

$f_S(TL(null, o_5), TL(null, o_5), o_3) \rightarrow$

$f_S(TL(null, o_5), o_5, o_3)$

$f_S(\dots, TL(T(i_1, o_6, o_7), o_5), o_3) \rightarrow$

$f_S(\dots, TL(o_6, TL(o_7, o_5)), IL(i_1, o_3))$

$f_S(o_1, TL(null, o_5), o_3) \rightarrow$

$f_S(o_1, o_5, o_3)$

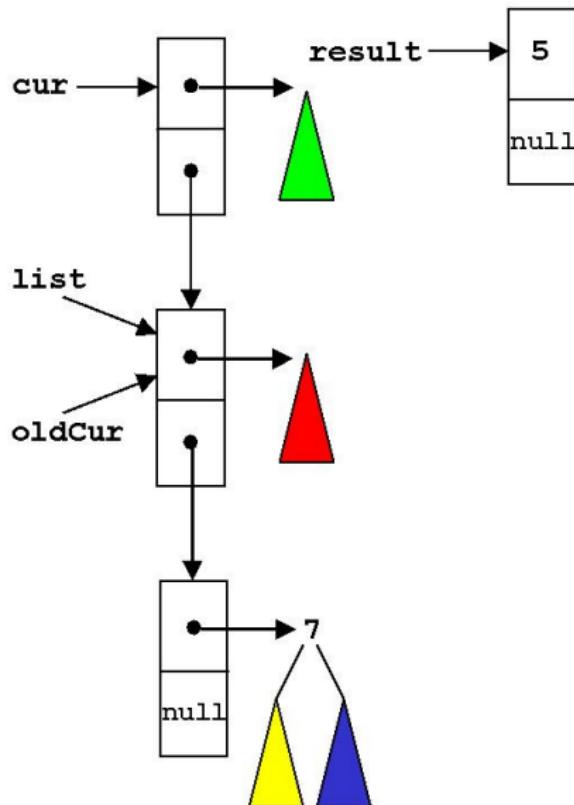
$f_S(o_1, TL(T(5, o_6, o_7), o_5), null) \rightarrow$

$f_S(o'_1, TL(o_6, TL(o_7, o_5)), IL(5, null))$

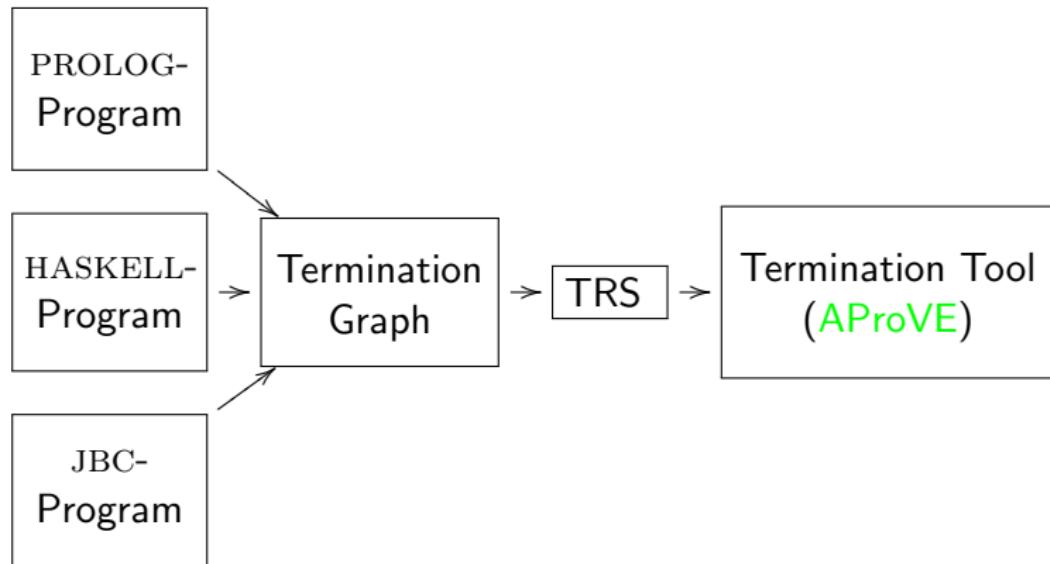
TRS is “natural”

termination easy

to prove automatically



# Automated Termination Analysis of JAVA BYTECODE by Term Rewriting



# Automated Termination Analysis of JAVA BYTECODE by Term Rewriting

- implemented in AProVE and evaluated on collection of 125 JBC-programs (*Termination Problem Data Base*)

	Success	Failure	Timeout	Runtime
AProVE	102	6	17	15.0
Julia	91	34	0	2.7
COSTA	72	52	1	4.5

- AProVE winner of the *International Termination Competition* for JBC, HASKELL, PROLOG, term rewriting
- <http://aprove.informatik.rwth-aachen.de>
- termination of “real” languages can be analyzed automatically, term rewriting is a suitable approach