

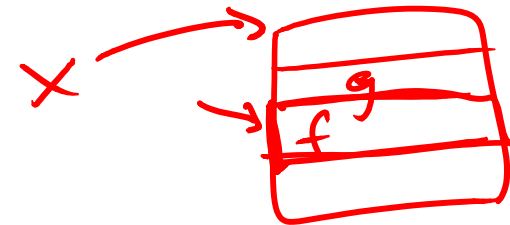
Representing Data



- In Java, the standard model is a mutable graph of objects
- It seems natural to represent references to symbols using mutable fields (initially null, **resolved** during name analysis)
- Alternative way is functional
 - store the **backbone** of the graph as a algebraic data type (immutable)
 - pass around a map linking from identifiers to their declarations
- Note that a field **class** `A { var f:T }` is like `f: Map[A,T]`

Symbol Table (Γ) Contents

- Map identifiers to the symbol with relevant information about the identifier
- All information is derived from syntax tree - symbol table is for efficiency
 - in old one-pass compilers there was only symbol table, no syntax tree
 - in modern compiler: we could always go through entire tree, but symbol table can give faster and easier access to the part of syntax tree, or some additional information
- Goal: efficiently supporting phases of compiler
- In the name analysis phase:
 - finding which identifier refers to which definition
 - we store *definitions*
- What kinds of things can we define? What do we need to know for each ID?



variables (globals, fields, parameters, locals):

- need to know types, positions - for error messages
 - later: memory layout. To compile `x.f = y` into `memcpy(addr_y, addr_x+6, 4)`
 - e.g. 3rd field in an object should be stored at offset e.g. +6 from the address of the object
 - the size of data stored in `x.f` is 4 bytes
 - sometimes more information explicit: whether variable local or global
- methods, functions, classes: recursively have with their own symbol tables

Functional: Different Points, Different Γ

```
class World {
```

```
  int sum;
```

```
  void add(int foo) {
```

```
    sum = sum + foo;
```

```
  } ←  $\Gamma_0$ 
```

```
  void sub(int bar) {
```

```
    sum = sum - bar;
```

```
  }
```

```
  int count;
```

```
}
```

$\Gamma_0 = \{(sum, int), (count, int)\}$

← $\Gamma_1 = \Gamma_0 [foo := int]$

← $\Gamma_1 = \Gamma_0 [bar := int]$

Imperative Way: Push and Pop

```
class World {
```

```
  int sum;
```

```
  void add(int foo) {
```

```
    sum = sum + foo;
```

```
  }
```

```
  void sub(int bar) {
```

```
    sum = sum - bar;
```

```
  }
```

```
  int count;
```

```
}
```

$\Gamma_0 = \{(\text{sum}, \text{int}), (\text{count}, \text{int})\}$

$\Gamma_1 = \Gamma_0 [\text{foo} := \text{int}]$
change table, record change

Γ_0 revert changes from table

$\Gamma_1 = \Gamma_0 [\text{bar} := \text{int}]$
change table, record change

revert changes from table

Imperative Symbol Table

- Hash table, mutable Map[ID,Symbol]
- Example:
 - hash function into array
 - array has linked list storing (ID,Symbol) pairs
- Undo stack: to enable entering and leaving scope
- Entering new scope (function,block):
 - add beginning-of-scope marker to undo stack
- Adding nested declaration (ID,sym)
 - lookup old value symOld, push old value to undo stack
 - insert (ID,sym) into table
- Leaving the scope
 - go through undo stack until the marker, restore old values

Functional: Keep Old Version

```
class World {
```

```
  int sum;
```

```
  void add(int foo) {
```

```
    sum = sum + foo;
```

```
  } ←  $\Gamma_0$ 
```

```
  void sub(int bar) {
```

```
    sum = sum - bar;
```

```
  }
```

```
  int count;
```

```
}
```

$\Gamma_0 = \{(\text{sum}, \text{int}), (\text{count}, \text{int})\}$

← $\Gamma_1 = \Gamma_0 [\text{foo} := \text{int}]$

create new Γ_1 , keep old Γ_0

← $\Gamma_2 = \Gamma_0 [\text{bar} := \text{int}]$

create new Γ_2 , keep old Γ_0

Functional Symbol Table Implemented

- Typical: Immutable Balanced Search Trees

sealed abstract class BST

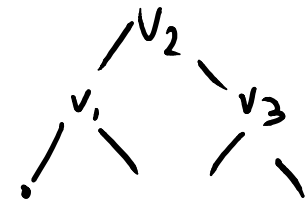
case class Empty() extends BST

case class Node(left: BST, value: Int, right: BST) extends BST

Simplified. In practice, BST[A],
store Int key and value A

- Updating returns new map, keeping old one

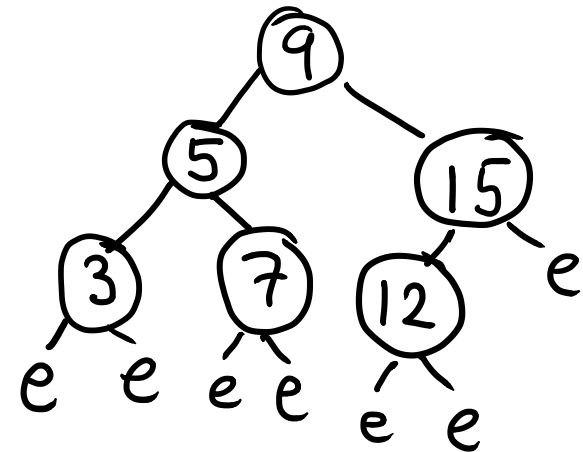
- lookup and update both $\log(n)$
- update creates new path (copy $\log(n)$ nodes, share rest!)
- memory usage acceptable



Lookup

```
def contains(key: Int, t : BST): Boolean = t match {  
  case Empty() => false  
  case Node(left,v,right) => {  
    if (key == v) true  
    else if (key < v) contains(key, left)  
    else contains(key, right)  
  }  
}
```

Running time bounded by tree height.



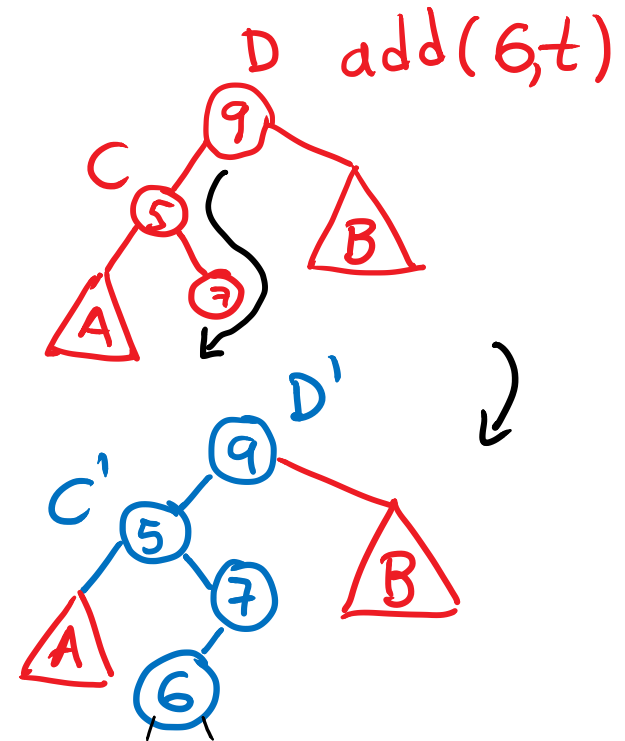
contains(6,t) ?

Insertion

```
def add(x : Int, t : BST) : Node = t match {  
  case Empty() => Node(Empty(),x,Empty())  
  case t @ Node(left,v,right) => {  
    if (x < v) Node(add(x, left), v, right)  
    else if (x==v) t  
    else Node(left, v, add(x, right))  
  }  
}
```

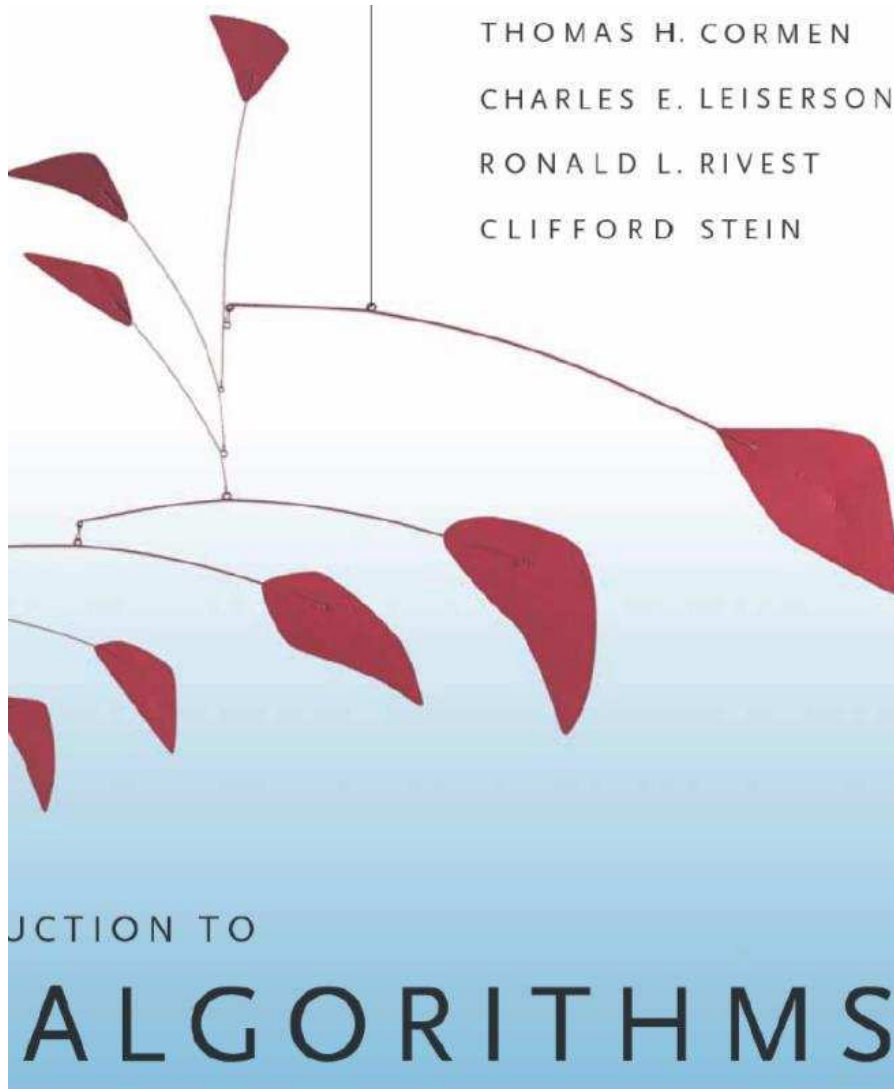
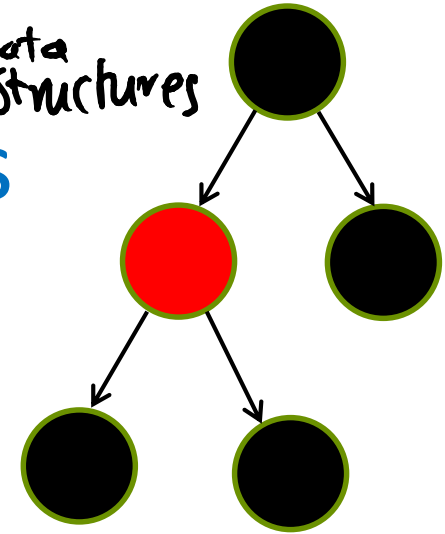
Both $\text{add}(x,t)$ and t remain accessible.

Running time and newly allocated nodes bounded by tree height.



Chris Okasaki : Purely Functional Data Structures



Balanced Trees: Red-Black Trees



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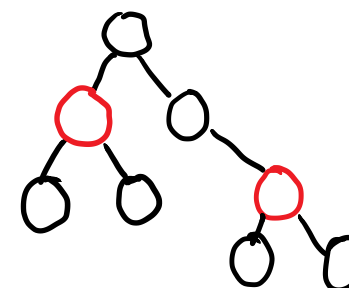
Balanced Tree: Red Black Tree

Goals:

- ensure that tree height remains at most $\log(\text{size})$
-  `add(1,add(2,add(3,...add(n,Empty())...)))` ~ linked list 
- preserve efficiency of individual operations:
rebalancing arbitrary tree: could cost $O(n)$ work

Solution: maintain mostly balanced trees: height still $O(\log \text{ size})$

```
sealed abstract class Color  
case class Red() extends Color  
case class Black() extends Color
```



```
sealed abstract class Tree  
case class Empty() extends Tree  
case class Node(c: Color, left: Tree, value: Int, right: Tree)  
    extends Tree
```

Properties of red-black trees

A *red-black tree* is a binary search tree with one extra bit of storage per node: its *color*, which can be either RED or BLACK. By constraining the node colors on any simple path from the root to a leaf, red-black trees ensure that no such path is more than twice as long as any other, so that the tree is approximately *balanced*.

Each node of the tree now contains the attributes *color*, *key*, *left*, *right*, and *p*. If a child or the parent of a node does not exist, the corresponding pointer attribute of the node contains the value NIL. We shall regard these NILs as being pointers to leaves (external nodes) of the binary search tree and the normal, key-bearing nodes as being internal nodes of the tree.

A red-black tree is a binary tree that satisfies the following *red-black properties*:

balanced
tree
constraints

1. Every node is either red or black.
2. The root is black.
3. Every leaf (NIL) is black.
4. If a node is red, then both its children are black.
5. For each node, all simple paths from the node to descendant leaves contain the same number of black nodes.

From 4. and 5.: tree height is $O(\log \text{ size})$.

Analysis is similar for mutable and immutable trees.

for immutable trees: see book by Chris Okasaki

Balancing

```
def balance(c: Color, a: Tree, x: Int, b: Tree): Tree = (c,a,x,b) match {  
  case (Black(),Node(Red(),Node(Red(),a,xV,b),yV,c),zV,d) =>  
    Node(Red(),Node(Black(),a,xV,b),yV,Node(Black(),c,zV,d))
```



```
  case (Black(),Node(Red(),a,xV,Node(Red(),b,yV,c)),zV,d) =>  
    Node(Red(),Node(Black(),a,xV,b),yV,Node(Black(),c,zV,d))
```

```
  case (Black(),a,xV,Node(Red(),Node(Red(),b,yV,c),zV,d)) =>  
    Node(Red(),Node(Black(),a,xV,b),yV,Node(Black(),c,zV,d))
```

```
  case (Black(),a,xV,Node(Red(),b,yV,Node(Red(),c,zV,d))) =>  
    Node(Red(),Node(Black(),a,xV,b),yV,Node(Black(),c,zV,d))
```

```
  case (c,a,xV,b) => Node(c,a,xV,b)
```

```
}
```

Insertion

```
def add(x: Int, t: Tree): Tree = {  
  def ins(t: Tree): Tree = t match {  
    case Empty() => Node(Red(),Empty(),x,Empty())  
    case Node(c,a,y,b) =>  
      if (x < y) balance(c, ins(a), y, b)  
      else if (x == y) Node(c,a,y,b)  
      else balance(c,a,y,ins(b))  
  }  
  makeBlack(ins(t))  
}  
  
def makeBlack(n: Tree): Tree = n match {  
  case Node(Red(),l,v,r) => Node(Black(),l,v,r)  
  case _ => n  
}
```

Modern object-oriented languages (e.g. Scala) support abstraction and functional data structures. Just use Map from Scala.

Exercise

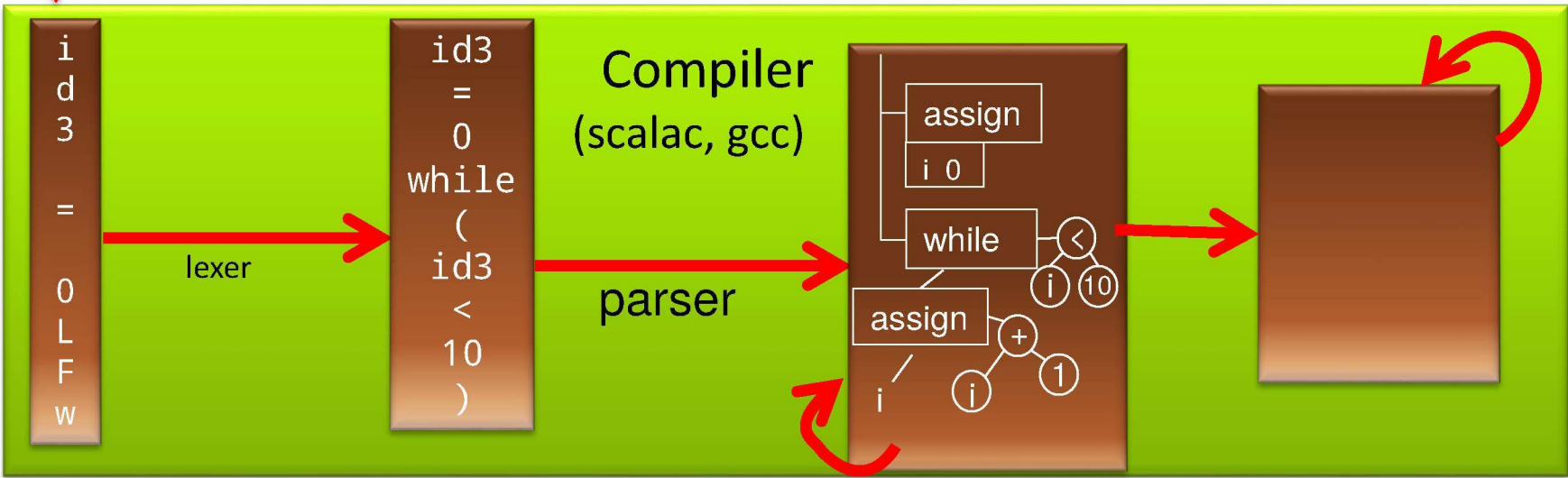
Determine the output of the following program assuming static and dynamic scoping. Explain the difference, if there is any.

```
object MyClass {  
  val x = 5  
  def foo(z: Int): Int = { x + z }  
  def bar(y: Int): Int = {  
    val x = 1; val z = 2  
    foo(y)  
  }  
  def main() {  
    val x = 7  
    println(foo(bar(3)))  
  }  
}
```



```
i = 0
while (i < 10) {
  i = i + 1 }
```

source code



characters

words
(tokens)

trees

Type Checking

Evaluating an Expression

scala prompt:

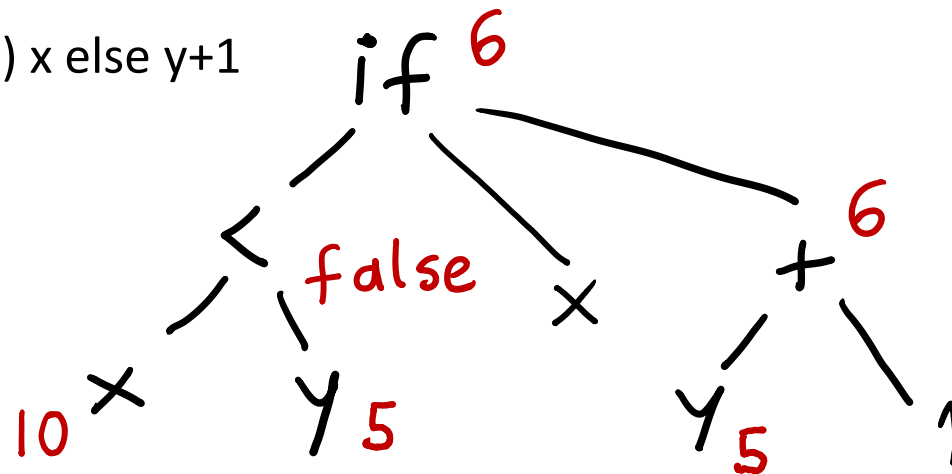
```
>def min1(x : Int, y : Int) : Int = { if (x < y) x else y+1 }  
min1: (x: Int,y: Int)Int  
>min1(10,5)  
res1: Int = 6
```

How can we think about this evaluation?

$x \rightarrow 10$

$y \rightarrow 5$

if (x < y) x else y+1



Computing types using the evaluation tree

scala prompt:

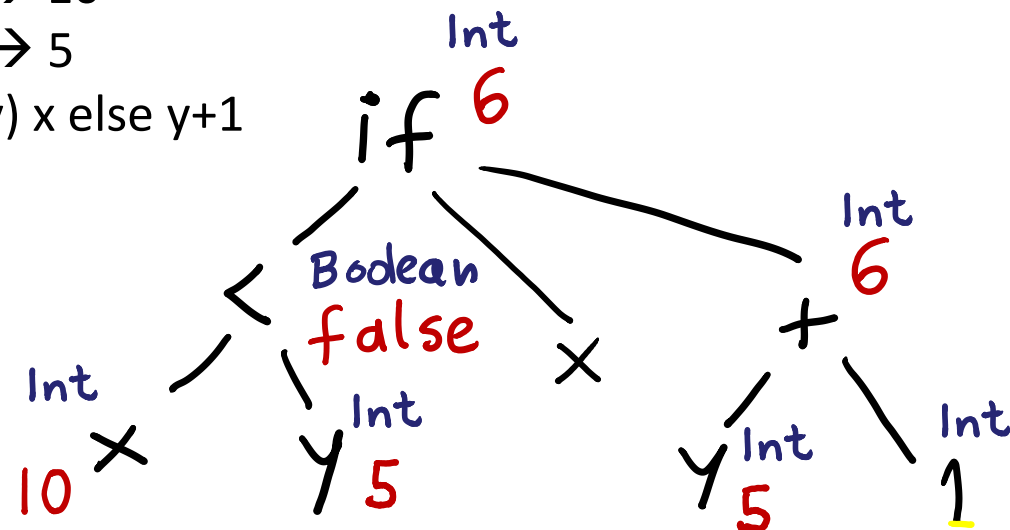
```
>def min1(x : Int, y : Int) : Int = { if (x < y) x else y+1 }  
min1: (x: Int,y: Int)Int  
>min1(10,5)  
res1: Int = 6
```

How can we think about this evaluation?

x : Int → 10

y : Int → 5

if (x < y) x else y+1

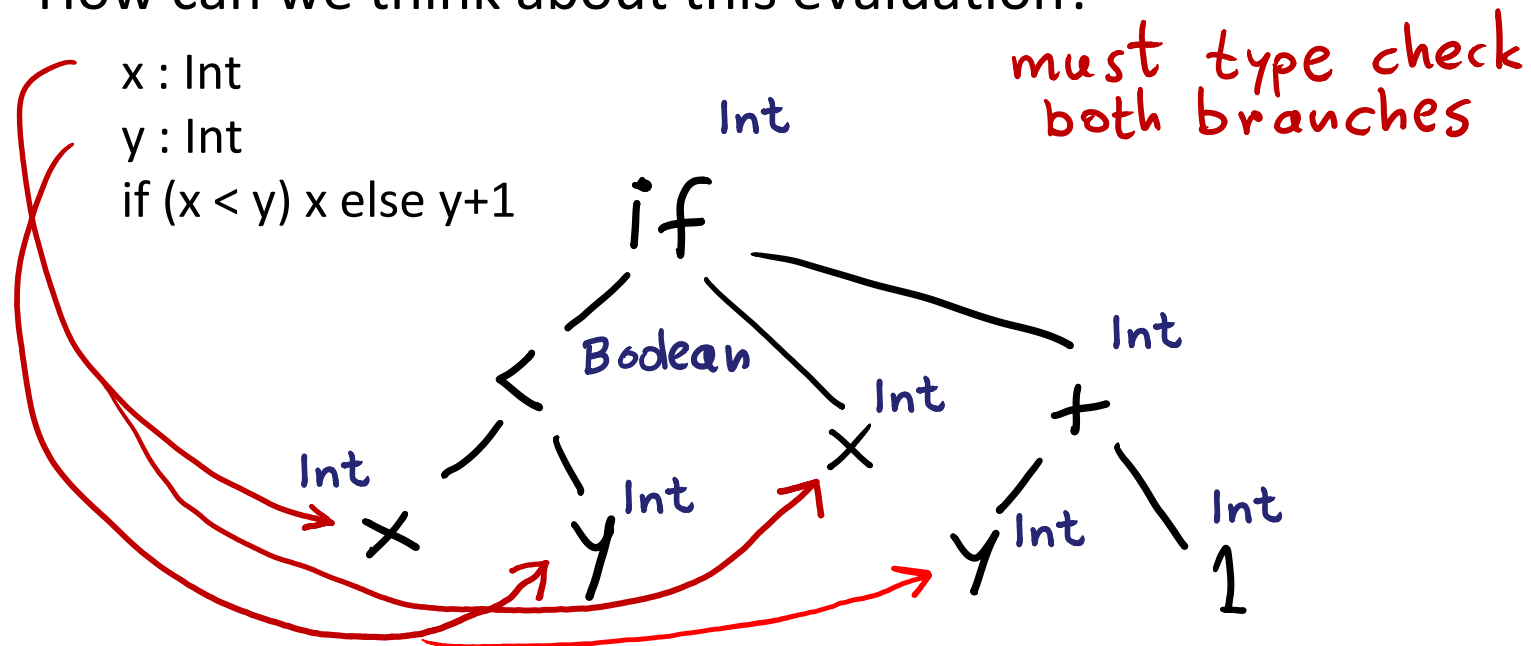


We can compute types without values

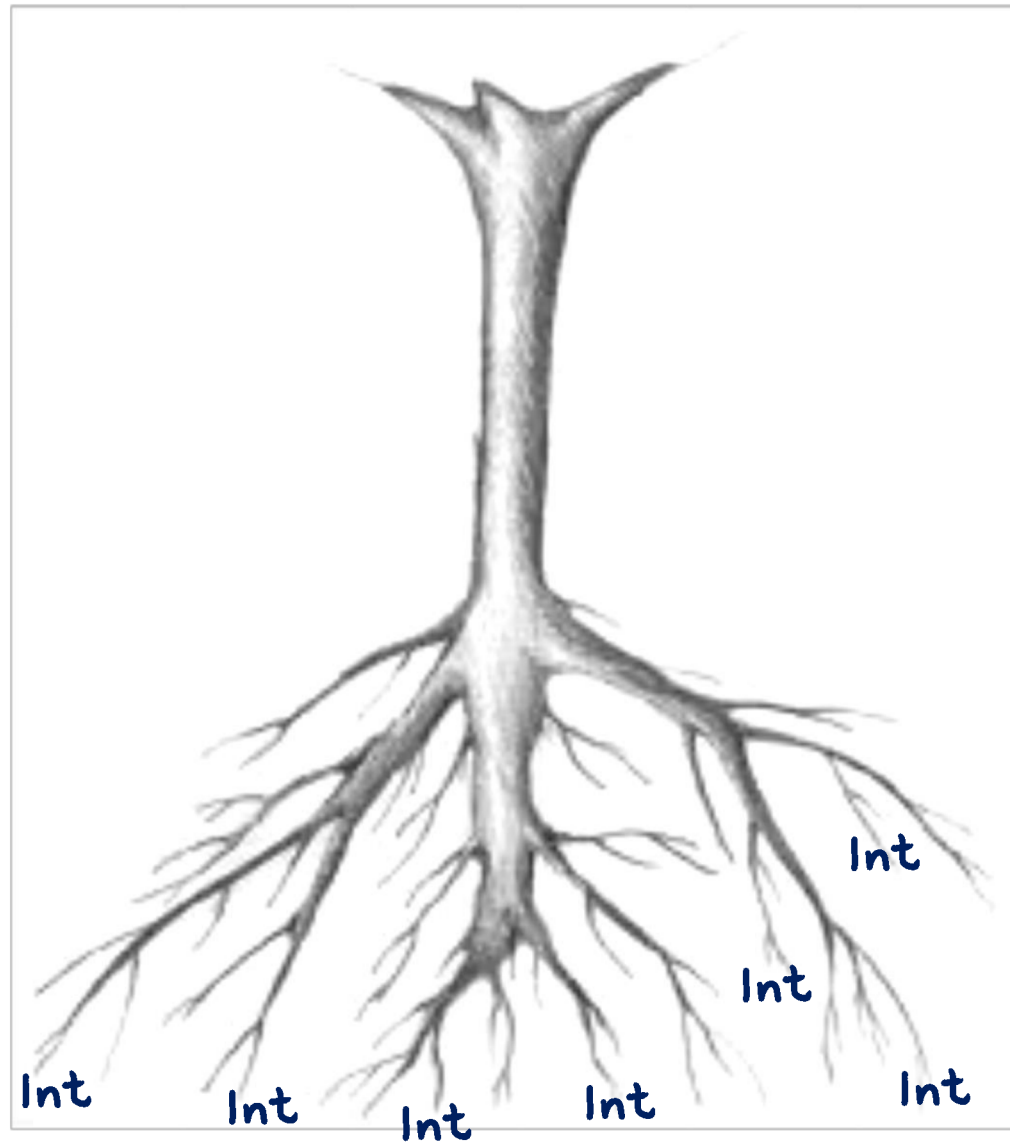
scala prompt:

```
>def min1(x : Int, y : Int) : Int = { if (x < y) x else y+1 }  
min1: (x: Int,y: Int)Int  
>min1(10,5)  
res1: Int = 6
```

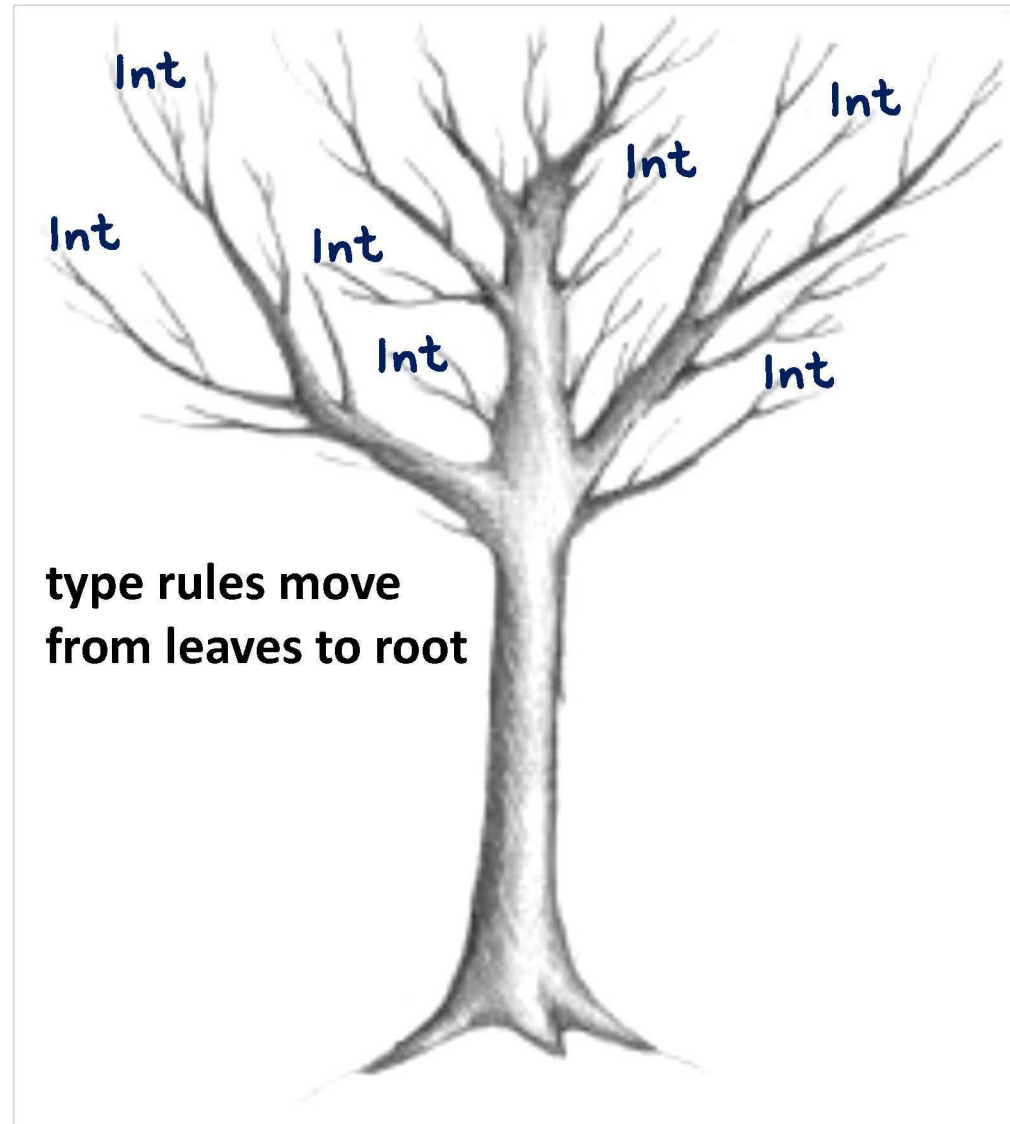
How can we think about this evaluation?



We do not like trees upside-down



Leaves are Up




Type Judgements and Type Rules

- e type checks to T under Γ (type environment)

$$\Gamma \vdash e : T$$

- Types of constants are predefined
- Types of variables are specified in the source code

- If e is composed of sub-expressions


$$\frac{\Gamma \vdash e_1 : T_1 \cdots \Gamma \vdash e_n : T_n}{\Gamma \vdash e : T}$$

type check
from leaves

Type Judgements and Type Rules

$$\Gamma \vdash e : T$$

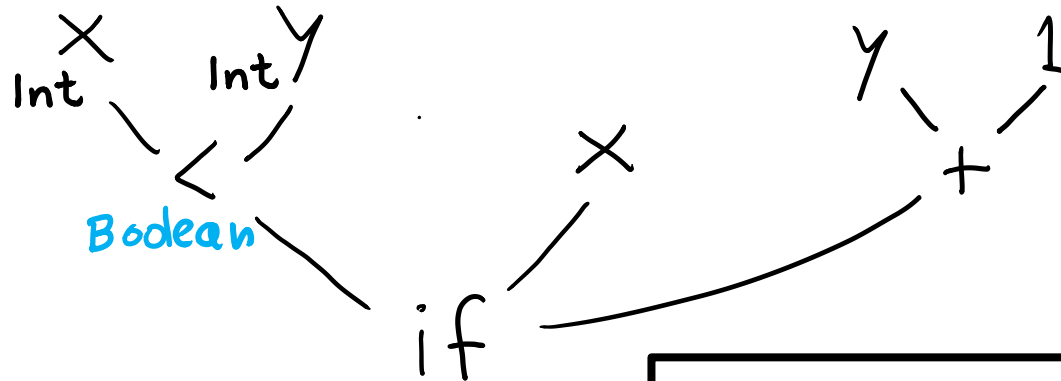
if the (free) variables of e have types given by the type environment Γ , then e (correctly) type checks and has type T

type rule
$$\frac{\Gamma \vdash e_1 : T_1 \cdots \Gamma \vdash e_n : T_n}{\Gamma \vdash e : T}$$

If e_1 type checks in Γ and has type T_1 and ... and e_n type checks in Γ and has type T_n then e type checks in Γ and has type T

Type Rules as Local Tree Constraints

x : Int
y : Int

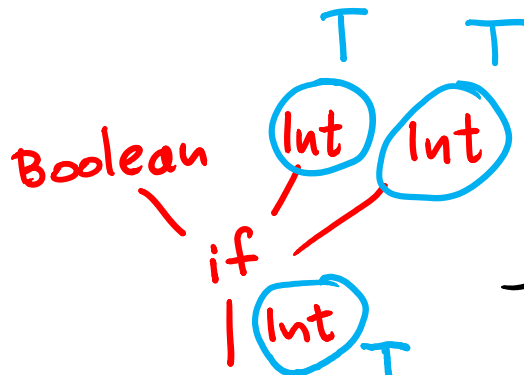


Type Rules

$$\frac{e_1 : \text{Int} \quad e_2 : \text{Int}}{e_1 < e_2 : \text{Boolean}}$$

for every type T, if
b has type Boolean, and ...
then

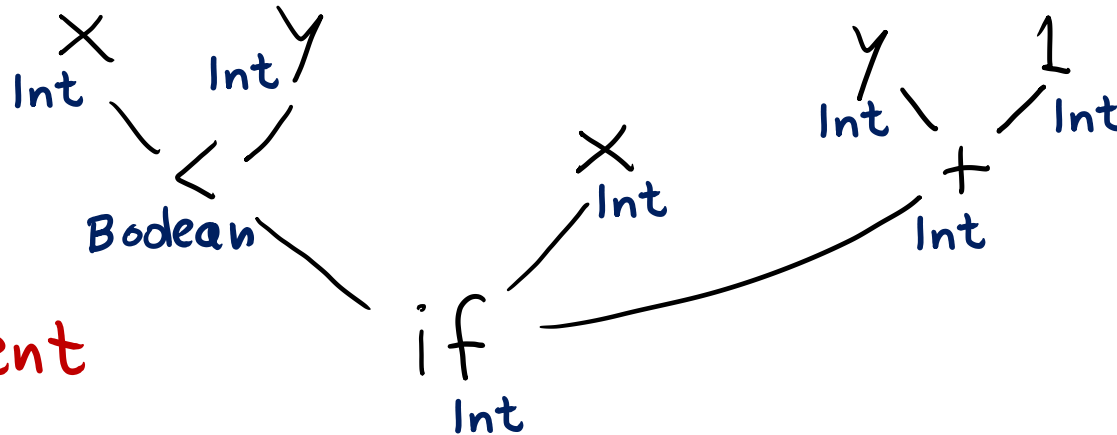
$$\frac{b : \text{Boolean} \quad e_1 : T \quad e_2 : T}{\text{if}(b) e_1 \text{ else } e_2 : T}$$



Type Rules with Environment

$x : \text{Int}$
 $y : \text{Int}$

type environment
 Γ



Type Rules

$$\frac{(x:T) \in \Gamma}{\Gamma \vdash x:T}$$

$$\frac{}{\Gamma \vdash \text{Int Const}(k) : \text{Int}}$$

$$\frac{\Gamma \vdash e_1 : \text{Int} \quad \Gamma \vdash e_2 : \text{Int}}{\Gamma \vdash (e_1 < e_2) : \text{Boolean}}$$

...(then) in the (same) environment Γ
 the expression $e_1 < e_2$ has type Bool.

$$\frac{\Gamma \vdash e_1 : \text{Int} \quad \Gamma \vdash e_2 : \text{Int}}{\Gamma \vdash (e_1 + e_2) : \text{Int}}$$

$$\frac{\Gamma \vdash b : \text{Boolean} \quad \Gamma \vdash e_1 : T \quad \Gamma \vdash e_2 : T}{\Gamma \vdash (\text{if}(b) e_1 \text{ else } e_2) : T}$$

Type Checker Implementation Sketch

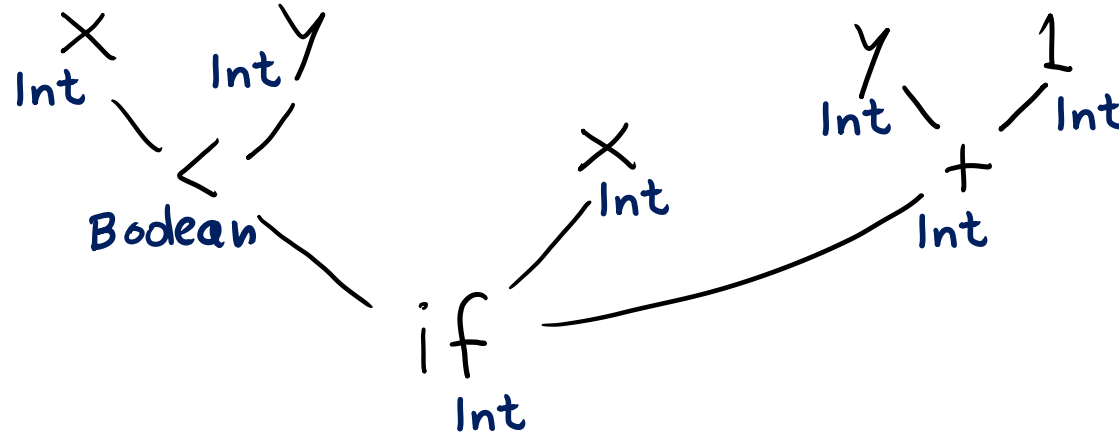
```
def typeCheck( $\Gamma$  : Map[ID, Type], e : ExprTree) : TypeTree = {  
  e match {  
    case Var(id) => { ?? }  
    case If(c,e1,e2) => { ?? }  
    ...  
  }  
  
  case Var(id) => {  $\Gamma$ (id) match  
    case Some(t) => t  
    case None => error(UnknownIdentifier(id,id.pos))  
  }  
}
```

Type Checker Implementation Sketch

- **case** `If(c,e1,e2) => {`
 val `tc = typeCheck(Γ ,c)`
 if (`tc != BooleanType`) `error(IfExpectsBooleanCondition(e.pos))`
 val `t1 = typeCheck(Γ , e1); val t2 = typeCheck(Γ , e2)`
 if (`t1 != t2`) `error(IfBranchesShouldHaveSameType(e.pos))`
 `t1`
 }

Derivation Using Type Rules

$x : \text{Int}$
 $y : \text{Int}$



Let $\Gamma = \{(x, \text{Int}), (y, \text{Int})\}$

$$\begin{array}{c}
 \frac{\frac{\frac{(x, \text{Int}) \in \Gamma}{\Gamma \vdash x : \text{Int}}}{\Gamma \vdash (x < y) : \text{Boolean}} \quad \frac{\frac{(y, \text{Int}) \in \Gamma}{\Gamma \vdash y : \text{Int}}}{\Gamma \vdash (y + 1) : \text{Int}}}{\Gamma \vdash (\text{if}(x < y) \ x \ \text{else} \ y + 1) : \text{Int}}
 \end{array}$$

Type Rule for Function Application

$$\Gamma \vdash e_1 : T_1 \cdots \Gamma \vdash e_n : T_n \quad \Gamma \vdash f : (T_1 \times \cdots \times T_n) \rightarrow T$$

$$\Gamma \vdash f(e_1, \dots, e_n) : T$$

Type Rule for Function Application

[Cont.]

We can treat operators as variables that have function type

$$+ : \text{Int} \times \text{Int} \rightarrow \text{Int}$$

$$< : \text{Int} \times \text{Int} \rightarrow \text{Boolean}$$

$$\&\& : \text{Boolean} \times \text{Boolean} \rightarrow \text{Boolean}$$

We can replace many previous rules with application rule:

$$\frac{\Gamma \vdash e_1 : T_1 \quad \dots \quad \Gamma \vdash e_n : T_n \quad \Gamma \vdash f : ((T_1 \times \dots \times T_n) \rightarrow T)}{\Gamma \vdash f(e_1, \dots, e_n) : T}$$

$$\Gamma \vdash f(e_1, \dots, e_n) : T$$

$$\frac{\Gamma \vdash e_1 : \text{Bool} \quad \Gamma \vdash e_2 : \text{Bool} \quad \Gamma \vdash \&\& : (\text{Bool} \times \text{Bool}) \rightarrow \text{Bool}}{\Gamma \vdash e_1 \&\& e_2 : \text{Bool}}$$

$$\Gamma \vdash e_1 \&\& e_2 : \text{Bool}$$

Computing the Environment of a Class

```
object World {  
  var data : Int  
  var name : String  
  def m(x : Int, y : Int) : Boolean { ... }  
  def n(x : Int) : Int {  
    if (x > 0) p(x - 1) else 3  
  }  
  def p(r : Int) : Int = {  
    var k = r + 2  
    m(k, n(k))  
  }  
}
```

$$\Gamma_0 = \{$$

(data, Int),
(name, String),
(m, Int x Int \rightarrow Boolean),
(n, Int \rightarrow Int),

(p, Int \rightarrow Int)

$$\}$$

We can type check each function m,n,p in this global environment

Extending the Environment

$\Gamma_0 = \{$

```
class World {  
  var data : Int  
  var name : String  
  def m(x : Int, y : Int) : Boolean { ... }  
  def n(x : Int) : Int {  
    if (x > 0) p(x - 1) else 3  
  }  
  def p(r : Int) : Int = {  
    var k: Int  
    k = r + 2  
    m(k, n(k))  
  }  
}
```

$(data, Int),$
 $(name, String),$
 $(m, Int \times Int \rightarrow Boolean),$
 $(n, Int \rightarrow Int),$
 $(p, Int \rightarrow Int) \}$

$\leftarrow \Gamma_0$

$\leftarrow \Gamma_1 = \Gamma_0 \oplus \{(r, Int)\}$

$\leftarrow \Gamma_2 = \Gamma_1 \oplus \{(k, Int)\} = \Gamma_0 \cup \{(r, Int), (k, Int)\}$

Type Rule for Method Definitions $\text{def } m(x_1:T_1, \dots, x_n:T_n): T = e$

$$\frac{\Gamma \oplus \{(x_1, T_1), \dots, (x_n, T_n)\} \vdash e : T}{\Gamma \vdash (\text{def } m(x_1:T_1, \dots, x_n:T_n): T = e) : \text{OK}}$$

$$\Gamma \vdash (\text{def } m(x_1:T_1, \dots, x_n:T_n): T = e) : \text{OK}$$

↑

Type Rule for Assignments

$$\frac{(x, T) \in \Gamma \quad \Gamma \vdash e : T}{\Gamma \vdash (x = e) : \text{void}}$$

$$\Gamma \vdash (x = e) : \text{void}$$

Unit

Type Rules for Block: $\{ \text{var } x_1:T_1 \dots \text{var } x_n:T_n; s_1; \dots s_m; e \}$

$$\Gamma \oplus \{(x_1, T_1), \dots, (x_n, T_n)\}$$

$$\vdash s_1 : \text{void}$$

$$\vdots$$
$$\vdash s_n : \text{void}$$

$$\vdash e : T$$

$$\Gamma \vdash \{ \text{var } x_1:T_1; \dots; \text{var } x_n:T_n; s_1; \dots; s_n; e \} : T$$

Blocks with Declarations in the Middle

$$\frac{\Gamma \vdash e : T}{\Gamma \vdash \{e\} : T} \quad \begin{array}{l} \text{just} \\ \text{expression} \end{array}$$

$$\frac{}{\Gamma \vdash \{\} : \text{void}} \quad \text{empty}$$

$$\frac{\Gamma \oplus \{(x, T_1)\} \vdash \{t_2; \dots; t_n\} : T}{\Gamma \vdash \{\text{var } x : T_1; t_2; \dots; t_n\} : T}$$

declaration is first

$$\frac{\Gamma \vdash s_1 : \text{void} \quad \Gamma \vdash \{t_2; \dots; t_n\} : T}{\Gamma \vdash \{s_1; t_2; \dots; t_n\} : T}$$

statement is first

Rule for While Statement

$$\Gamma \vdash b : \text{Boolean} \quad \Gamma \vdash s : \text{void}$$

$$\Gamma \vdash (\text{while}(b) s) : \text{void}$$

Rule for a Method Call

```
class T0 {  
  ...  
  def m(x1:T1, ..., xn:Tn):T = {  
    ...  
  }  
}
```

$$\frac{\Gamma \vdash x : T_0 \quad \Gamma_{T_0} \vdash m : T_0 \times T_1 \times \dots \times T_n \rightarrow T \quad \forall i \in \{1, 2, \dots, n\} \quad \Gamma \vdash e_i : T_i}{\Gamma \vdash x.m(e_1, \dots, e_n) : T}$$

$m(x, e_1, \dots, e_n)$

Type Checking Expression in a Body

```

class World {
  var data : Int
  var name : String
  def m(x : Int, y : Int) : Boolean { ... }
  def n(x : Int) : Int {
    if (x > 0) p(x - 1) else 3
  }
  def p(r : Int) : Boolean = {
    var k: Int
    k = r + 2
    m(k, n(k))
  }
}

```

$\Gamma_0 = \{$

$(data, Int),$
 $(name, String),$
 $(m, Int \times Int \rightarrow Boolean),$
 $(n, Int \rightarrow Int),$
 $(p, Int \rightarrow Int) \}$

$\leftarrow \Gamma_0$

$\leftarrow \Gamma_1 = \Gamma_0 \oplus \{(r, Int)\}$

$\leftarrow \Gamma_2 = \Gamma_1 \oplus \{(k, Int)\}$

$$\frac{\Gamma_2 \vdash k: Int \quad \frac{\Gamma_2 \vdash n: Int \rightarrow Int \quad \Gamma_2 \vdash k: Int}{\Gamma_2 \vdash n(k): Int} \quad \Gamma_2 \vdash m: Int \times Int \rightarrow Bool}{\Gamma_2 \vdash m(k, n(k)): Bool}$$

Example to Type Check

```

object World {
  var z : Boolean
  var u : Int
  def f(y : Boolean) : Int {
    z = y
    if (u > 0) {
      u = u - 1
      var z : Int
      z = f(!y) + 3
      z+z
    } else { 0 }
  }
}

```

$\Gamma_0 = \{$
 $(z, \text{Boolean}),$
 $(u, \text{Int}),$
 $(f, \text{Boolean} \rightarrow \text{Int}) \}$

$\Gamma_1 = \Gamma_0 \oplus \{(y, \text{Boolean})\}$

$$\frac{\Gamma_1 \vdash z: \text{Boolean} \quad \Gamma_1 \vdash y: \text{Boolean}}{\Gamma_1 \vdash (z=y): \text{void}}$$

Exercise:

$$\frac{\quad ???}{\Gamma \vdash \text{if}(u > 0)\{\text{body}\} \text{else}\{0\}: \text{Int}}$$

Solution

$$\frac{
 \frac{
 \frac{(u, \text{Int}) \in \Gamma}{\Gamma \vdash u : \text{Int}} \quad \vdash 0 : \text{Int}
 }{\Gamma \vdash u > 0 : \text{Boolean}}
 \quad
 \frac{
 \frac{(u, \text{Int}) \in \Gamma}{\Gamma \vdash u : \text{Int}} \quad \vdash 1 : \text{Int}
 }{\Gamma \vdash u = u - 1 : \text{void}}
 \quad
 \frac{
 \frac{
 \frac{
 \frac{(y, \text{Boolean}) \in \Gamma'}{\Gamma' \vdash y : \text{Boolean}} \quad \frac{(f, \text{Boolean} \rightarrow \text{Int}) \in \Gamma'}{\Gamma' \vdash f : \text{Boolean} \rightarrow \text{Int}}
 }{\Gamma' \vdash f(!y) : \text{Int}}
 \quad
 \frac{
 \frac{(z, \text{Int}) \in \Gamma'}{\Gamma' \vdash z : \text{Int}} \quad \vdash 3 : \text{Int}
 }{\Gamma' \vdash z : \text{Int}}
 \quad
 \frac{(z, \text{Int}) \in \Gamma'}{\Gamma' \vdash z : \text{Int}}
 }{\Gamma' \vdash \{z+z\} : \text{Int}}
 }{\Gamma' \vdash \{z=f(!y)+3\} : \text{void}}
 }{\Gamma' = \Gamma \oplus (z, \text{Int}) \vdash \{z=f(!y)+3; z+z\} : \text{Int}}
 }{\Gamma \vdash \{\text{var } z : \text{Int}; z=f(!y)+3; z+z\} : \text{Int}}
 }{\Gamma \vdash \{\text{u} = \text{u} - 1; \text{var } z : \text{Int}; z = f(!y) + 3; z + z\} : \text{Int}}
 }{\Gamma \vdash \text{if } (u > 0) \{ u = u - 1; \text{var } z : \text{Int}; z = f(!y) + 3; z + z \} \text{ else } \{ 0 \} : \text{Int}}$$