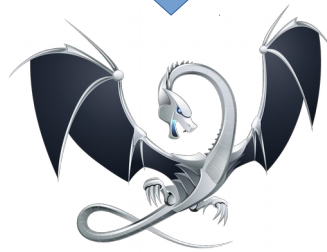


Compilers for Uncooperative Languages

Olivier Flückiger

Batch Compiler

```
print "HelloWorld"
```

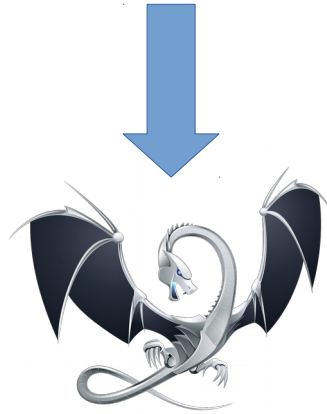


```
1010101010
```

Batch Compiler

print "HelloWorld"

compile-time



1010101010

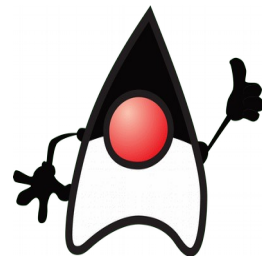
run-time

JIT Compiler

print "HelloWorld"



push "hello world"
call "print"

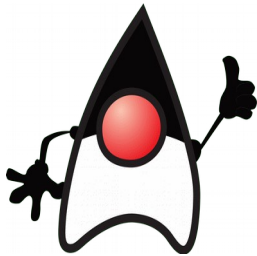


JIT Compiler

print "HelloWorld"



push "hello world"
call "print"

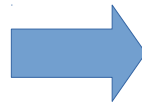
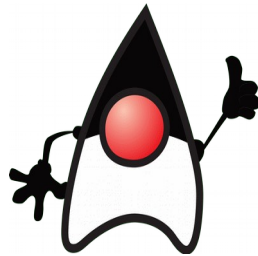


JIT Compiler

print "HelloWorld"



push "hello world"
call "print"

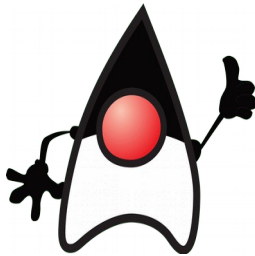


JIT Compiler

print "HelloWorld"



push "hello world"
call "print"

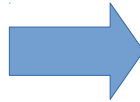
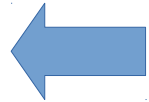
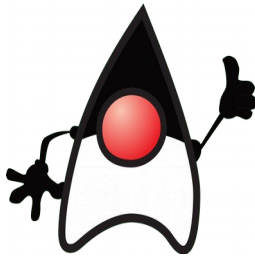


JIT Compiler

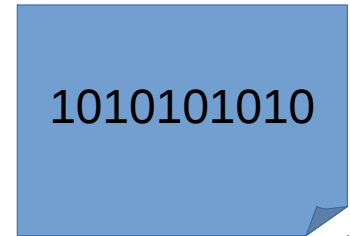
print "HelloWorld"



push "hello world"
call "print"



1010101010

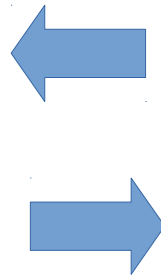
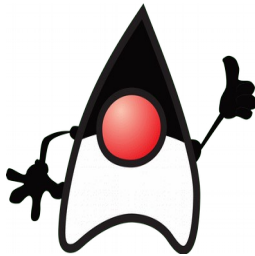


JIT Compiler

print "HelloWorld"



push "hello world"
call "print"



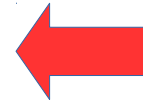
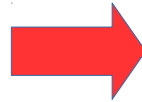
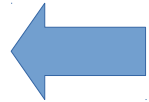
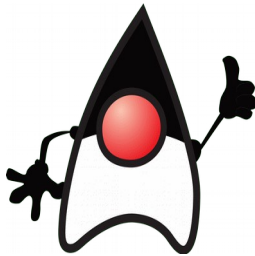
1010101010

JIT Compiler

print "HelloWorld"



push "hello world"
call "print"



1010101010

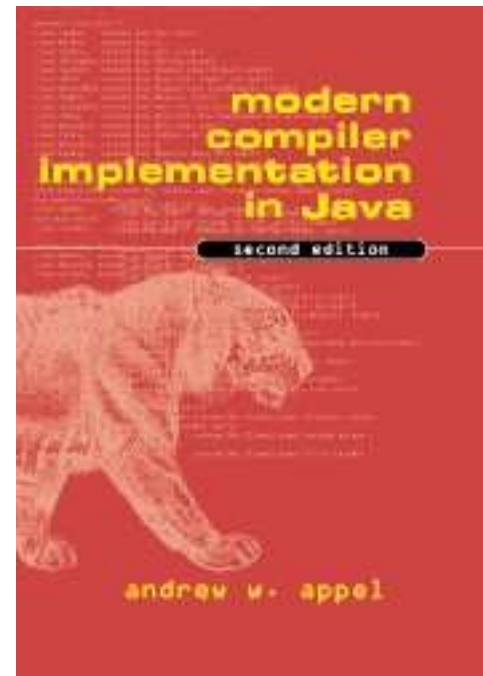
Some Basic Tricks in the Book

Speculative Optimizations

Case Study R

Basic Tricks

(not in this book



)

Inline Caches

```
function(var s)  
  s.width()
```

```
function (var shape)
  shape.width()
```



```
m = shape.proto.lookup(msg)
invoke(shape, m)
```



```
function (var shape)  
  shape.width()
```



```
m = shape.proto.lookup(msg)  
invoke(shape, m)
```

Published in ECOOP '91 proceedings, Springer Verlag Lecture Notes in Computer Science 512, July, 1991.

Optimizing Dynamically-Typed Object-Oriented Languages With Polymorphic Inline Caches

Urs Hölzle
Craig Chambers
David Ungar[†]

Computer Systems Laboratory, Stanford University, Stanford, CA 94305
{urs,craig,ungar}@self.stanford.edu

Abstract: *Polymorphic inline caches* (PICs) provide a new way to reduce the overhead of polymorphic message sends by extending inline caches to include more than one cached lookup result per call site. For a set of typical object-oriented SELF programs, PICs achieve a median speedup of 11%.

As an important side effect, PICs collect type information by recording all of the receiver types actually used at a given call site. The compiler can exploit this type information to generate better code when *recompiling* a method. An experimental version of such a system achieves a median speedup of 27% for our set of SELF programs, reducing the number of non-inlined message sends by a factor of two.

Implementations of dynamically-typed object-oriented languages have been limited by the paucity of type information available to the compiler. The abundance of the type information provided by PICs suggests a new compilation approach for these languages, *adaptive compilation*. Such compilers may succeed in generating very efficient code for the time-critical parts of a program without incurring distracting compilation pauses.

```
function (var shape)  
  shape.width()
```



```
inlineCacheFail(shape, "width")
```

```
function (var shape)
  shape.width()
```



```
inlineCache(shape, "width")
```

```
function (var shape)
  shape.width()
```



```
If obj.proto == Rectangle
  Rectangle::width(shape)
else
  inlineCacheFail(shape, "width")
```

```
function (var shape)
  shape.width()
```



```
If obj.proto == Rectangle
  Rectangle.width(shape)
else
  inlineCacheFail(shape, "width")
```

```
function (var shape)
  shape.width()
```



```
If obj.proto == Rectangle
  Rectangle::width(shape)
elif obj.proto == Circle
  Circle::width(shape)
else
  inlineCacheFail(shape, "width")
```

Hidden Classes

point = {}

point.x = 1

point.y = 2

```
point = {}  
point.x = 1  
if (hasY) {  
    point.y = 2  
}
```

```
point =
```

No static object layout

```
point.x = 1
```

```
if (hasY) {
```

```
    point.y = 2
```

```
}
```

An Efficient Implementation of SELF, a Dynamically-Typed Object-Oriented Language Based on Prototypes*

Craig Chambers, David Ungar, and
Elgin Lee

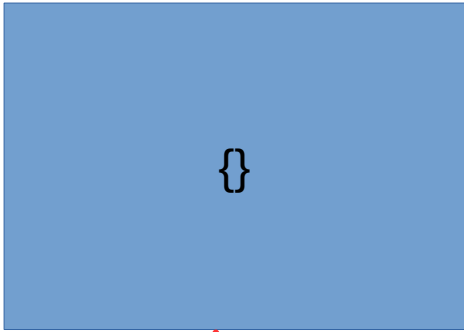
Center for Integrated Systems, Stanford University
self@self.stanford.edu

Abstract

We have developed and implemented techniques that double the performance of dynamically-typed object-oriented languages. Our SELF implementation runs

1. Introduction

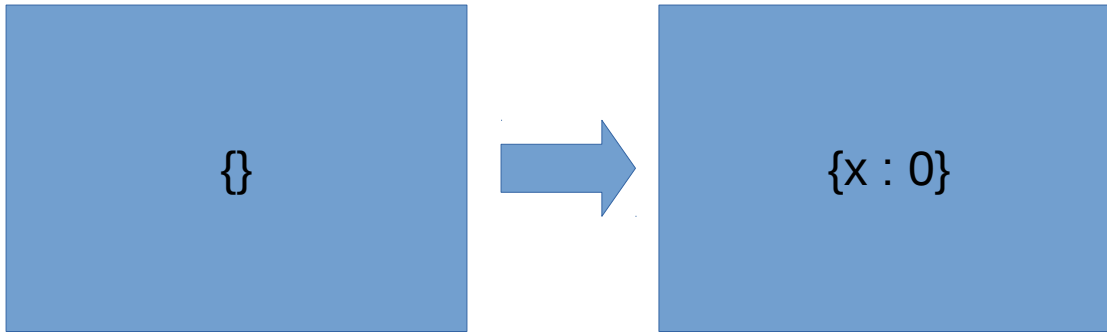
SELF [US87] is a dynamically-typed object-oriented language inspired by the Smalltalk-80** language [GP83]. Like Smalltalk, SELF has no type declarations



point = {}

point.x = 1

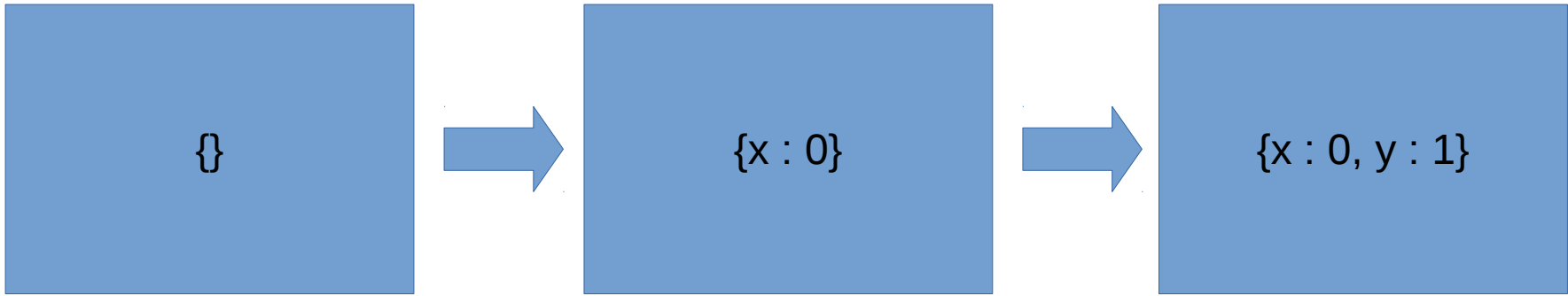
point.y = 2



~~point = {}~~

point.x = 1

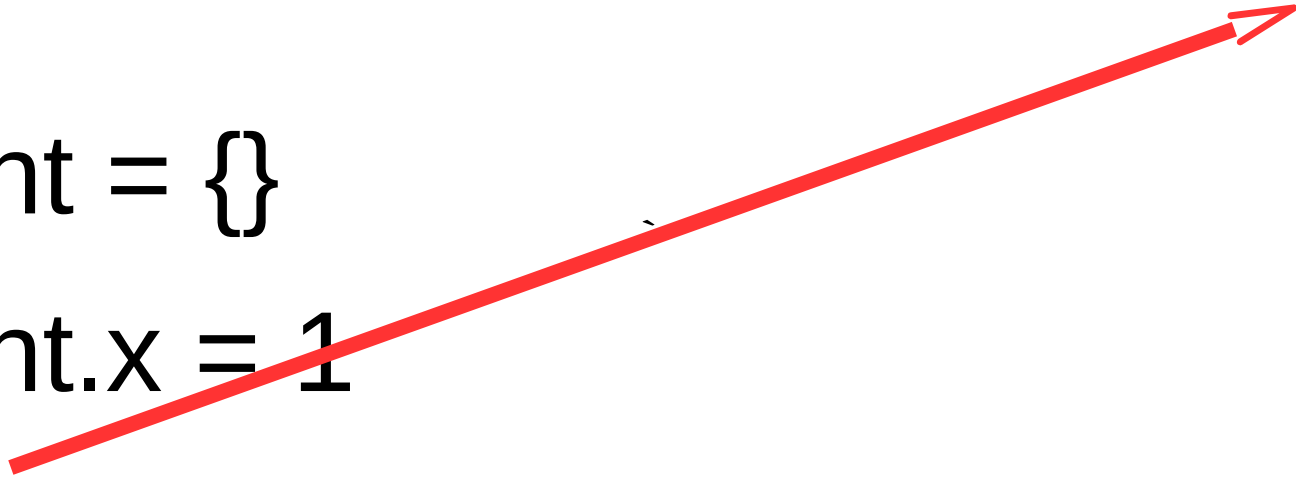
point.y = 2



point = $\{\}$

point.x = 1

point.y = 2



Without Maps

cartesian point traits

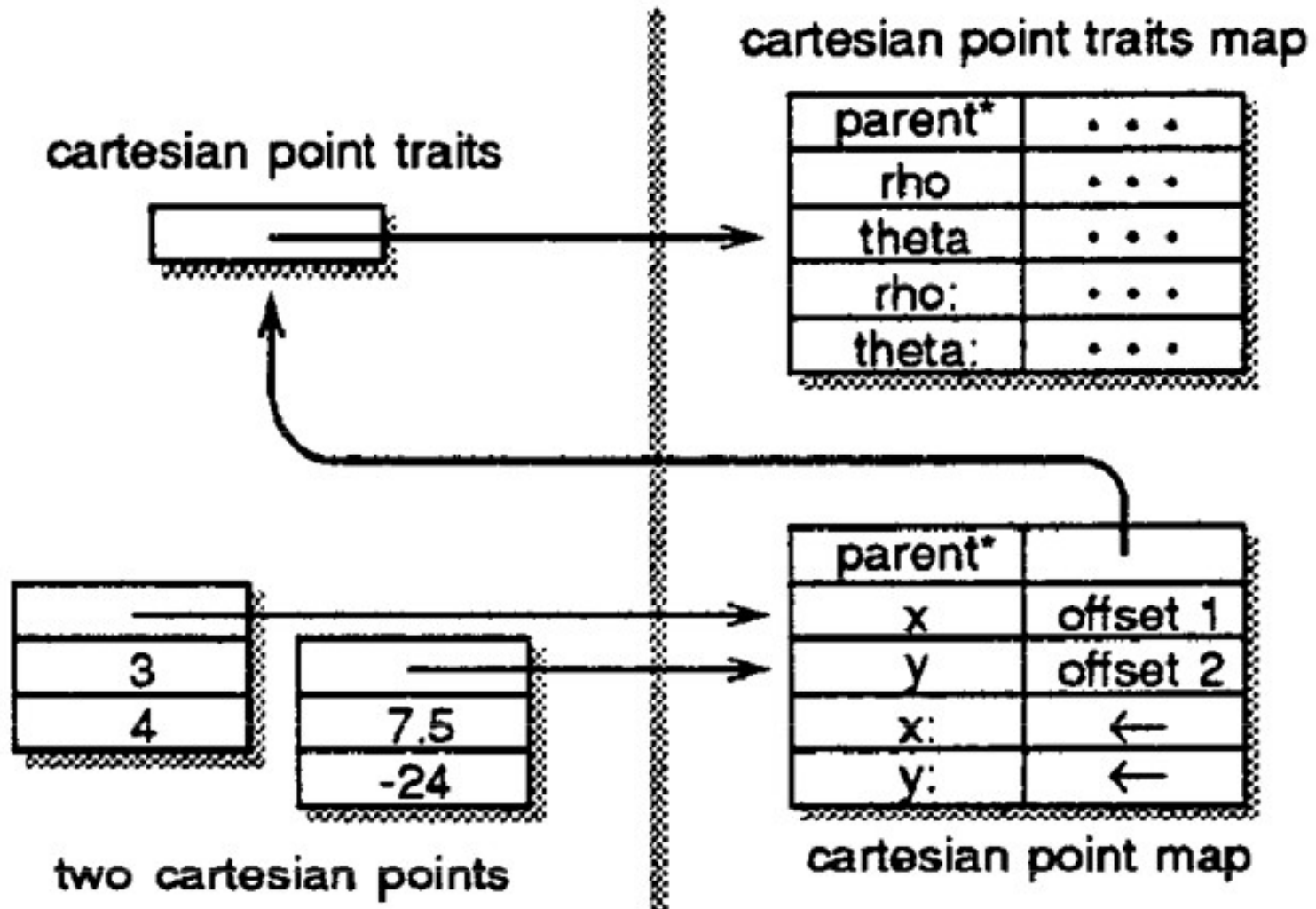
parent*	...
rho	...
theta	...
rho:	...
theta:	...

parent*	
x	3
y	4
x:	←
y:	←

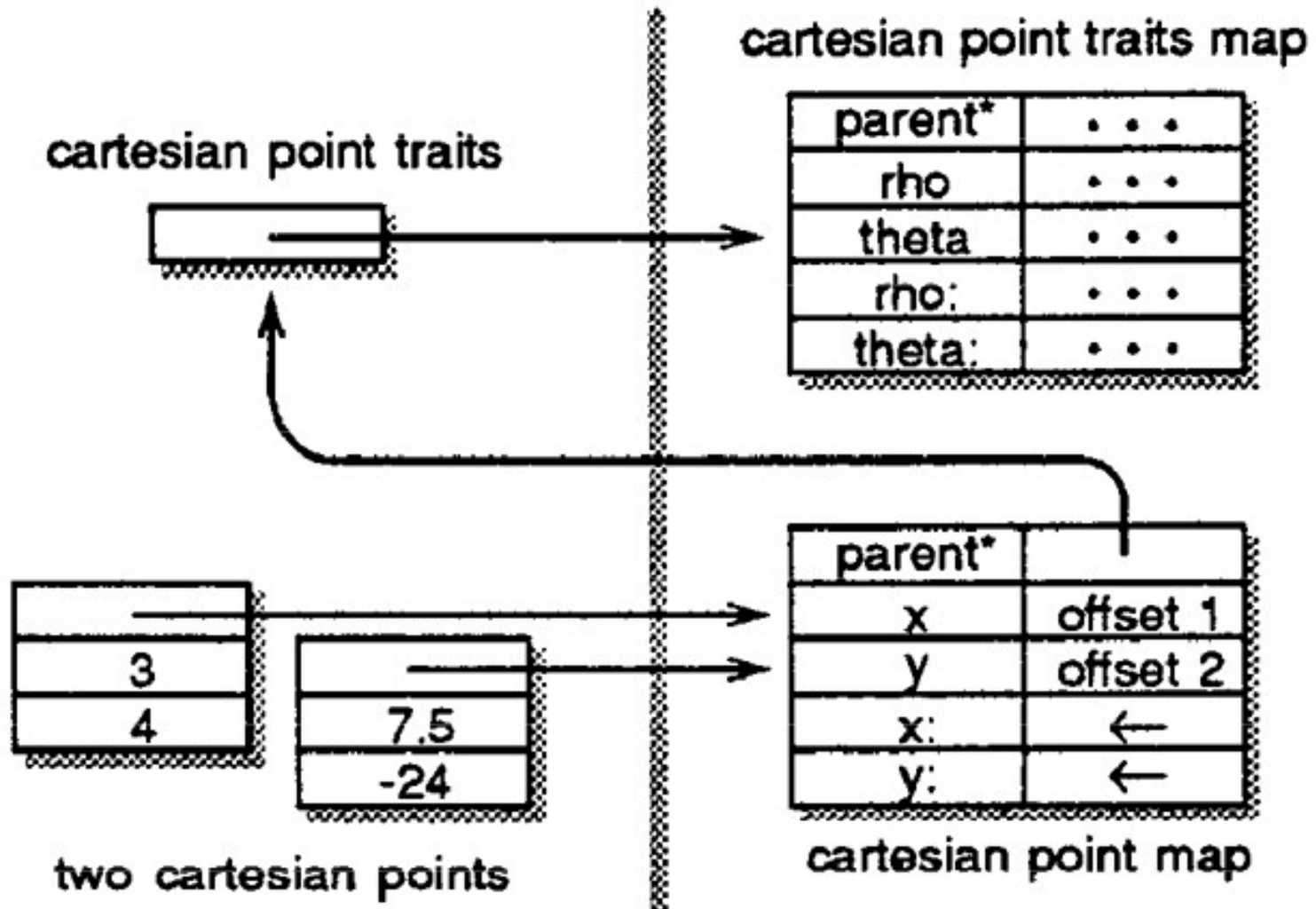
parent*	
x	7.5
y	-24
x:	←
y:	←

two cartesian points

With Maps



With Maps



Specialization

```
function add(a, b)  
  return a+b
```

```
function add(a, b)  
  return a+b
```

```
add(1, 2)
```

```
function add(a, b)  
  return a+b
```

```
add(1, 2)
```

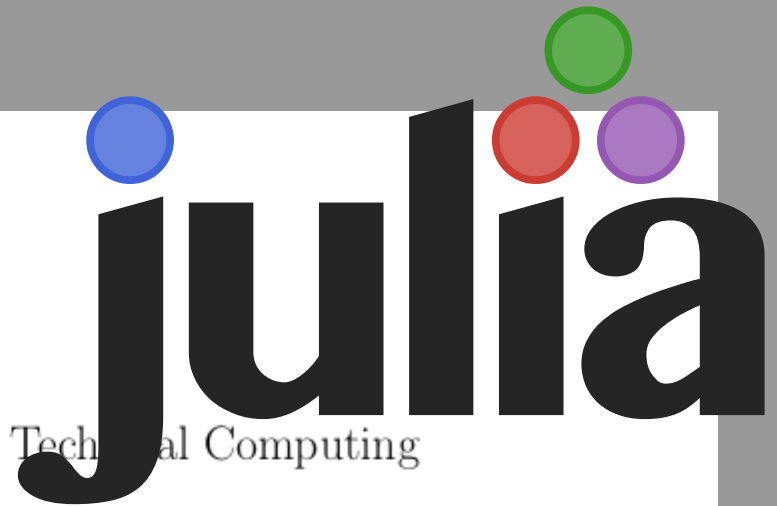
```
add(1.1, 2.2)
```

```
function add(a, b)  
  return a+b
```

```
add(1, 2)
```

```
add(1.1, 2.2)
```

```
add("1", "2")
```



Julia: A Fast Dynamic Language for Technical Computing

Jeff Bezanson*
MIT

Stefan Karpinski†
MIT

Viral B. Shah‡

Alan Edelman§
MIT

September 25, 2012

Abstract

Dynamic languages have become popular for scientific computing. They are generally considered highly productive, but lacking in performance. This paper presents Julia, a new dynamic language for technical computing, designed for performance from the beginning by adapting and extending modern programming language techniques. A design based on generic functions and a rich type system simultaneously enables an expressive programming model and successful type inference, leading to good performance for a wide range of programs. This makes it possible for much of Julia's library to be written in Julia itself, while also incorporating best-of-breed C and Fortran libraries.

1 Introduction

Convenience is winning. Despite advances in compiler technology and execution for high-performance computing, programmers continue to prefer high-level dynamic languages for algorithm development and data analysis in applied math, engineering, and the sciences. High-level environments such as MATLAB[®], Octave [26], R [18], SciPy [29], and SciLab [17] provide greatly increased convenience and productivity. However, C and Fortran remain the gold standard languages for computationally-intensive problems because high-level dynamic languages still lack sufficient performance. As a result, the most challenging areas of technical computing have benefited the least from the increased abstraction and productivity offered by


```
function add(a, b)  
  return a+b
```

```
add(1, 2)
```

```
add(1.1, 2.2)
```

```
add("1", "2")
```

```
function add(a, b)  
  return a+b
```



add : i64, i64 → i64

```
add(1, 2)
```

```
add(1.1, 2.2)
```

```
add("1", "2")
```

```
function add(a, b)
```

```
  return a+b
```

add : i64, i64 → i64

```
add(1, 2)
```

```
add(1.1, 2.2)
```

```
add("1", "2")
```

add : d64, d64 → d64

```
function add(a, b)
```

```
  return a+b
```

add : i64, i64 → i64

A blue rectangular box with a folded bottom-right corner containing the text "add : i64, i64 → i64". An arrow points from the call "add(1, 2)" to this box.

```
add(1, 2)
```

add : d64, d64 → d64

A blue rectangular box with a folded bottom-right corner containing the text "add : d64, d64 → d64". An arrow points from the call "add(1.1, 2.2)" to this box.

```
add(1.1, 2.2)
```

add : str, str → str

A blue rectangular box with a folded bottom-right corner containing the text "add : str, str → str". An arrow points from the call "add('1', '2')" to this box.

```
add("1", "2")
```

- + simple, no deoptimization needed
- needs complex typesystem

Tracing

Trace-based Just-in-Time Type Specialization for Dynamic Languages

Andreas Gal^{*+}, Brendan Eich^{*}, Mike Shaver^{*}, David Anderson^{*}, David Mandelin^{*},
Mohammad R. Haghighat[§], Blake Kaplan^{*}, Graydon Hoare^{*}, Boris Zbarsky^{*}, Jason Orendorff^{*},
Jesse Ruderman^{*}, Edwin Smith[#], Rick Reitmaier[#], Michael Bebenita⁺, Mason Chang^{+ #}, Michael Franz⁺

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Intel Corporation[§]

{mohammad.r.haghighat}@intel.com

University of California, Irvine⁺

{mbebenit,changm,franz}@uci.edu

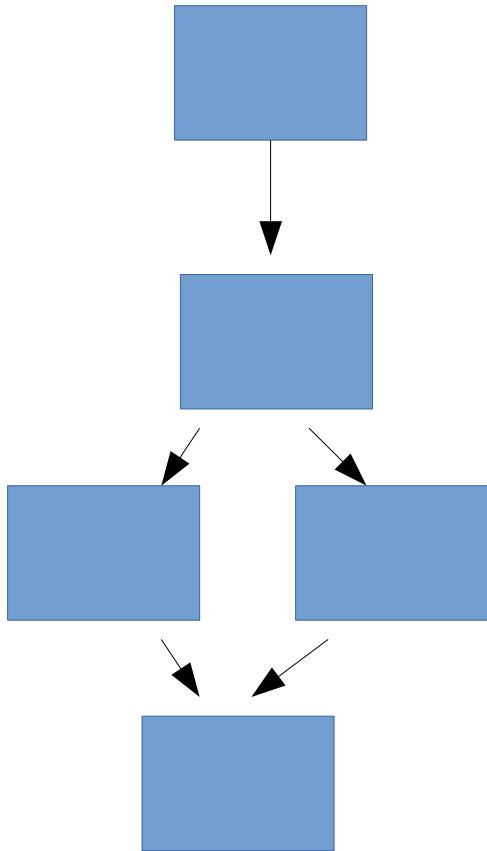
Abstract

Dynamic languages such as JavaScript are more difficult to compile than statically typed ones. Since no concrete type information is available, traditional compilers need to emit generic code that can handle all possible type combinations at runtime. We present an alternative compilation technique for dynamically-typed languages that identifies frequently executed loop traces at run-time and then generates machine code on the fly that is specialized for the actual dynamic types occurring on each path through the loop. Our method provides cheap inter-procedural type specialization, and an elegant and efficient way of incrementally compiling lazily discovered alternative paths through nested loops. We have implemented

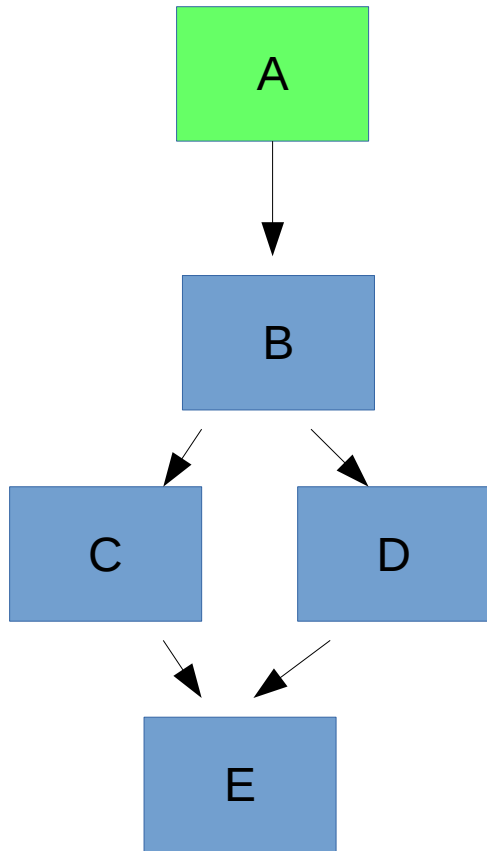
and is used for the application logic of browser-based productivity applications such as Google Mail, Google Docs and Zimbra Collaboration Suite. In this domain, in order to provide a fluid user experience and enable a new generation of applications, virtual machines must provide a low startup time and high performance.

Compilers for statically typed languages rely on type information to generate efficient machine code. In a dynamically typed programming language such as JavaScript, the types of expressions may vary at runtime. This means that the compiler can no longer easily transform operations into machine instructions that operate on one specific type. Without exact type information, the compiler must emit slower generalized machine code that can deal with all

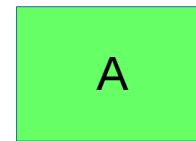
interpreter



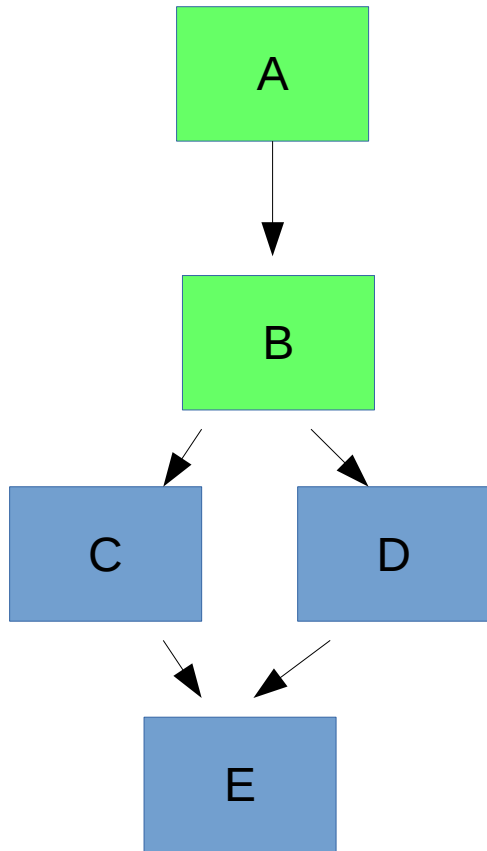
interpreter



native



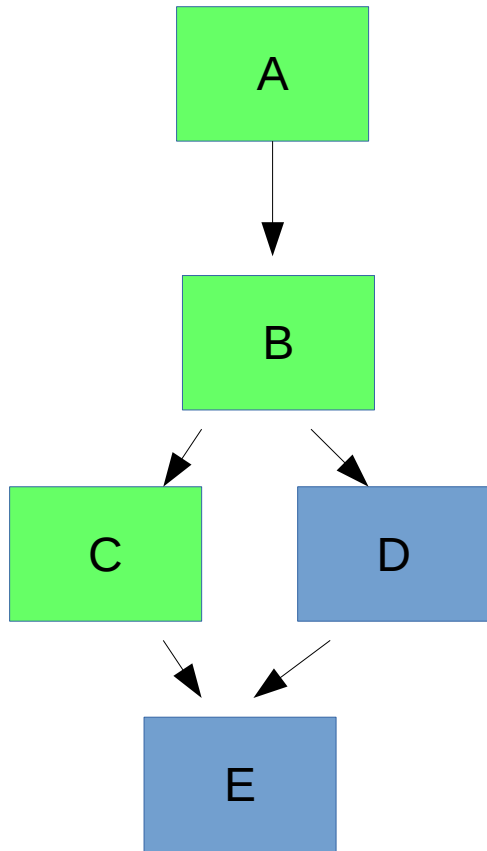
interpreter



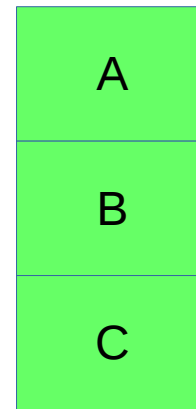
native



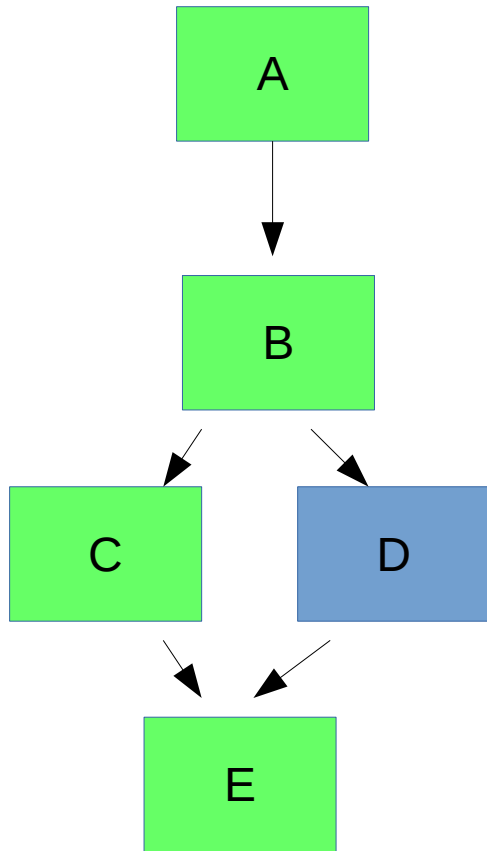
interpreter



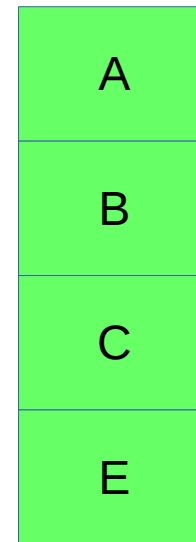
native



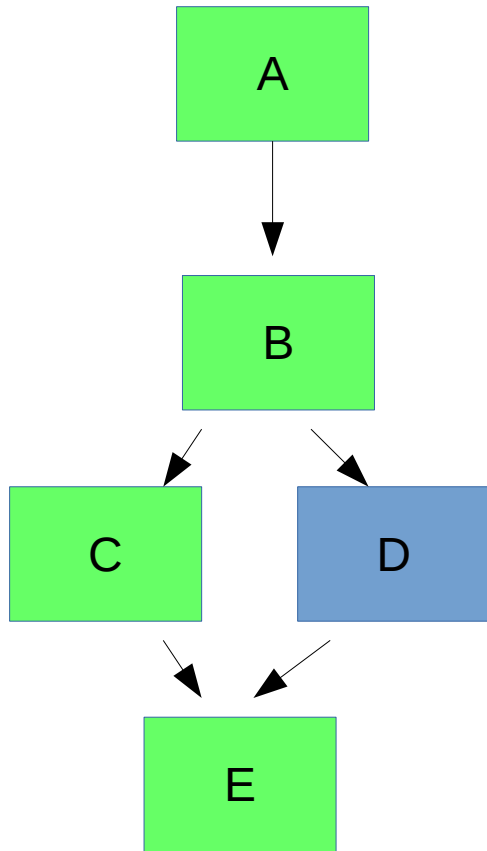
interpreter



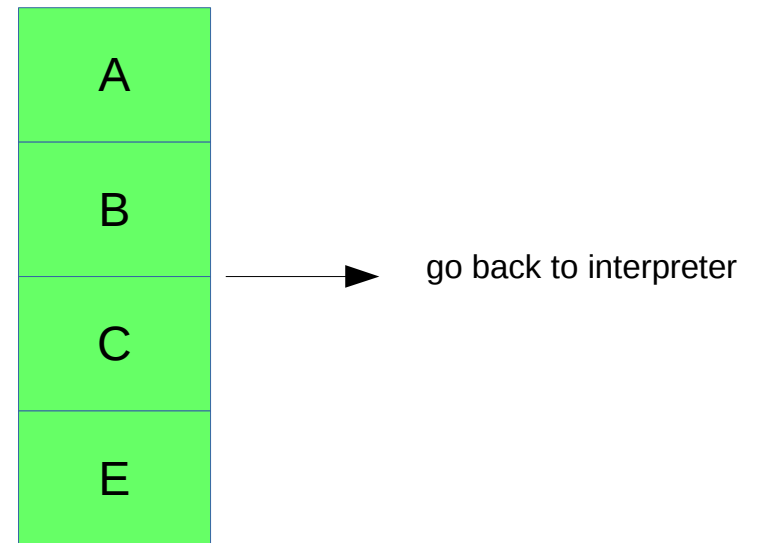
native



interpreter



native



- + very simple to implement
- + good performance for stable code
- + loop unrolling for free

- + very simple to implement
- + good performance for stable code
- + loop unrolling for free

- traces hard to optimize further
- path explosion

Speculative Optimizations

Case Study: R

Speculation

```
function sorted(x) {  
  for (var i = 1; i < x.length; i++)  
    if (x[i] < x[i-1])  
      return false;  
  return true;  
}
```

```

function sorted(x) {
  for (var i = 1; i < x.length; i++)
    if (x[i] < x[i-1])
      return false;
  return true;
}

```

```

function `[ ]` (x,i) {
  if (typeof(x) != array) error()
  if (typeof(i) != int)
    i = convert(i, int)
  return get(x, i)
}

```

```

function `<` (a,b) {
  if (typeof(a) == float) {
    if (typeof(b) != float)
      b = convert(b, float)
    return ltf(a.val, b.val)
  }
  if (typeof(b) == int) {
    ...
  }
  ...
}

```

```

function sorted(x) {
  for (var i = 1; i < x.length; i++)
    if (x[i] < x[i-1])
      return false;
  return true;
}

```

```

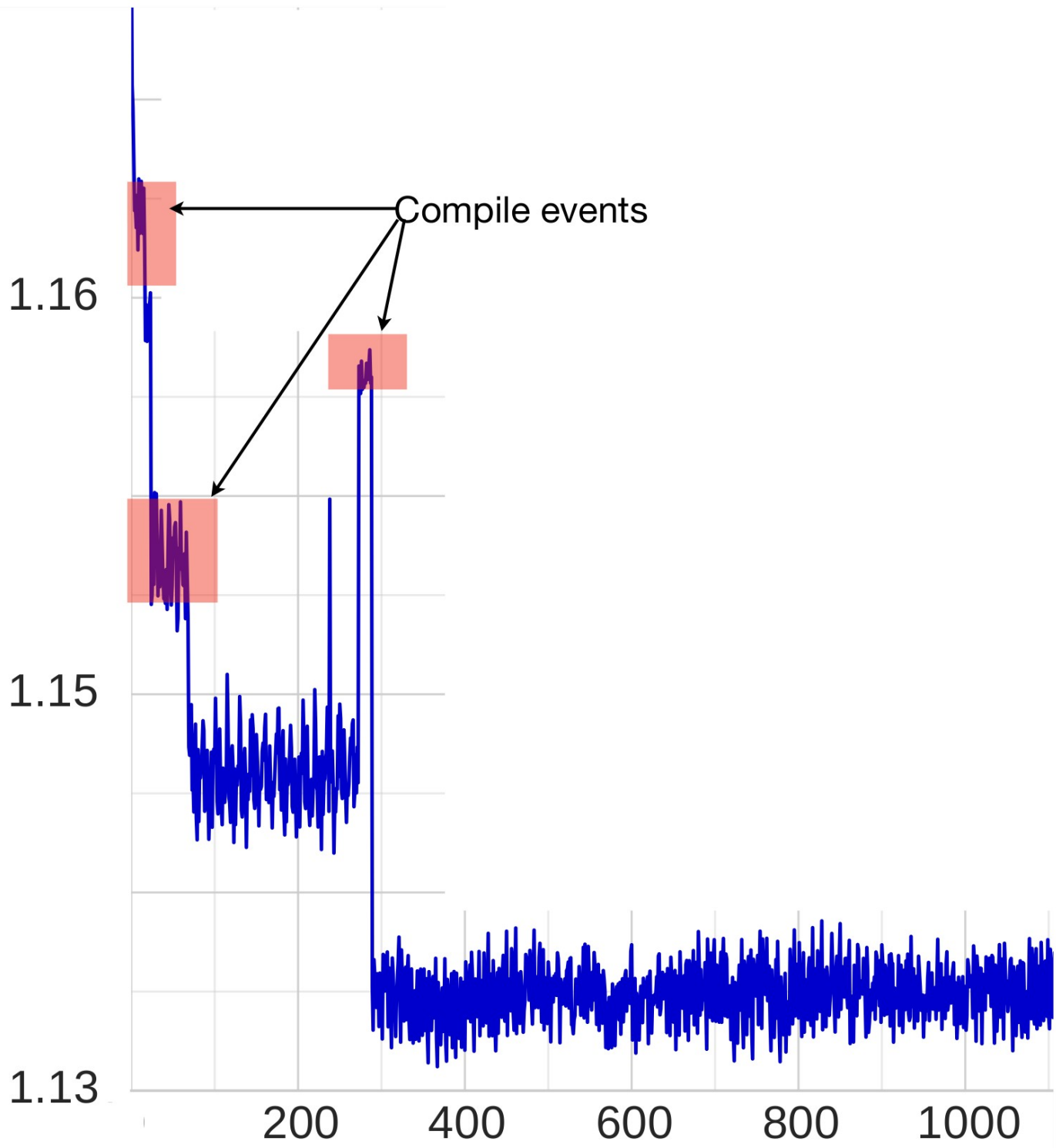
function `[ ]` (x,i) {
  if (typeof(x) != array) error()
  if (typeof(i) != int)
    i = convert(i, int)
  return get(x, i)
}

```

```

function `<` (a,b) {
  if (typeof(a) == float) {
    if (typeof(b) != float)
      b = convert(b, float)
    return ltf(a.val, b.val)
  }
  if (typeof(b) == int) {
    ...
  }
  ...
}

```



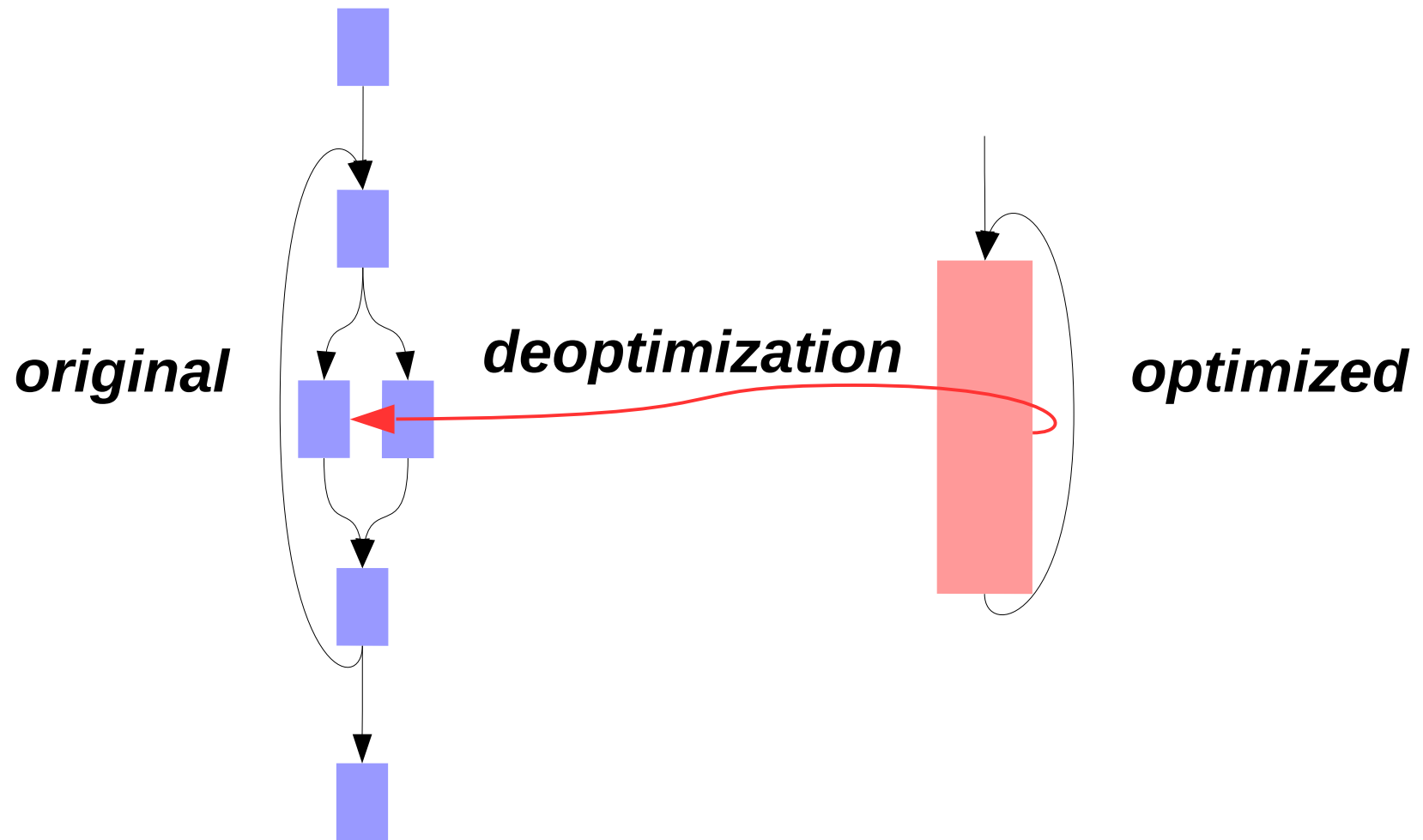
Fasta JS benchmark,
V8, Linux, i7-4790

[Barrett ea. *Virtual Machine Warmup Blows Hot and Cold*. OOPSLA17]

```
function sorted(x) {  
  for (var i = 1; i < x.length; i++)  
  
    t1 = get(x, i)  
  
    t2 = get(x, i-1)  
    t3 = t1.val  
    t4 = t3.val  
    t5 = ltf(t3, t4)  
    if (t5) return 0  
  
  return 1  
}
```

```
function sorted(x) {  
  for (var i = 1; i < x.length; i++)  
  
    DeoptIf(typeof x != floatarray)  
    DeoptIf(OutOfBounds x, i)  
    t1 = get(x, i)  
    DeoptIf(OutOfBounds x, i-1)  
    t2 = get(x, i-1)  
    t3 = t1.val  
    t4 = t3.val  
    t5 = ltf(t3, t4)  
    if (t5) return 0  
  
  return 1  
}
```


Correctness



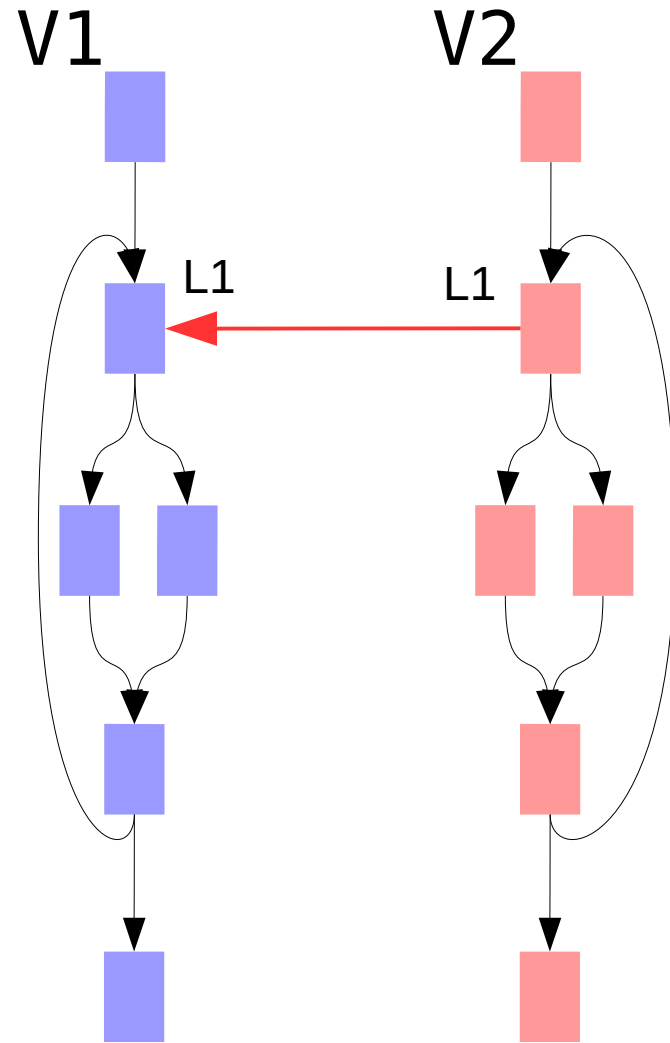
Me: how can this be true?

Correctness of Speculative Optimizations with Dynamic Deoptimization

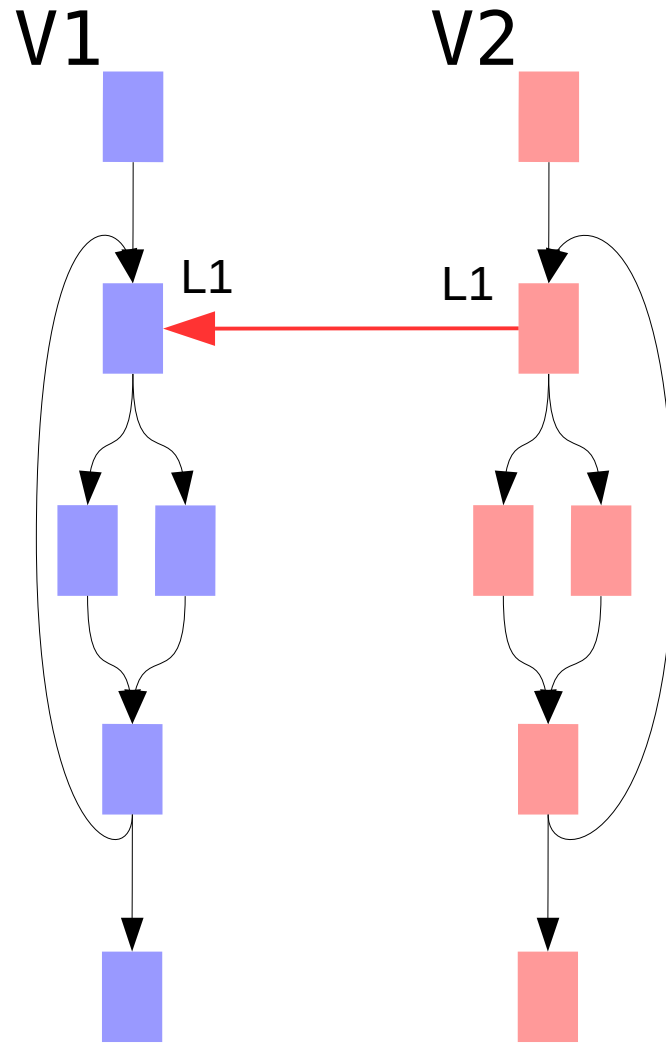
Olivier Flückiger, Gabriel Scherer, Ming-Ho Yee,
Aviral Goel, Amal Ahmed, Jan Vitek

Northeastern University,
INRIA, and CVUT

Writing a JIT



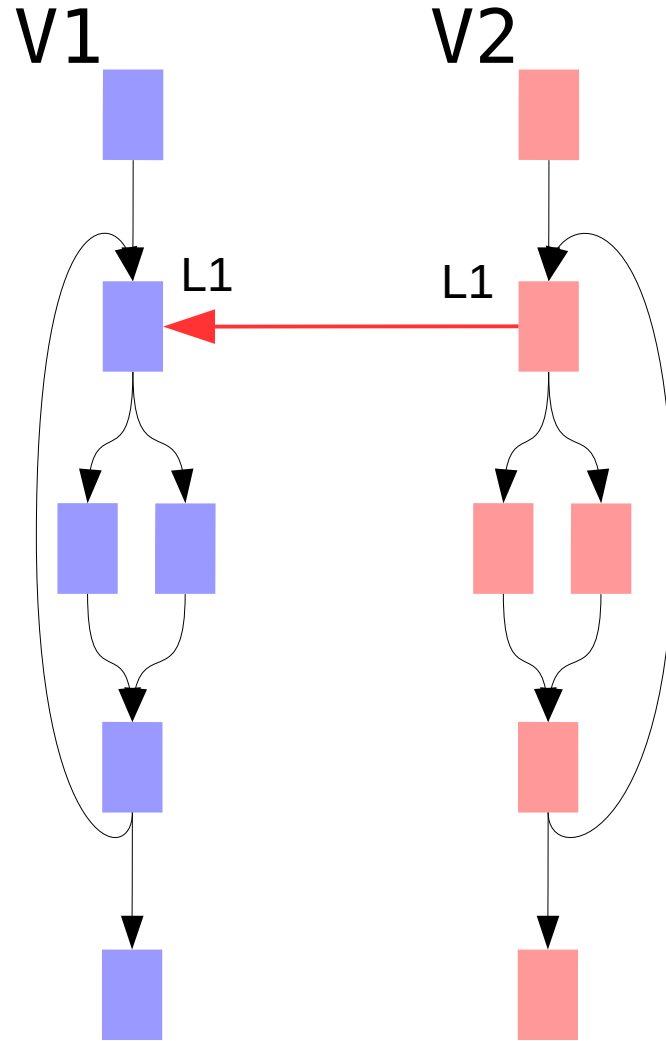
1. Create identical copy



1. Create identical copy

2. Add empty assumes

```
assume true  
else F.V1.L1 [x=x]
```



1. Create identical copy

2. Add empty assumes

```
assume true  
else F.V1.L1 [x=x]
```

3. Optimize code
by adding guards

Writing a JIT

Copy

get(x, i)

```
V1 | var off = 2  
   | L0 branch (x = nil) L2 L1  
   | L1 return x[off+i]  
   | L2 return nil
```


Writing a JIT

Copy

get(x, i)

V1
L0 **branch** (x = nil) L2 L1
L1 **return** x[off+i]
L2 **return** nil

V2
L0 **branch** (x = nil) L2 L1
L1 **return** x[off+i]
L2 **return** nil


get(x, i)

```
V1 | var off = 2  
   | L0 branch (x = nil) L2 L1  
   | L1 return x[off+i]  
   | L2 return nil
```

```
V2 | var off = 2  
   | L0 assume true  
   |     else get.V1.L0 [x=x,i=i,off=off]  
   | branch (x = nil) L2 L1  
   | L1 return x[off+i]  
   | L2 return nil
```


```
get(x, i)
```

```
V1  ...
```

```
V2  var off = 2  
L0 assume true  
   else get.V1.L0 [x=x,i=i,off=off]  
   branch (x = nil) L2 L1  
L1 return x[off+i]  
L2 return nil
```

get(x, i)

V1  ...

V2  **var off = 2**
L0 **assume** true
 else get.V1.L0 [x=x, i=i, off=**off**]
 branch (x = nil) L2 L1
L1 **return** x[**off**+i]
L2 **return** nil

get(x, i)

V1  ...

V2  ~~var off = 2~~


```
L0  assume true
      else get.V1.L0 [x=x, i=i, off= 2 ]
      branch (x = nil) L2 L1
L1  return x[ 2 +i]
L2  return nil
```

Writing a JIT

Speculation

get(x, i)

V1  ...


V2  L0 **assume** true
 else get.V1.L0 [x=x, i=i, off=2]
 branch (x = nil) L2 L1
 L1 **return** x[2+i]
 L2 **return** nil

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get(x, i)

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Speculation


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get(x, i)

V1  ...

V2  L0 **assume** (x ≠ nil)
 else get.V1.L0 [x=x, i=i, off=2]
~~L0 **branch** (x = nil) false L2 L1~~
L1 **return** x[2+i]
L2 ~~**return** nil~~

get(x, i)

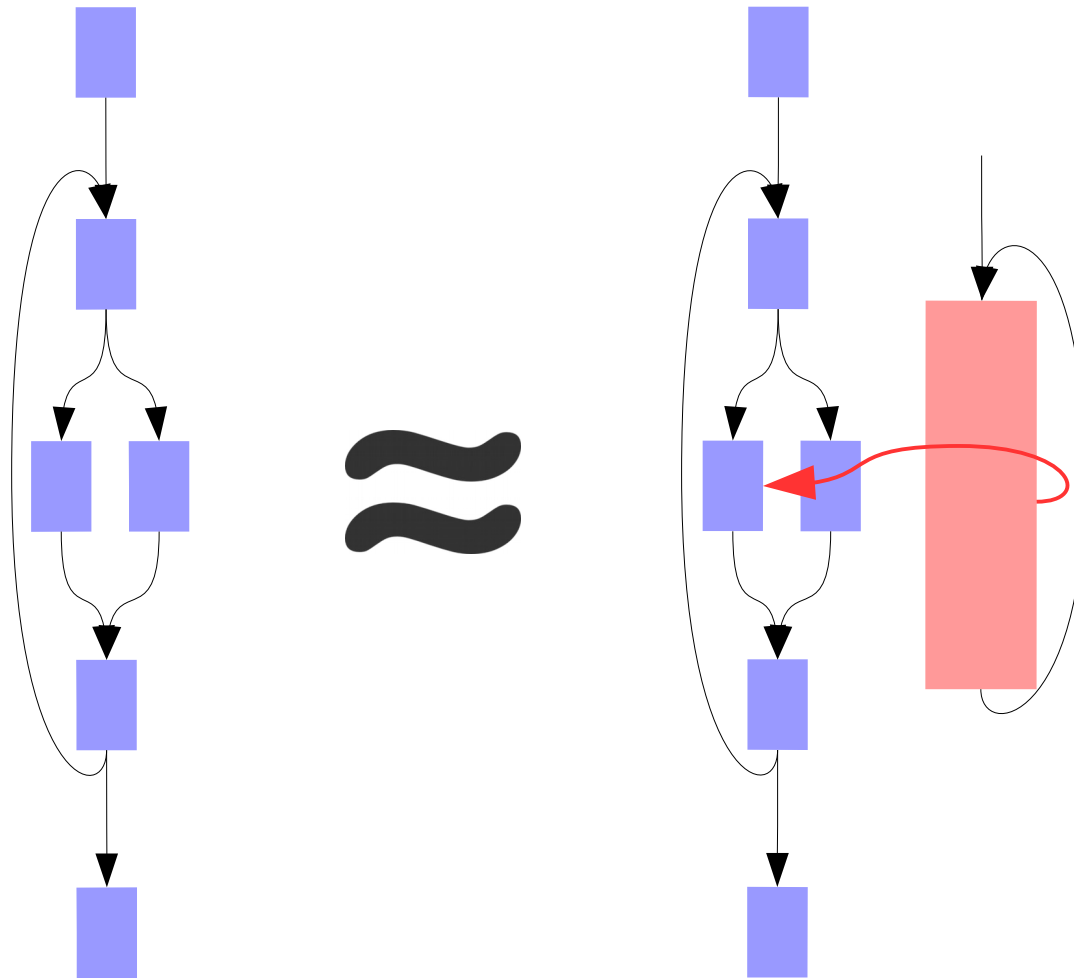
V1  ...

V2  L0 **assume** (x ≠ nil)
else get.V1.L0 [x=x, i=i, off=2]

L1 **return** x[2+i]

Correctness

Proof Structure



Case Study: R

Me: how hard can it be?

l) scopes


```
x <- 1
```

```
f <- function(a) x + a
```

```
g <- function() {
```

```
  x <- 2
```

```
  f(0)
```

```
}
```

```
g() # what does this return?
```

```
x <- 1
```

```
f <- function(a) x + a
```

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g <- function() {
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  x <- 2
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  f(0)
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g() # what does this return?
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  f(0)
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g() # what does this return?
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g <- function() {
```

```
  x <- 2
```

```
  f(0)
```

```
}
```

```
g() # → 1
```

```
x <- 1
f <- function(a) x + a
g <- function() {
  x <- 2
  f(0)
}
g() # → 1
```

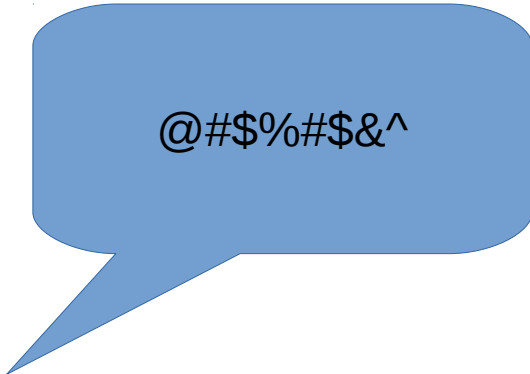


lexical scope!

```
x <- "gotcha"
g <- function(a) {
  x <- 1
  rm(list=a)
  x
}
g("x")
```

```
x <- "gotcha"  
g <- function(a) {  
  x <- 1  
  rm(list=a)  
  x  
}  
g("X")
```

```
x <- "gotcha"  
g <- function(a) {  
  x <- 1  
  rm(list=a)  
  x  
}  
g("x") # → "gotcha"
```



@#\$%#\$&^


```
x <- "gotcha"  
g <- function(a) {  
  x <- 1  
  rm(list=a)  
  x  
}  
g("X") # → "gotcha"
```

```
x <- "gotcha"  
g <- function(a) {  
  x <- 1  
  rm(list=a)  
  x  
}  
g("x") # → "gotcha"
```

II) promises

```
f <- function(x) {  
  print("a")  
  x  
}  
f(print("b"))
```

```
f <- function(x) {  
  print("a")  
  x  
}
```

```
f(print("b")) # → "a, b"
```

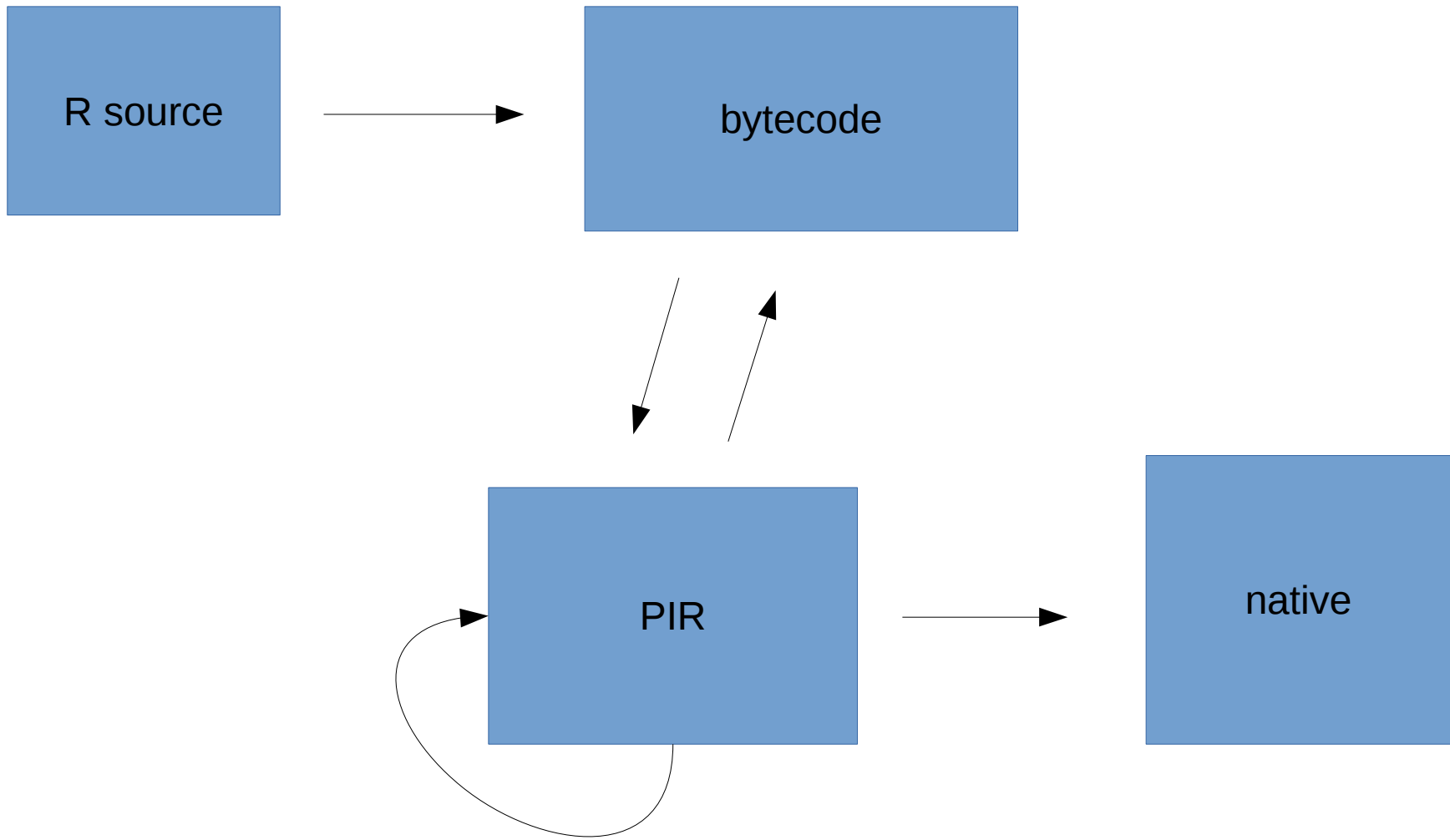
```
f <- function(x) {  
  print("a")
```

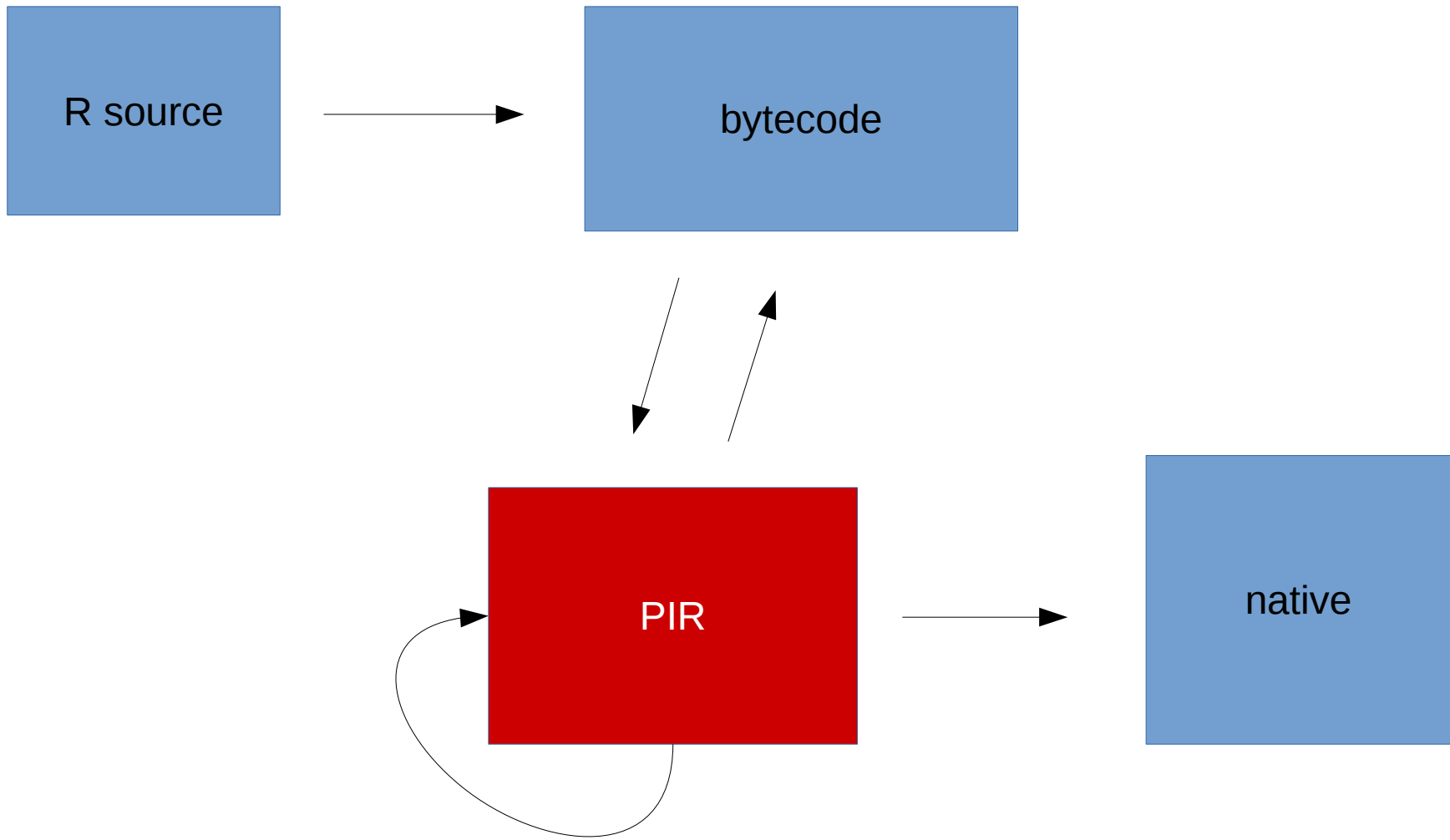
```
  X  
  `print("b")` | env | __result__  
}
```

```
f(print("b")) # → "a, b"
```

- demo

Ř





modeling first-class scopes and promises

```
a <- 1  
f <- function(b) b  
f(a)
```

```
a <- 1
f <- function(b) b
f(a)
```

main

```
%7 = LdConst [1] 1
%8 = StVar a, %7, G
%9 = MkClosure (f, G)
%10 = MkArg (pr0, G)
%11 = Call %9 (%10) G
...
```

pr0

```
%12 = LdVar a, G
Return %12
```

```
a <- 1
f <- function(b) b
f(a)
```

f

```
%1 = LdArg 0
e2 = MkEnv (b = %1) parent = G
%3 = Force (%1) e2
Return %3
```

main

```
%7 = LdConst [1] 1
%8 = StVar a, %7, G
%9 = MkClosure (f, G)
%10 = MkArg (pr0, G)
%11 = Call %9 (%10) G
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pr0

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%12 = LdVar a, G
Return %12
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a <- 1
f <- function(b) b
f(a)
```

f

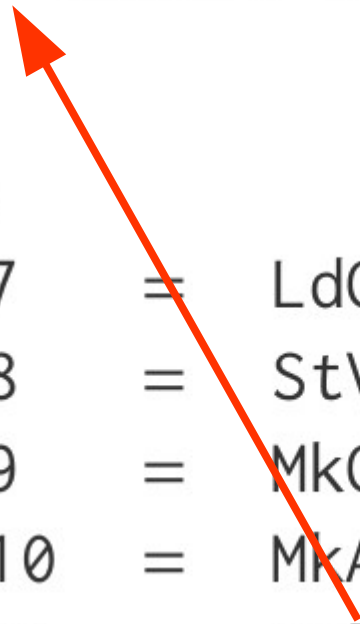
```
%1 = LdArg 0
e2 = MkEnv (b = %1) parent = G
%3 = Force (%1) e2
Return %3
```

main

```
%7 = LdConst [1] 1
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e2 = MkEnv (b = %10) parent = G

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a <- 1
f <- function(b) b
f(a)
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%7 = LdConst [1] 1

%8 = StVar a, %7, G

%10 = MkArg (pr0, e8)

e2 = MkEnv (b = %10) parent = G

%12 = LdVar a, G

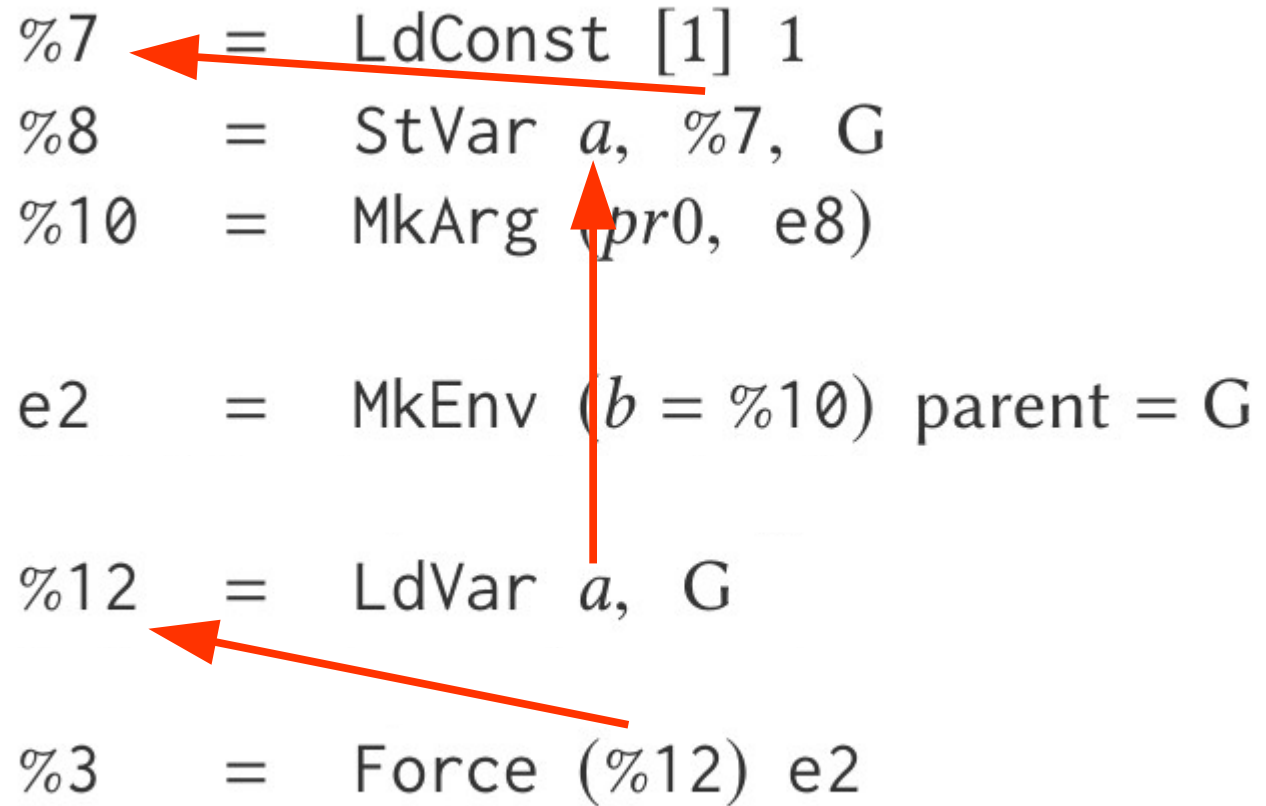
%3 = Force (%12) e2



```
a <- 1
f <- function(b) b
f(a)
```

main

```
%7 ← = LdConst [1] 1
%8   = StVar a, %7, G
%10  = MkArg (pr0, e8)
e2   = MkEnv (b = %10) parent = G
%12  = LdVar a, G
%3   = Force (%12) e2
```



Compiler Correctness

S – source language
T – target language
→ – compiler

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if $S \rightarrow T$
then $S \stackrel{s=t}{=} T$

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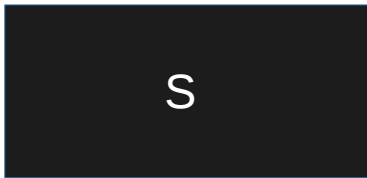
(whole program correctness)

observational equivalence

$$S \stackrel{s=t}{=} T$$

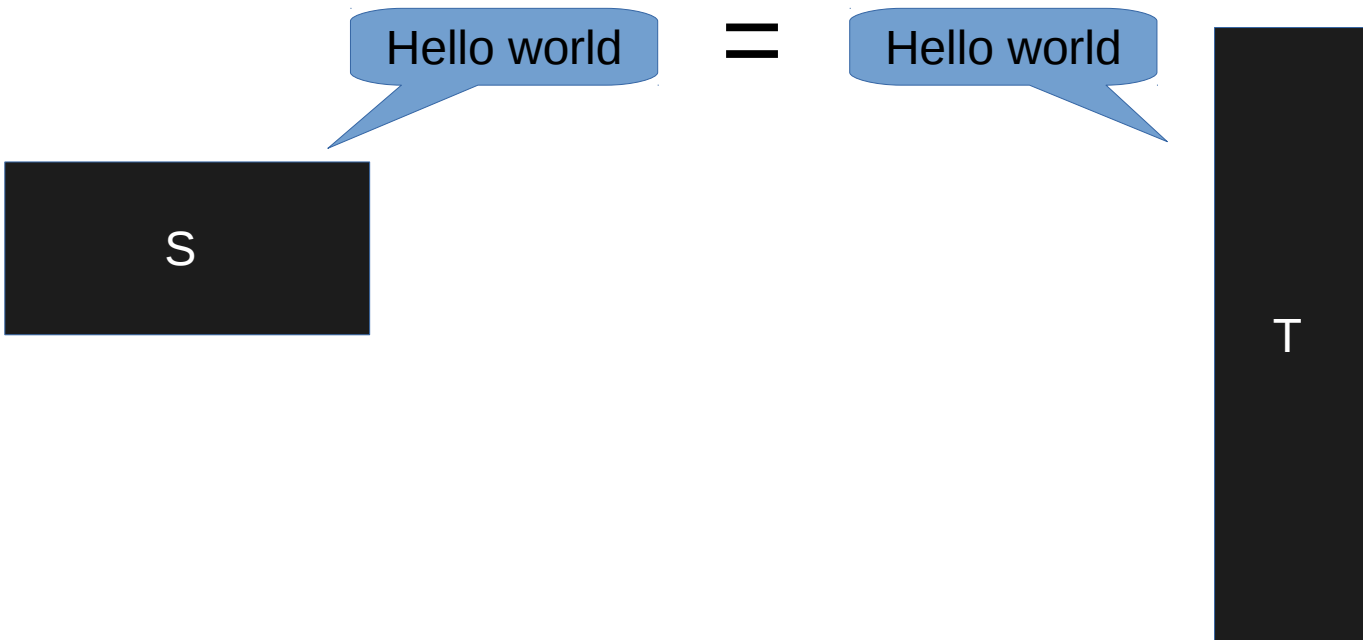
observational equivalence

$$S \stackrel{s=t}{=} T$$

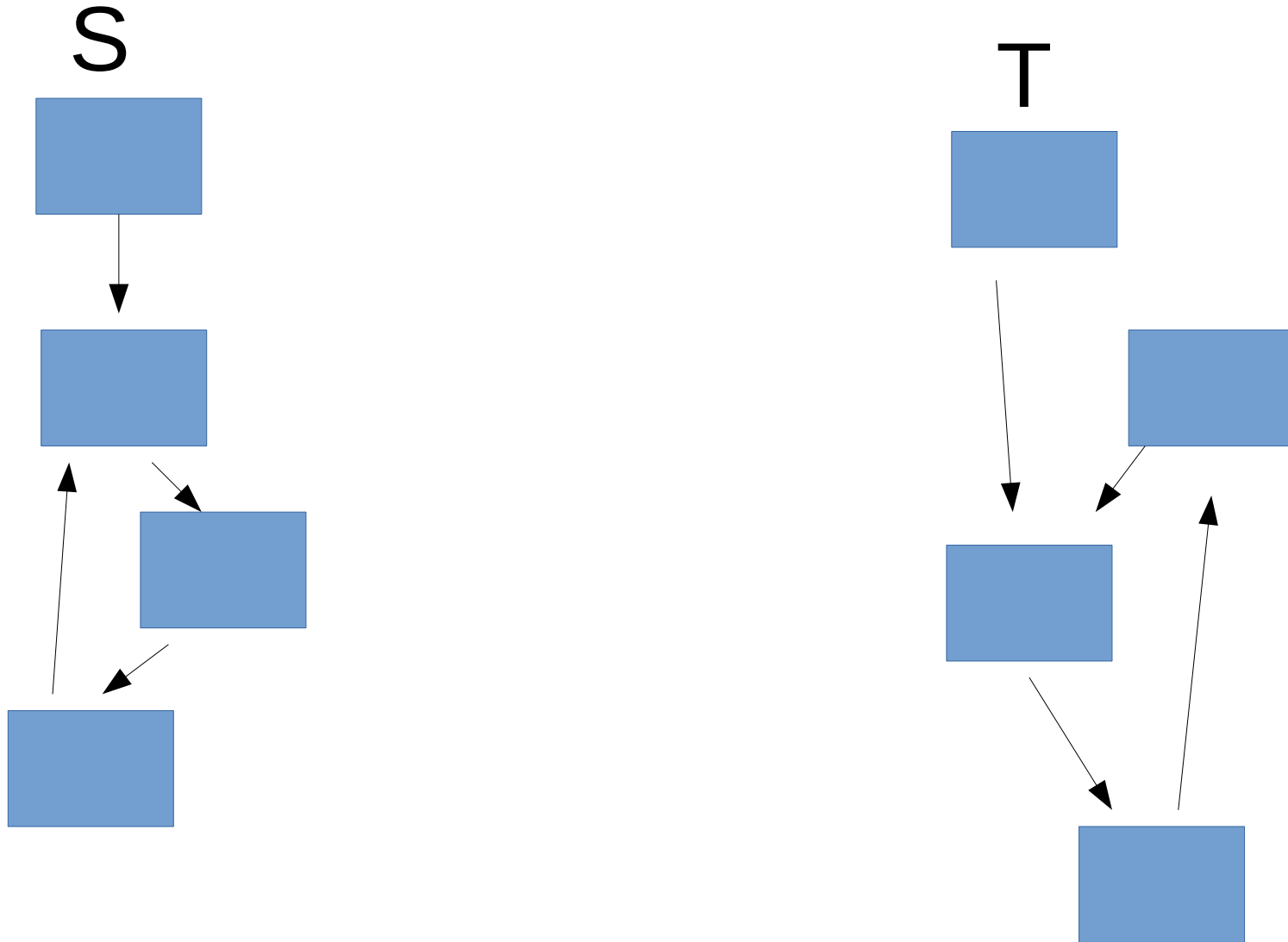


observational equivalence

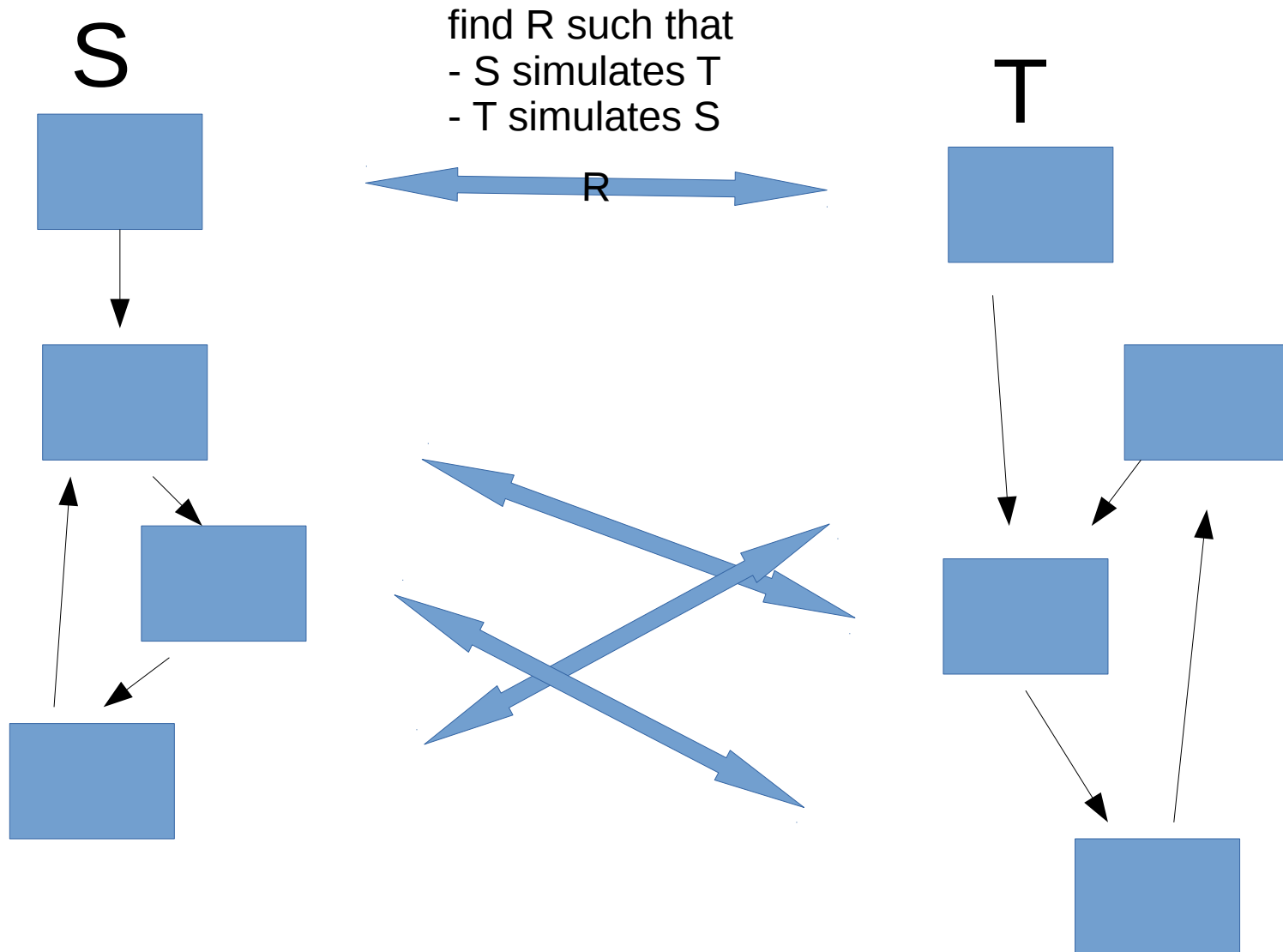
$$S \stackrel{s=t}{=} T$$



Bi-Simulation



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Bi-Simulation

