

Interpreters Everywhere and All the Time



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Stefan Marr
PLISS, September 2023



Engineering and
Physical Sciences
Research Council



University of
Kent

**Got a Question?
Please Interrupt Me!**





Stefan Marr

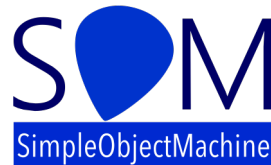
Tinkering with interpreters
for 6,000 days, and counting



How it Started



Course on
Virtual Machines
1st of April 2007



Course Project:
Build a just-in-time
compiler for CSOM

In between:
Many Years of Brussels & Lille
(and Linz, but without the chocolate)



This is THE BEST Chocolate!



How it's Going

University of
Kent

SOM
SimpleObjectMachine

THE
**ROYAL
SOCIETY**

“something like a
professor”

still tinkering with
interpreters

Who Are We?



Please stand up, if you have used a programming language!



Please stand, if you have implemented a programming language!



Please stand,
if it's a language
we have or will hear of!



Please stand, if it's any kind of interpreter!



Topics Discussed Today

- How are programming languages implemented?
- Types of interpreters
 - Abstract syntax tree
 - Bytecode
- Interpreter optimizations
 - Lookup caching
 - AST/bytecode-level inlining
 - Library lowering, library intrinsification
 - Super nodes, super instructions
 - Self-optimization, bytecode quickening

**Got a Question?
Please Interrupt Me!**



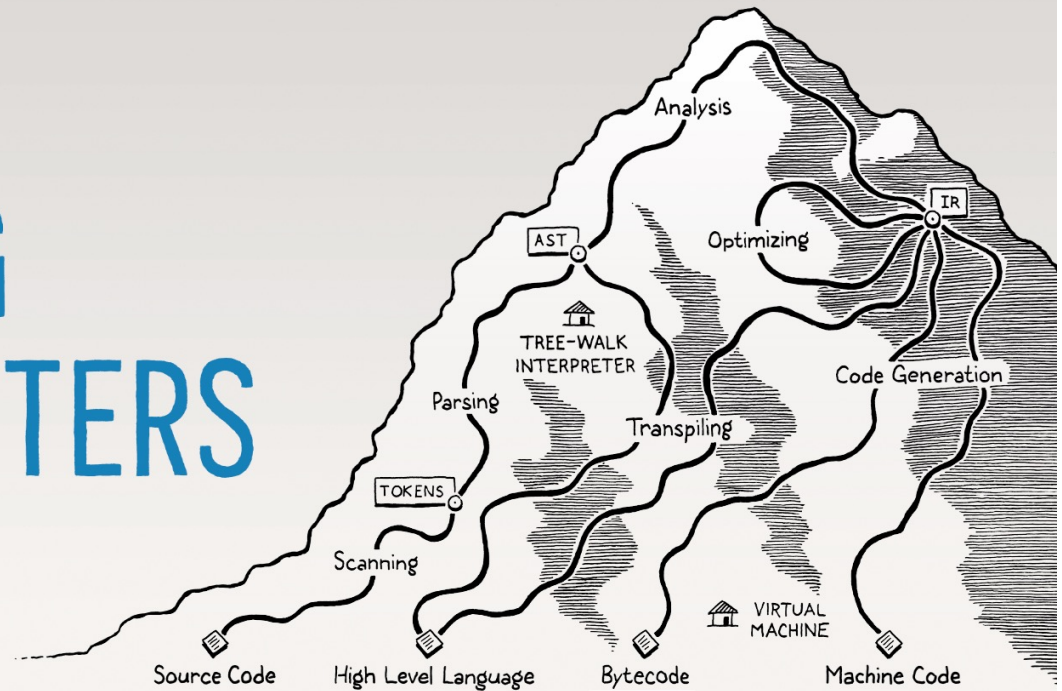
Disclaimer!

Through the lens of Meta-compilation Systems
Graal+Truffle and RPython



CRAFTING INTERPRETERS

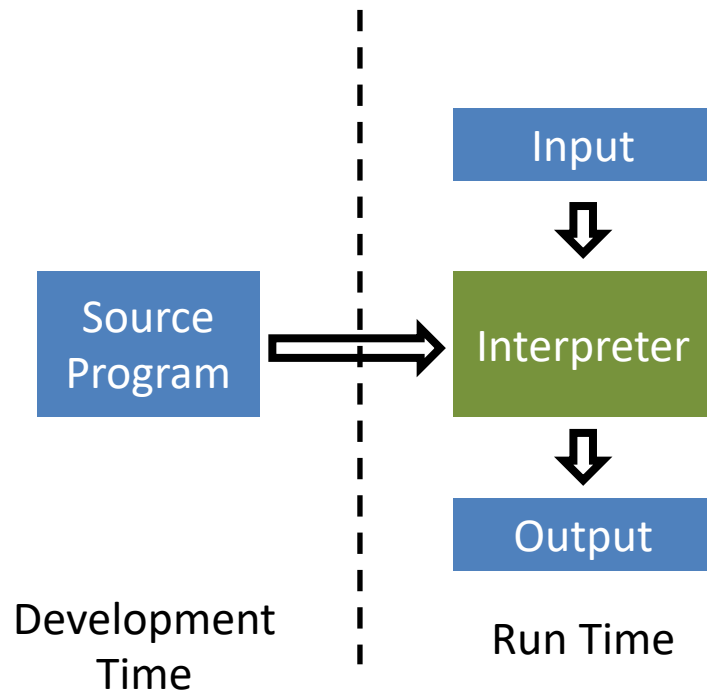
ROBERT NYSTROM



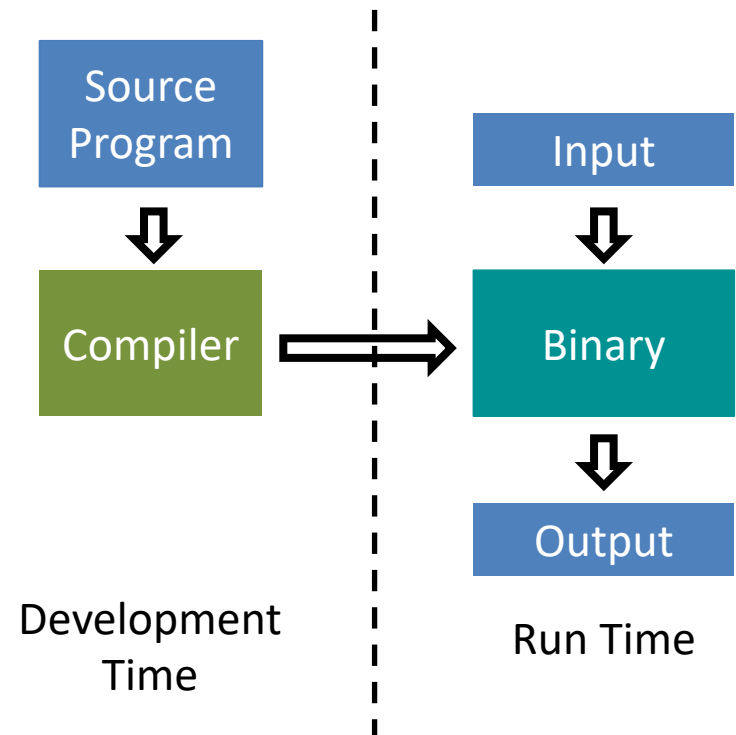
I am not using it today, but highly recommended: <https://craftinginterpreters.com/>

HOW TO IMPLEMENT A PROGRAMMING LANGUAGE?

Language Implementation Approaches

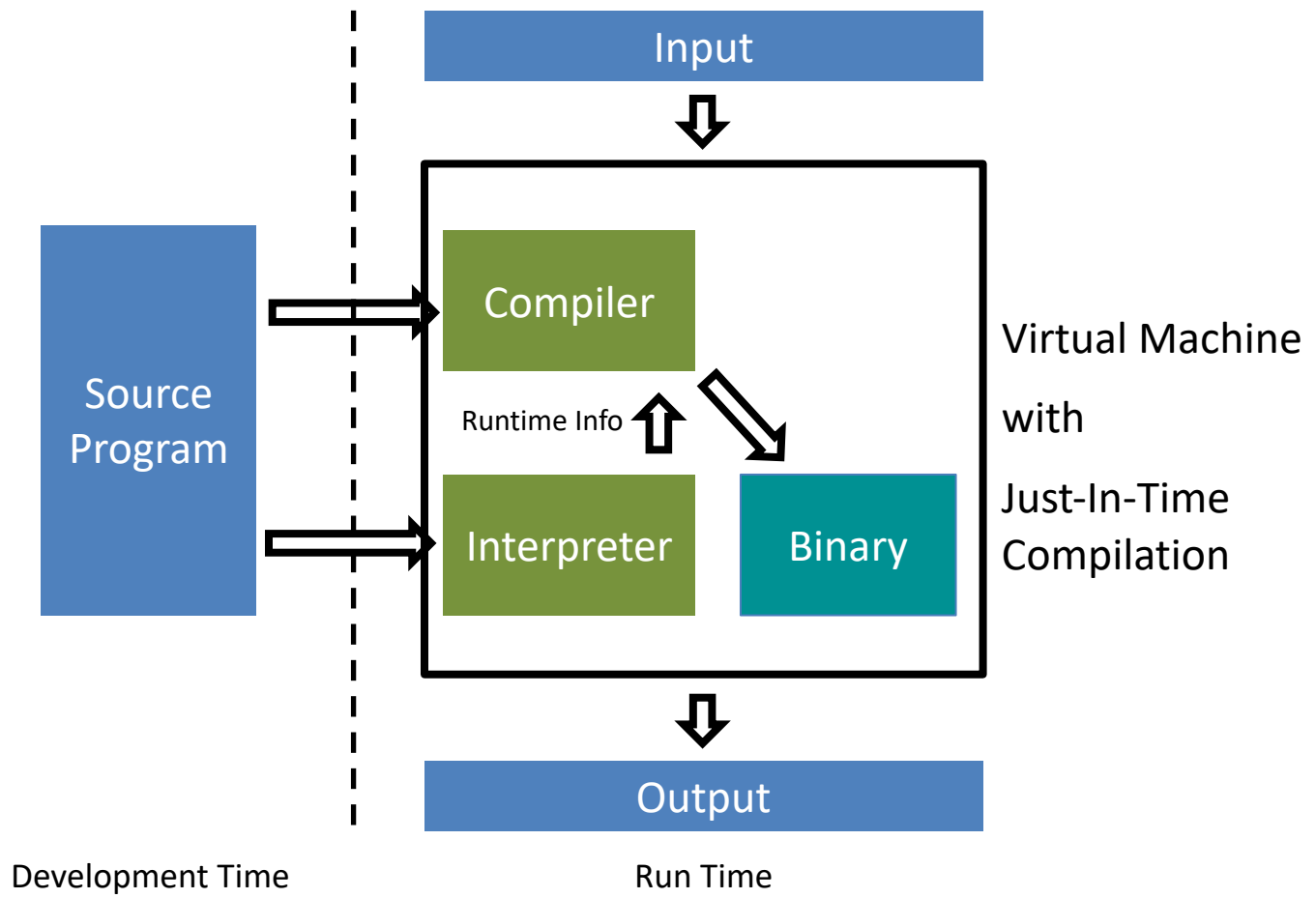


Simple, but often slow

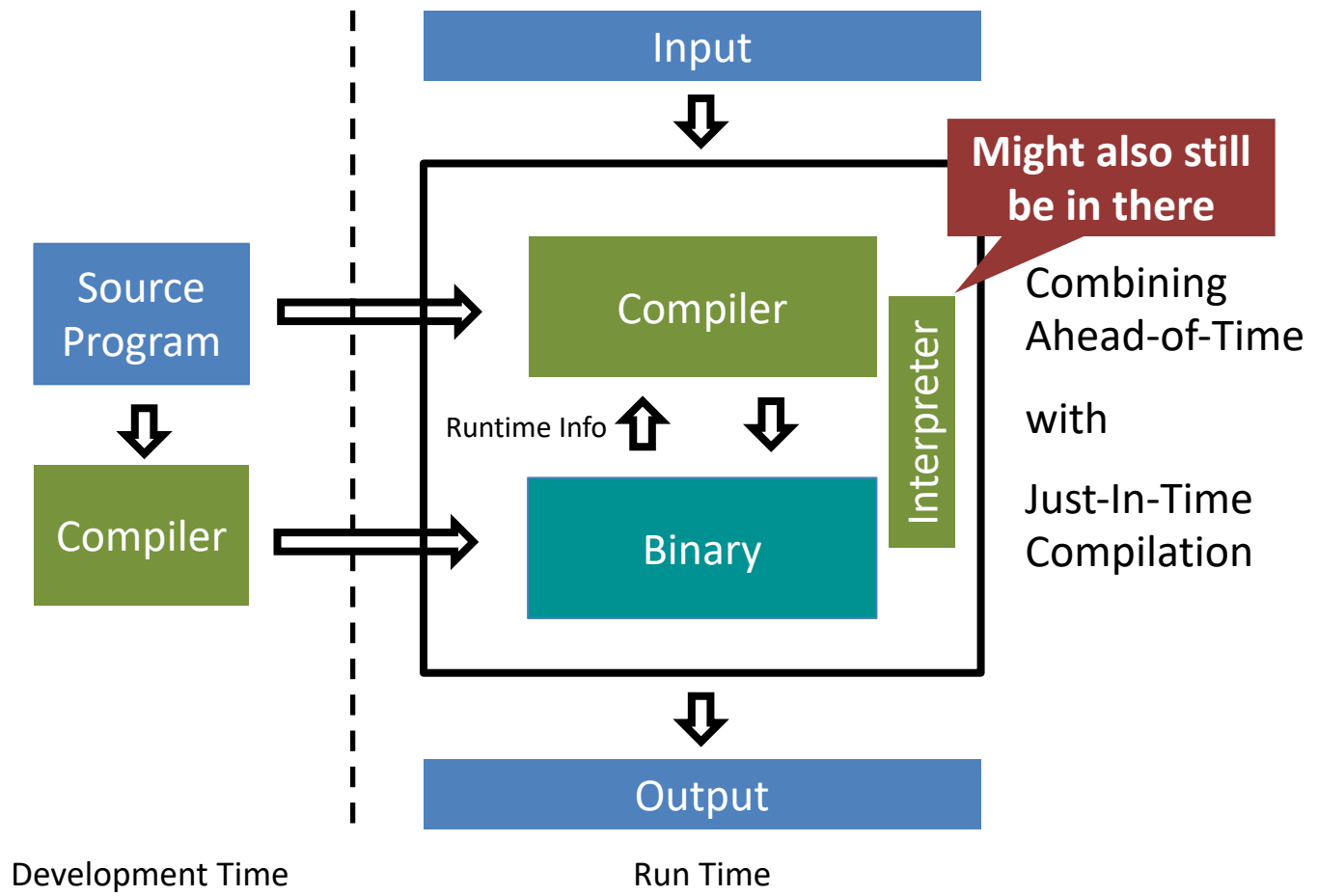


More complex, but often faster
Not ideal for all languages.

Modern Virtual Machines



Virtual Machines with Ahead-of-Time Compilation



Pointers for this week

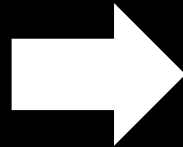
- JavaScript AOT Compilation
Manuel Serrano
- Programming Languages on the Web
Michael Lippautz
- A Brief Introduction to Just-in-Time
Compilation
by myself

TYPES OF INTERPRETERS

Code Convention



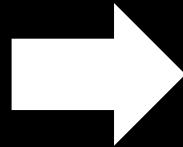
JavaScript-ish



Application Code

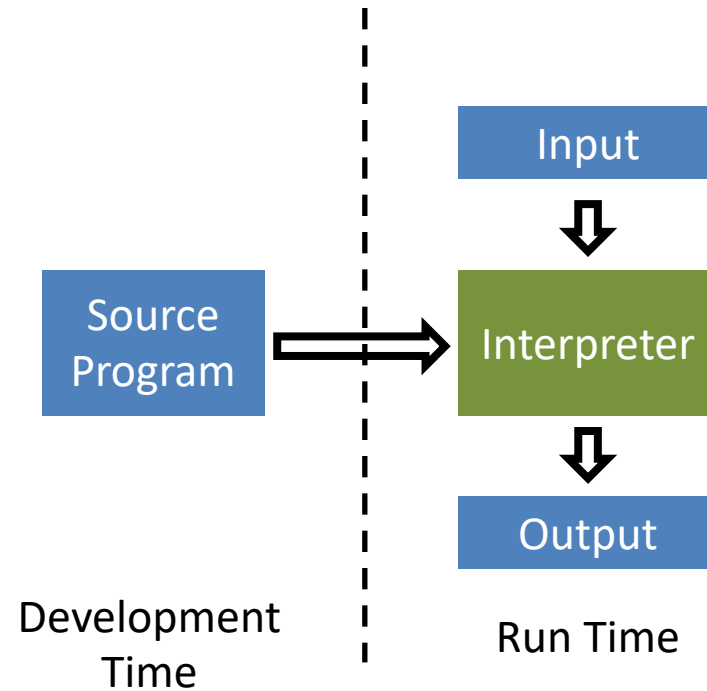


Python-ish
with implicit typing



Interpreter Code

Basic Interpretation



From Program to Abstract Syntax Tree

```
function hello() {  
    log("Hello");  
}
```

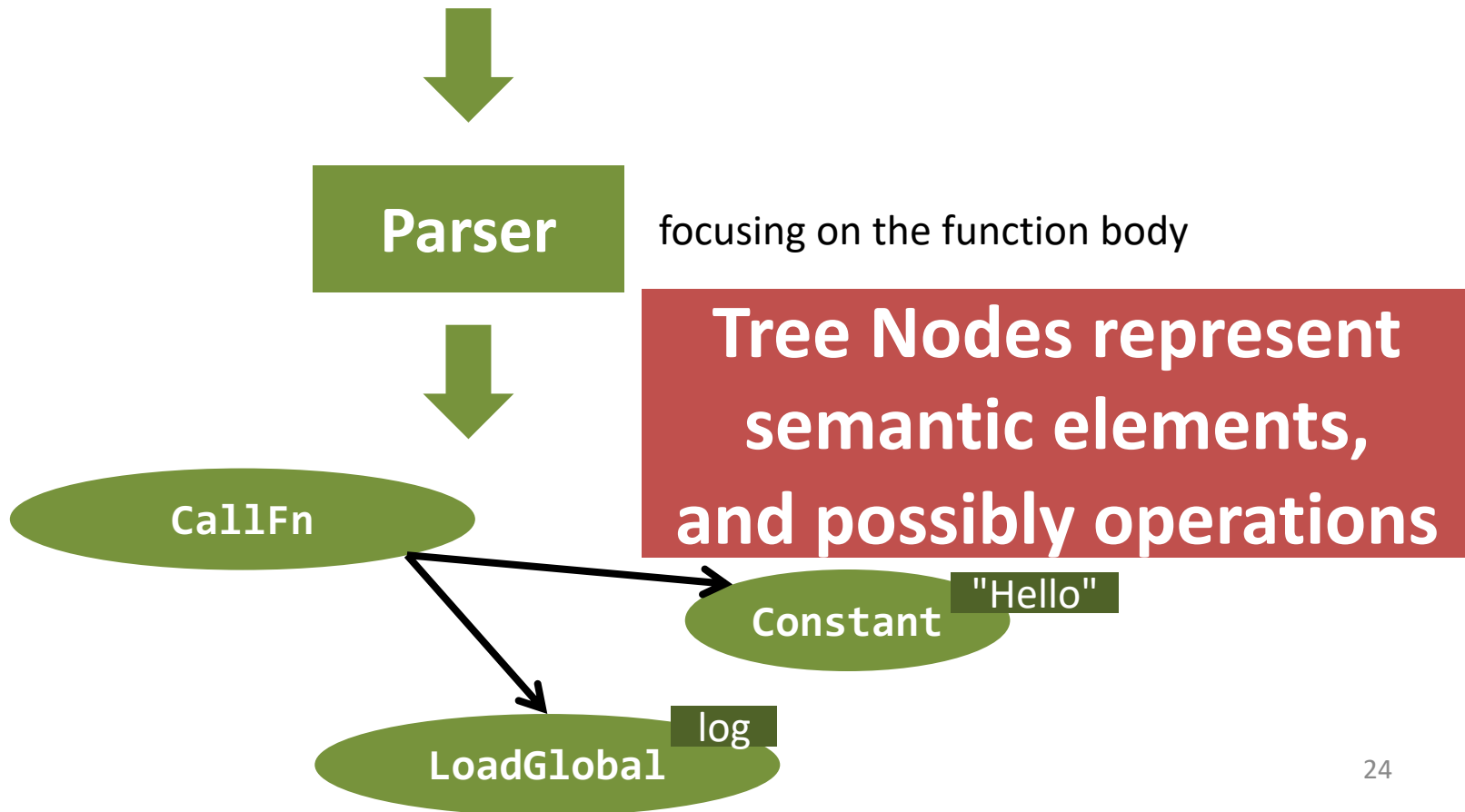
programs are read by a parser

a parser is based on a grammar
describing the language

```
functionDeclaration:  
Function Identifier  
'(' formalParameterList? ')'  
'{' functionBody '}'
```

From Program to Abstract Syntax Tree

```
function hello() {  
  log("Hello");  
}
```



A Simple Abstract Syntax Tree Interpreter

```
log("Hello");
```

root_node



CallFn

**Simple Interpreter:
an execute method for
each node**

Constant

"Hello"

log

LoadGlobal

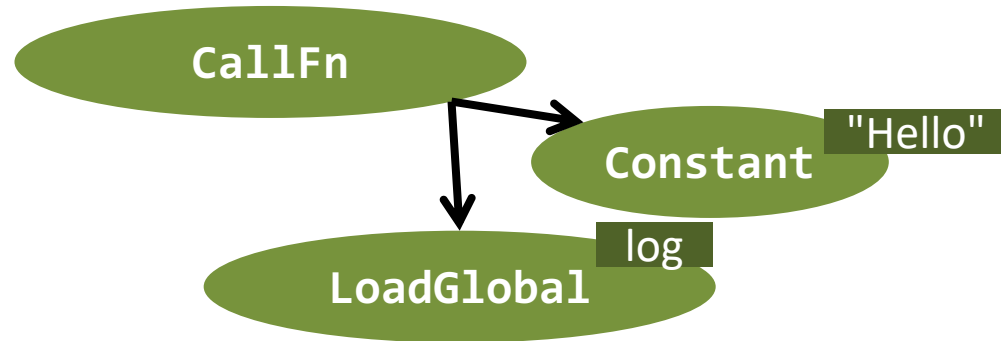
```
root_node = parse(file)
root_node.execute(Frame())
```

Implementing execute() methods

```
log("Hello");
```

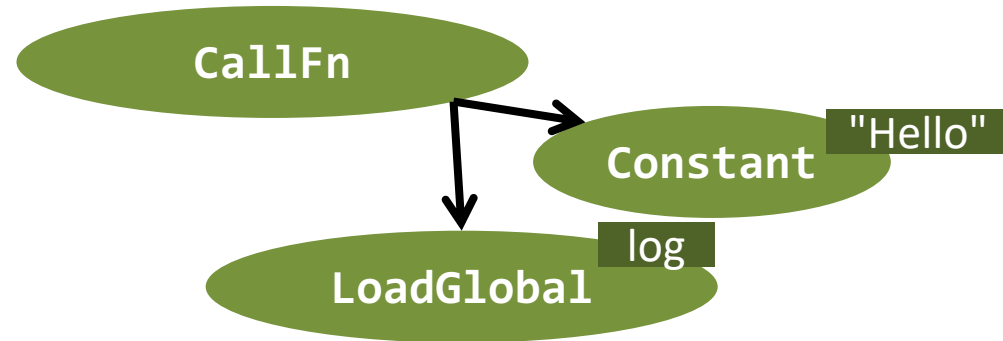
```
class Constant:  
    final value  
    def execute(frame):  
        return value
```

```
class LoadGlobal:  
    final binding  
    def __init__(name):  
        binding = lookupGlobal(name)  
    def execute(frame):  
        return binding.value
```



Implementing execute() methods

```
log("Hello");
```



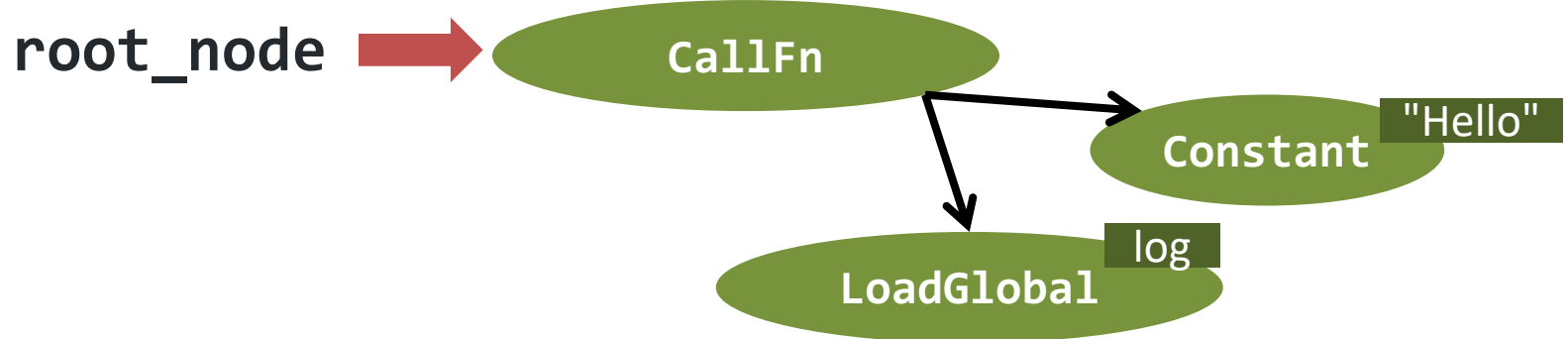
```
class Constant:
    final value
    def execute(frame):
        return value
```

```
class LoadGlobal:
    final binding
    # ...
    def execute(frame):
        return binding.value
```

```
class CallFn:
    node fn
    node argument
    def execute(frame):
        fn = fn.execute(frame)
        arg = argument.execute(frame)
        return call(fn, arg)
```

Abstract Syntax Tree Interpreters

```
log("Hello");
```



Simple and Flexible

Any drawbacks?



Abstract Syntax Tree Interpreters

Benefits

- Very close to the source code
- Conceptually simple
- Makes building them “easy”

Drawbacks

- A tree node per operation
 - Noncontiguous representation
 - High-ish memory use per node
- Many virtual methods (execution overhead)

BYTECODE INTERPRETERS

From Program to Bytecodes

```
log("Hello");
```

Parser

A linearized and compact representation

Constant

"Hello"

log

LoadGlobal

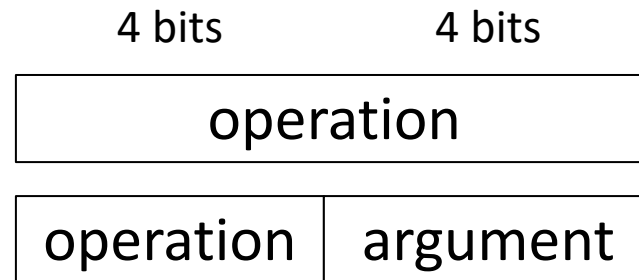
LoadGlobal "log"

LoadConstant "Hello"

CallFn

Bytecode Encoding

- Represent common operations
- In a dense representation



**Hypothetical
encoding
options**

LoadGlobal	"log"		1100 0000
LoadConstant	"Hello"		1110 0001
CallFn			1000 0000

translates to

Classic Bytecode Interpreter

```
LoadGlobal "log"  
LoadConstant "Hello"  
CallFn
```

```
def interpret():  
    idx = 0  
  
    while idx < method.length:  
        bc = method[idx]  
        switch bc:  
            case 0b1000_0000: # CallFn  
                arg      = frame.pop()  
                fn       = frame.pop()  
                result = call(fn, arg)  
                frame.push(result)
```

Bytecode Interpreters

Benefits

- Compact and contiguous representation
- Traditionally more efficient than AST interpreters
- Bytecode can be more efficient to parse

Drawbacks

- Requires extra design step
 - Bytecode format
 - Machine type
- Removes execution further from source code
 - Need to resolve mapping during debugging

**For some languages,
mapping is trivial, e.g.,
Smalltalk**

Research and Literature

- Bytecode design
 - Stack vs. Register
 - Shi, Y., Gregg, D., Beatty, A. & Ertl, M. A. (2005). Virtual machine showdown: stack versus registers. *VEE'05*.
 - Top of stack caching
 - Ertl, M. A. (1995). Stack Caching for Interpreters. *PLDI'95*.
- Direct & indirect threaded interpretation
 - Ertl, M. A. & Gregg, D. (2003). The Structure and Performance of Efficient Interpreters.. *J. Instruction-Level Parallelism*, 5.
- Crafting Interpreters, Robert Nystrom
<https://craftinginterpreters.com/>
- Java Virtual Machine specification
<https://docs.oracle.com/javase/specs/index.html>
- Smalltalk's bytecode set
http://www.mirandabanda.org/bluebook/bluebook_chapter28.html
- JavaScriptCore Bytecode Design
<https://webkit.org/blog/9329/a-new-bytecode-format-for-javascriptcore/>
- V8 Ignition Interpreter design
<https://v8.dev/docs/ignition>



But

AST and Bytecode Interpreters

are still

“Often Slow” Interpreters!

**WHY CARE FOR THESE
“OFTEN SLOW”
INTERPRETERS?**

The Problem:

**Old assumptions don't hold for today's
massive codebases and
engineering approaches!**

For the last 30 years,
we optimized for
Long-Running
Server Applications

Large Applications, Frequent Changes



> 100 million
lines of Hack/PHP

A new version every
75 minutes¹

1. HHVM Jump-Start: Boosting Both Warmup and Steady-State Performance at Scale. Guilherme Ottoni, Bin Liu. CGO'21
2. <https://shopify.engineering/automatic-deployment-at-shopify>
3. <https://instagram-engineering.com/continuous-deployment-at-instagram-1e18548f01d1>
4. <https://instagram-engineering.com/let-your-code-type-hint-itself-introducing-open-source-monkeytype-a855c7284881>

Large Applications, Frequent Changes



> 100 million
lines of Hack/PHP



shopify

> 3 million
lines of Ruby

A new version every 30-40 times a day
75 minutes¹ (every 36-48min)²

1. HHVM Jump-Start: Boosting Both Warmup and Steady-State Performance at Scale. Guilherme Ottoni, Bin Liu. CGO'21
2. <https://shopify.engineering/automatic-deployment-at-shopify>
3. <https://instagram-engineering.com/continuous-deployment-at-instagram-1e18548f01d1>
4. <https://instagram-engineering.com/let-your-code-type-hint-itself-introducing-open-source-monkeytype-a855c7284881>

Large Applications, Frequent Changes



> 100 million
lines of Hack/PHP



shopify

> 3 million
lines of Ruby



> million
lines of Python⁴

A new version every 75 minutes¹ 30-40 times a day (every 36-48min)² 30-50 times a day³

1. HHVM Jump-Start: Boosting Both Warmup and Steady-State Performance at Scale. Guilherme Ottoni, Bin Liu. CGO'21
2. <https://shopify.engineering/automatic-deployment-at-shopify>
3. <https://instagram-engineering.com/continuous-deployment-at-instagram-1e18548f01d1>
4. <https://instagram-engineering.com/let-your-code-type-hint-itself-introducing-open-source-monkeytype-a855c7284881>

The Cost of Change

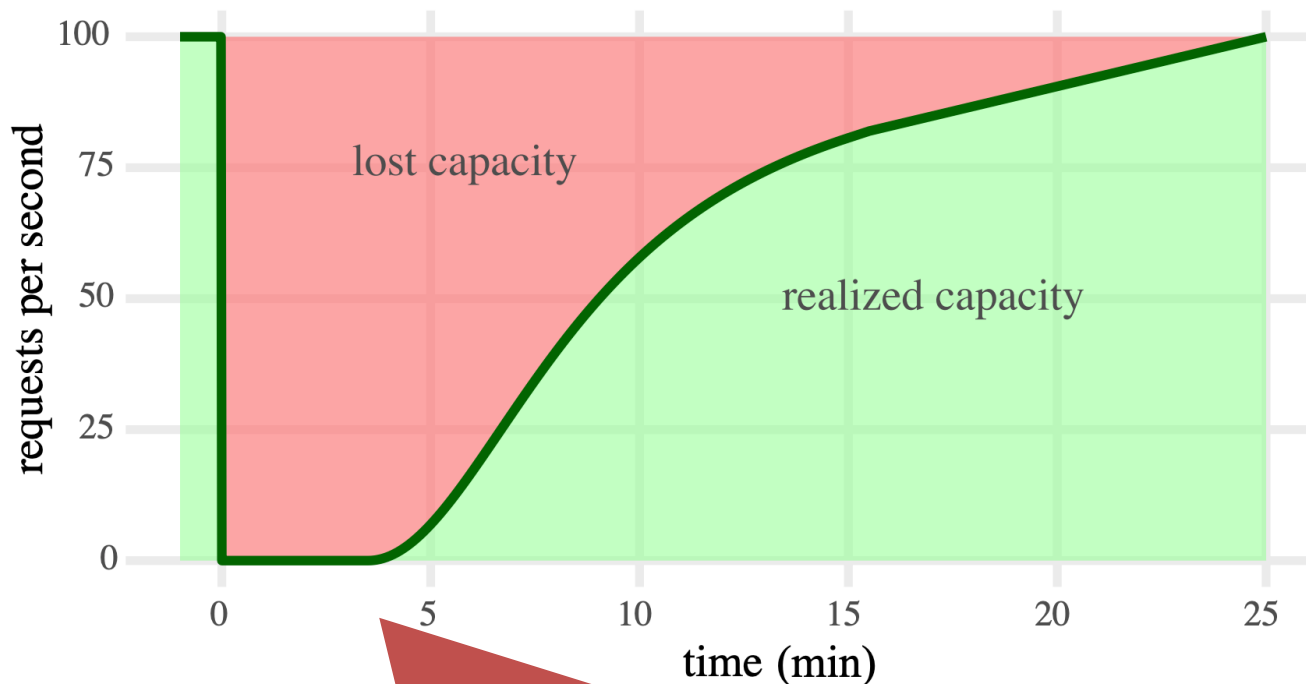


Fig.

**With millions of servers,
every update “costs”!
(need twice the capacity)**

**Estimated Energy
Bill, in 2020:
£500,000,000
(7,170,000 MWh)**

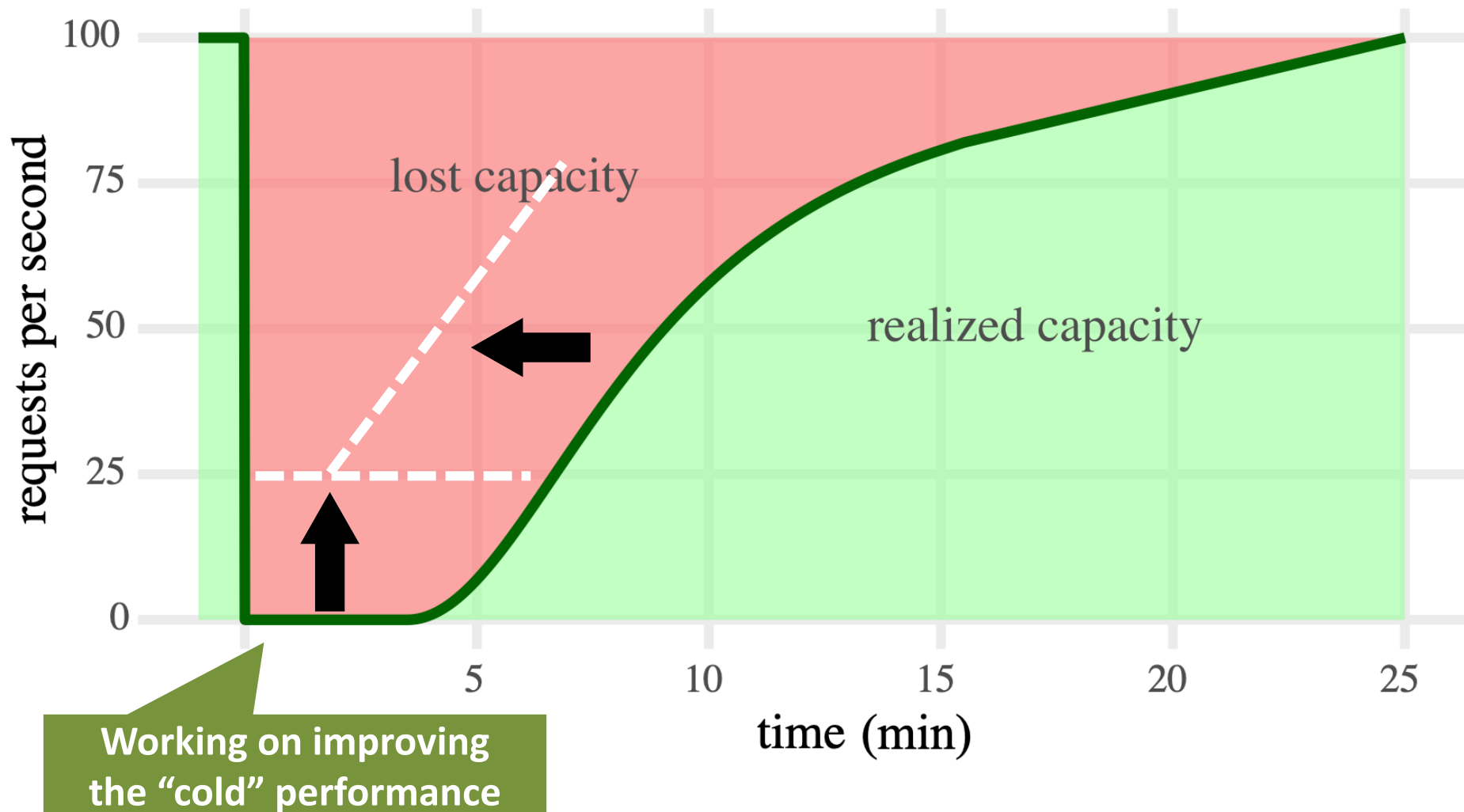
HHVM Jump-Start: Boosting both Warmup and Steady State Performance at Scale.

Guilherme Ottoni, Bin Liu. CGO'21

<https://sustainability.fb.com/report-page/energy/>



Building Faster Interpreters



SCIENCE ADVOCATES

Why is it important that we optimize interpreters?

Oh! They are used by many languages! Being fast reduces cost and increases productivity!



SCIENTISTS

Why is it important that we optimize interpreters?

BECAUSE IT'S
FUCKING
AWESOME.



And, it's a
very hard problem...

How Many Interpreters/Compilers are Used During Execution?

- A Calculator Server

```
{ "jsonrpc": "2.0",  
  "method": "subtract",  
  "params": [42, 23], "id": 1 }
```
- Running on top of Node.js
- Running inside QEMU
- On top of a x86-64 processors?

2



4



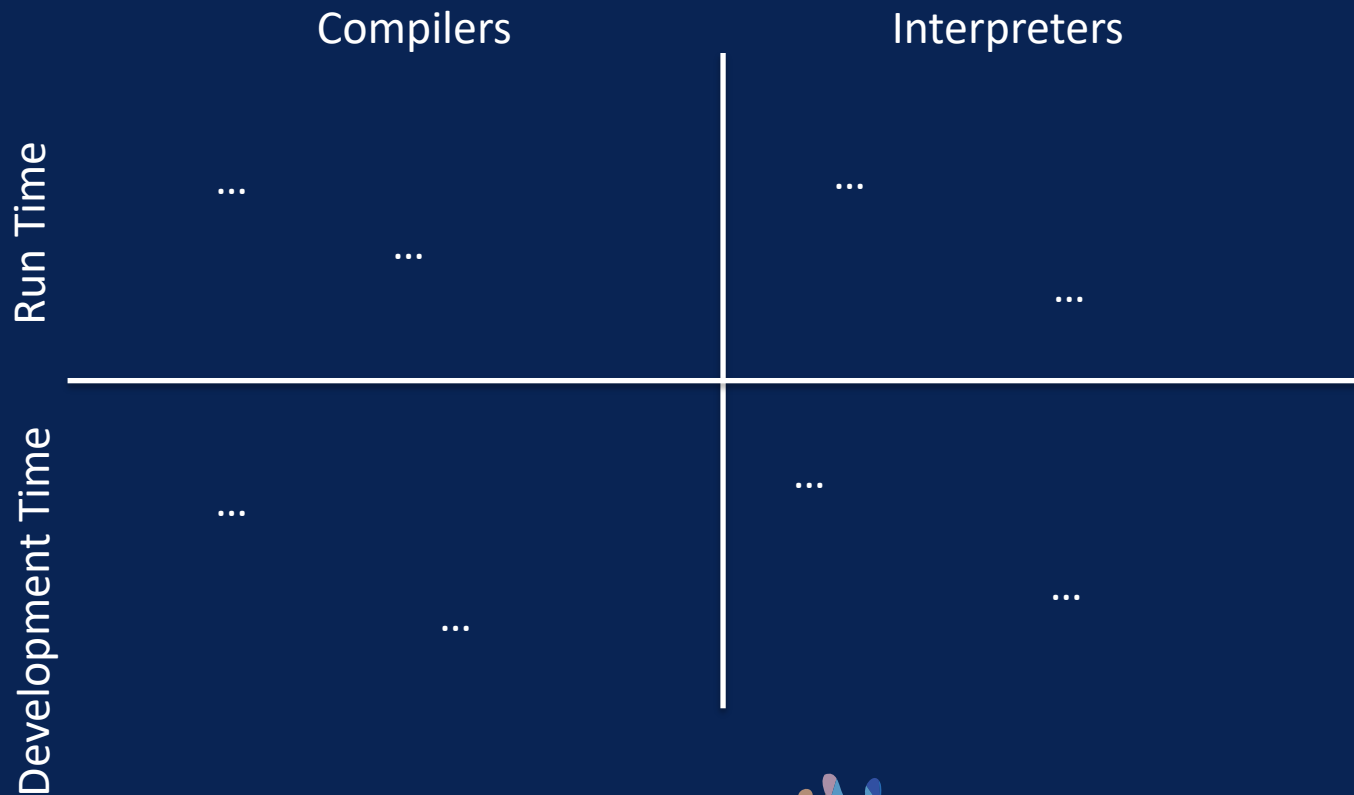
6



more



Which Interpreters and Compilers are Involved to Create/Run this Stack?



Scenario

- JSON RPC
- Node.js
- QEMU
- x86-64



Interpreters

Everywhere and All The Time!

5min Break

Next up

How can we optimize interpreters?

**HOW CAN WE OPTIMIZE
INTERPRETERS?**

LOOKUP CACHING

A Class Hierarchy Example

```
class Widget {  
  fitsInto(width) {  
    return this.width <= width;  
  }  
}  
  
class Button extends Widget {}  
class RadioButton extends Button {}
```

```
function findAllThatFit(arr, width) {  
  const result = [];  
  for (const w of arr)  
    if (w.fitsInto(width))  
      result.push(w)  
  return result;  
}
```

What does this program do?



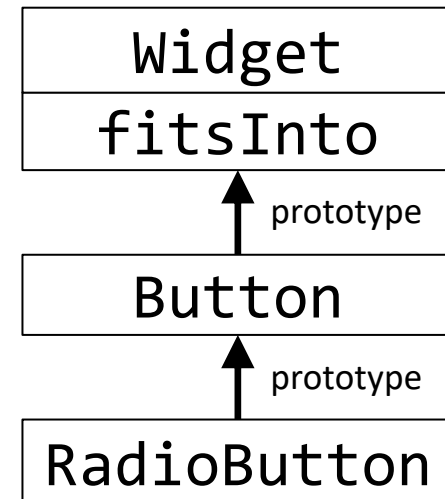
Lookups can be frequent and costly

```
class Widget {  
  fitsInto(width) {  
    return this.width <=  
  }  
}
```

For each `fitsInto` call
hasProperty: 3x
getPrototype: 2x

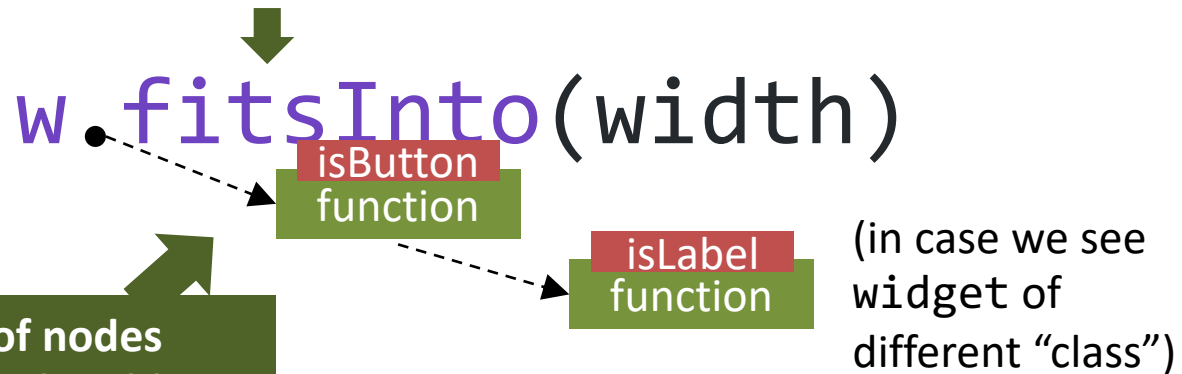
```
class Button extends Widget {}  
class RadioButton extends Button {}
```

```
function findAllThatFit(arr, width) {  
  const result = [];  
  for (const w of arr)  
    if (w.fitsInto(width))  
      result.push(w)  
  return result;  
}
```



Solution: Lookup Caching

could be various functions,
but we don't need to do the same lookup repeatedly



For AST: chain of nodes
For bytecode: a side table

cache

a guard check + lookup result

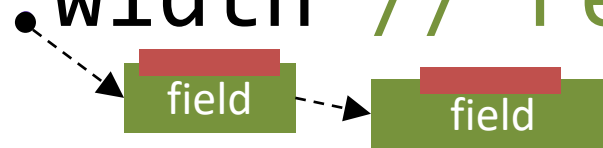
Any other language features
we could use this for?

Useful when lookup is
expensive, and essential
for JIT compilation

Lookup Caching Field Access

`w.width = width // write`

`width = w.width // read`



e.g. for
languages
where one can
add/remove
fields

Inlining Trivial Methods

```
class Widget {  
    #height;  
    getHeight() {  
        return this.height;  
    }  
    getAnswer() {  
        return 42;  
    }  
}
```

```
const b = new Button
```

```
b.getHeight()
```

read field

```
b.getAnswer()
```

42

**Extra benefit:
avoid call overhead**

**Already mentioned
in the '91 paper...**

Lookup Cache

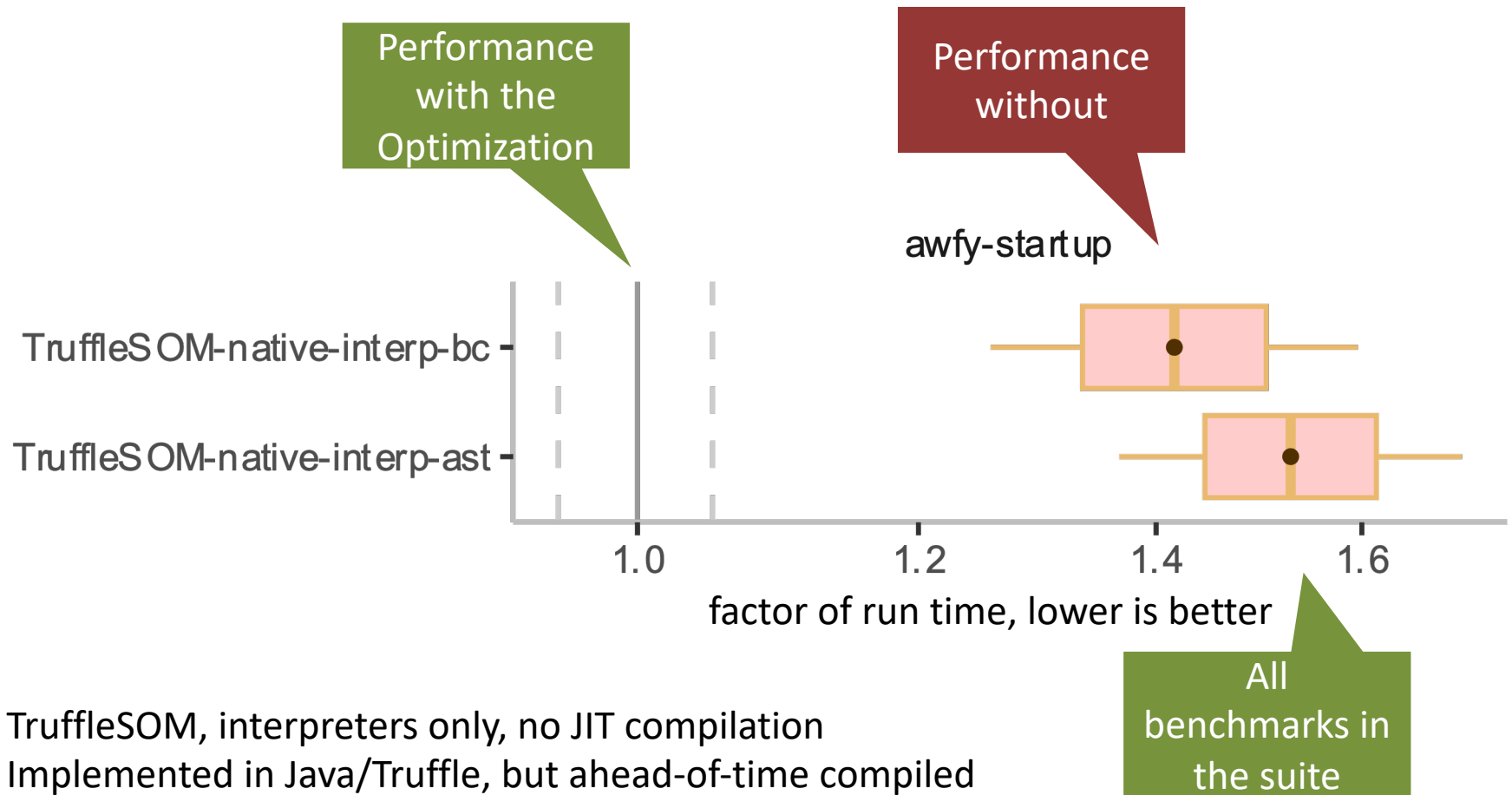
- Can be used for
 - Method/function lookup
 - Field access
 - Getters, setters, method returning constants, other “trivial” methods
 - Object creation when `new` is a method
 - Reflective operations, caches can be nested...

Disclaimer!

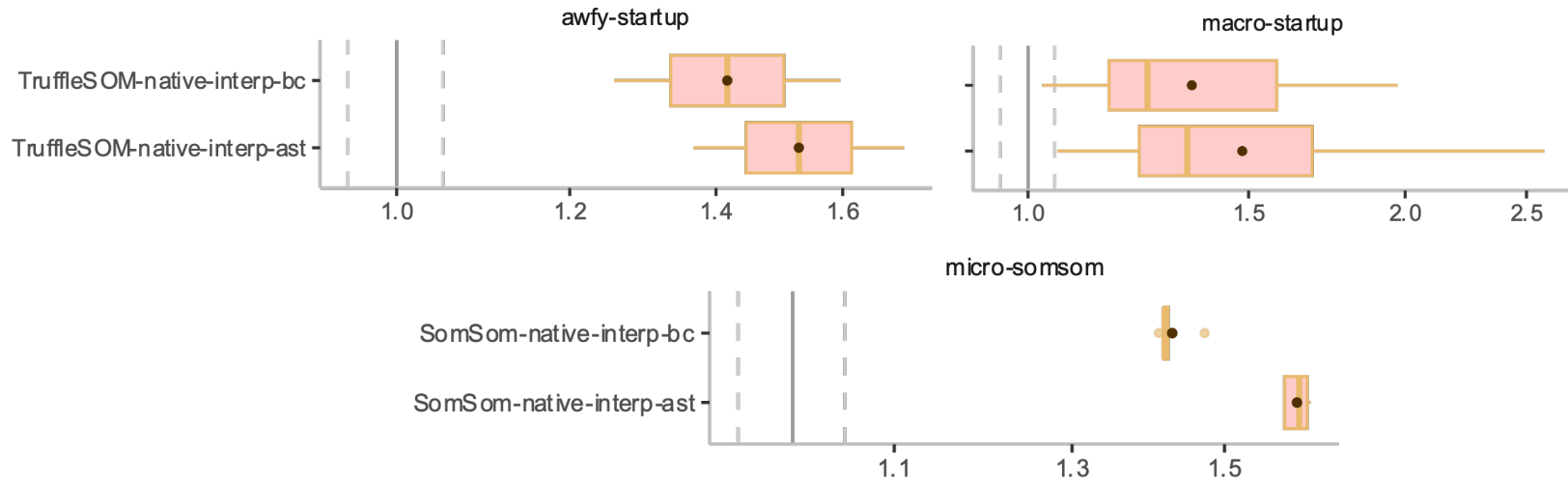
Through the lens of Meta-compilation Systems
Graal+Truffle and RPython



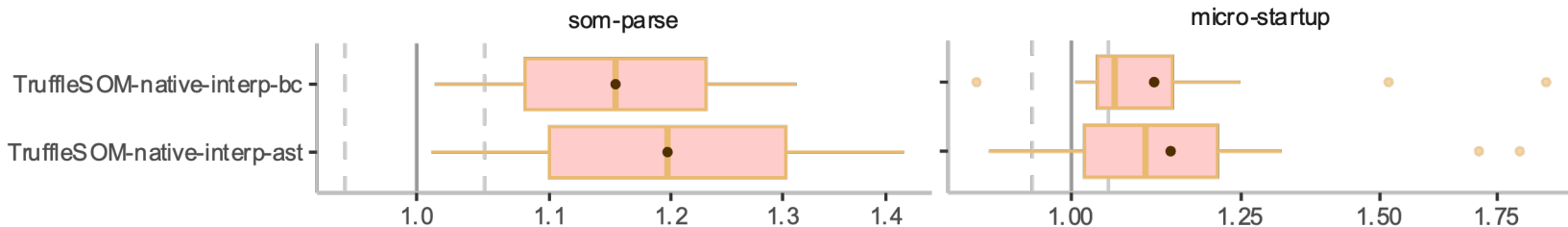
Performance Benefit for the Interpreter



Performance Benefit for the Interpreter



Larger Benchmarks take about 1.5x more time without Lookup Caching



Performance Benefit, More Details

micro-somsom

Executor: SomSom-native-interp-ast

		#M	median time in ms	time diff %
List		1	20434.63	62
Loop		1	14287.21	63
Mandelbrot		1	321.64	59
Queens		1	12918.73	61
Recurse		1	12934.17	59

Performance Benefit, More Details

macro-startup

Executor: TruffleSOM-native-interp-ast

			#M	median time in ms	time diff %
DeltaBlue		5	51.62	38	
GraphSearch		5	33.50	30	
Json		5	78.03	20	
NBody		5	80.62	158	
PageRank		5	22.68	6	
Richards		5	417.26	80	

Research and Literature

- **Efficient Implementation of the Smalltalk-80 System.**
Deutsch, L. P. & Schiffman, A. M. (1984). *POPL'84*
- **Optimizing Dynamically-Typed Object-Oriented Languages With Polymorphic Inline Caches.**
Hölzle, U., Chambers, C. & Ungar, D. (1991). *ECOOP'91*
- **Zero-Overhead Metaprogramming: Reflection and Metaobject Protocols Fast and without Compromises.**
Marr, S., Seaton, C. & Ducasse, S. (2015). *PLDI'15*
- **Who You Gonna Call: Analyzing the Run-time Call-Site Behavior of Ruby Applications.**
Kaleba, S., Larose, O., Jones, R., & Marr, S. (2022). *DLS'22*
- Optimizing prototypes in V8
<https://mathiasbynens.be/notes/prototypes>
- <https://mathiasbynens.be/notes/shapes-ics>
- <https://mrale.ph/blog/2012/06/03/explaining-js-vms-in-js-inline-caches.html>



INLINING OF CONTROL STRUCTURES

Languages where Control Flow is Realized with Methods?

Languages

Examples of Methods

...

...

...

...

...

...

...

...



Let's Go all In on Polymorphic Methods!

```
class True {  
  ifTrue(lambda) {  
    return lambda.call();  
  }  
  ifTrueElse(  
    trueL, falseL) {  
    return trueL.call();  
  }  
}
```

```
class False {  
  ifTrue(lambda) {  
    return null;  
  }  
  ifTrueElse(  
    trueL, falseL) {  
    return falseL.call();  
  }  
}
```

```
true.ifTrue(()) => {  
  // a bit clunky in JS syntax,  
  // but works...  
});
```

Iterating with Methods

```
class Range {  
  each(lambda) {  
    let i = this.start;  
    while (i < this.end) {  
      lambda.call(i);  
      i += 1;  
    }  
    return null;  
  }  
}
```

```
(1..10).each(n => log(n));
```

Can be applied to all control flow

- if/for/while
- each/map/filter
- computeIfAbsent

Inlining the Simple Cases Only

constant lambda, right
there in the code

```
debugMode.ifTrue(() => {  
  log("Hello");  
});
```

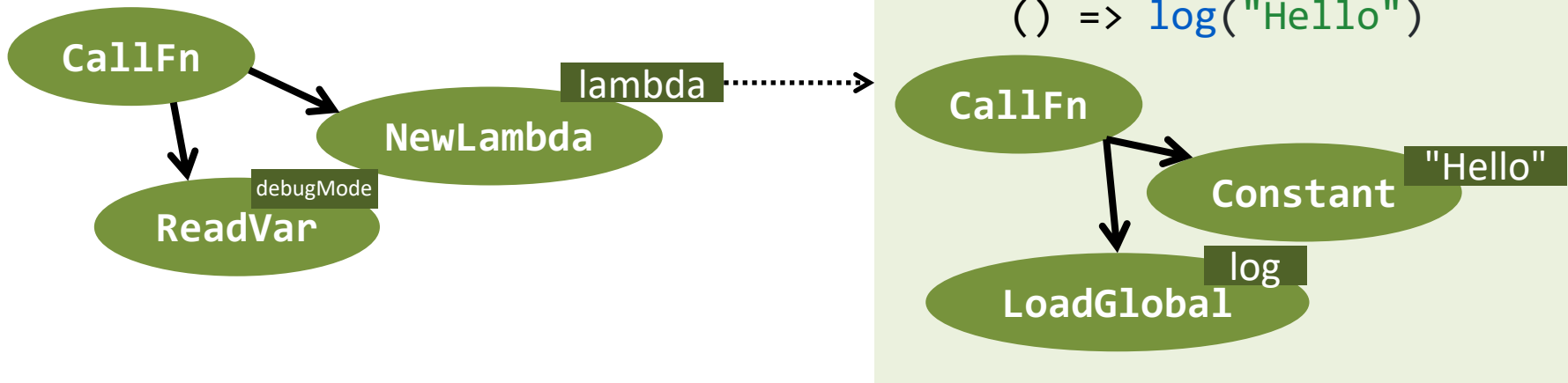
```
(1..10).each(n => log(n));
```

ensure correctness
as we do with
lookup caches

Inlining ifTrue

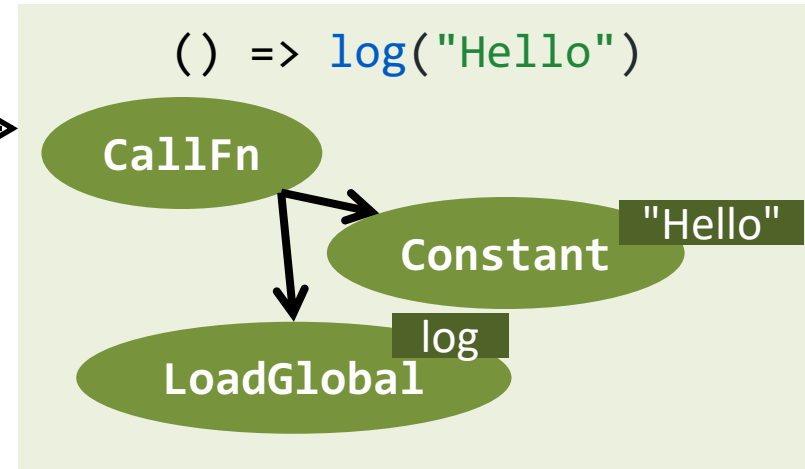
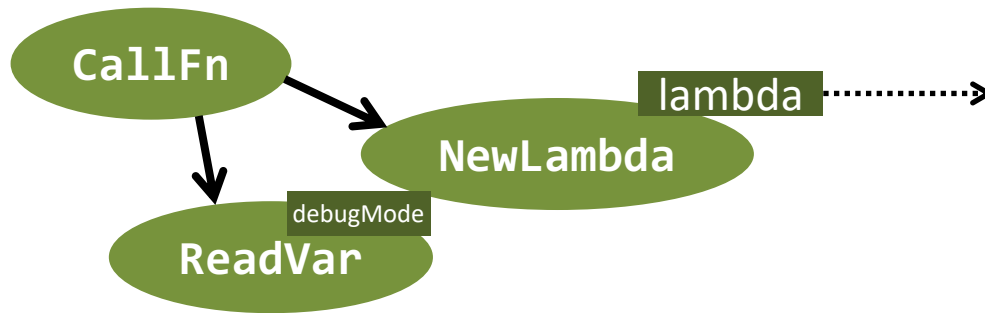
```
debugMode.ifTrue(() => {  
    log("Hello");  
});
```

```
debugMode.ifTrue(() => {...});
```



Inlining ifTrue

```
debugMode.ifTrue(() => {...});
```



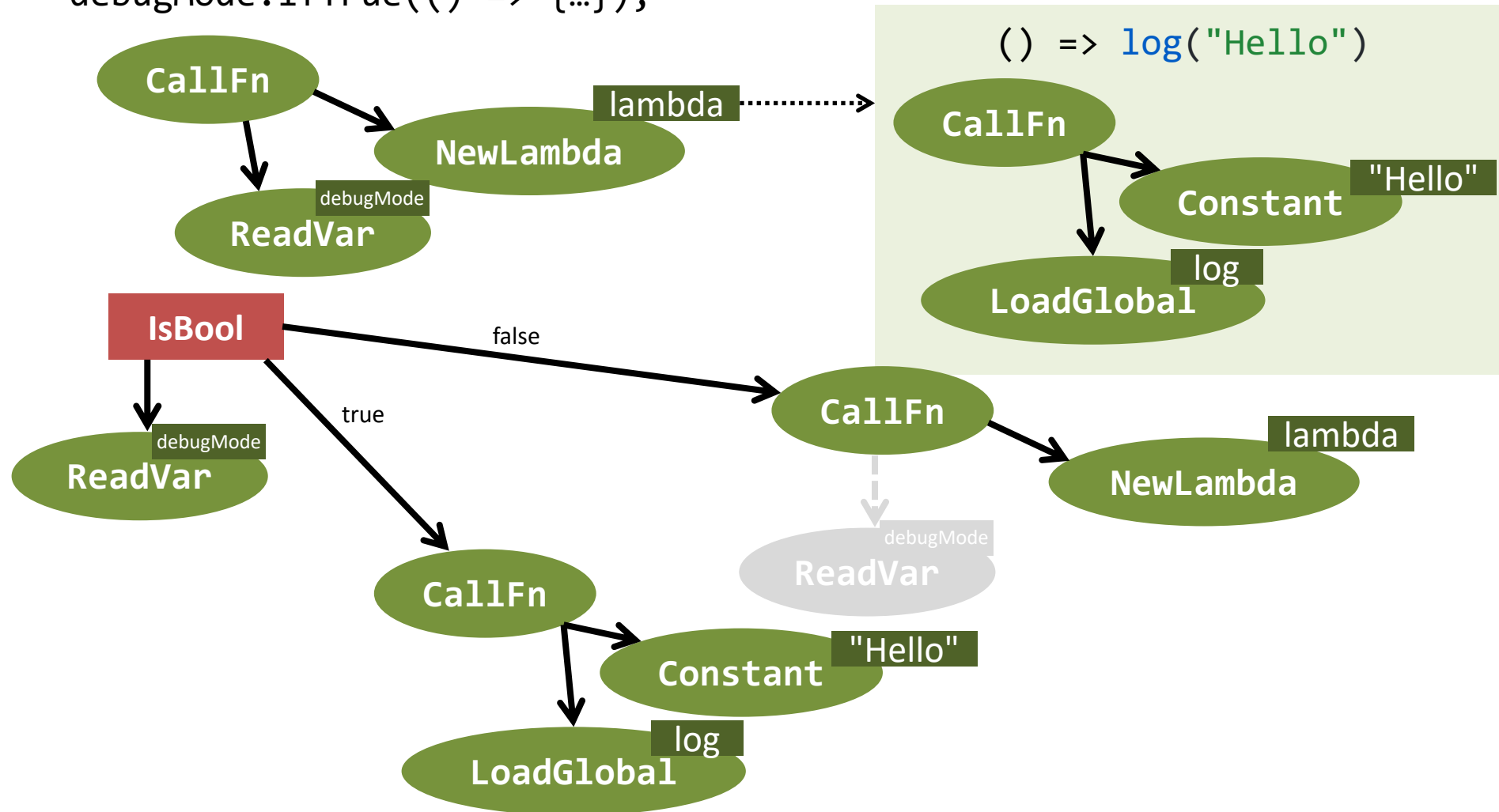
For inlining this, we need to

- Insert the guard
- Keep the old nodes as fallback
- Copy and adapt the body of

**Get's more interesting
with lexical scopes and
variables**

Inlining ifTrue

```
debugMode.ifTrue(() => {...});
```



Inlining ifTrue

```
debugMode.ifTrue(() => {...});
```

```
LoadVar    debugMode  
NewLambda  lambda  
CallFn     ifTrue
```

Inlined Version

```
LoadVar    debugMode
```

```
TopIsBool
```

```
JumpIfFalse -> fls
```

```
Pop // remove debugMode from stack
```

```
LoadGlobal  "log"  
LoadConstant "Hello"  
CallFn
```

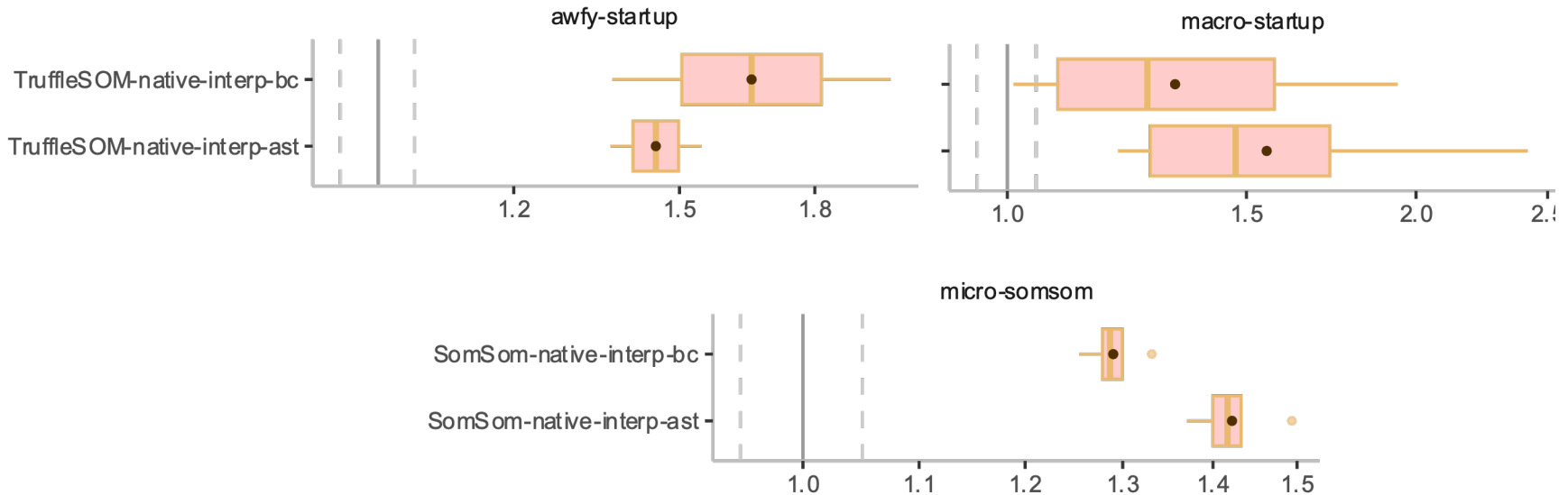
```
fls: NewLambda lambda  
CallFn ifTrue
```

```
() => log("Hello")
```

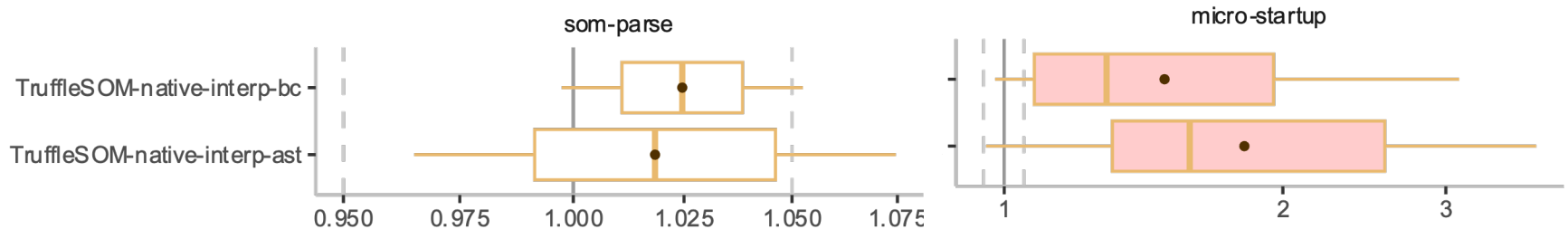
```
LoadGlobal  "log"  
LoadConstant "Hello"  
CallFn
```

Looping gets more complicated,
but works similarly

Performance Benefit for the Interpreter



Larger Benchmarks take about 1.4x more time without Inlining of Control Structures



Some More Details

macro-startup

Executor: TruffleSOM-native-interp-ast

					#M	median time in ms	time diff %
DeltaBlue		5	50.09	34			
GraphSearch		5	32.28	25			
Json		5	114.52	77			
NBody		5	37.66	21			
PageRank		5	51.94	142			
Richards		5	374.90	62			

micro-startup

Executor: TruffleSOM-native-interp-ast

				median time		time diff %
				#M	in ms	
Bounce		5	61.48	31		
BubbleSort		5	69.00	161		
Dispatch		5	64.02	62		
Fannkuch		5	49.87	124		
Fibonacci		5	80.89	55		
FieldLoop		5	28.53	54		
IntegerLoop		5	41.26	5		
List		5	29.91	118		
Loop		5	220.85	219		
Mandelbrot		5	76.28	201		
Permute		5	94.17	24		
Queens		5	64.69	50		
QuickSort		5	97.02	155		
Recurse		5	70.86	53		
Sieve		5	101.11	205		
Storage		5	57.33	25		
Sum		5	109.92	159		
Test		10	237.39	6		
TestGC		10	113.96	-4		
Towers		5	38.65	32		
TreeSort		5	87.05	120		
WhileLoop		5	107.62	276		

LIBRARY LOWERING
LIBRARY INTRINSIFICATION

Integer class in SOM

```
class Integer {  
  = (argument) primitive  
  < (argument) primitive
```

Built into the
interpreter

```
<>(argument) { return !(this = argument); }  
> (argument) { return (this >= argument).and(() => this <> argument); }  
>=(argument) { return !(this < argument); }  
<=(argument) { return (this < argument).or(() => this = argument); }  
negative() { return this < 0; }
```

```
max(otherInt) {  
  return (this < otherInt).ifTrueElse(otherInt, this);  
}
```

```
min(otherInt) {  
  return (this > otherInt).ifTrueElse(otherInt, this);  
}
```

```
}
```

Normal code, part of
the standard library

Array class in SOM

```
class Array {  
  copy() { return copy(1); }  
  copy(start) { return copy(start, this.length); }  
  copy(start, end) {  
    const result = Array.new(end - start + 1);  
    let i = 1.  
    (start..end).each((e) => {  
      result[i] = e;  
      i += 1;  
    });  
    return result;  
  }  
}
```

Array.copy, conceptually simple, but implemented by naïve library functions

How to get this to be fast?



Implementing Library Methods in the Virtual Machine

```
class Integer {  
  <=(argument) { return (this < argument).or(()) => this = argument); }  
  
  negative() { return this < 0; }  
  
  max(otherInt) {  
    return (this < otherInt).ifTrueElse(otherInt, this);  
  }  
}
```

Standard Library

```
class IntegerPrimitives:  
  def lessThanOrEqual(a: long, b: long):  
    return a <= b  
  
  def negative(a: long):  
    return a < 0  
  
  def max(a: long, b: long):  
    if a < b:  
      return b  
    return a
```

Implementation in VM

- Standard library should be “immutable”
- Changes to standard library won't show effect
- Debuggers and profilers will show unexpected behavior
- Only works for standard library, optimization impact limited

Any drawbacks
of this approach?



Optimistic and Very Aggressive Library Lowering for Array class

```
createSomeArray() { return Array.new(1000, 'fast fast fast'); }
```

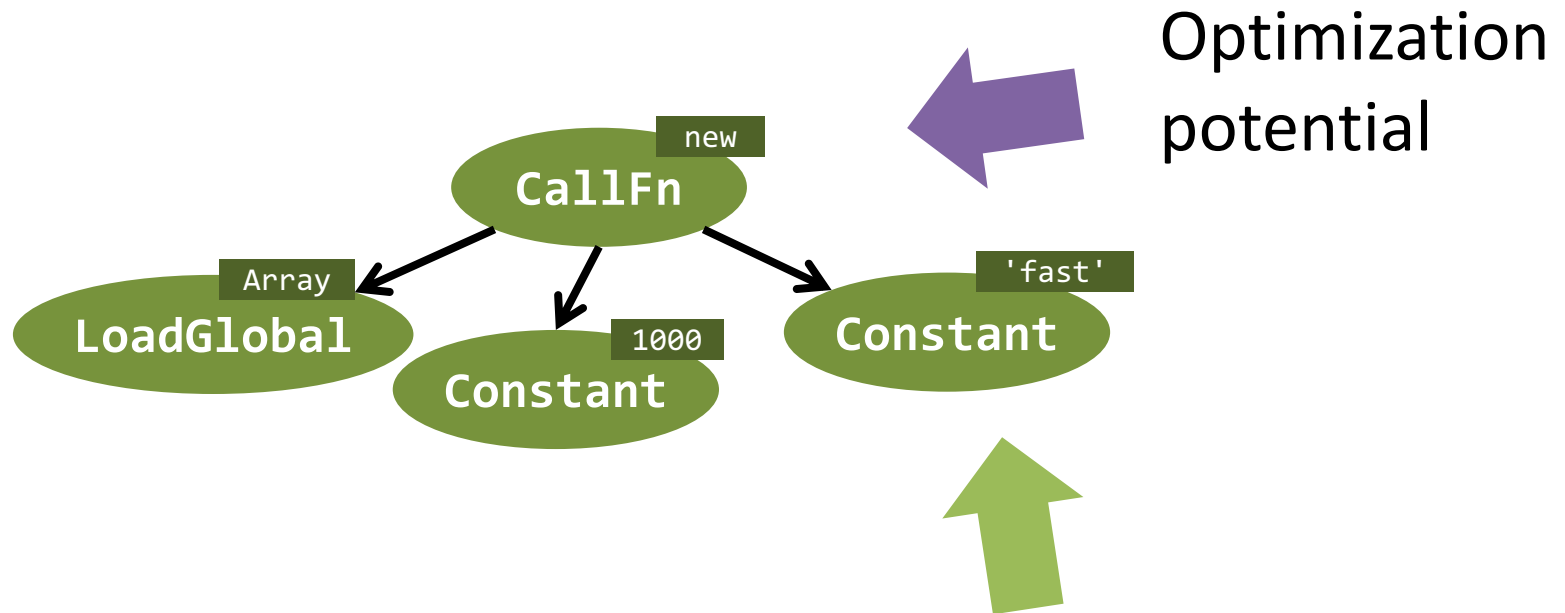
```
class Array {  
  static new(size, lambda) {  
    return new(size).setAll(lambda);  
  }  
  
  setAll(lambda) {  
    forEach((i, v) -> { this[i] = lambda.eval(); });  
  }  
}
```

```
class Object {  
  eval() { return this; }  
}
```

**Some Object-
Oriented Language**

Optimizing for Object Values

```
createSomeArray() { return Array.new(1000, 'fast fast fast'); }
```



Self-optimizing new(size, lambda)

```
createSomeArray() { return Array.new(1000, 'fast fast fast'); }
```

```
def UninitArrNew.execute(frame):
```

```
    size := size_expr.execute(frame)
```

```
    val  := val_expr.execute(frame)
```

```
    return specialize(size, val).
```

```
        execute_evaluated(frame, size, val)
```

```
def UninitArrNew.specialize(size, val):
```

```
    if val instanceof Lambda:
```

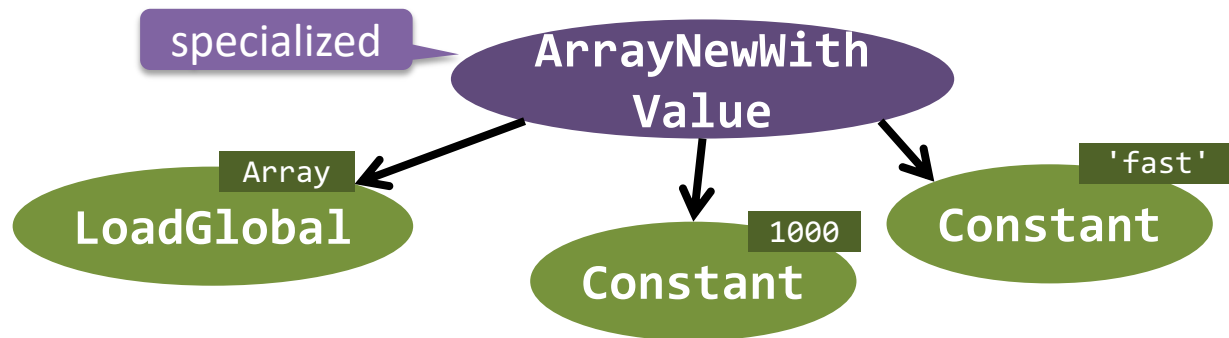
```
        return replace(StdMethodInvocation())
```

```
    else:
```

```
        return replace(ArrNewWithValue())
```

Specialized new(size, lambda)

```
createSomeArray() { return Array.new(1000, 'fast fast fast'); }
```

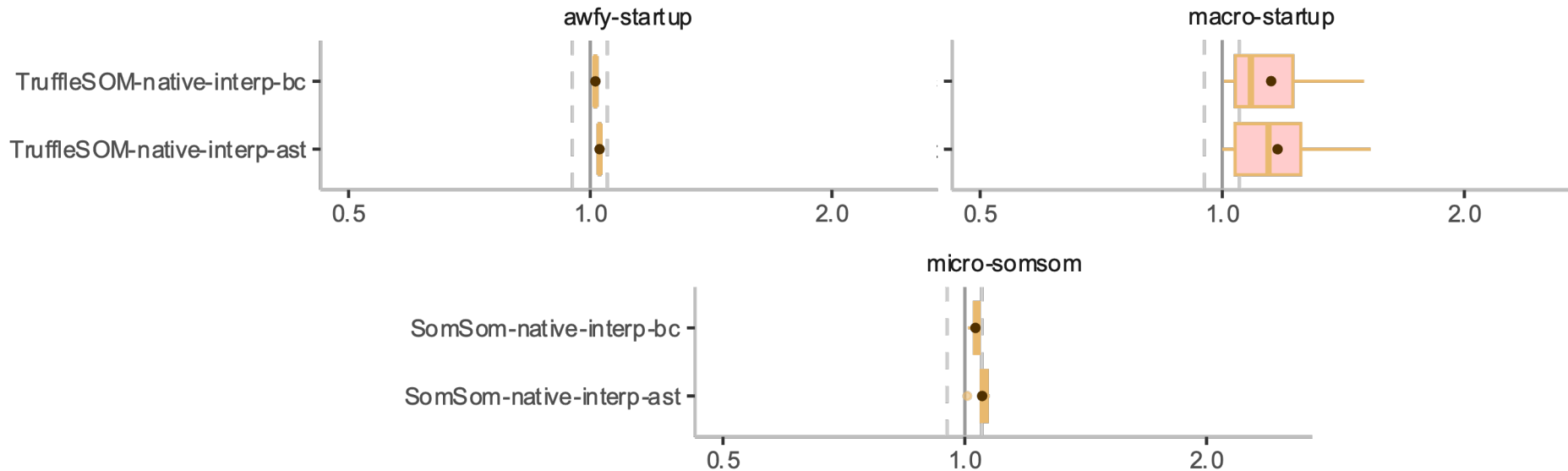


```
def ArrNewWithValue.execute_evaluated(frame, size, val):
```

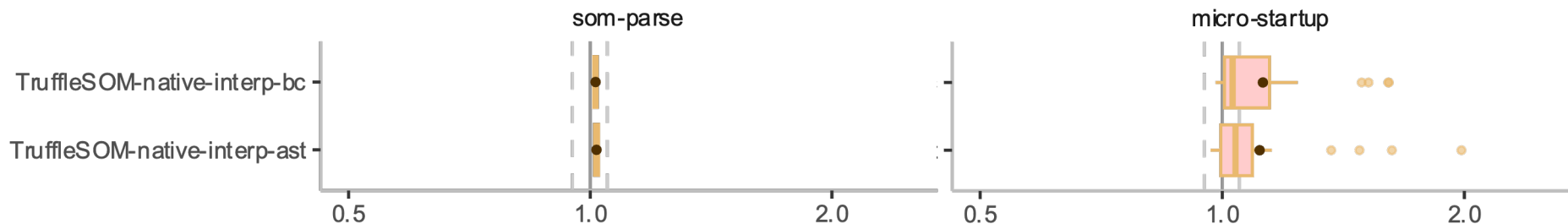
```
    return Array([val] * 1000)
```

1 specialized node vs. 1000x `this[i] = lambda.eval()`
 1000x `eval() { return this; }`

Performance Benefit



Reaching the point where optimizations are very specific.
But still great for some benchmarks!



macro-startup

Executor: TruffleSOM-native-interp-ast

					#M	median time in ms	time diff %
DeltaBlue		5	37.97	3			
GraphSearch		5	32.27	26			
Json		5	98.46	53			
NBody		5	33.10	7			
PageRank		5	26.71	22			
Richards		5	229.73	0			

micro-startup

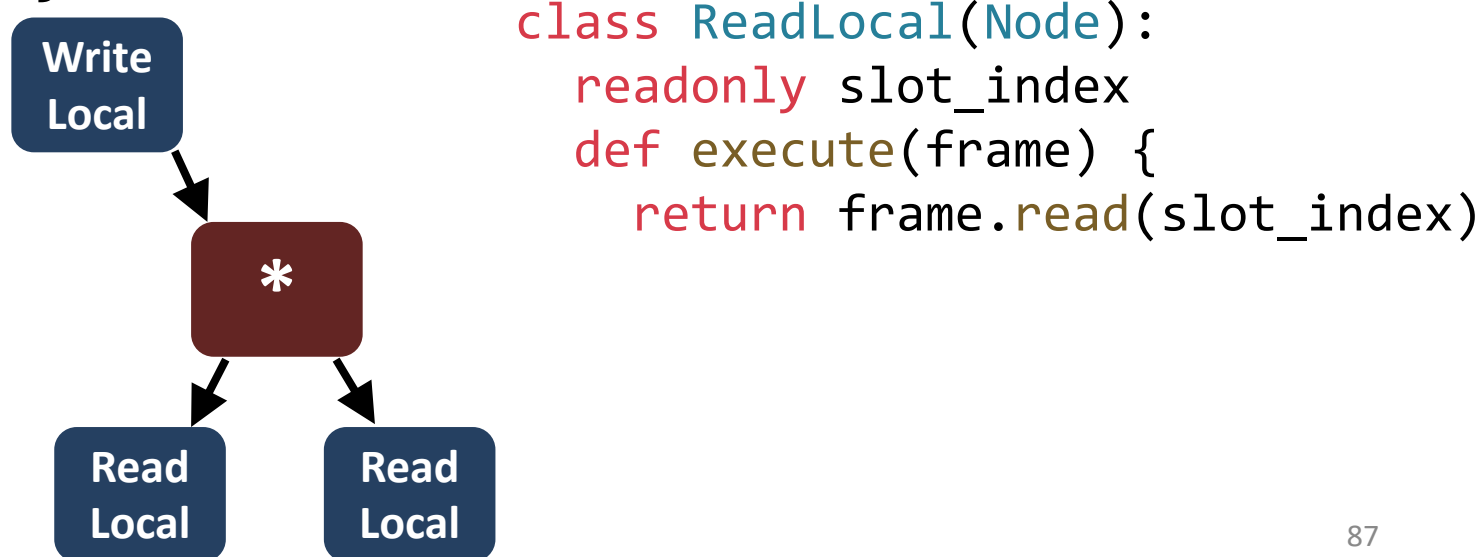
Executor: TruffleSOM-native-interp-ast

					#M	median time in ms	time diff %
Bounce		5	64.21	37			
BubbleSort		5	27.79	5			
Dispatch		5	39.23	-1			
Fannkuch		5	43.95	98			
Fibonacci		5	52.27	0			
FieldLoop		5	18.80	0			
IntegerLoop		5	39.74	-1			
List		5	14.29	4			

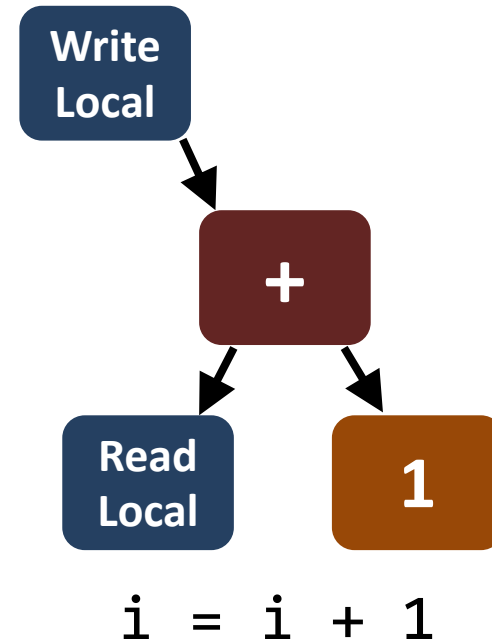
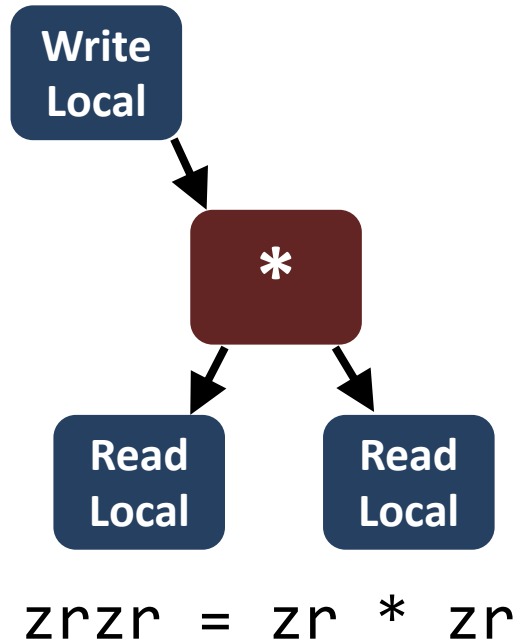
SUPERNODES AND SUPERINSTRUCTIONS

Optimize Code Patterns

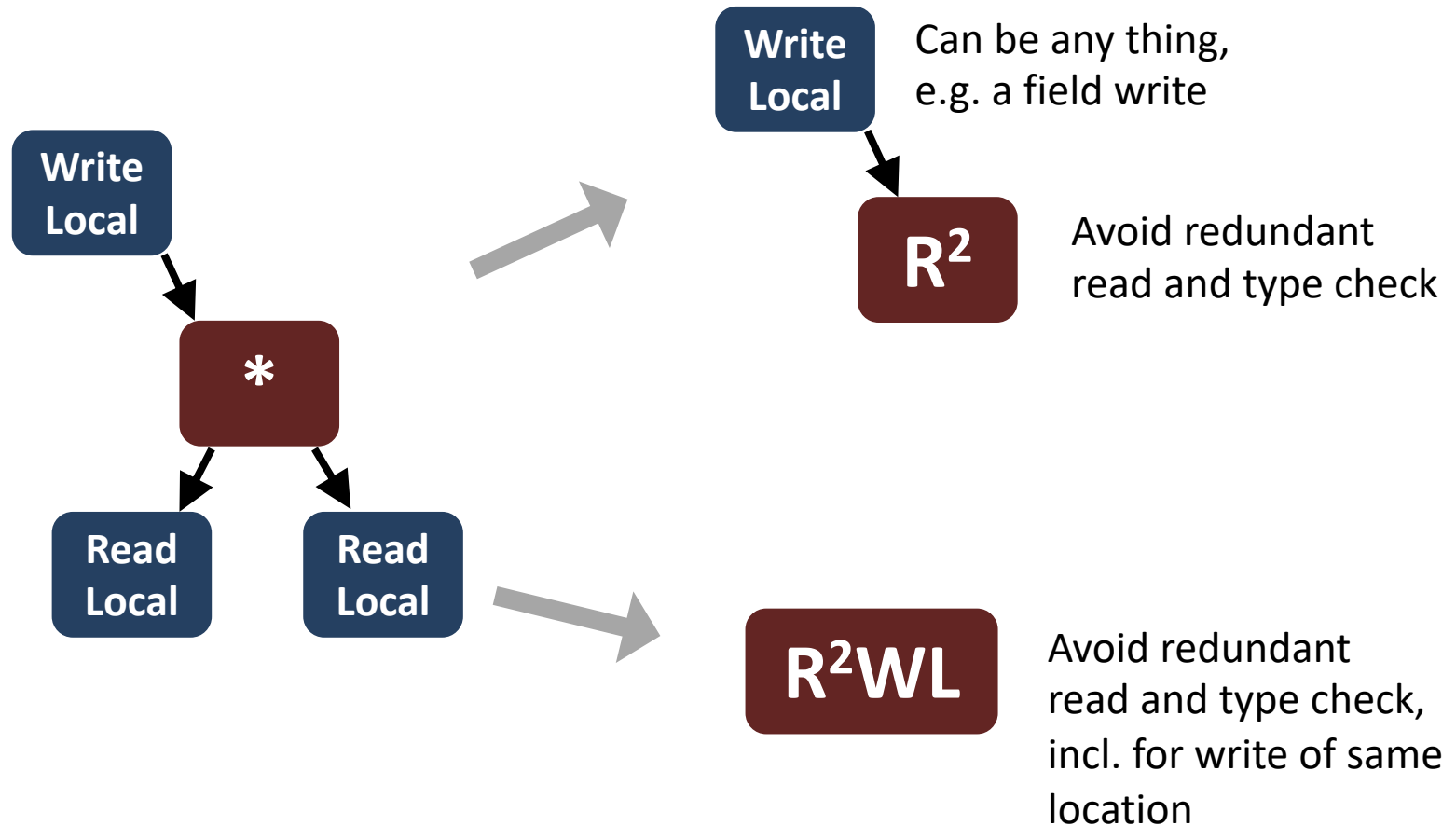
```
function mandelbrot() {  
    let zr = 0.0;  
    // while ... while ...  
    zr * zr;  
    // ...  
}
```



Applies to Various Node Patterns



Create Different Square Super Nodes for Different Situations



18 Super Nodes in Total

Variations of

- Method activation with **this** as argument
 - **this**.method(arg1, arg2)
- Increment/decrement operations
 - var **+=** n
- Compute square
 - var = **d * d**
- String equality with constant
 - var **== 'constant'**

Very “focused” experiment

Results for Super Nodes

	median time in ms	time diff %
DeltaBlue	39.53	-2
GraphSearch	27.48	-3
Json	58.84	-14
NBody	33.62	-5
PageRank	24.94	-11
Richards	250.72	-11

- Optimizing small patterns can give a nice gain
- But not generalizable...

	median time in ms	time diff %
Bounce	47.07	-11
Dispatch	36.34	-19
Fibonacci	49.37	-11
FieldLoop	19.78	-56
Loop	43.69	-56
Mandelbrot	30.52	-26
Permute	77.10	-10
Queens	45.96	-6
QuickSort	41.27	-9
Recurse	43.65	-10
Sieve	34.31	-15
Sum	32.81	-34
Test	184.28	-6
Towers	28.55	-10
WhileLoop	29.98	-29

For Bytecodes: Superinstructions

`i = i + 1`

bytecode to add 1



LoadField `i`
LoadConstant `1`
CallFn `+`
StoreField `i`

bytecode to add 1
to field



LoadField `i`
Inc
StoreField `i`

IncField `i`

Research and Literature

- **Optimizing an ANSI C interpreter with superoperators**
Proebsting, T. A. (1995). *POPL'95*
- **Combining Stack Caching with Dynamic Superinstructions**
Ertl, M. A. & Gregg, D. (2004). *IVME'04*
- **Optimizing Indirect Branch Prediction Accuracy in Virtual Machine Interpreters.**
Casey, K., Ertl, M. A. & Gregg, D. (2007). *TOPLAS'07*
- **Less Is More: Merging AST Nodes To Optimize Interpreters.**
Larose, O., and Kaleba, S. & Marr, S. (2022). *MoreVMs'23*



Dynamic Languages

cnt + 1

ECMAScript Specification Sec. 11.6.1

```
left = ToPrimitive(GetValue(cnt))
```

```
right = ToPrimitive(GetValue(1))
```

```
if (IsString(left) || IsString(right)) {  
    return ToString(left).concat(ToString(right))  
}
```

```
return ToNumber(left) + ToNumber(right)
```



Dynamic Languages

cnt + 1

ECMAScript Specification Sec. 11.6.1

```
left = ToPrimitive(GetValue(cnt))  
right = ToPrimitive(GetValue(1))
```

```
if (IsString(left) || IsString(right)) {  
    return ToString(left).concat  
}
```

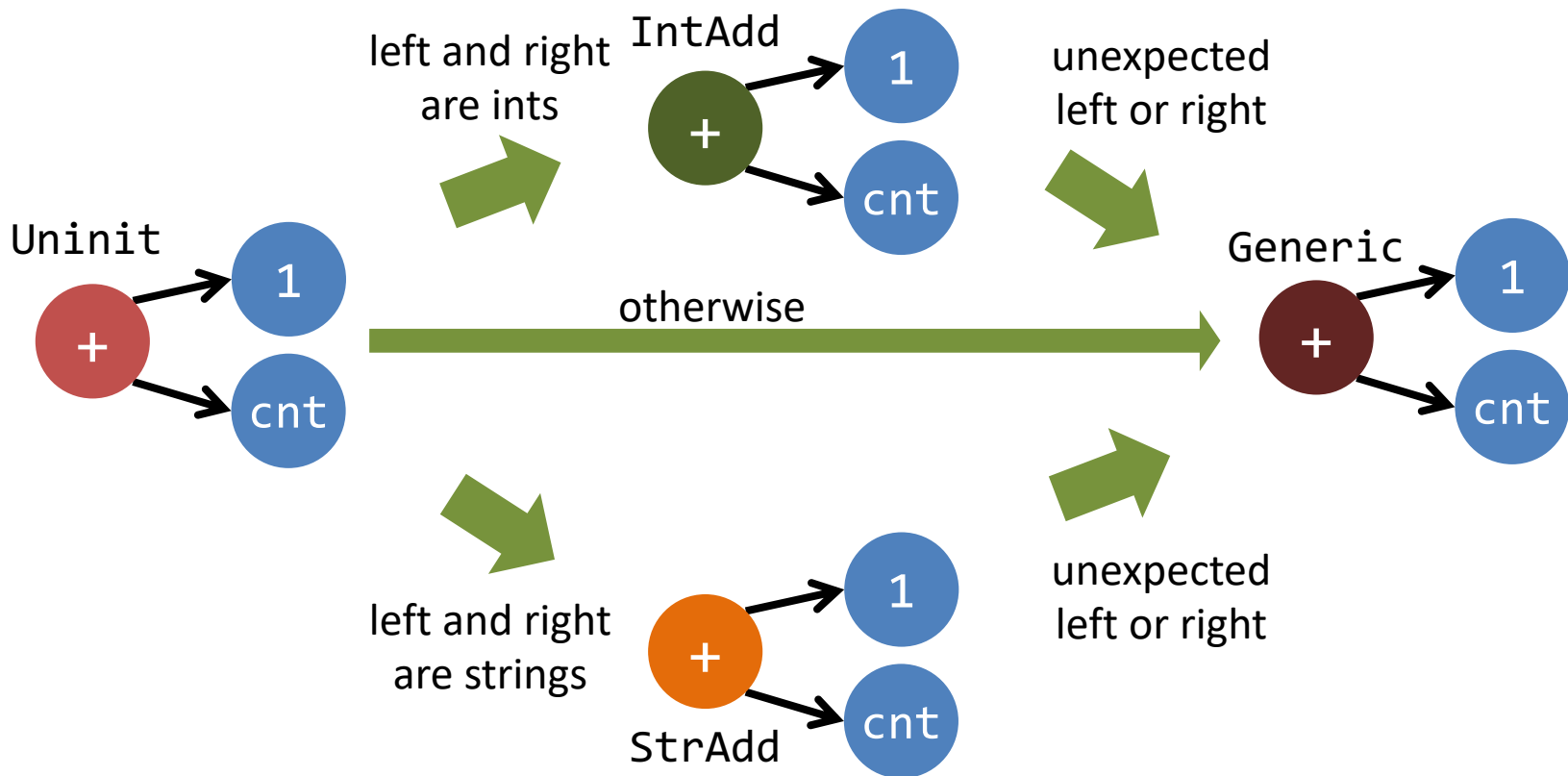
Could we optimize this somehow?

```
return ToNumber(left) + ToNum
```



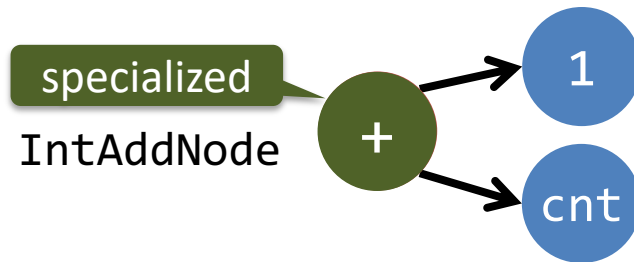
SPECULATIVE OPTIMIZATION

Self Optimization and Speculation



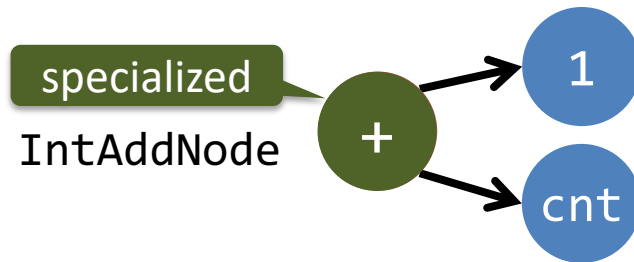
observe run-time value
select optimization of first execution

Self Optimization and Speculation



```
class UninitAdditionNode(BinaryNode):
def execute(frame):
    lVal = left.execute(frame)
    rVal = right.execute(frame)
    if type(lVal) == int and type(rVal) == int:
        return replace(IntAddNode(self)).
            execute_evaluate(lVal, rVal)
```

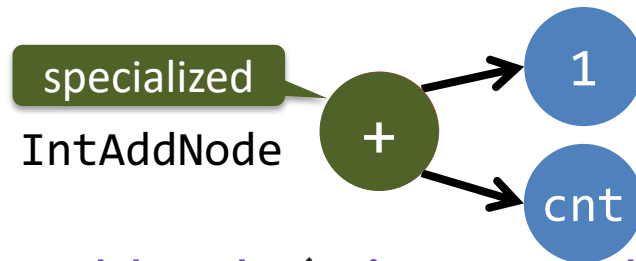
Self Optimization and Speculation



```
class IntAddNode(BinaryNode):
    def execute(frame):
        lVal = left.execute(frame)
        rVal = right.execute(frame)
        if type(lVal) == int and type(rVal) == int:
            return lVal + rVal
        else:
            return deoptimize(lVal,
```

Simplified Version

Self Optimization and Speculation



```
class IntAddNode(BinaryNode):  
    def execute(frame):
```

```
        try:
```

```
            lVal = left.execute_int(frame)
```

```
        except UnexpectedResult, exp:
```

```
            return deoptimize(exp)
```

```
        try:
```

```
            rVal = right.execute_int(frame)
```

```
        except UnexpectedResult,
```

```
            return deoptimize(lVal
```

```
        return lVal + rVal
```

**Check moved down
tree, and potentially
eliminated**

Bytecode Quickening

`i = i + 1`

run with `i` being an int



```
LoadField    i
LoadConstant 1
IntInc
StoreField   i
```

run with `i` being a str



```
LoadField    i
LoadConstant 1
CallFn       +
StoreField   i
```

```
LoadField    i
LoadConstant 1
StrAdd
StoreField   i
```

Rewriting constrained by
bytecode format!
And the linear format!

Some Possible Self-Optimizations

- Type profiling and specialization
 $\text{cnt} + 1$
- Lookup caching
- Value caching
- Operation inlining
- Library Lowering



Summary

Self Optimization

- For AST interpreters
- Specialize nodes
 - Fast run-time check
 - Avoid complex general case
 - A *local* optimization
- Uses deoptimization to fall back to general case

Speculation

- Assume future behavior is same as past behavior
- Requires fallback strategy (deoptimization)
- Used with self optimization, quickening, and JIT compilation

Research and Literature

- **AST interpreters**
 - **Self-Optimizing AST Interpreters**
Würthinger, T., Wöß, A., Stadler, L., Duboscq, G., Simon, D. & Wimmer, C. (2012). *DLS'12*
- **Bytecode interpreters**
 - **Efficient Interpretation Using Quickening**
Brunthaler, S. (2010). *DLS'10*
 - **Optimizing Indirect Branch Prediction Accuracy in Virtual Machine Interpreters**
Casey, K., Ertl, M. A. & Gregg, D. (2007). *ACM Trans. Program. Lang. Syst.*, 29, 37.
 - **Multi-Level Quickening: Ten Years Later.**
Brunthaler, S. (2021)
arXiv:2109.02958v1
- **JIT compilers, deoptimization**
 - **An Efficient Implementation of SELF a Dynamically-Typed Object-Oriented Language Based on Prototypes.**
Chambers, C., Ungar, D. & Lee, E. (1989). *OOPSLA'89*



AST versus Bytecode



Which one is faster?



Abstract Syntax Tree
Interpreters



Which one is faster?



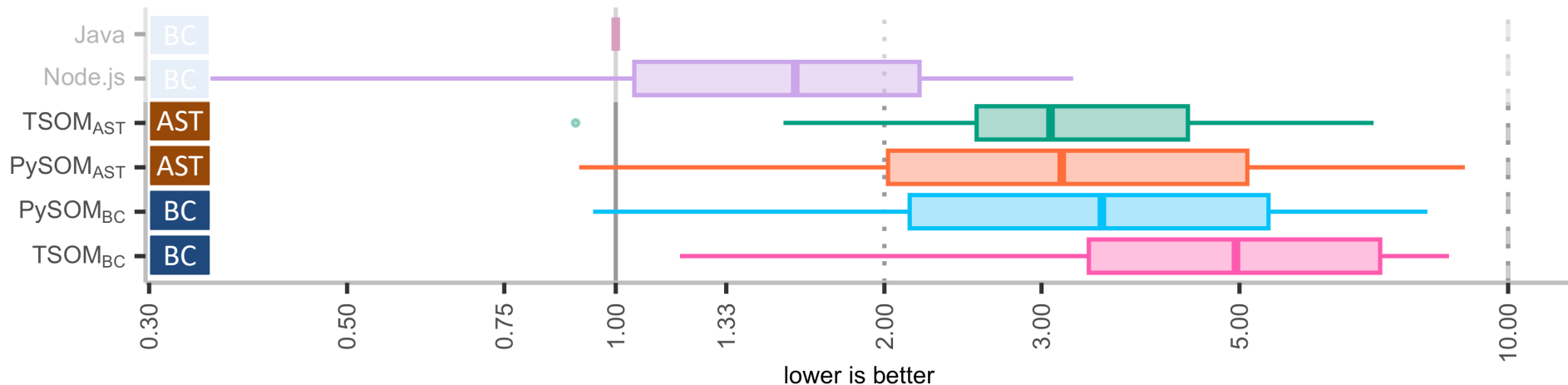
Bytecode
Interpreters

Disclaimer!

Through the lens of Meta-compilation Systems
Graal+Truffle and RPython



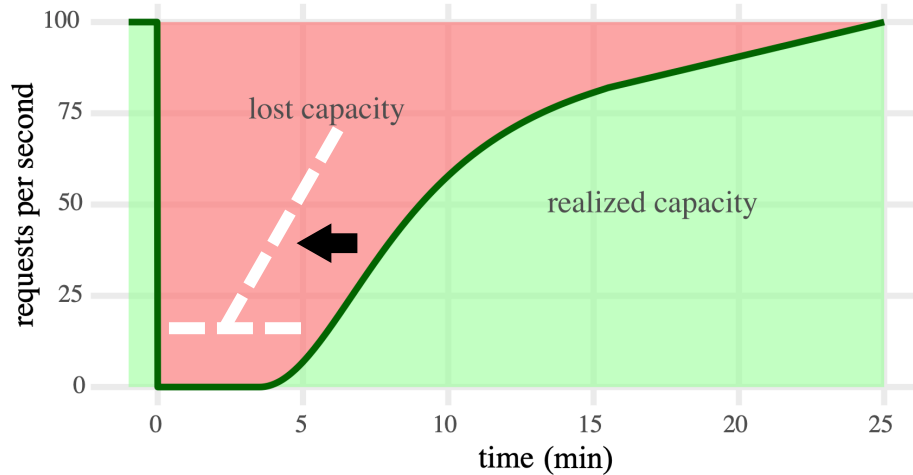
AST vs Bytecode Interpreters for Metacompilation Systems



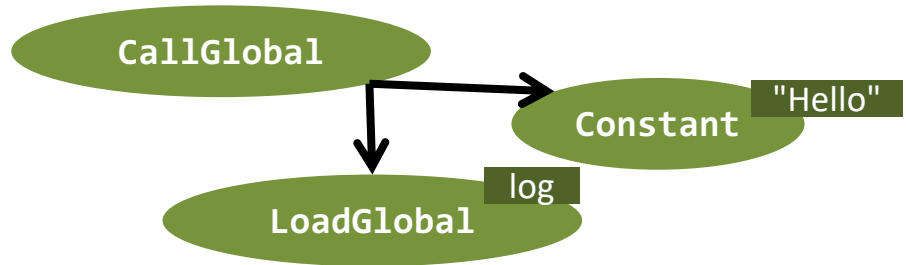
AST interpreters can be surprisingly fast!
Though, bytecodes are much more compact in memory.

WARP UP

Interpreter performance is critical
for overall performance

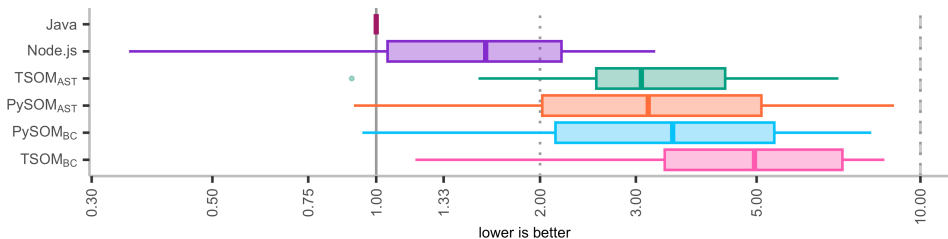


Most are AST or Bytecode Interpreters



LoadGlobal "log"
LoadConstant "Hello"
CallFn

Can reach similar performance
(in metacompilation systems)



AST vs. Bytecode: Interpreters in the Age of Meta-Compilation.
O. Larose, S. Kaleba, H. Burchell, S. Marr. OOPSLA'23. to appear
<https://stefan-marr.de/downloads/oopsla23-larose-et-al-ast-vs-bytecode-interpreters-in-the-age-of-meta-compilation.pdf>

Lookup Caching is Generic, and Highly Effective

`w` fitsInto(width)
function

Inlining also effective,
but gets complicated quickly

Library Lowering/Intrinsification,
Supernodes/instructions,
... get more and more specific
Should be driven by need!