



FastR

R on the JVM with the FastR Runtime

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October 26, 2015



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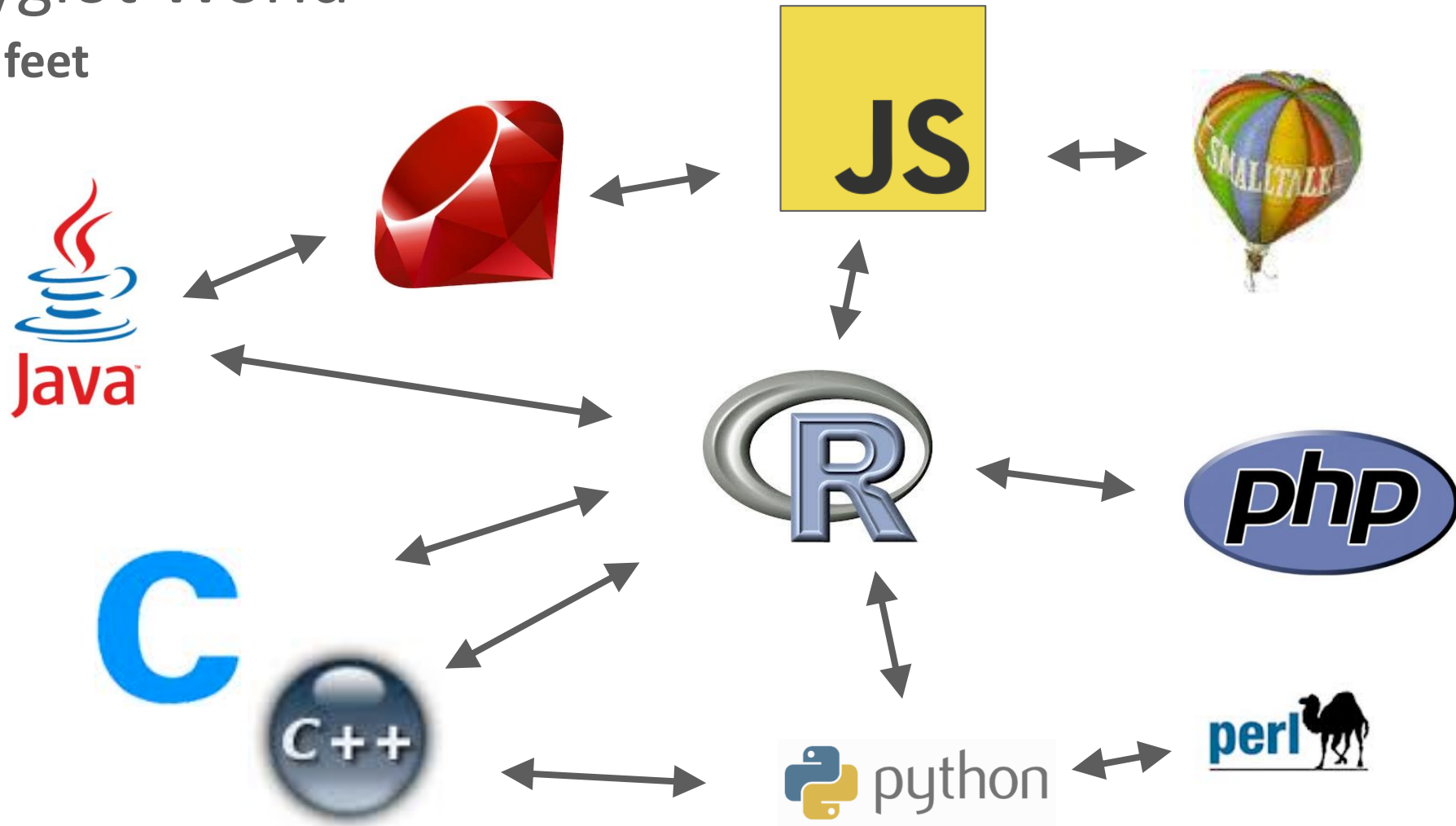
„The Polyglot World“

From 30,000 feet



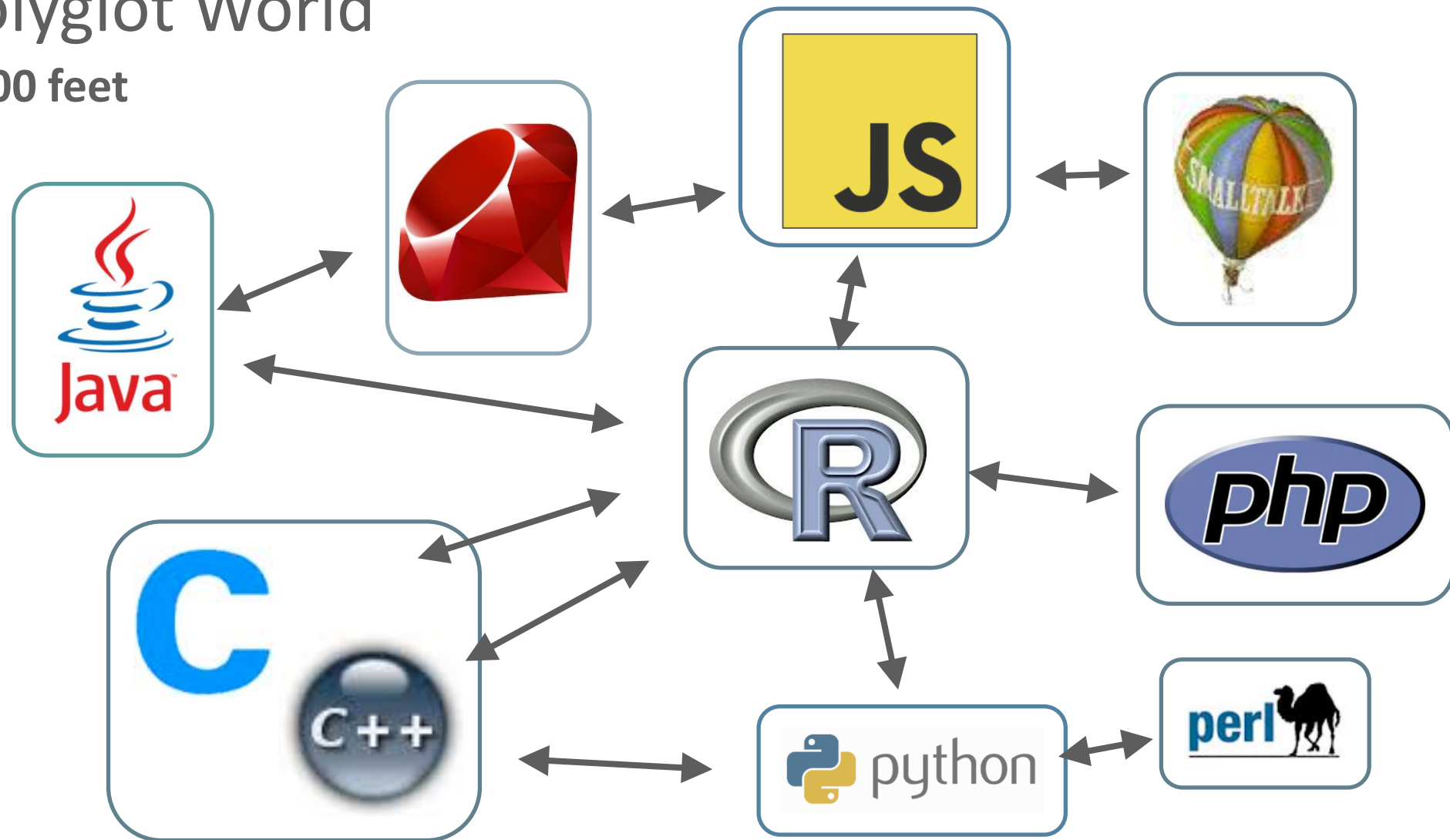
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From 20,000 feet



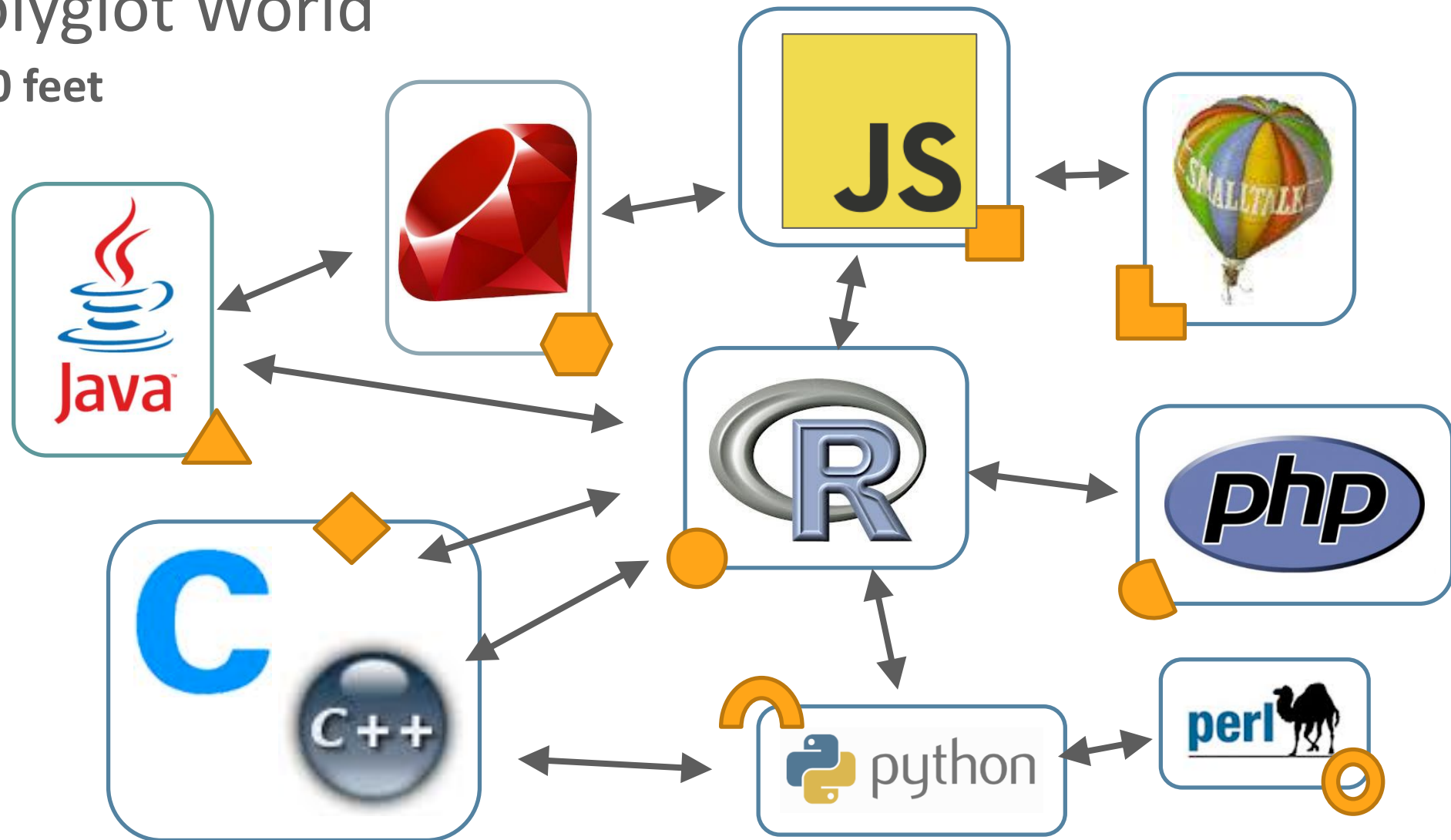
„The Polyglot World“

From 10,000 feet



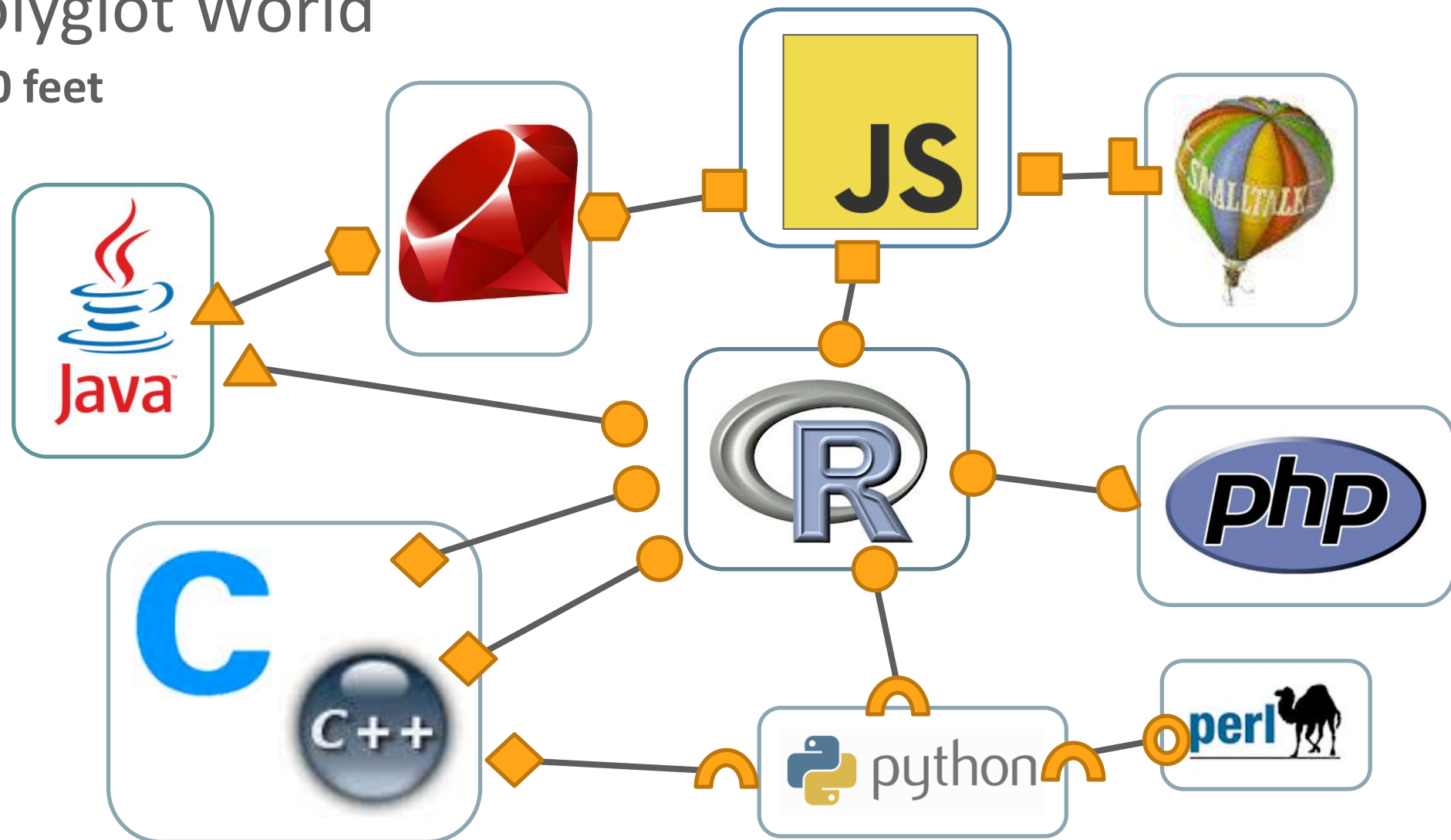
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From 1,000 feet



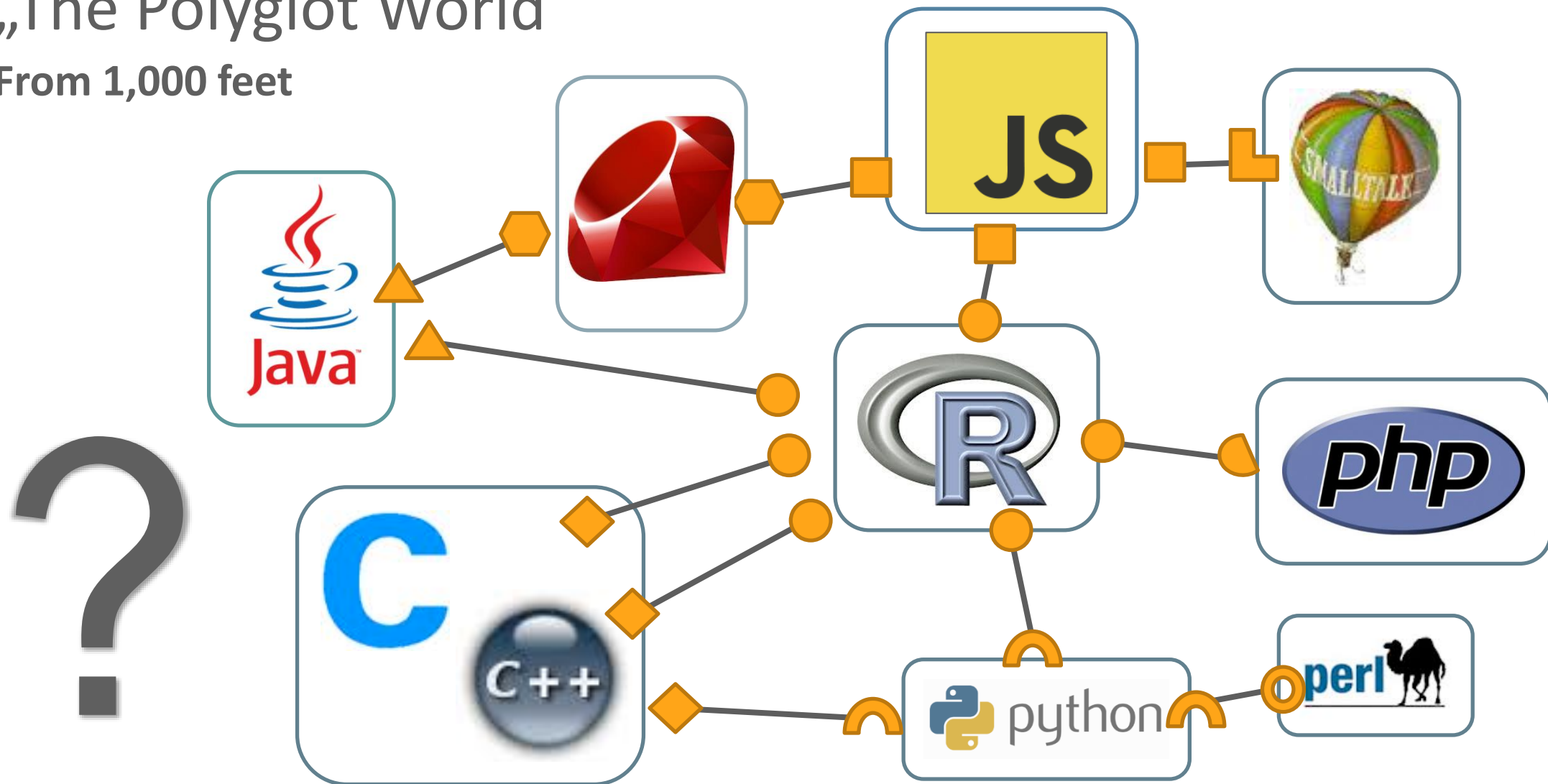
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From 1,000 feet

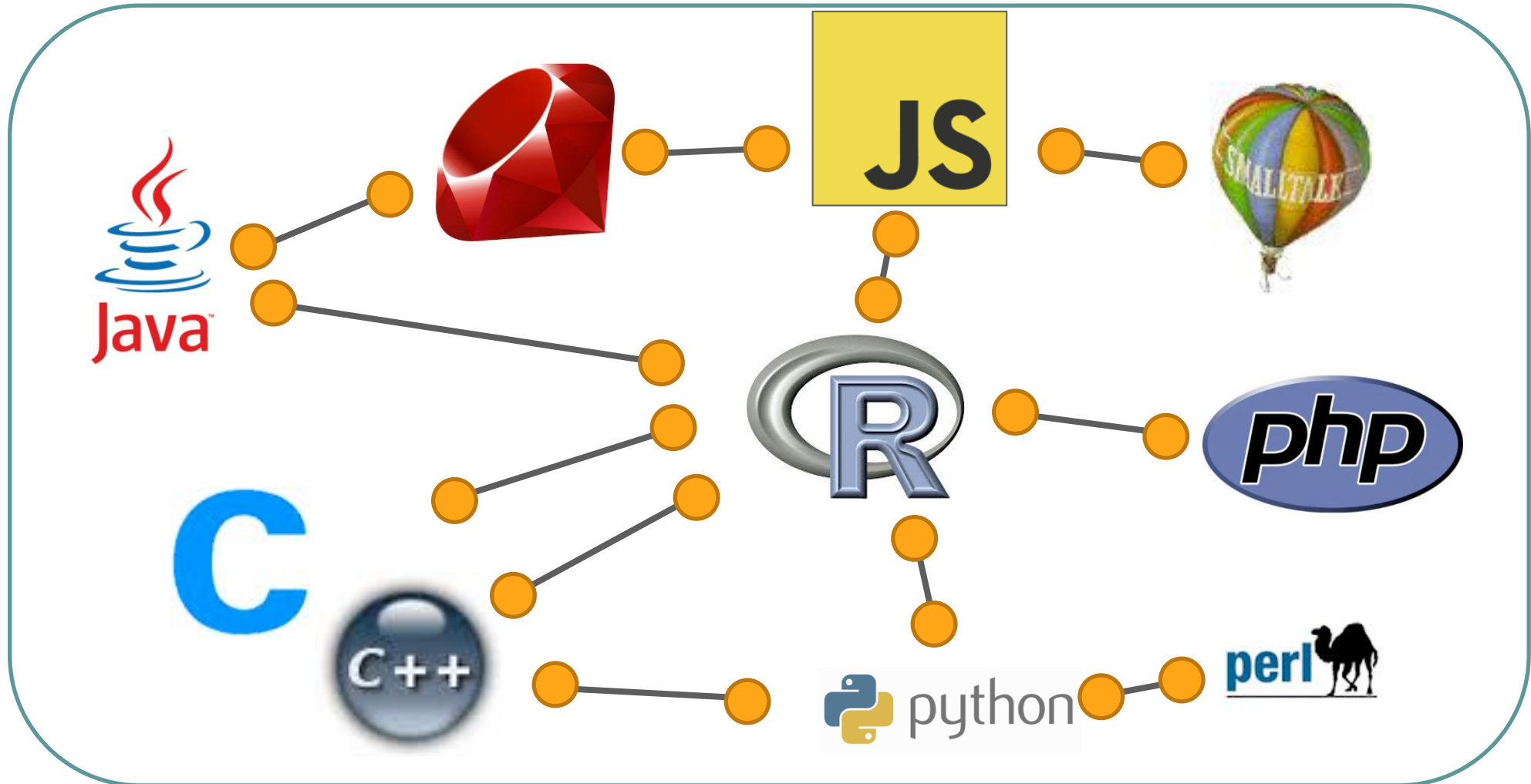


„The Polyglot World“

From 1,000 feet



„The Polyglot World“



The R Language for Statistical Computing

An important citizen of the polyglot world.

The R Language

- Powerful vector operations

```
v <- 3  
[1] 3
```

```
v <- 1:4  
[1] 1 2 3 4
```

```
v <- matrix(1:4, nrow=2, ncol=2)
```

```
v <- 1:8; dim(v) <- c(2,2,2)
```

```
v <- cos(v) * v / log(v)
```

The R Language

- Powerful vector operations

`v[3]`

`v[3:6]`

`v[c(1, 3, 8)]`

`v[c(-3, -2)]`

`v[v > 4]`

`v[1, 2, ..]`

The R Language

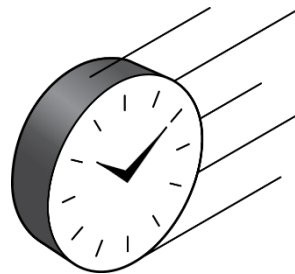
- Dynamic lookup for every operation (even "+", "[", etc.)

```
> `+` <- function(a, b) {a - b}  
> 1 + 1  
[1] 0
```

```
> `( ` <- function(a) {a + 1}  
> ((1))  
[1] 3
```

Why R?

- Ease of use
 - Readily available
 - High level of abstraction
 - Lots of builtin functionality
 - Data types for statistics
 - Ease access to data in files
 - General-purpose language
- Interactive, agile system
 - Data exploration and manipulation
 - Graphics abilities
 - Integration with data representation technologies (web servers, typesetting systems, ...)
- Large ecosystem
 - Large corpus of third-party packages (CRAN: 6000, bioconductor: 1000, ...)
 - Covers many areas of data science: statistics, machine learning, bioinformatics, health sciences, geospatial, ...



The R Language – code puzzle

```
a <- 0;
foo <- function(b) {
  a <- 42
  b
}
bar <- function(b) {
  a <- 0
  b + a
}
bar(foo(0))
=> [1] 42
```

- Lazy evaluation of arguments (“promises”) + side effects!

What's wrong with R?

- Centered around GNUR
 - Complex and asymmetrical language features
 - Lack of specification
 - Lack of tests for language
 - Tricky licensing situation causes lack of diversity
- Poor performance (except for vector operations)
 - Encourages expressing simple operations in complex ways (convoluted matrix operations, etc.)
 - Encourages unnecessary porting of R code to C/C++/Fortran/... for performance reasons
 - Single-threaded execution (high overhead for parallel execution)
- Monolithic, standalone runtime
 - Integration with other systems either limits functionality or incurs communication overhead
 - No tight integration with RDBMS (because of security and licensing)

The FastR project

- An Oracle Labs Open Source R implementation based on the Graal technology stack.

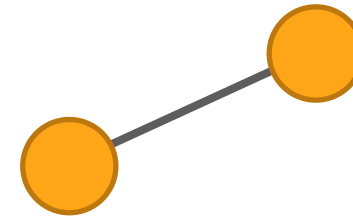
<https://bitbucket.org/allr/fastr>



Compatible with
GNUR



High Performance
„FastR“



A member of the
polyglot world

Compatibility Status

- Lack of specification
 - Extensive test suite: 10k tests (80% pass)
 - Approx. 4k auto-generated (“testr” project, Roman Tsegelskyi, Purdue)
 - Expected test results not derived from specification, but from GNU-R execution
- Extensive set of builtins
 - Significant subset implemented (as required by benchmarks, test applications, etc.)
- Complex and “disruptive” language features
 - Promises, deparsing, error handling, visibility, ...
 - Close to complete support - shows viability of the approach



Performance – Removing Abstractions

```
function(a)
  (((a+7)*3+5)*2+1)*8)+6
```

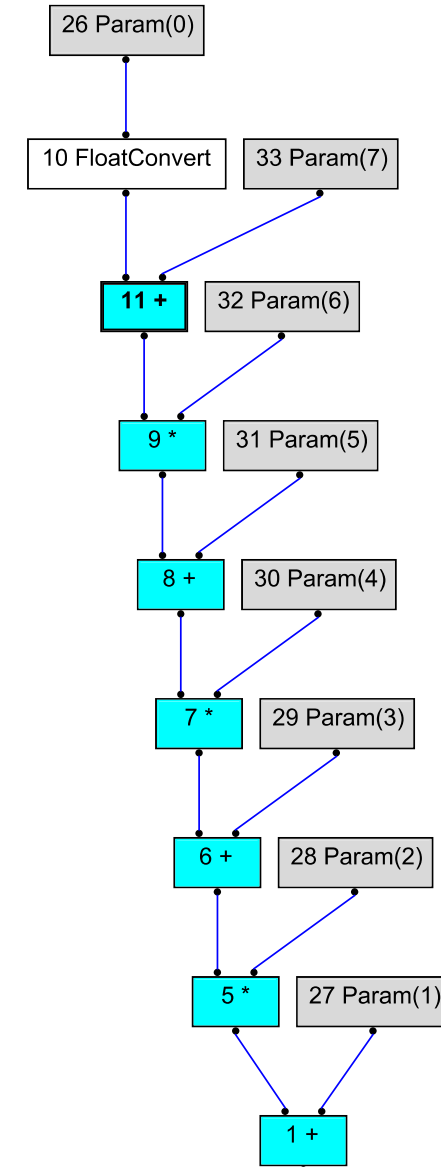
- Usually: arithmetic operations, but:
 - Do „+“ and „*“ resolve to the arithmetic builtins? (completely dynamic lookup)
 - Class of „a“?
 - Do „+.class“ and „*.class“ exist?
 - Type of „a“?
 - Any method can be added/removed/changed at the point where „a“ is evaluated (lazy promise)
 - Intermediate results needed?
- VM needs to remove all these abstractions

Performance – Removing Abstractions

```
function(a)
  ((( (a+7) *3+5) *2+1) *8)+6
```



A long way



Performance Expectations

- No speedup on code calling C libraries:

```
qra <- qr(a, tol = 1e-7)
c <- qr.coef(qra, b)
```



- 2-5x speedup on vector code:

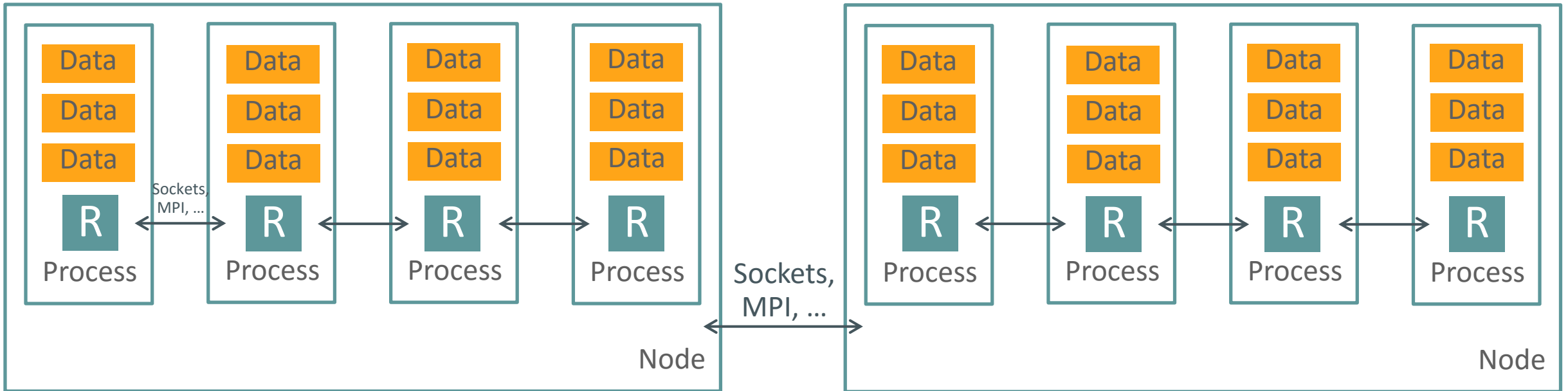
```
a <- floor(runif(10000)*1000)
b <- (phi^a - (-phi)^(-a))/sqrt(5)
```

- 50x speedup on loops and scalar code:

```
for (j in 1:input_size) {
  for (k in 1:input_size) {
    b[k,j] <- abs(j - k) + 1
  }
}
```

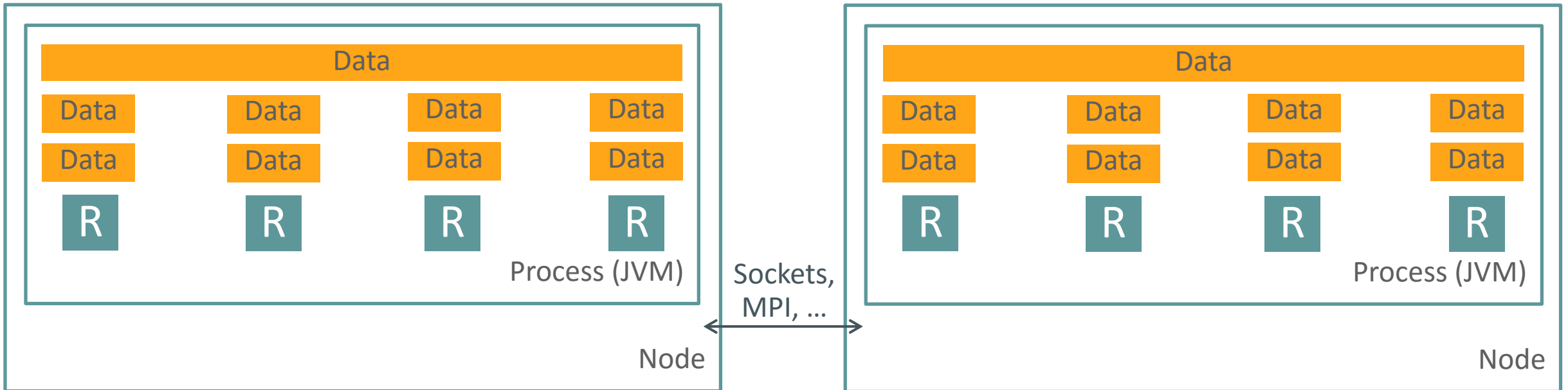

Performance - Parallelization

“Traditional” R-style parallelism



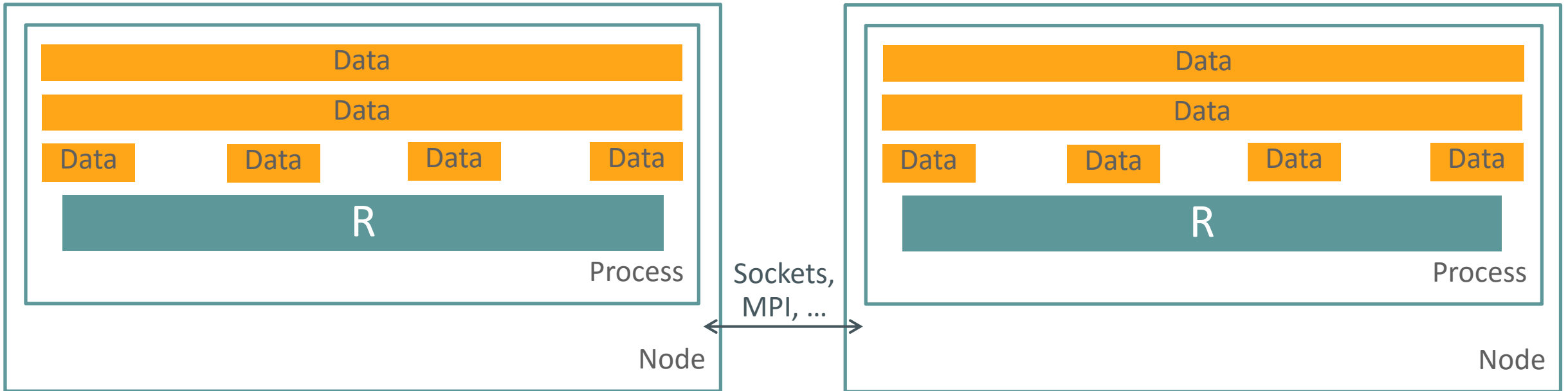
Performance - Parallelization

Simulated R-style parallelism

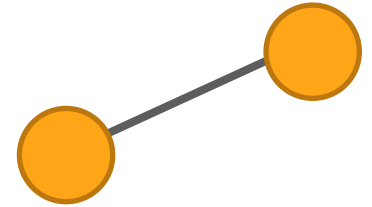


Performance - Parallelization

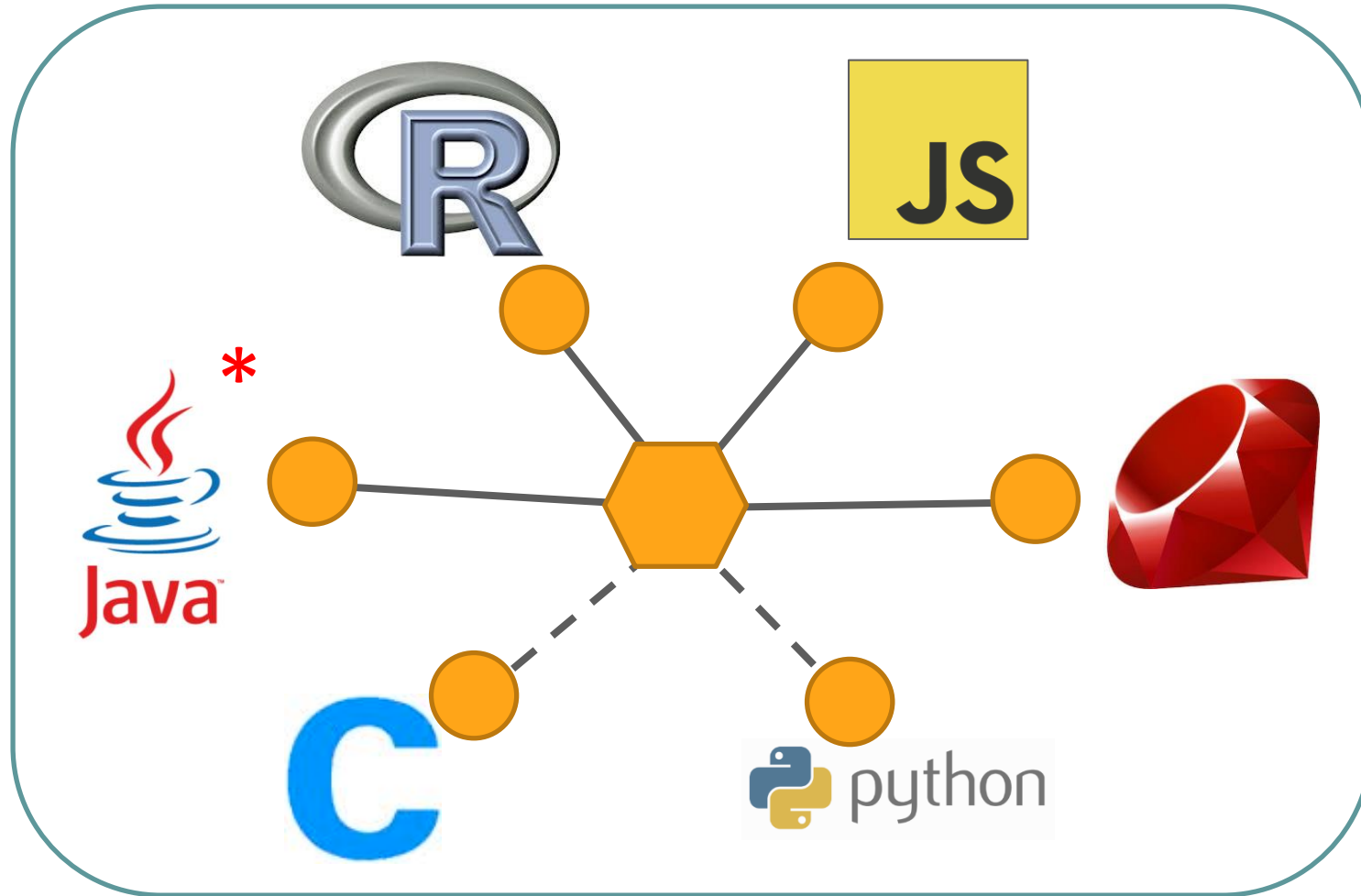
Custom parallelization APIs, automatic parallelization



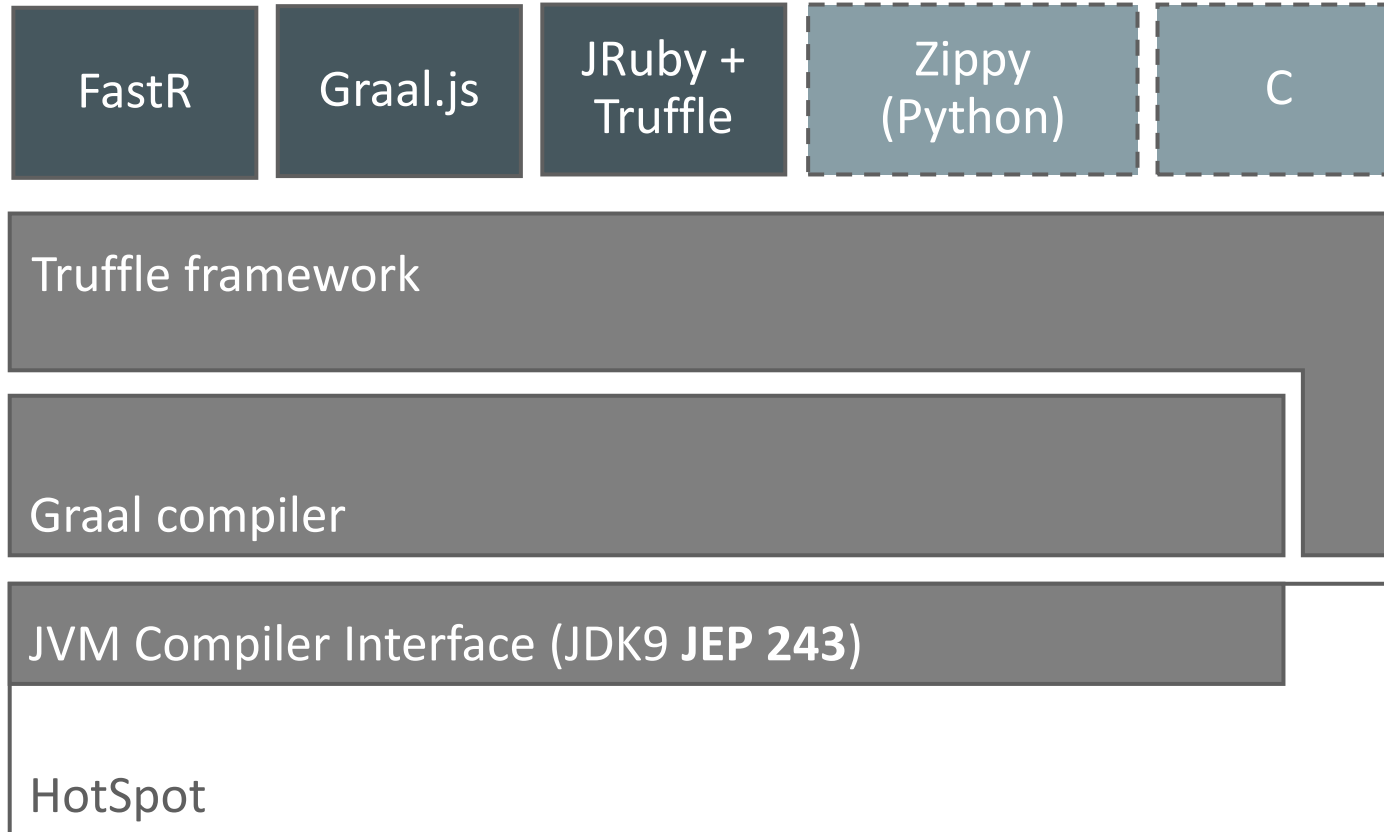
„The Polyglot World“



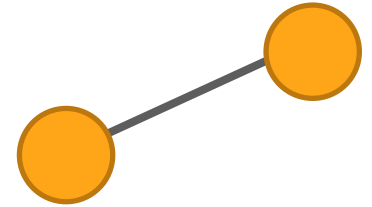
„The Polyglot Graal World“



The Polyglot Graal Technology Stack



FastR – as a member of the polyglot **Graal** world



- FastR is implemented as Graal language
=> AST Interpreter instead of dynamic bytecode generation.
- Graal enables Java-like performance for dynamic languages
- Optimizations across language boundaries
- Reuses customizable Truffle components (e.g. Object model)
- Tools built for Graal ecosystem can be used for all languages.

GraalVM - Early Access

- **Download it on Oracle Technology network!**
 - <http://goo.gl/Cptlpf>
 - Or goto OTN and search for “graalvm”
- JDK 8 with JVMCI + Graal + JavaScript + Ruby + FastR
- Disclaimer: FastR and Language Interopability are still experimental

Demo

The FastR Team



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Acknowledgements

Oracle Labs

Danilo Ansaloni
Stefan Anzinger
Daniele Bonetta
Matthias Brantner
Laurent Daynès
Gilles Duboscq
Michael Haupt
Christian Humer
Mick Jordan
Peter Kessler
Hyunjin Lee
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More on FastR and Graal

- Visit us at the Geek Bar for more information
- Chris Seaton's talk on Ruby on top of Graal.
 - Same Room Wednesday 15:00 – 16:00
- Download GraalVM @ OTN
 - <http://goo.gl/Cptlpf>
- We are interested in user stories/cases!
- Contact: christian.humer@oracle.com

