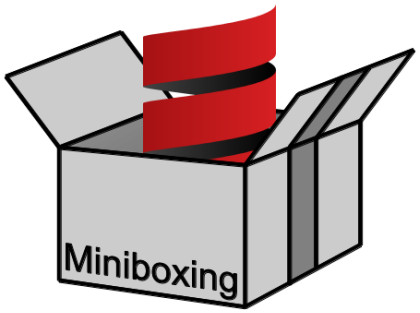

Miniboxing

Load-time Specialization on the JVM

OOPSLA, 29th of October 2013

Vlad Ureche
Cristian Talau
Martin Odersky

EPFL

We all like generics

We all like generics

a trivial example

We all like generics

a trivial example

```
def identity[T](t: T): T = t
```

We all like generics

a trivial example

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- will take any type and
- will return **that same type**

We all like generics

a trivial example

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def identity[T](t: T): T = t
```

but under **erasure:**

```
def identity(t: Any): Any = t
```

We all like generics

a trivial example

```
def identity[T](t: T): T = t
```

but under **erasure:**

Any is the top of the Scala type system

```
def identity(t: Any): Any = t
```

We all like generics

a trivial example

```
x = identity(3)
```

We all like generics

a trivial example

```
x = identity(3)
```

under **erasure:**

```
x = unbox(identity(box(3)))
```

We all like generics

but under **erasure**

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generics execute similarly to **dynamic languages**

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but under **erasure**

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- generic values **lose** their **type information**

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Dynamic language VMs use **specialization** to improve performance*

We all like generics

but under **erasure**

generics execute similarly to **dynamic languages**

- generic values **lose** their **type information**
- primitives need **boxing**
- performance is **affected**

Dynamic language VMs use **specialization** to improve performance*

*but the HotSpot JVM **doesn't**

Generics

Specialization

Miniboxing

Performance

Evaluation

WE ARE HERE

Scala has a solution

Scala has a solution

it's called specialization*

* Iulian Dragos – PhD thesis, EPFL, 2010

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Compile-time (static) transformation

- **duplicates** the original code
- **adapts it** for each primitive type
- **rewrites** programs to use the adapted code

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Compile-time (static) transformation

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Adapted code doesn't need to box

Performance is regained.

Specialization

let's revisit `def identity`

Specialization

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```
def identity[T](t: T): T = t
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Specialization

let's revisit `def identity`

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def identity[T](t: T): T = t
```

```
def identity_V(t: Unit): Unit = t
def identity_Z(t: Boolean): Boolean = t
def identity_B(t: Byte): Byte = t
def identity_C(t: Char): Char = t
def identity_S(t: Short): Short = t
def identity_I(t: Int): Int = t
def identity_J(t: Long): Long = t
def identity_F(t: Float): Float = t
def identity_D(t: Double): Double = t
```

Specialization

let's revisit `def identity`

```
def identity[T](t: T): T = t
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```
def identity_V(t: Unit): Unit = t
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def identity_I(t: Int): Int = t
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def identity_F(t: Float): Float = t
def identity_D(t: Double): Double = t
```

Generates 10 times the original code

Specialization

… it gets even worse

Specialization

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```
def pack[T1, T2](t1: T1, t2: T2) = ...
```

Specialization

… it gets even worse

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def pack[T1, T2](t1: T1, t2: T2) = ...
```

```
def pack_VV(t1: Unit, t2: Unit)
def pack_VZ(t1: Unit, t2: Boolean)
def pack_VB(t1: Unit, t2: Byte)
def pack_VC(t1: Unit, t2: Char)
def pack_VS(t1: Unit, t2: Short)
def pack_VI(t1: Unit, t2: Int)
def pack_VJ(t1: Unit, t2: Long)
def pack_VF(t1: Unit, t2: Float)
def pack_VD(t1: Unit, t2: Double)
```

Specialization

… it gets even worse

```
def pack[T1, T2](t1: T1, t2: T2) = ...
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```
def pack_VV(t1: Unit, t2: Unit)
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```

10^n, where n is the number of type params

Specialization

… it gets even worse

```
def pack[T1, T2](t1: T1, t2: T2) = ...
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def pack_VV(t1: Unit, t2: Unit)
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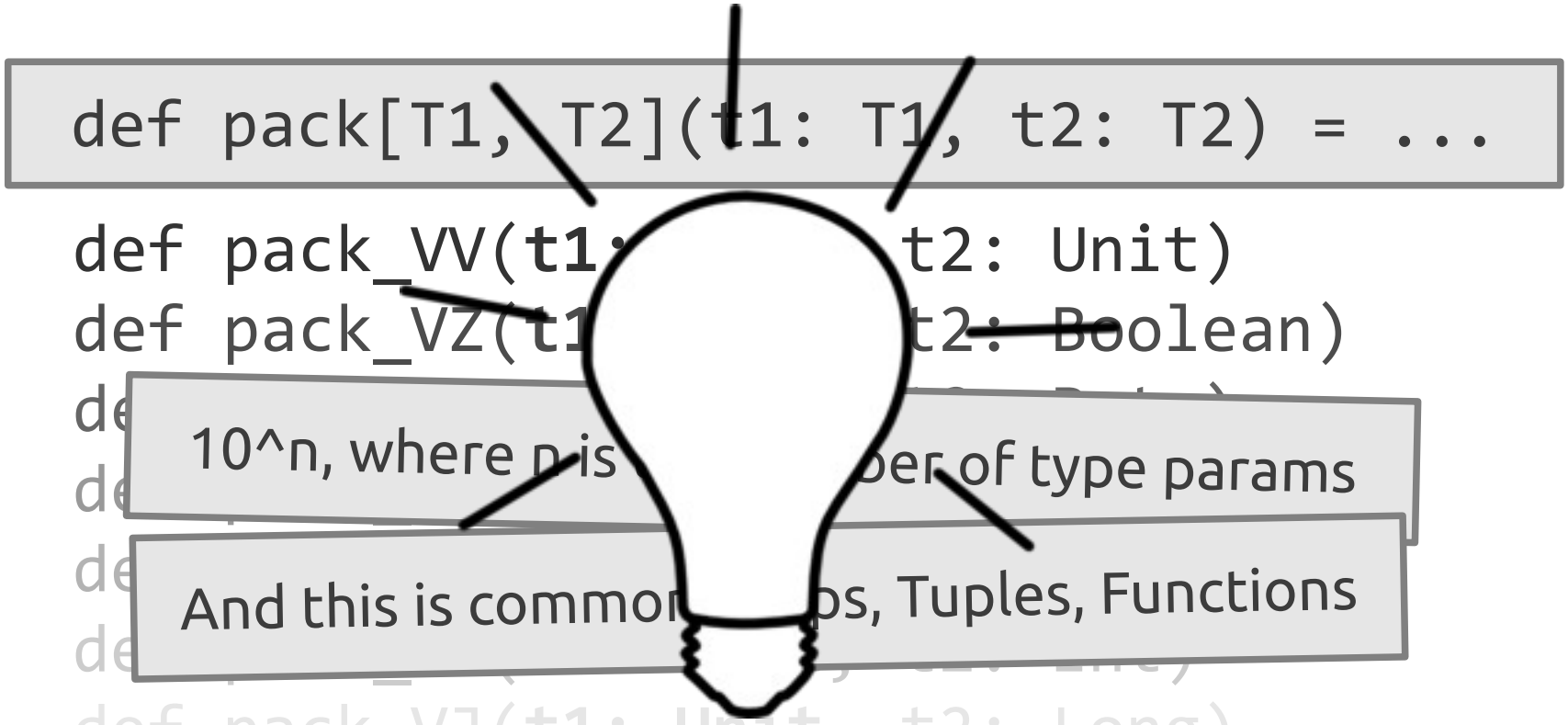
def pack_VF(t1: Unit, t2: Float)
def pack_VD(t1: Unit, t2: Double)
```

10^n, where n is the number of type params

And this is common: Maps, Tuples, Functions

Specialization

… it gets even worse



Generics

Specialization

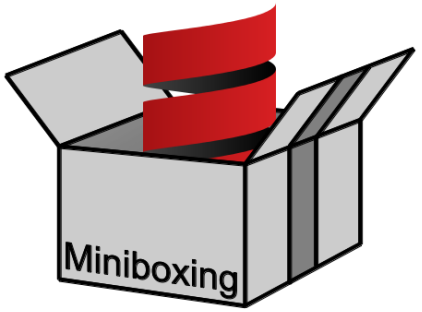
Miniboxing

WE ARE HERE

Performance

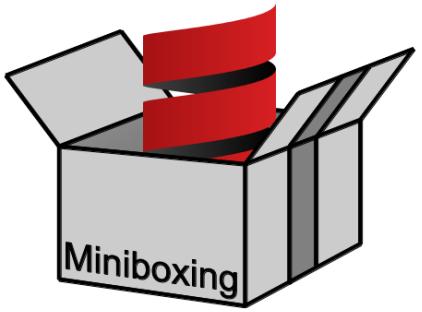
Evaluation

Miniboxing



Miniboxing

reduces the variants



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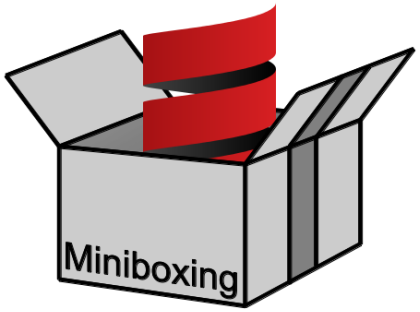
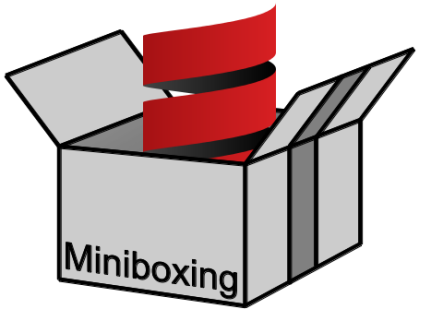


reduces the variants

by using something like a **tagged union**

TAG	DATA (VALUE)

Miniboxing



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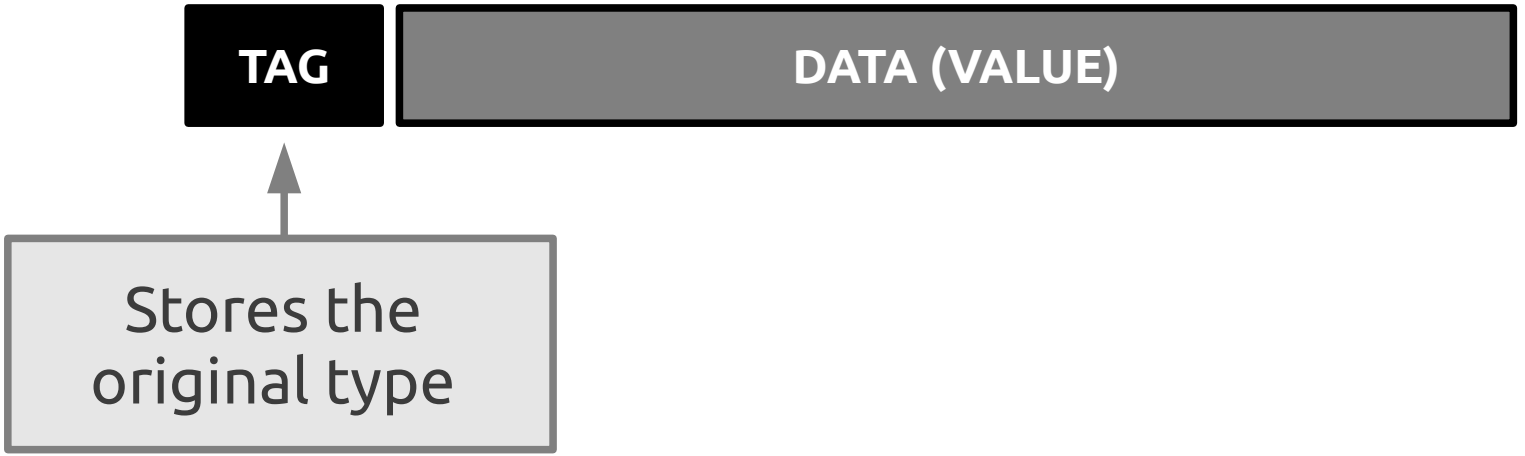

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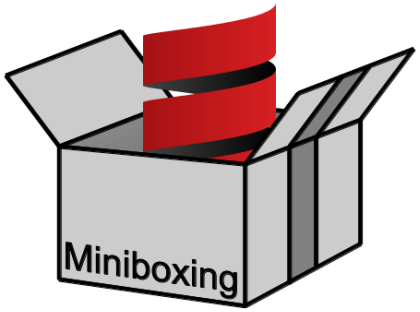

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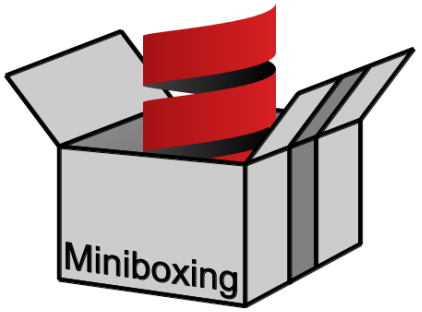

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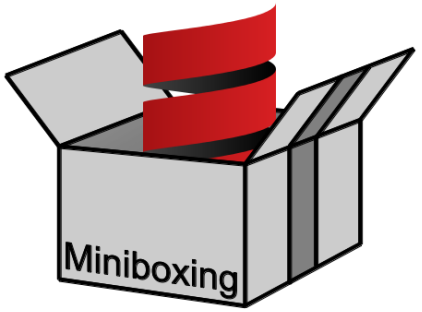

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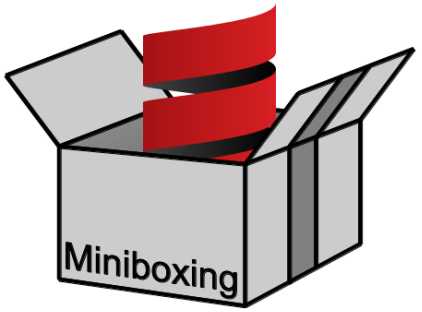

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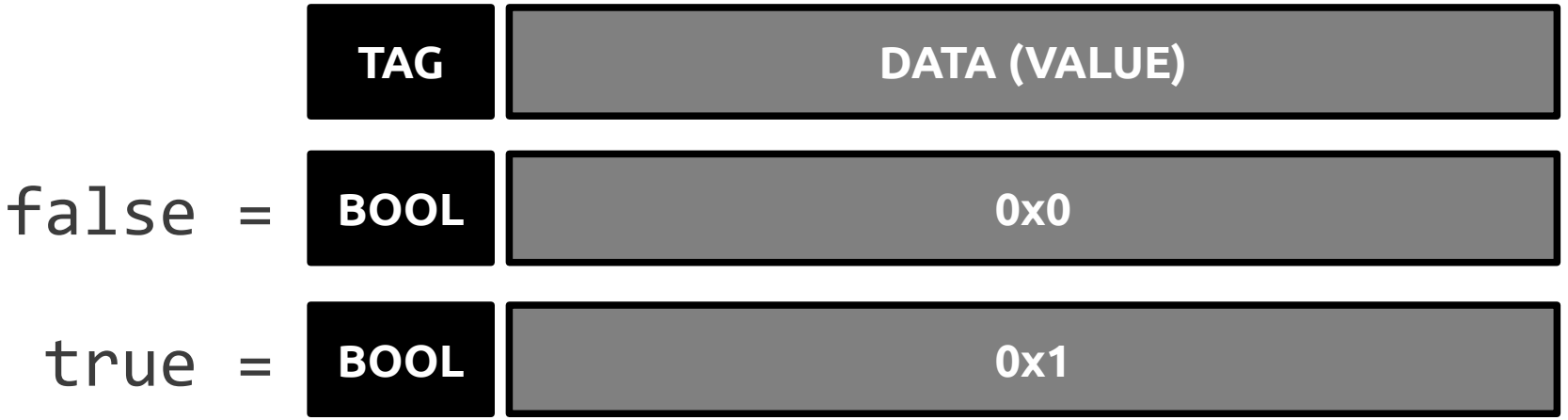

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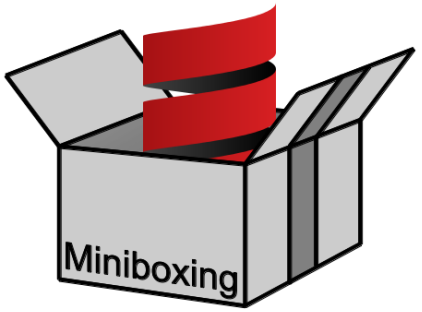

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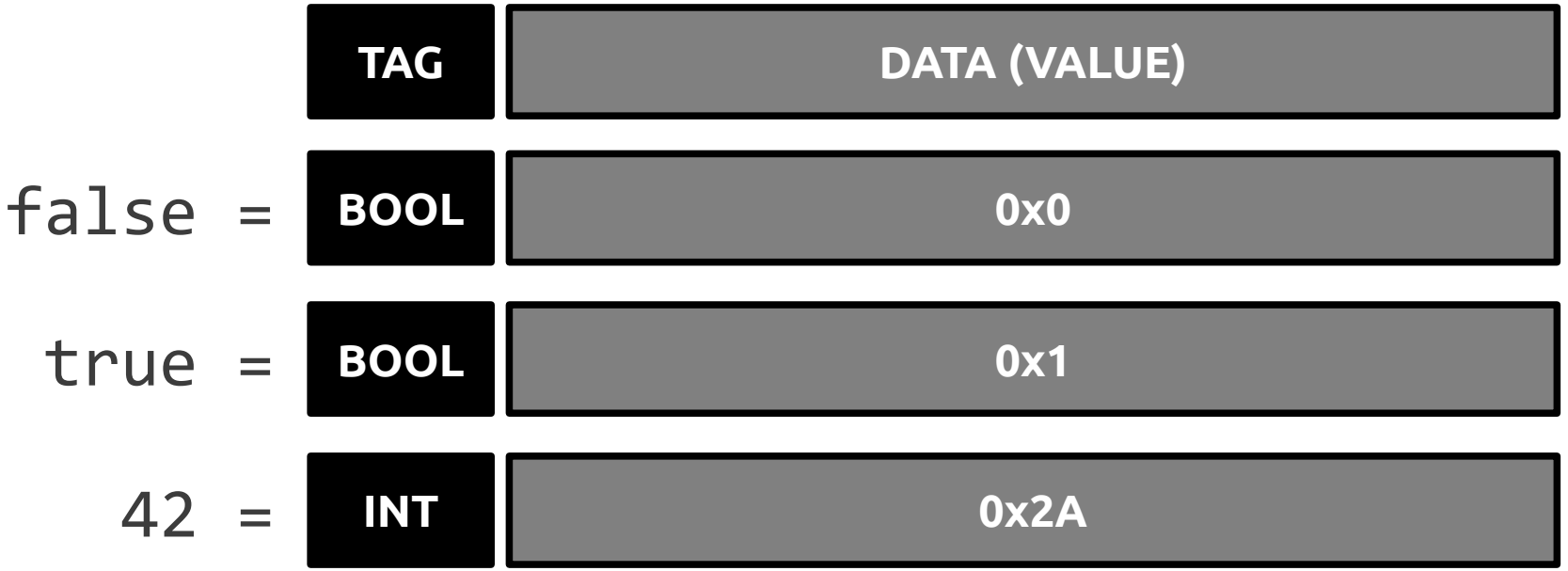

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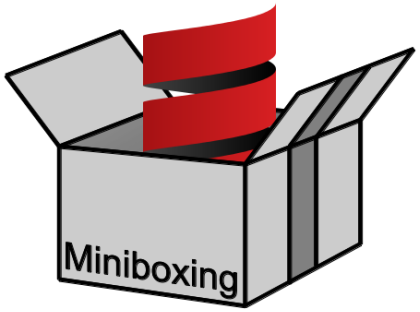

reduces the variants

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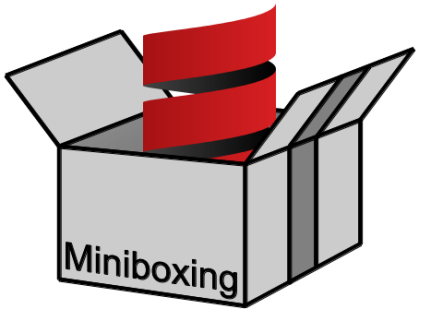
TAG	DATA (VALUE)

Miniboxing



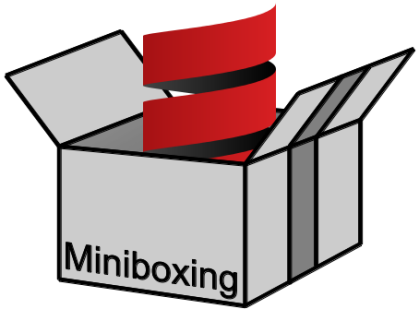
reduces the variants

by using something like a **tagged union**

and using the **static type information**

- tags are attached to **code**, not to values

Miniboxing



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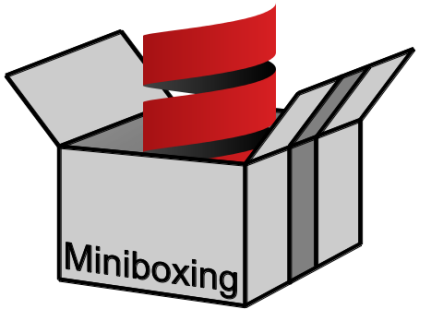

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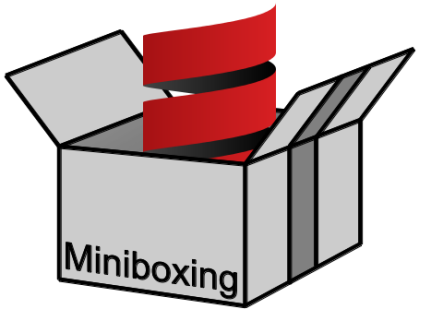

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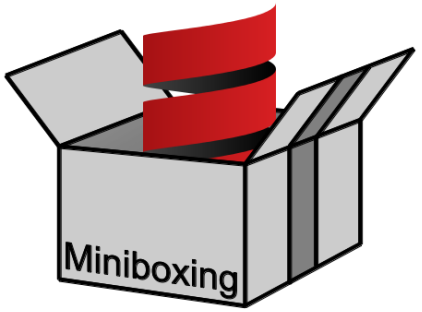

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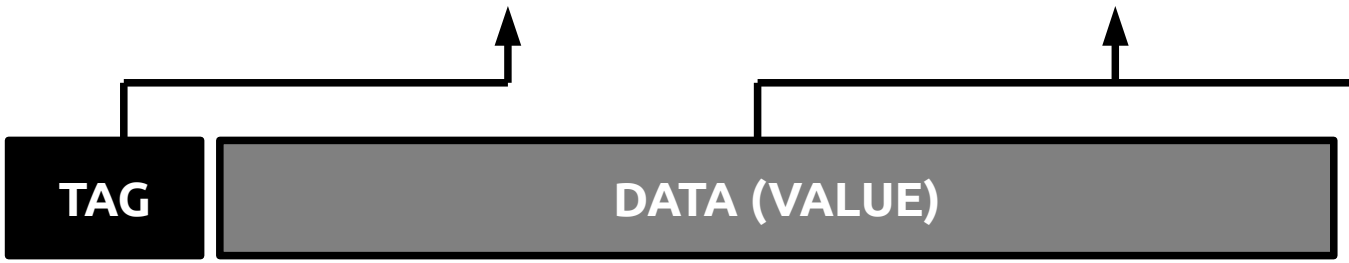

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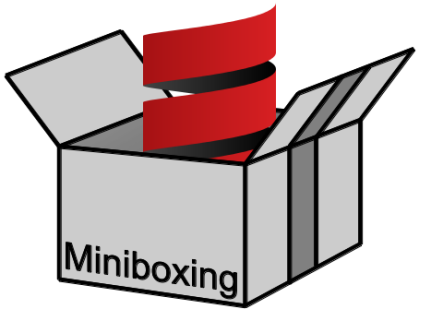

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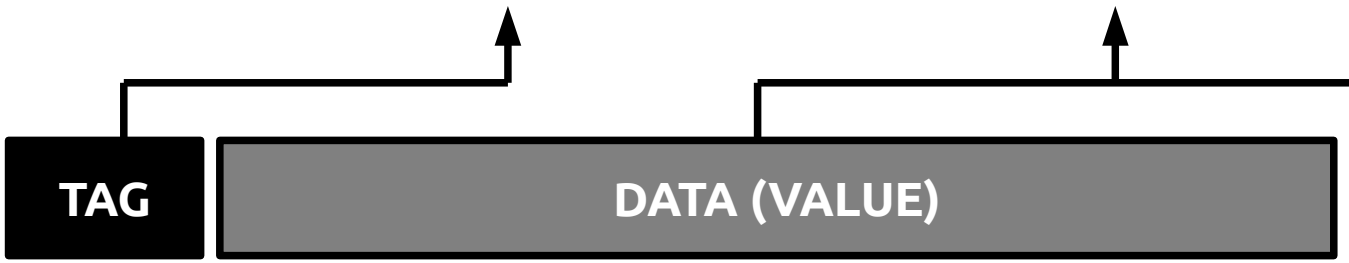
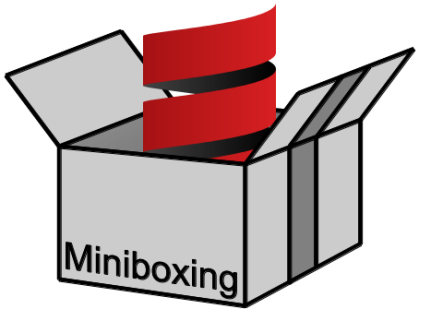


T_tag corresponds to the **type parameter**, instead of the values being passed around.

Miniboxing



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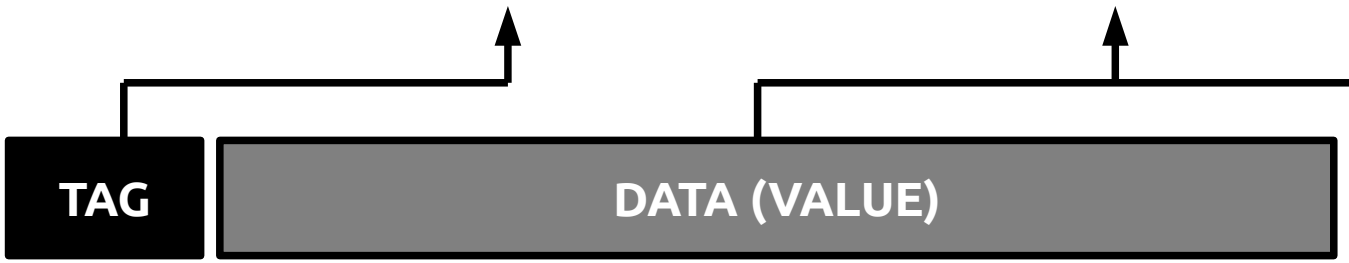
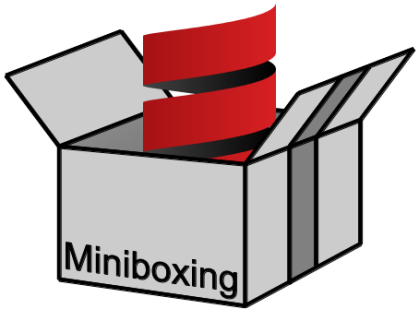


T_tag corresponds to the **type parameter**, instead of the value[illegible]und.

Tag hoisting

Miniboxing



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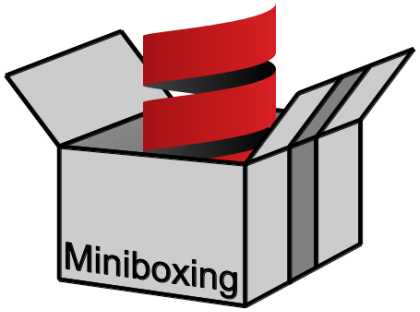
Two variants per type parameter (reference + minibox)

Miniboxing



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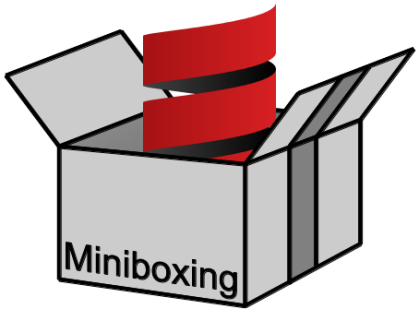
Two variants per type parameter (reference + minibox)

`def pack` will have 4 variants

Miniboxing



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Two variants per type parameter (reference + minibox)

`def pack` will have 4 variants

Tag hoisting is instrumental in obtaining good performance

Generics

Specialization

Miniboxing

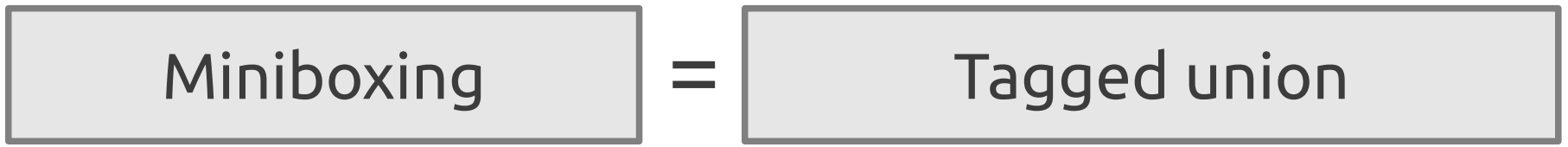
Performance

WE ARE HERE

Evaluation

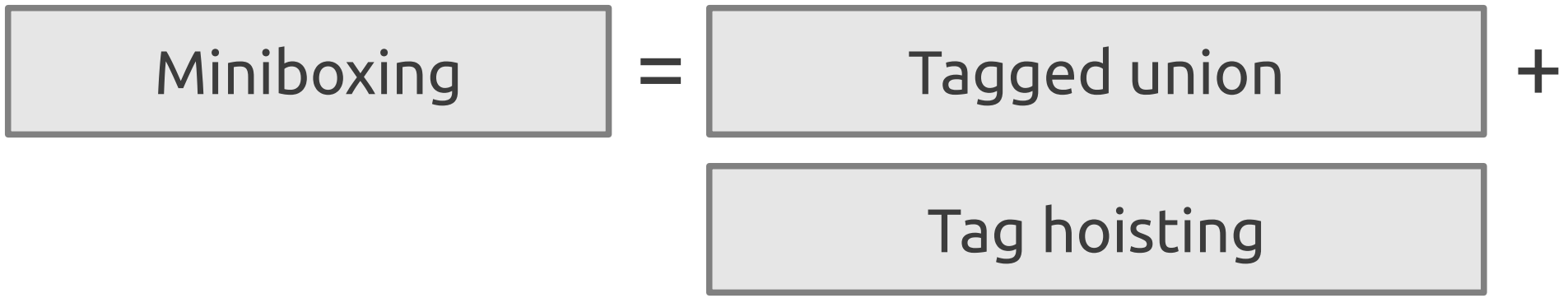
Performance

needs one more ingredient



Performance

needs one more ingredient



Performance

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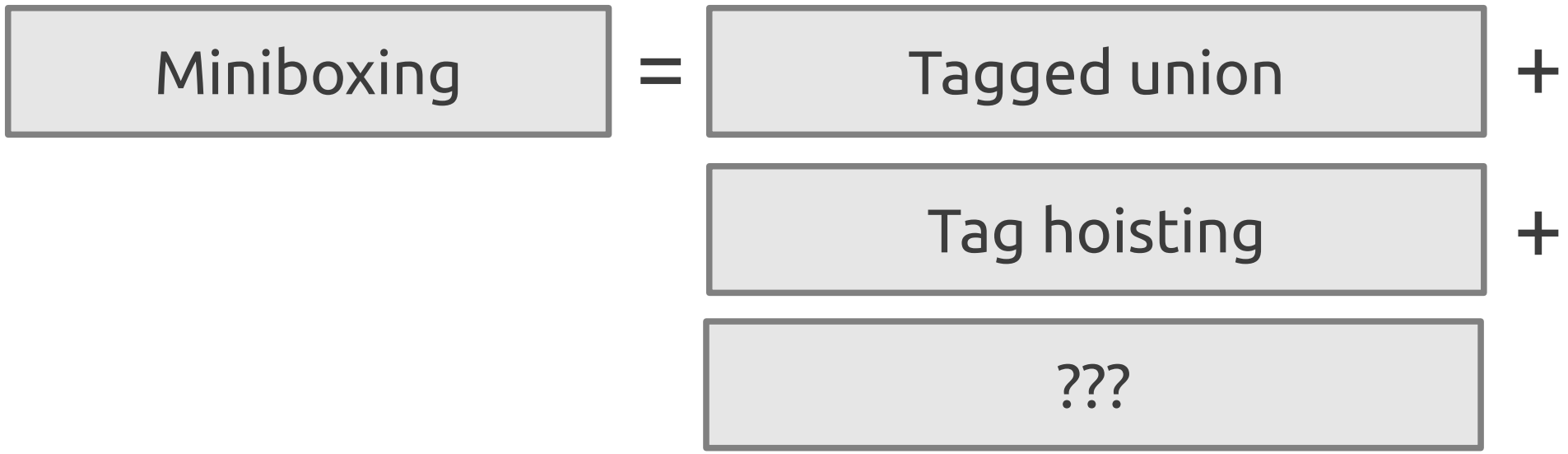


Performance

needs one more ingredient

Miniboxing = Tagged union +

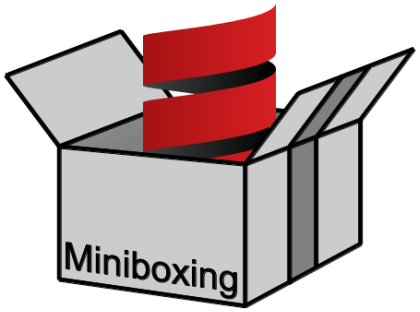
Tag hoisting +

???

Why do we need a **secret ingredient?**

Switching on tags

kills performance



Switching on tags

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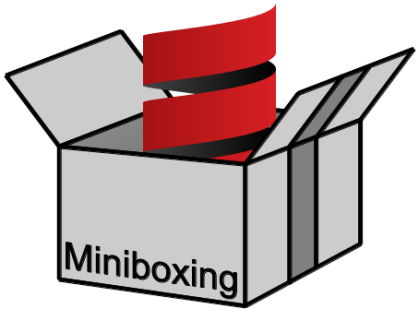
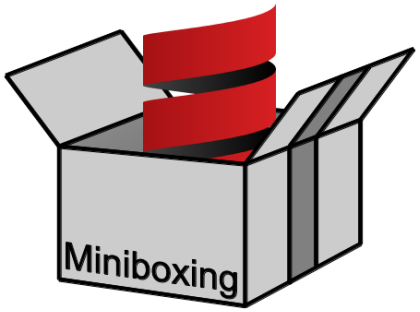



```
def toString(T_tag: Byte,
             value: Long): String =
  T_tag match {
    case UNIT => ...
    case BOOL => ...
    ...
  }
```

Switching on tags
kills performance

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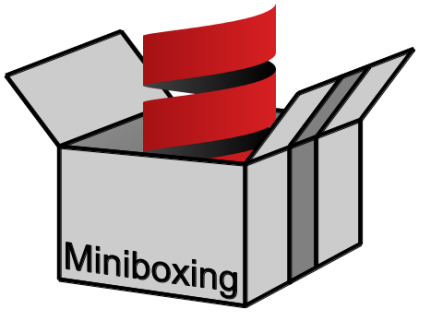
Even more so for consecutive switches

Switching on tags

kills performance




```
T_tag match {
  case X => op1
}
T_tag match {
  case X => op2
}
```

Switching on tags

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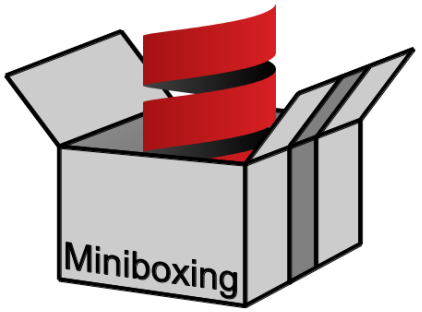


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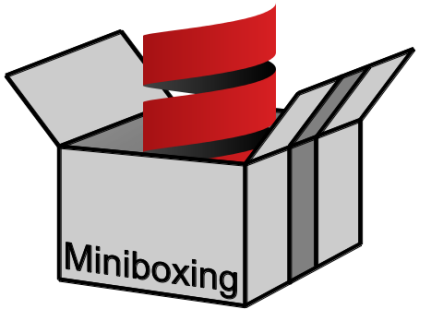
Redundant switch

Switching on tags

kills performance




```
T_tag match {
  case X => op1
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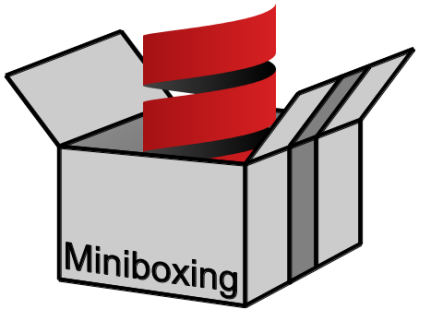
T_tag match {
  case X => op2
}
```

Redundant switch

Switching on tags

kills performance

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T_tag match {
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Redundant switch

Switching on tags

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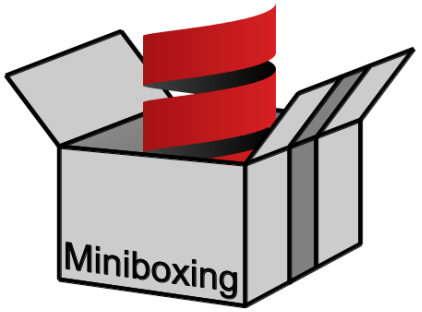


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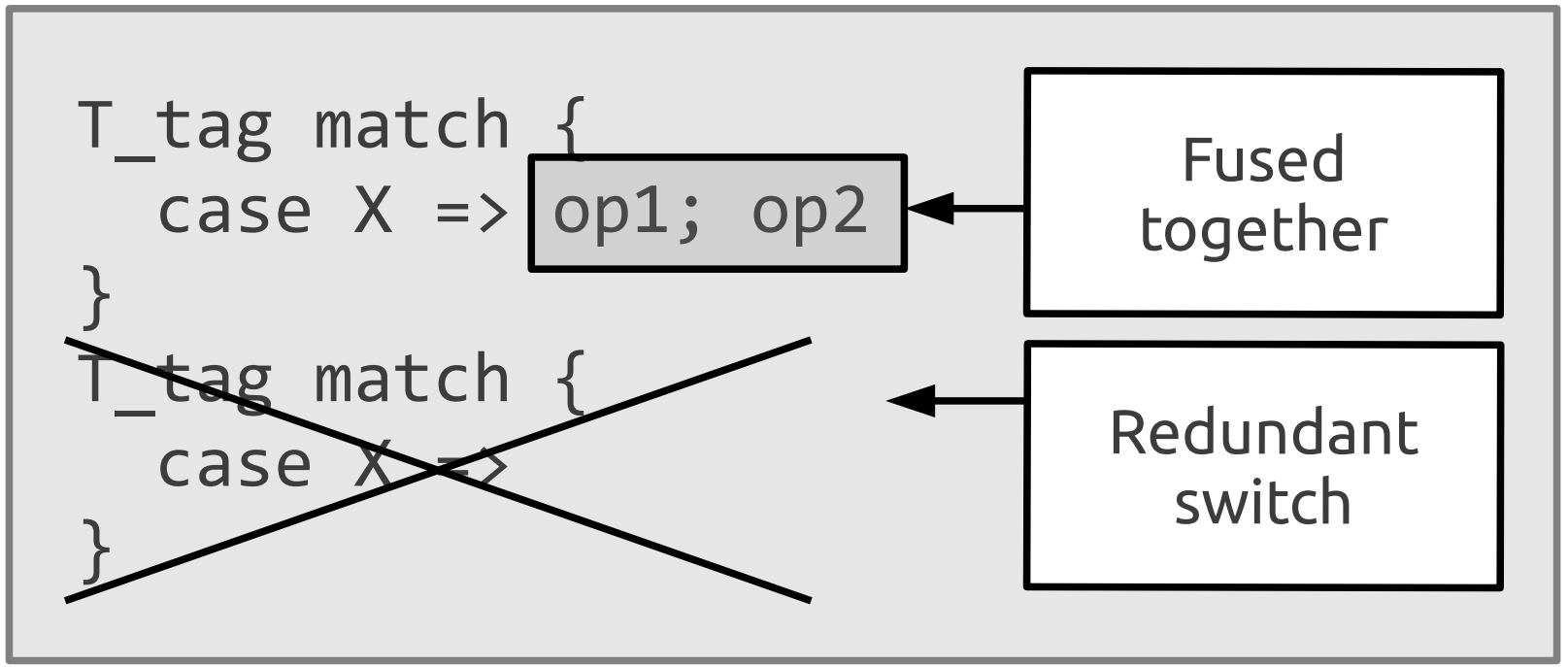

Switching on tags
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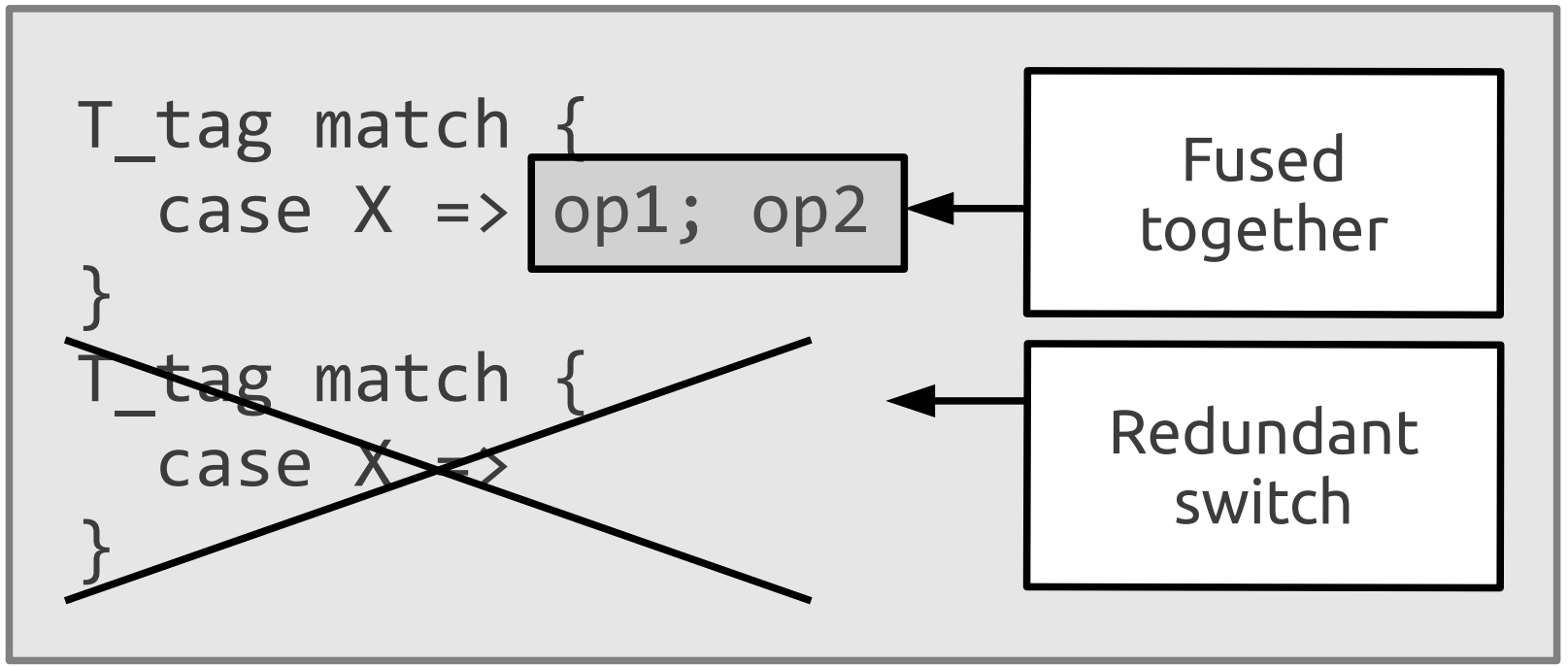
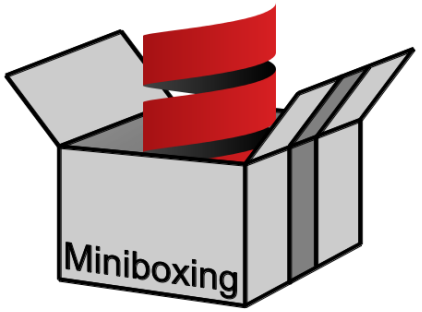


This is critical for **array operations**

Switching



`ArrayBuffer.reverse()`

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def reverse(): Unit {
  var index = 0
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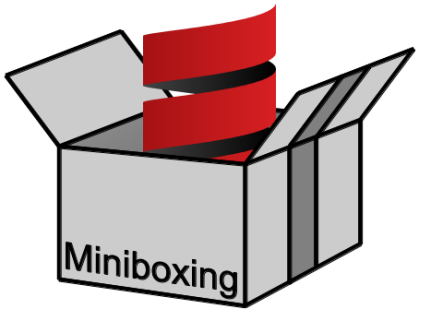
```

Switching



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```

```
T_tag match {
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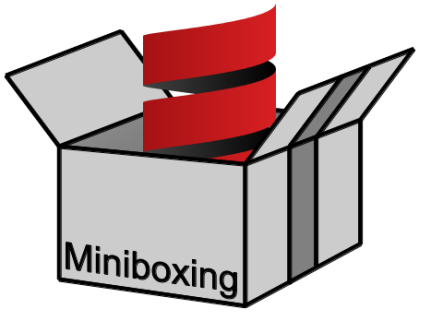
```

Switching



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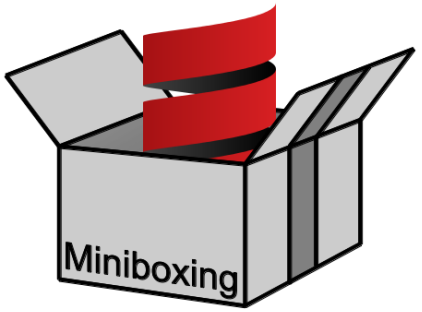

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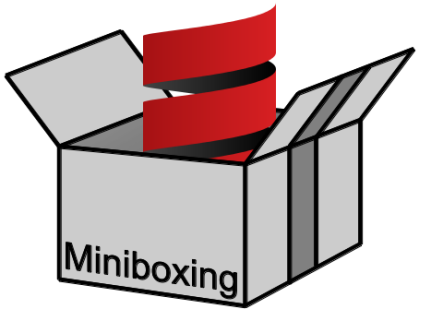

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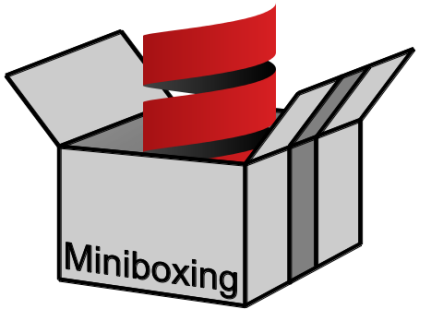
  ...
}
```

Fuse the operations together?

Switching



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}
```

```
T_tag match {
  case INT =>
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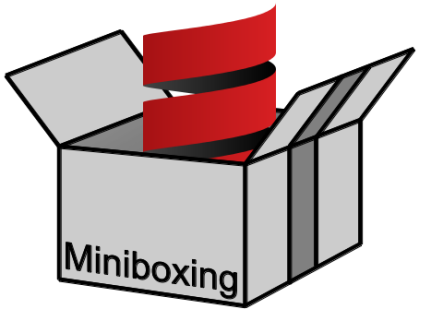
    array(.) = ...
    array(.) = ...
  ...
}
```

Switching



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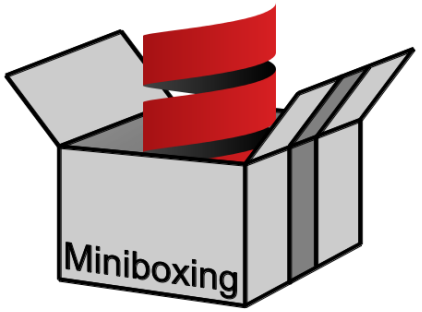
    array(.) = ...
  ...
}
```

Hoist the switch out of the loop?

Switching



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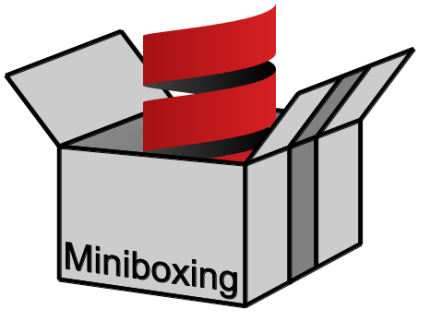
  }
}
```

```
T_tag match {
  case INT =>
    var index = 0
    while (...) {
      ...
      index += 1
    }
}
```

Switching



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```
T_tag match {
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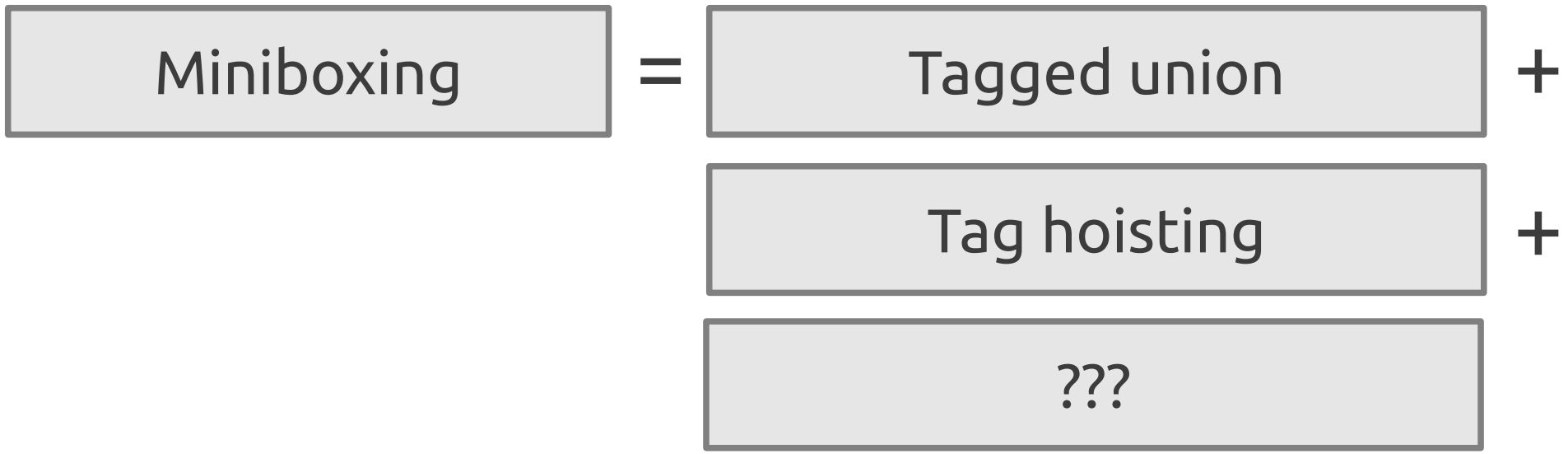
    }
}
```

Is that enough? Method may be **called from a loop**

Performance

needs one more ingredient



Performance

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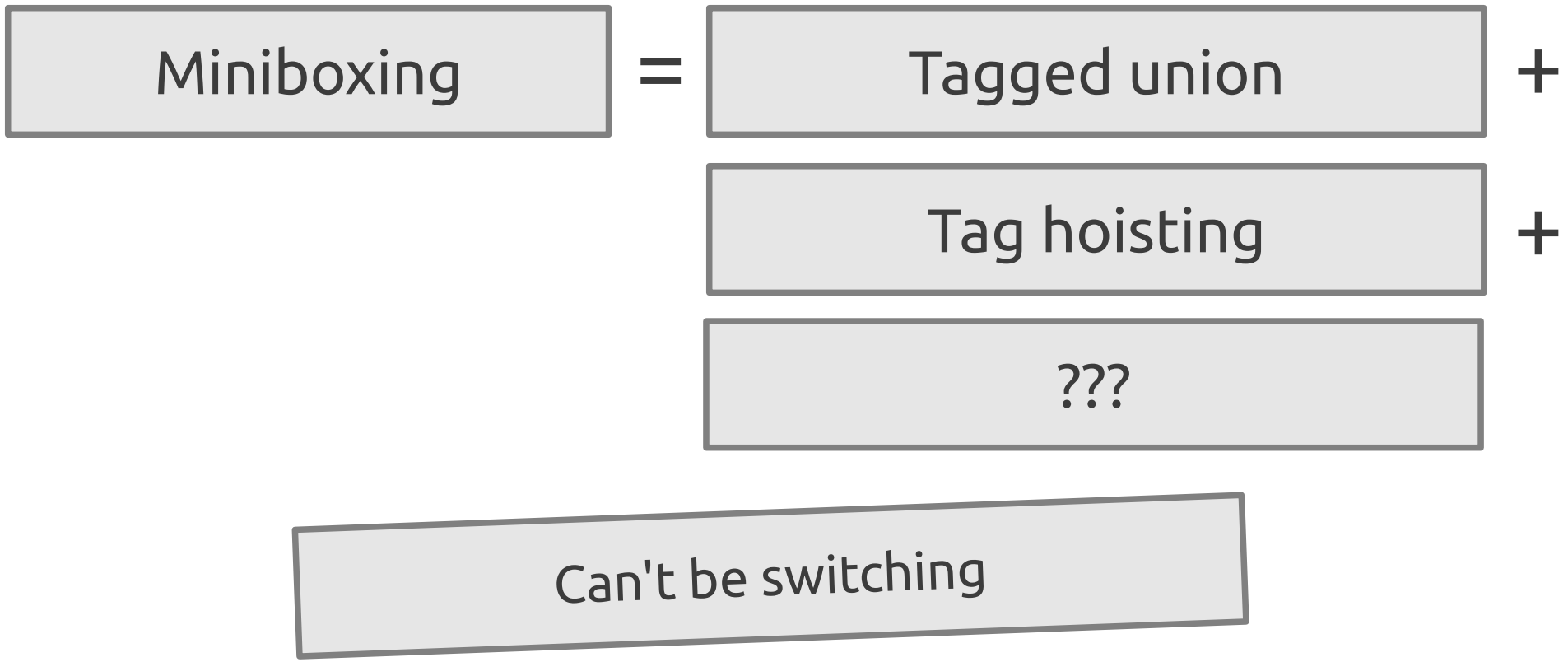

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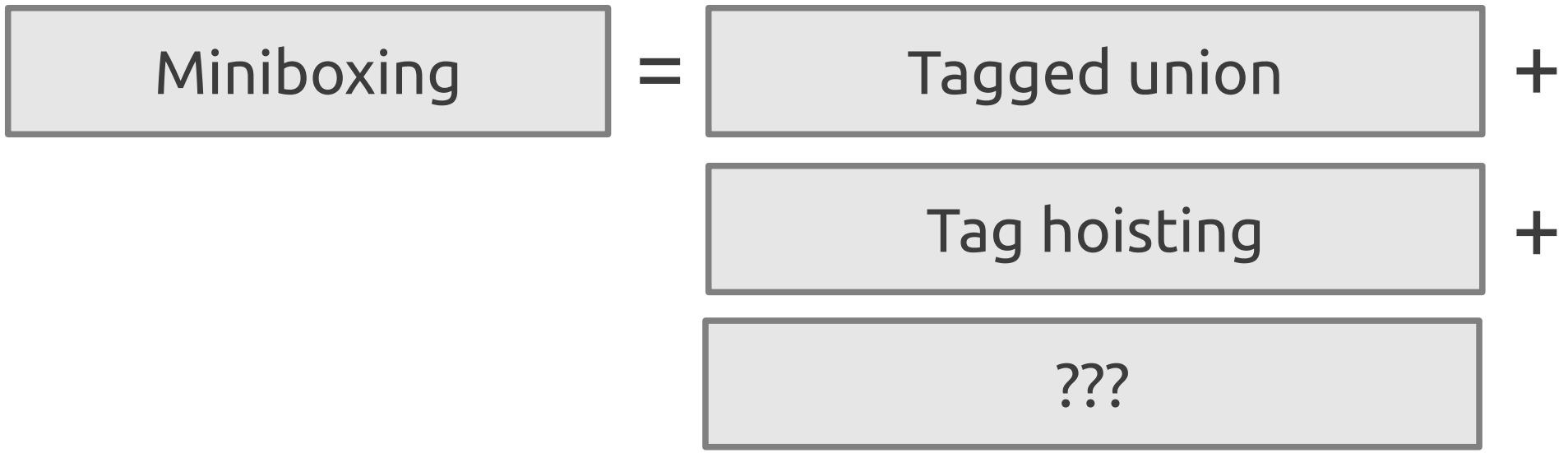
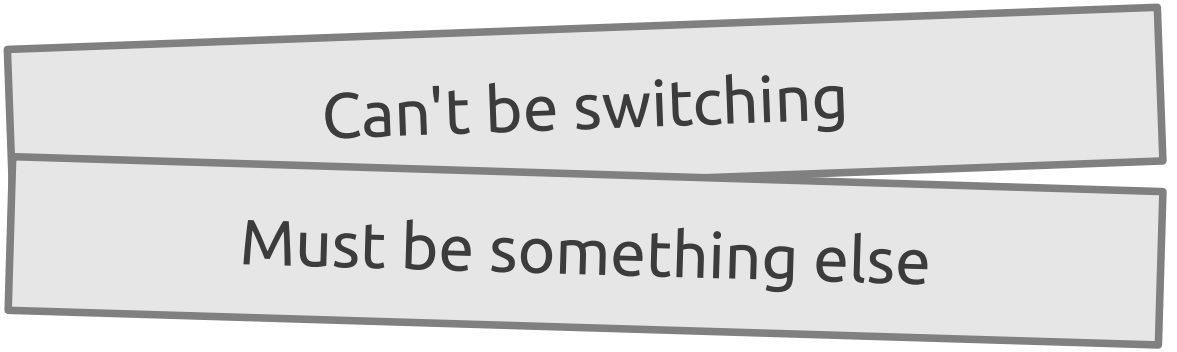
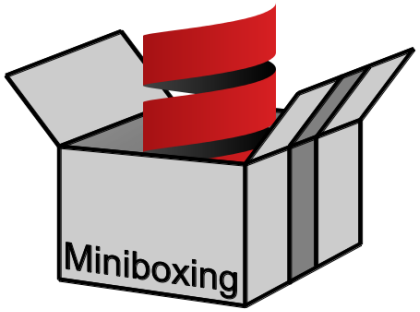


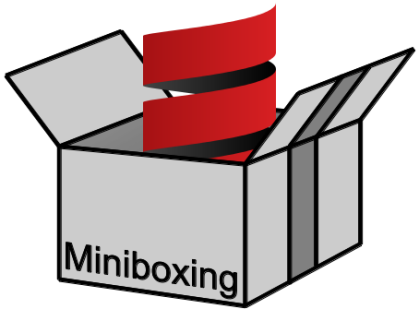


Dispatching



- Dispatch object
  - Encodes array interactions

Dispatching



- Dispatch object
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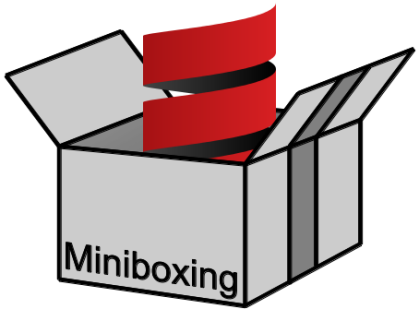
```
class Dispatcher[T] {
  def array_get(...): Long
  def array_set(...): Unit
}
```

Dispatching



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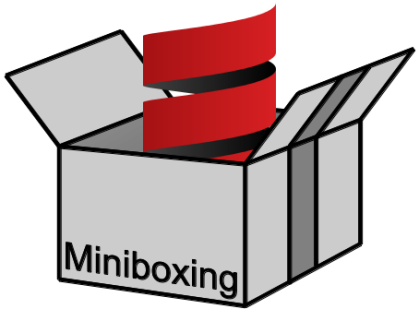
```
def identity_M(T_dispatcher: Dispatcher[T],
               t: Long): Long
```

Dispatching



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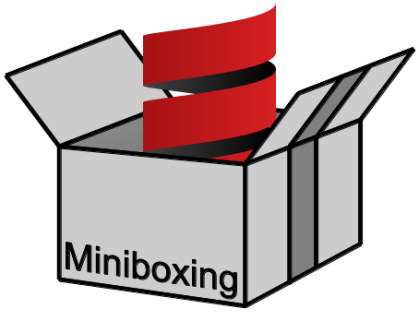
instead of tag

Dispatching



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```
object IntDispatcher extends Dispatcher[Int] {
  def array_get(...): Long = ...
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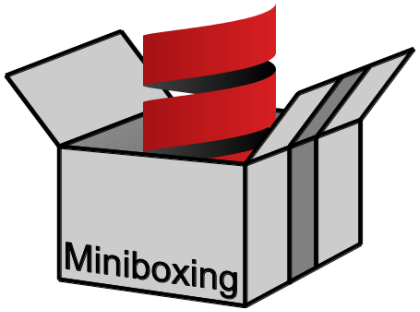
```

Dispatching



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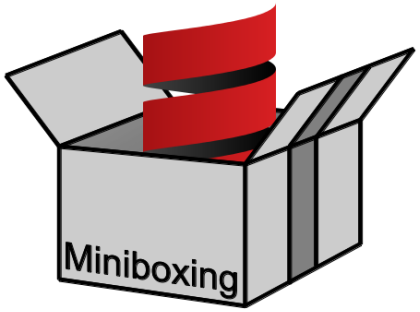
```

```
object LongDispatcher ...
object CharDispatcher ...
```

Dispatching



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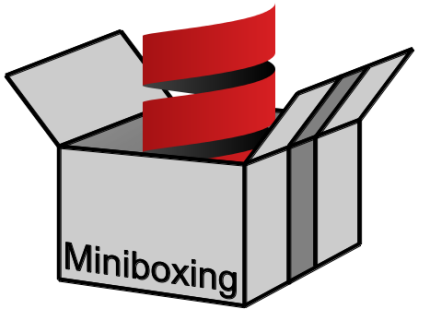
Passing a dispatcher = hoisted already

Dispatching



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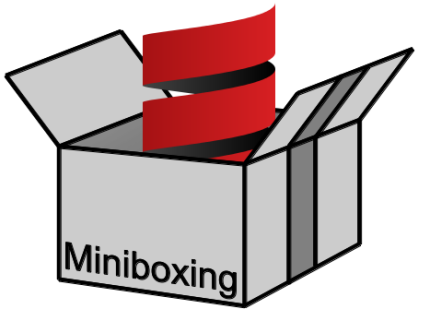
}
```

Dispatching



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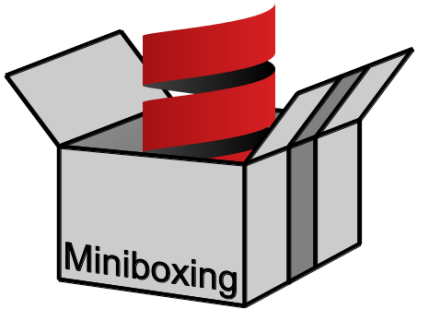
T_dispatcher.array_get

Dispatching



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T_dispatcher.array_get

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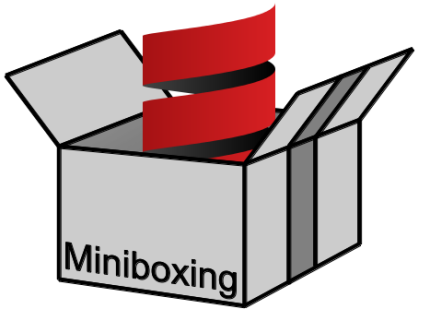

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T_dispatcher.array_get

T_dispatcher.array_get

T_dispatcher.array_set

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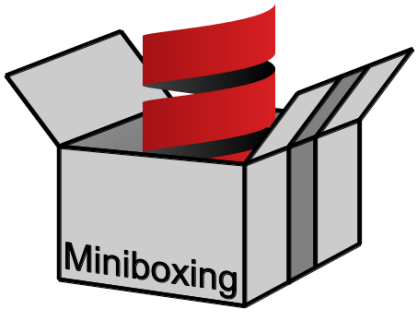
Dispatching



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T_dispatcher.array_get

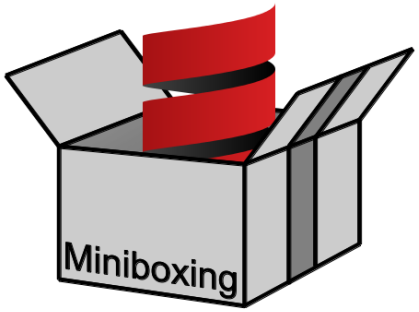
T_dispatcher.array_get

T_dispatcher.array_set

T_dispatcher.array_set

With inlining, we get good performance

Dispatching

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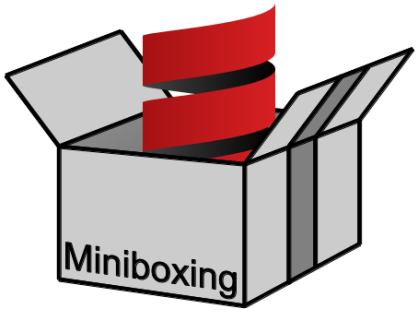


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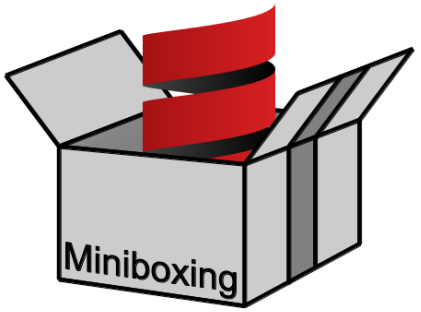
IntDispatcher

Monomorphic, okay

Dispatching

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T_dispatcher.array_get
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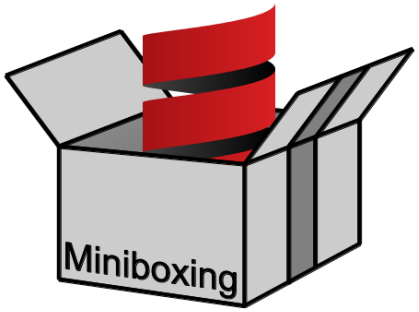
IntDispatcher

LongDispatcher

Monomorphic, okay

Polymorphic, okay

Dispatching

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ArrayBuffer.reverse()
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IntDispatcher

LongDispatcher

DoubleDispatcher

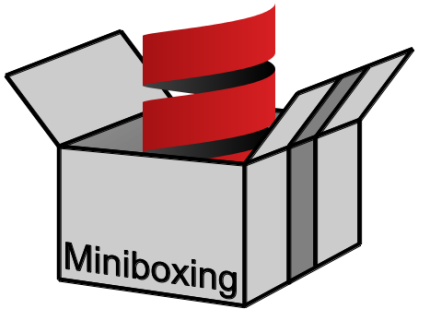
Monomorphic, okay

Polymorphic, okay

Megamorphic* → no more inlining

*** for the HotSpot JVM**

Dispatching

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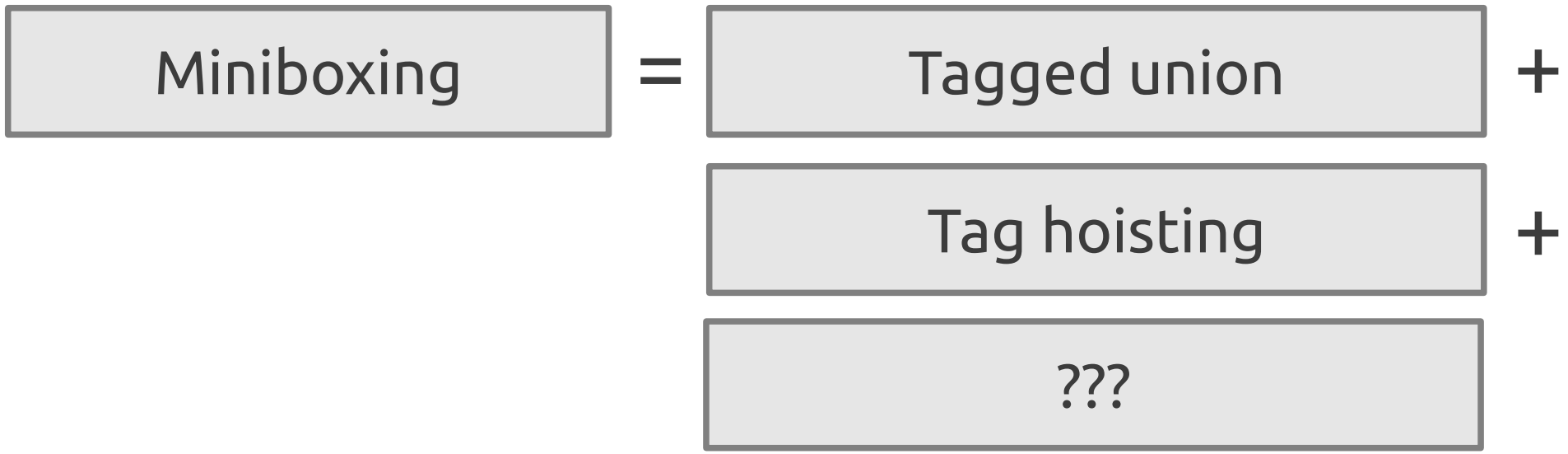
*** for the HotSpot JVM**

No more inlining → bad performance

Performance

needs one more ingredient



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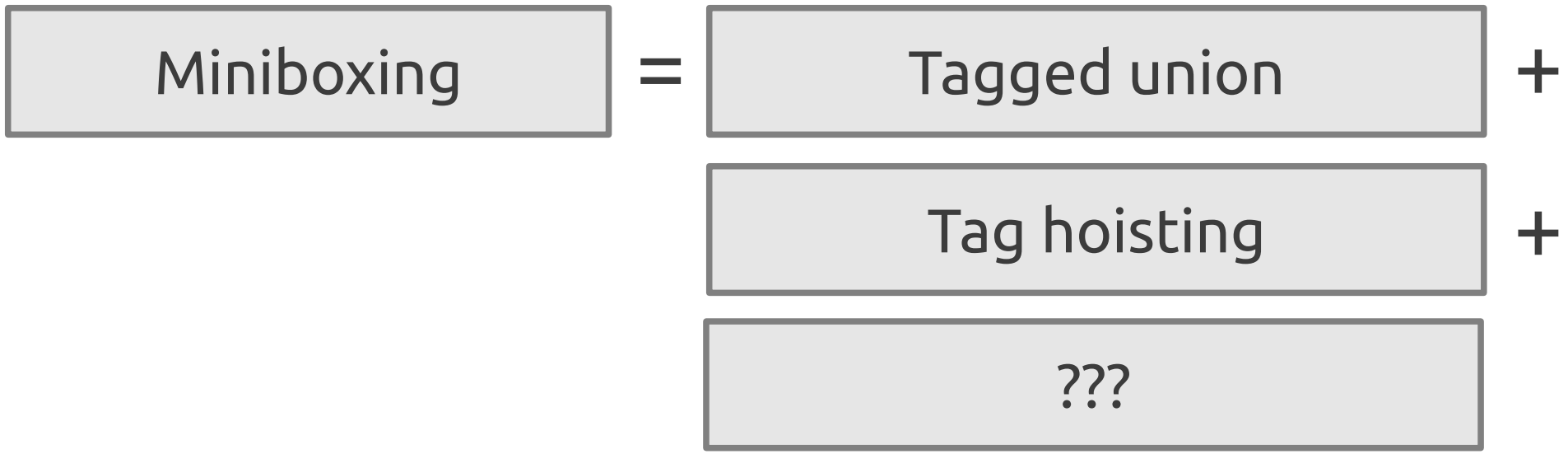
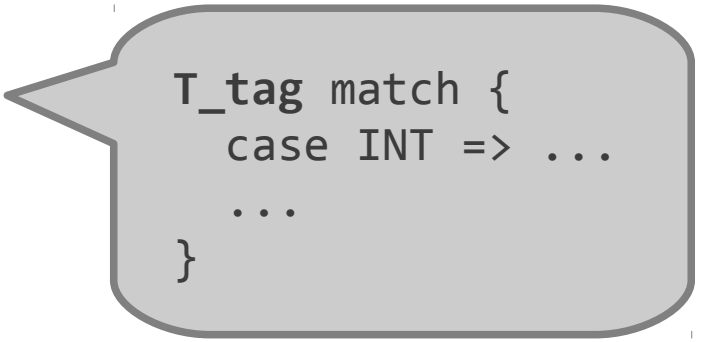


Object oriented dispatch isn't that

The secret ingredient

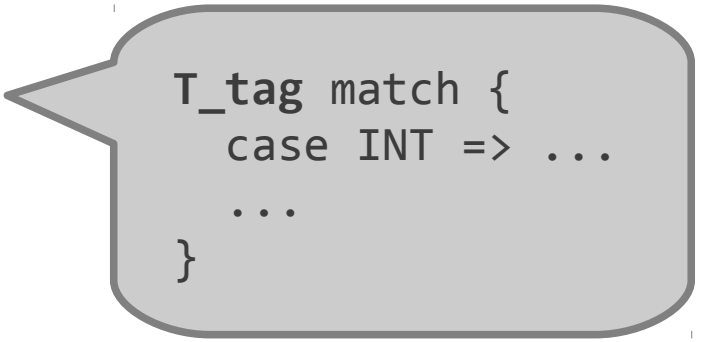
The secret ingredient

- **Switch-based** dispatching



The secret ingredient

- **Switch-based** dispatching
- When instantiating the class
  - **T_tag** is **known**



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- When instantiating the class
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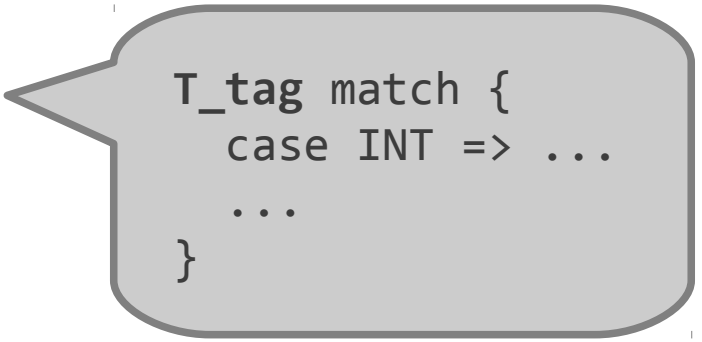

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- When instantiating the class
  - **T_tag** is **known**
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```
T_tag match {
  case INT => ...
  ...
}
```

Encode T_tag in the class name?

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- When instantiating the class
  - **T_tag** is **known**
  - **T_tag** is a **constant**

```
T_tag match {
  case INT => ...
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```

Encode T_tag in the class name?

Staticly? Code explosion!

Load-time specialization

- Load-time transformation

```
T_tag match {
  case INT => ...
  case CHAR => ...
  case UNIT => ...
  ...
}
```

Load-time specialization

- Load-time transformation
  - set **`T_tag`** statically

```
INT match {
  case INT => ...
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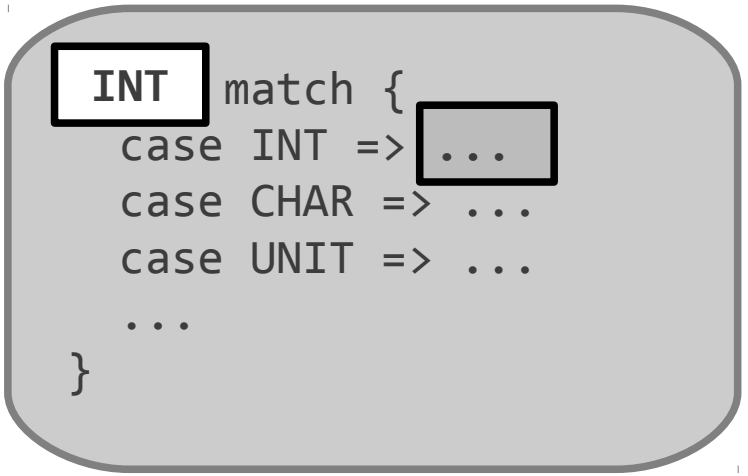
Load-time specialization

- Load-time transformation
  - set **T_tag** statically
  - perform **constant folding**



Load-time specialization

- Load-time transformation
  - set `T_tag` statically
  - perform **constant folding**
  - perform **dead code elimination**

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Only the useful code

Load-time specialization

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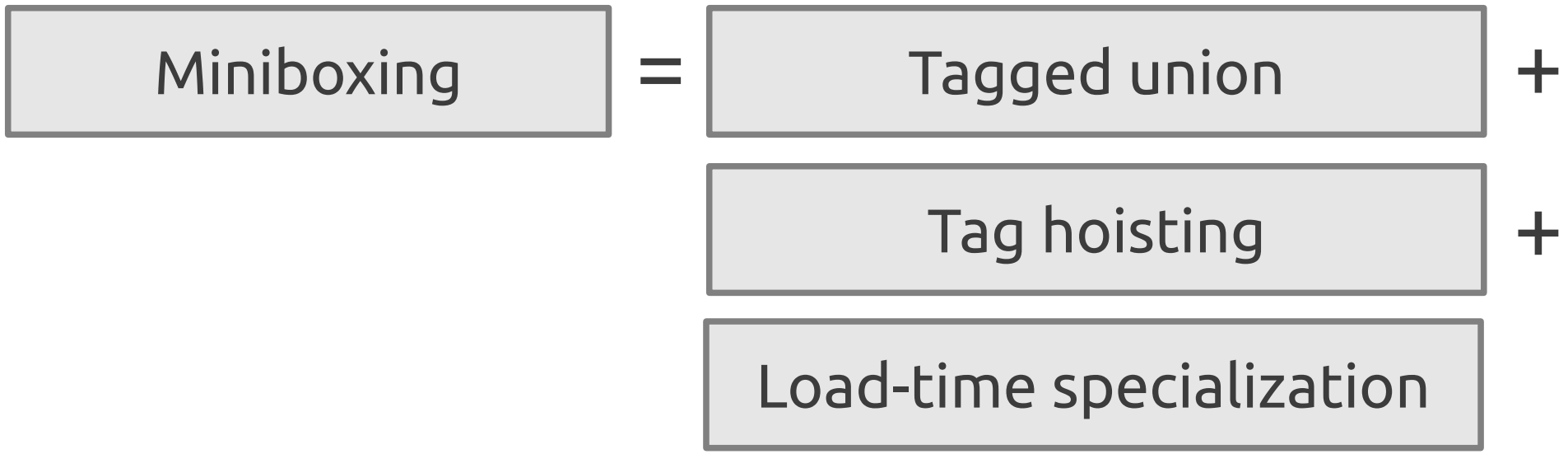
Is this the secret ingredient? **Yes!**

Performance

needs one more ingredient



Performance

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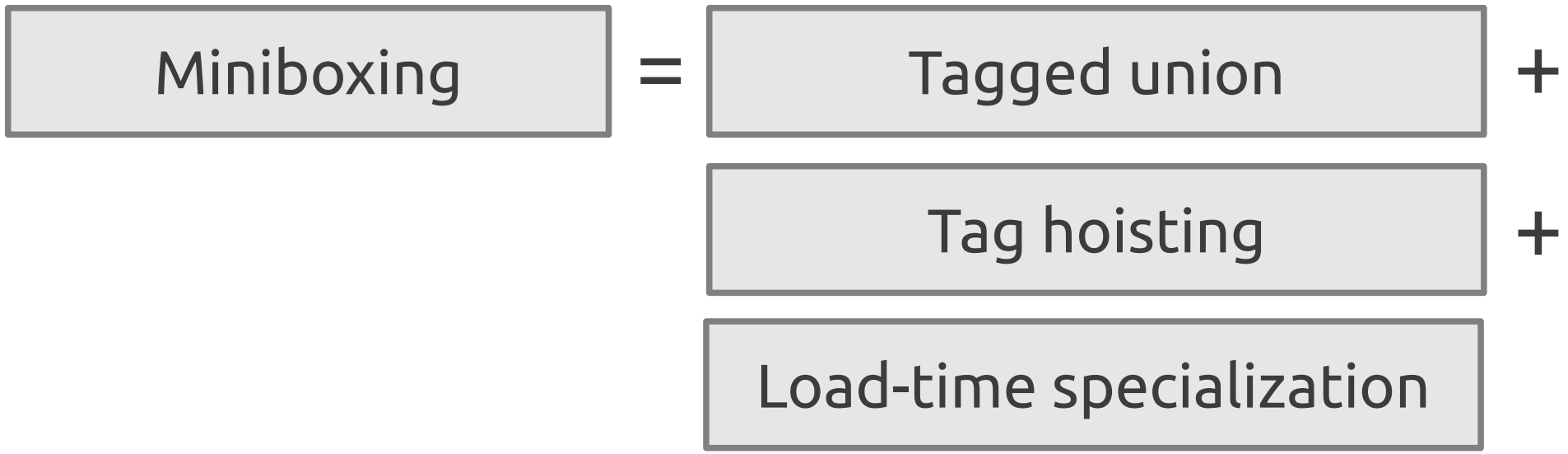


Attaching tags to code enables load-time specialization

Generics

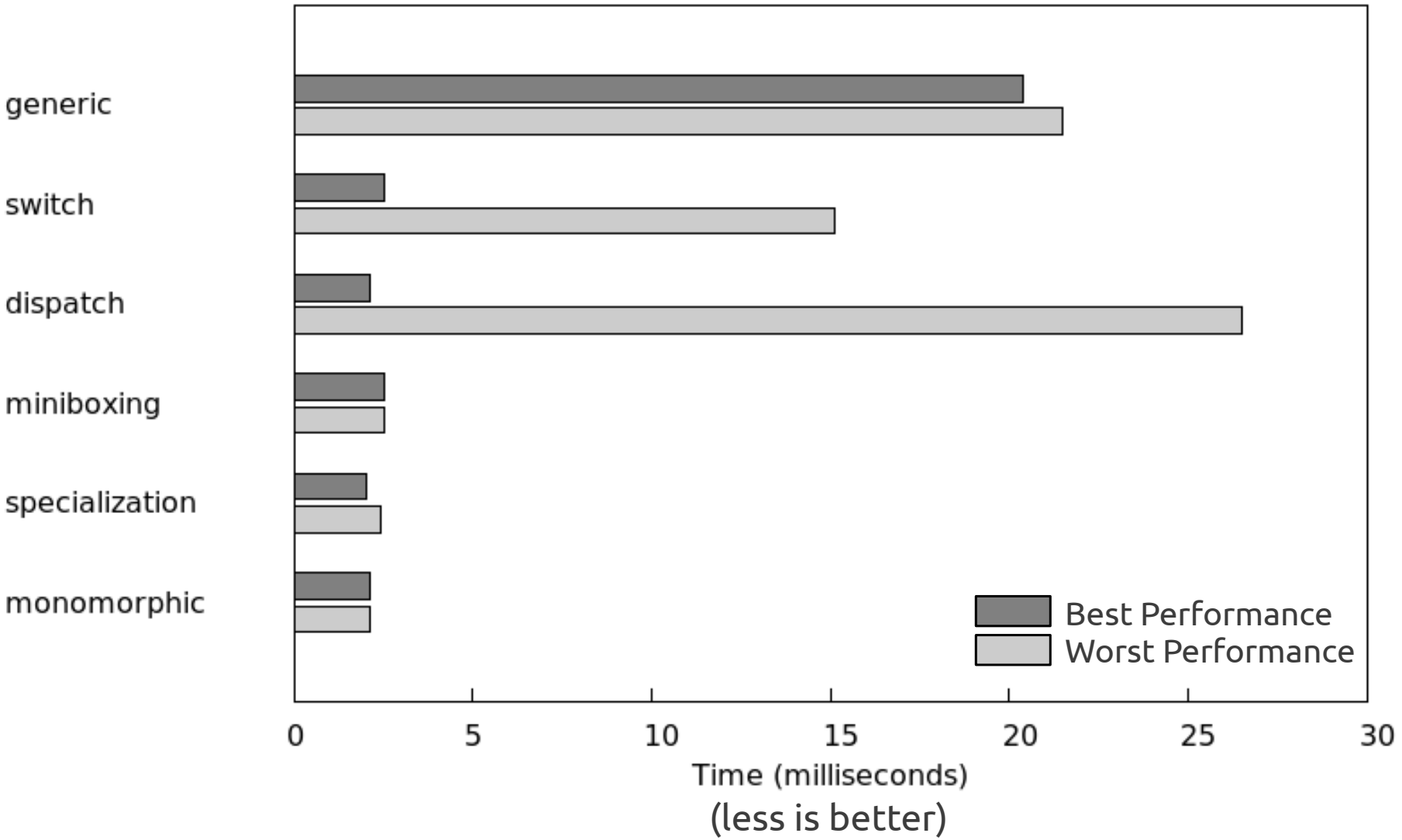
Specialization

Miniboxing

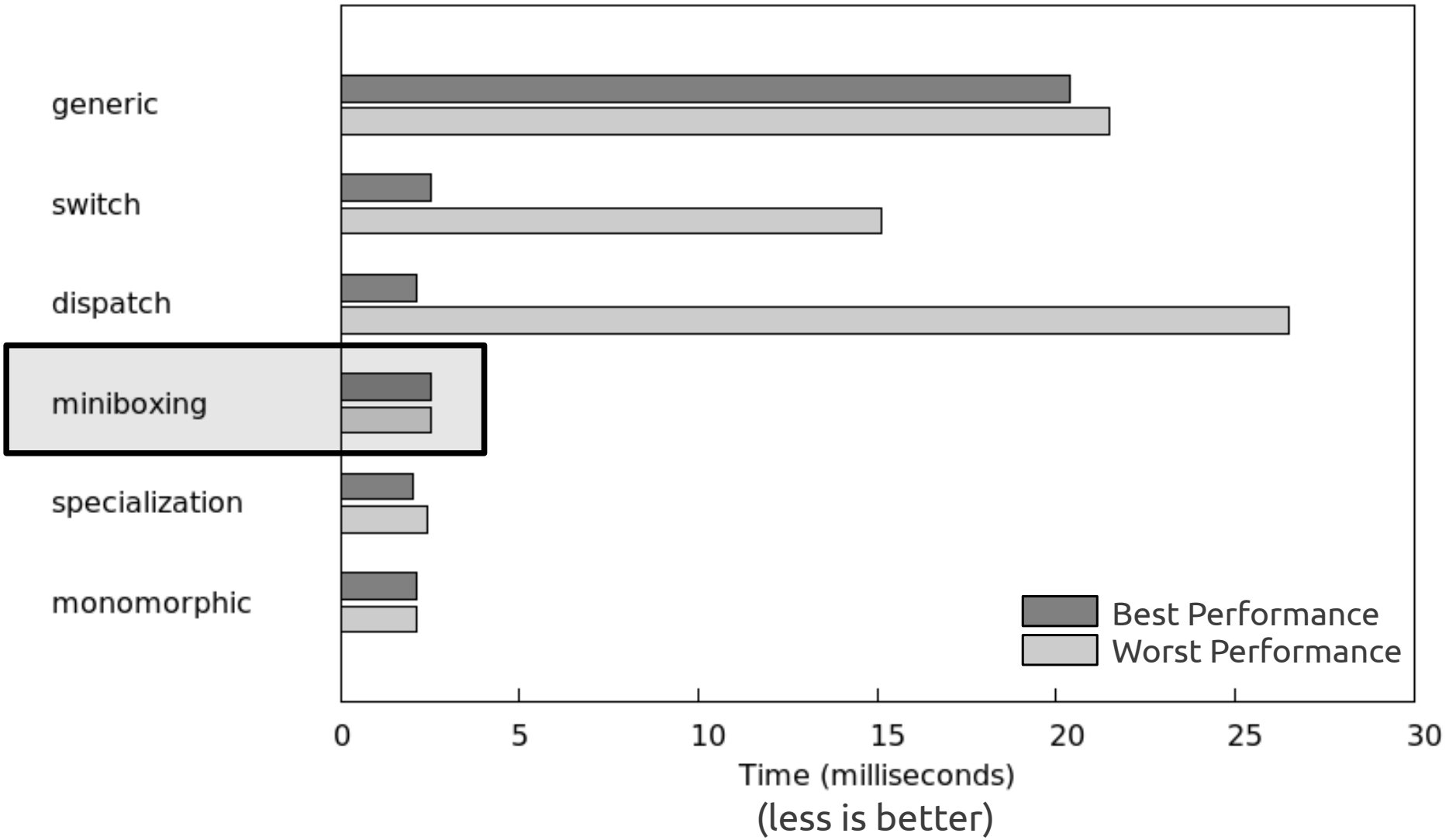
Performance

Evaluation

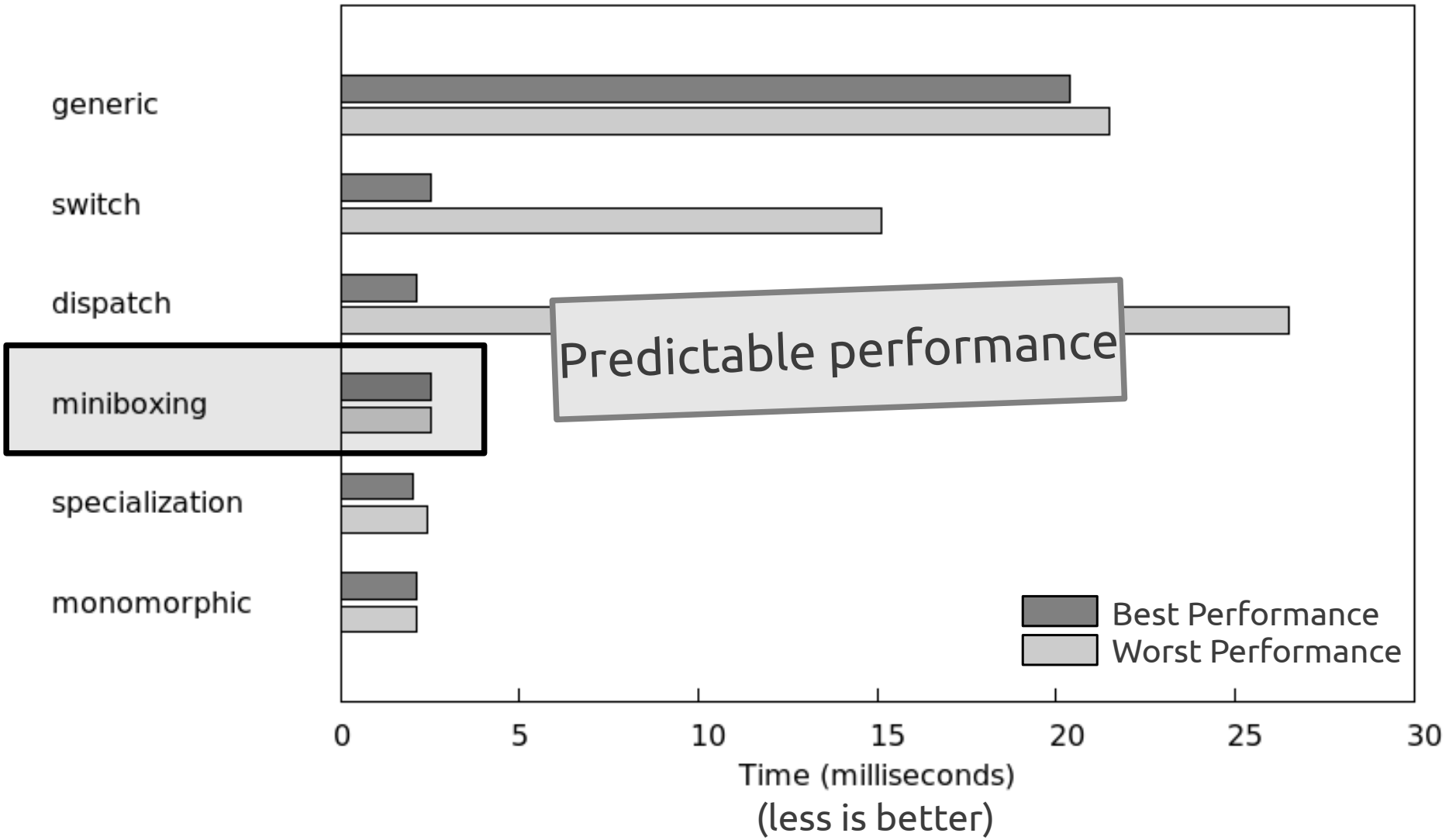
Evaluation - Performance



Evaluation - Performance



Evaluation - Performance



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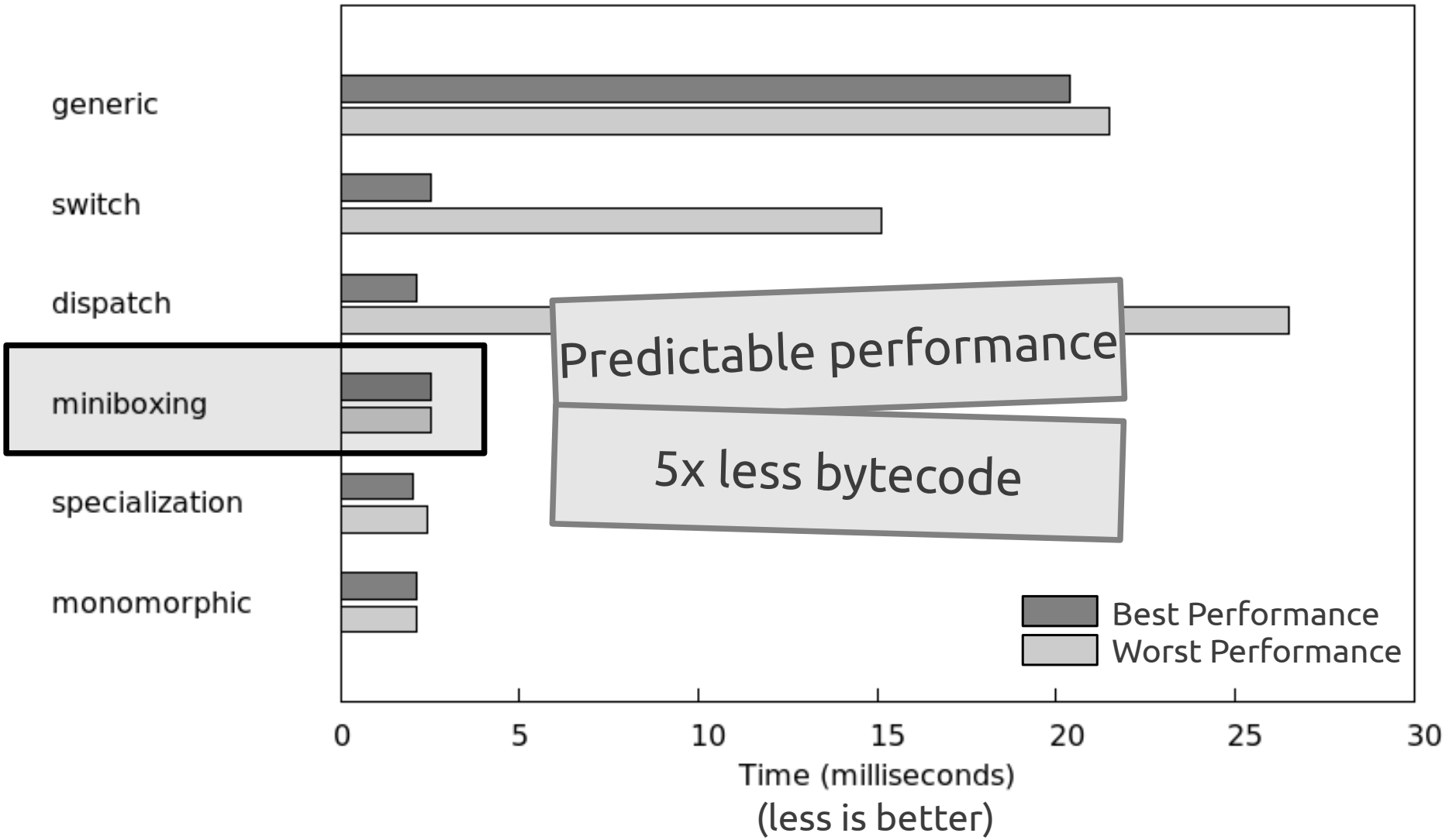

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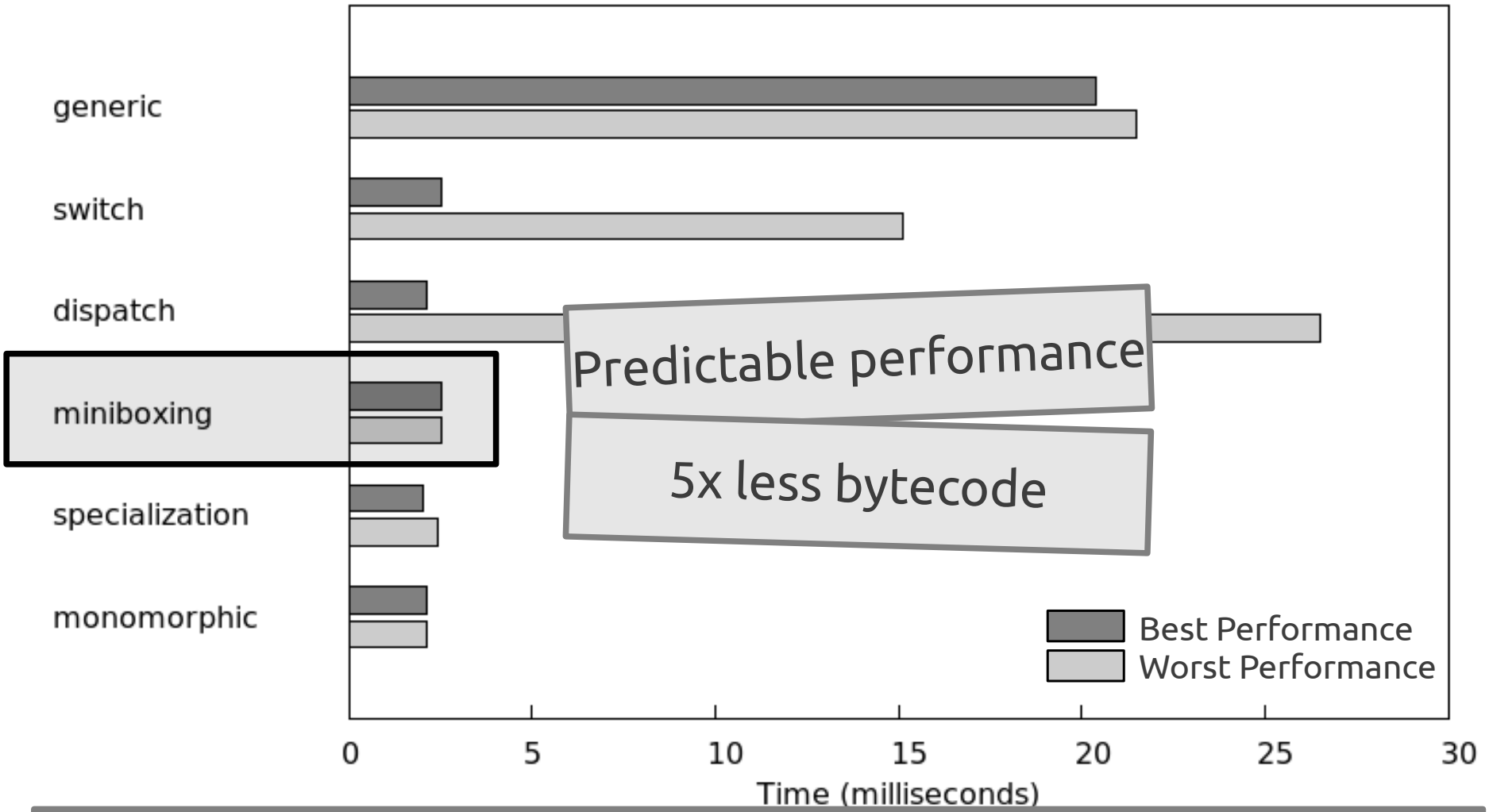
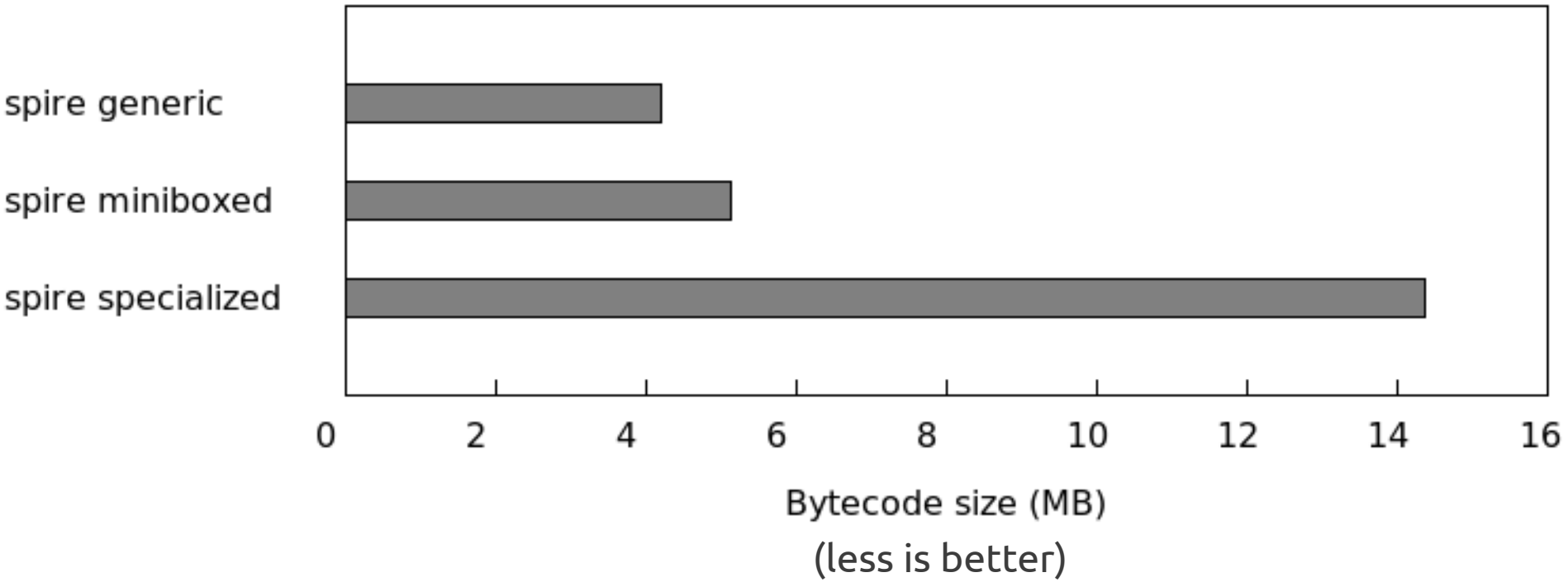


Similar results on other benchmarks

Evaluation - Code size

Spire – numeric abstractions library (12KLOC)



Evaluation - Code size

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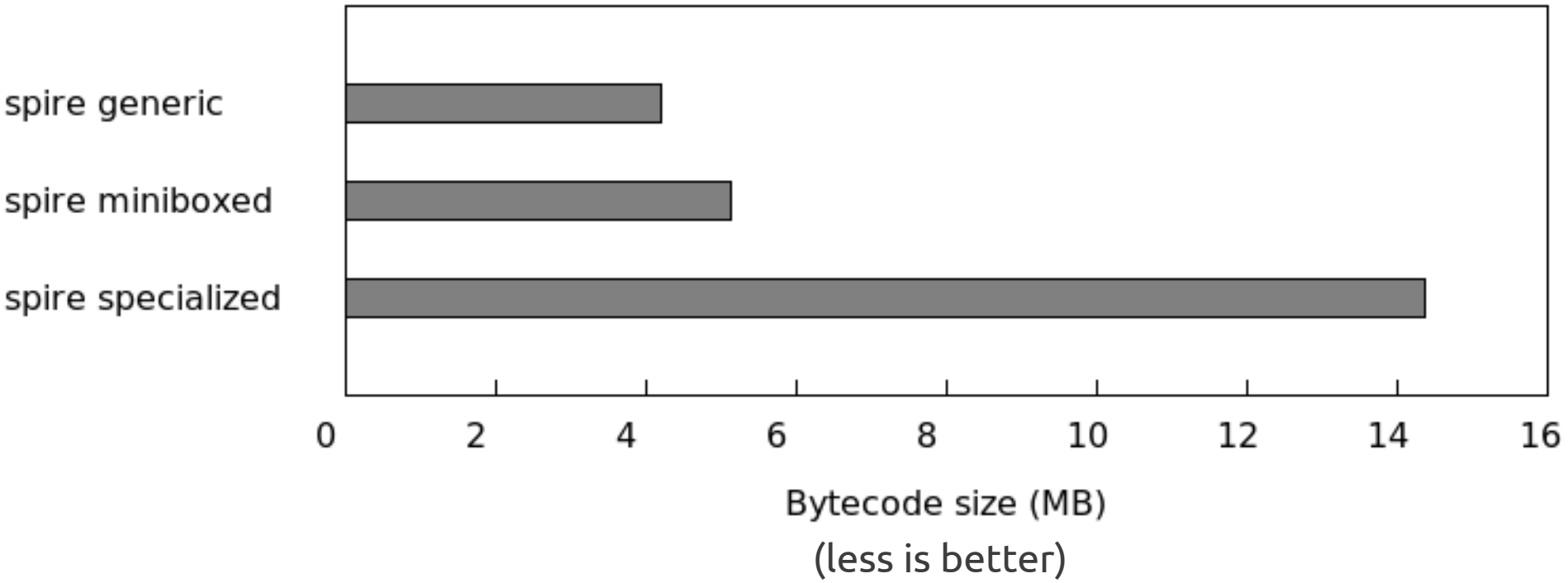
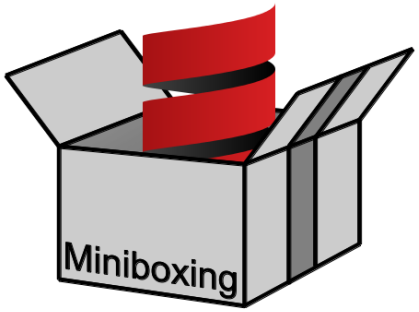


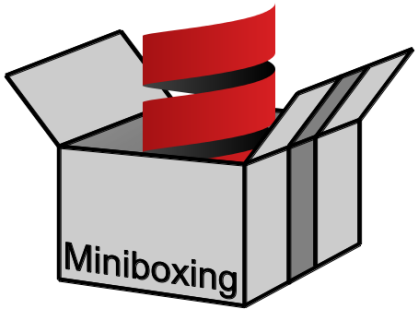
2.8x bytecode reduction (4.7x for `Vector` in std. lib)

Contributions



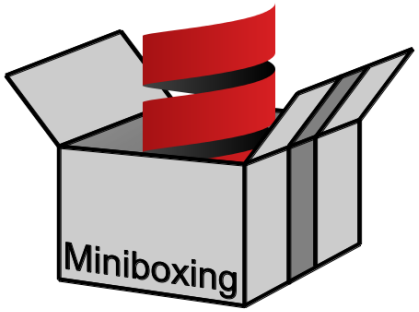
Miniboxing

Contributions



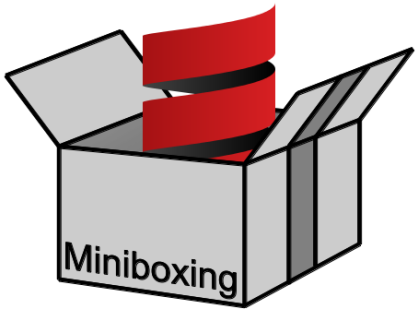
Miniboxing	=	Tagged union

Contributions



Miniboxing = Tagged union + Tag hoisting

Contributions

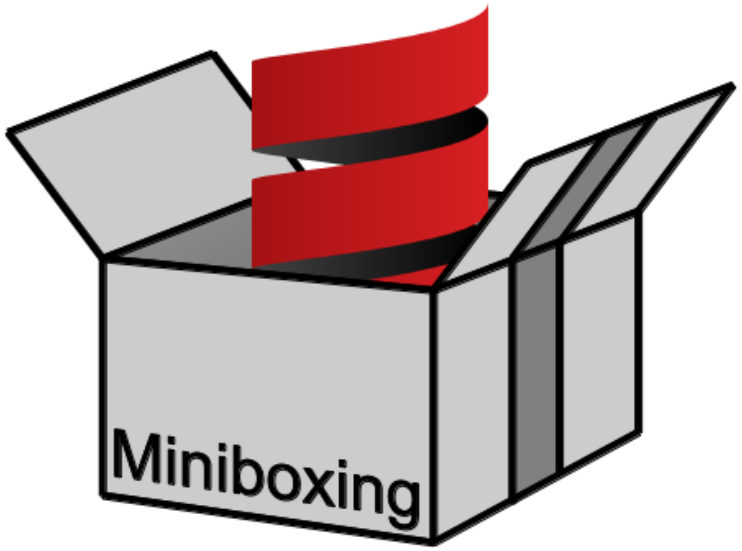


Miniboxing = Tagged union +

Tag hoisting +

Load-time specialization

Conclusions



- improves performance
- reduces bytecode size

visit scala-miniboxing.org!