



scala-miniboxing.org

14th of November 2014
PNWScala
Portland, OR

Vlad URECHE

PhD student in the Scala Team @ EPFL

Miniboxing guy. Also worked on Scala specialization, the backend and scaladoc.



@VladUreche



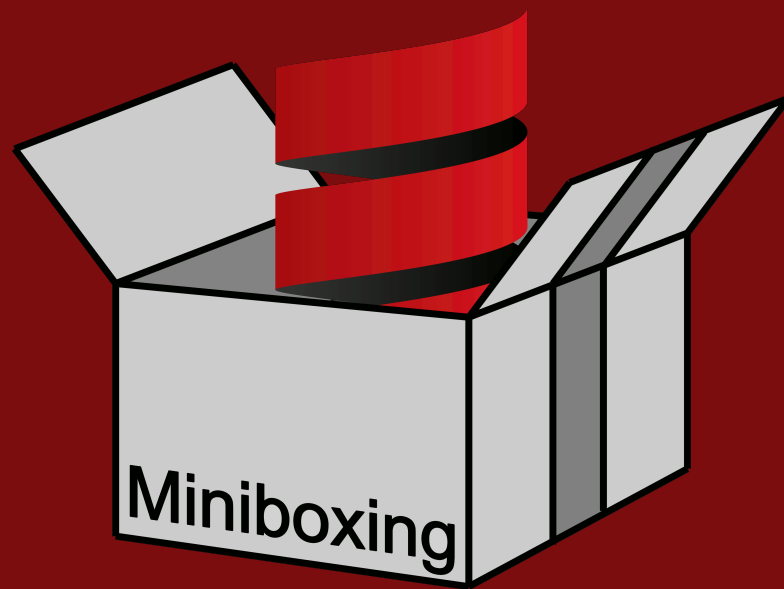
@VladUreche



vlad.ureche@epfl.ch



scala-miniboxing.org



scala-miniboxing.org



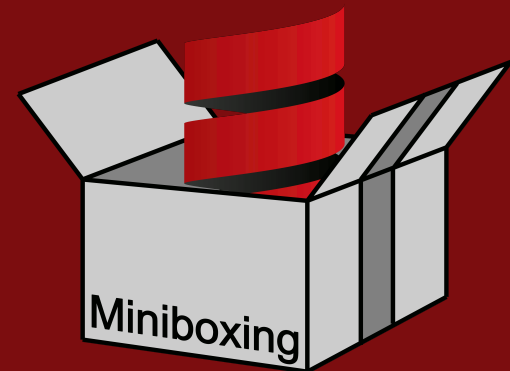
What is miniboxing?

Why use it?

How to use it?

Benchmarks

Conclusion

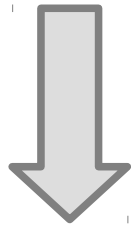


Erased Generics

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

Erased Generics

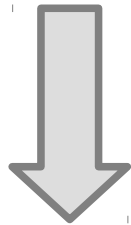
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scalac / javac

Erased Generics

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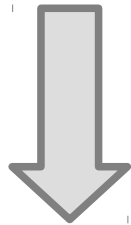
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Erased Generics

identity(5)

Erased Generics

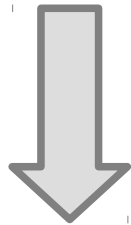
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scalac / javac

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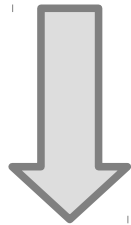


scalac / javac

identity(java.lang.Integer.valueOf(5))

Erased Generics

identity(5)



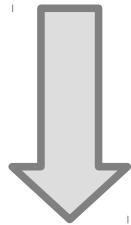
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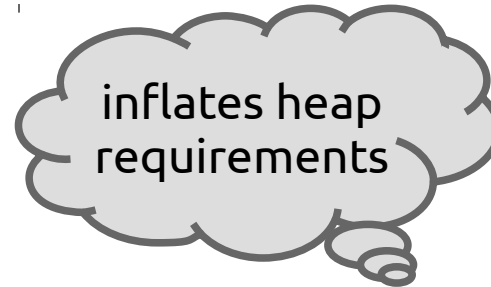
Object representation

Erased Generics

identity(5)



scalac / javac

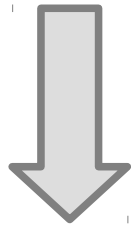


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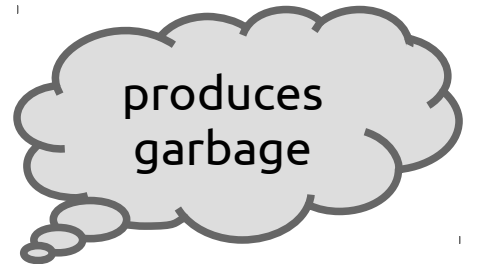
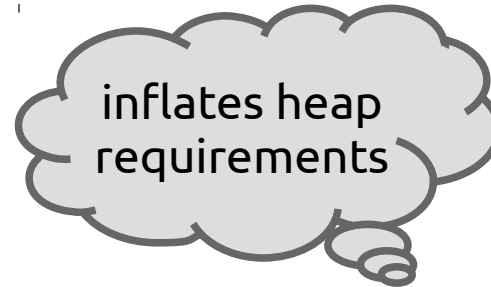
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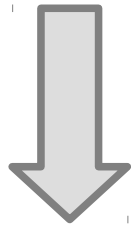


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Object representation

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identity(5)



scalac / javac

inflates heap
requirements

produces
garbage

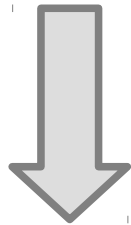
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Object representation

indirect
(slow) access
to the value

Erased Generics

identity(5)



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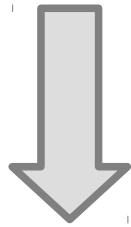
breaks locality
guarantees

Specialization

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


Specialization

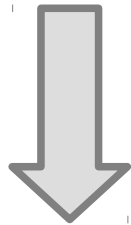
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specialization

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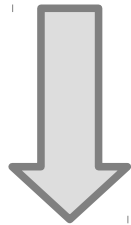


specialization

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

Specialization

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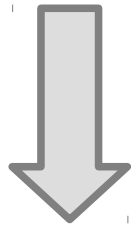


specialization

```
def identity(t: Object): Object = t  
def identity_Z(t: bool): bool = t
```

Specialization

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

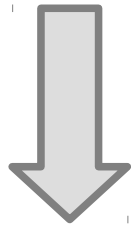


specialization

```
def identity(t: Object): Object = t  
def identity_Z(t: bool): bool = t  
def identity_C(t: char): char = t
```

Specialization

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



specialization

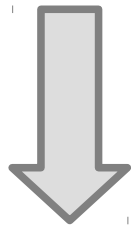
```
def identity(t: Object): Object = t  
def identity_Z(t: bool): bool = t  
def identity_C(t: char): char = t  
... (7 other variants)
```

Specialization

identity(5)

Specialization

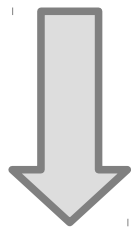
identity(5)



specialization

Specialization

identity(5)

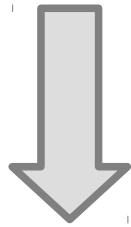


specialization

identity_1(5)

Specialization

identity(5)

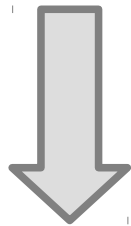


specialization

identity_I(5) // no boxing!

Specialization

identity(5)



specialization

identity_I(5) // no boxing!

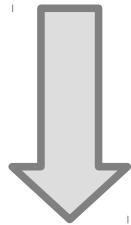
The variant of identity
specialized for **int**

Specialization

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

Specialization

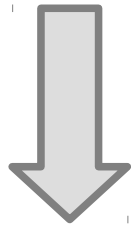
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specialization

Specialization

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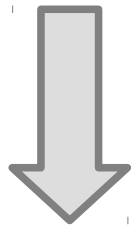


specialization

```
// 100 methods (102)
```

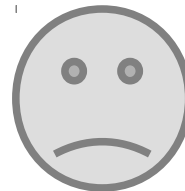
Specialization

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def tupled[T1, T2](t1: T1, t2: T2) ...
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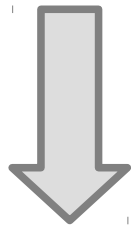
specialization

```
// 100 methods (102)
```



Specialization

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



specialization

```
// 100 methods ( $10^2$ )
```



Can we do
better?

Specialization

the insight

One day in 2012
Miguel Garcia walked
into my office and
said: *“From a low-level
perspective, there
are only values and
pointers. Maybe you
can use that!”*

Specialization

the insight

One day in 2012 Miguel Garcia walked into my office and said: *“From a low-level perspective, there are only values and pointers. Maybe you can use that!”*

LONG

DOUBLE

INT

FLOAT

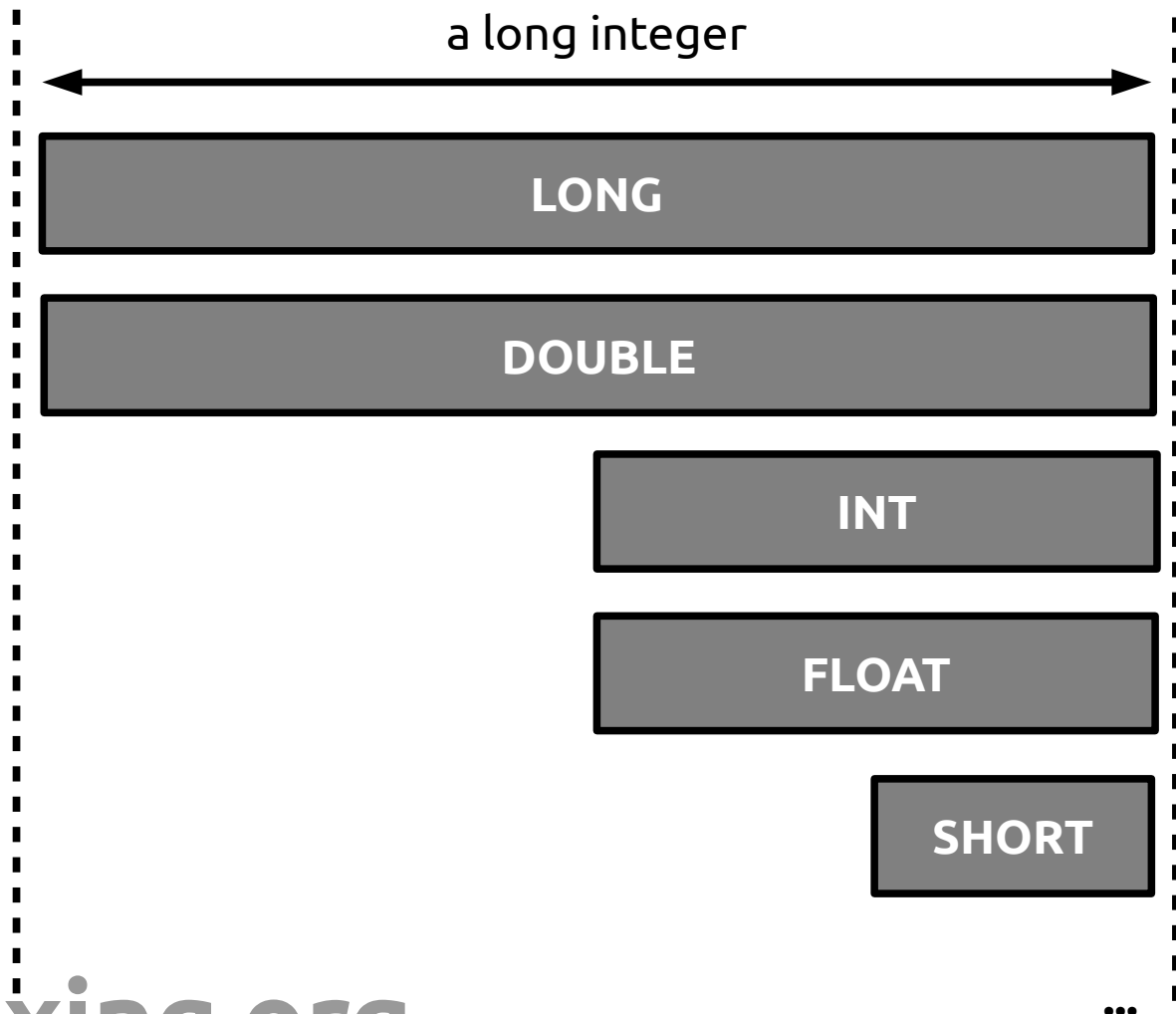
SHORT

...

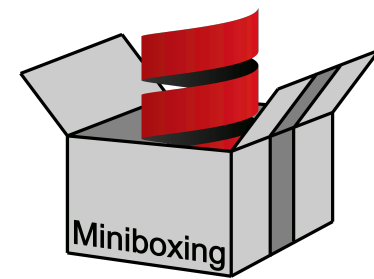
Specialization

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Miniboxing

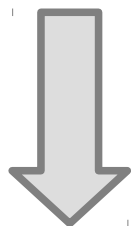


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def identity[T](t: T): T = t
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Miniboxing



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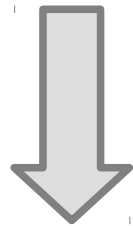
miniboxing

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Miniboxing



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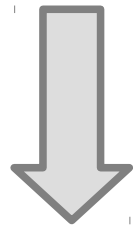
miniboxing

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def identity(t: Object): Object = t
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Miniboxing



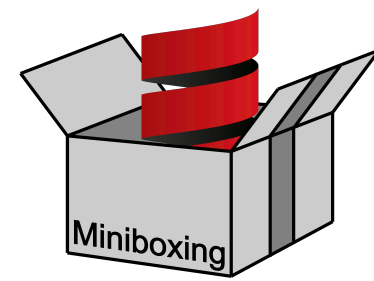
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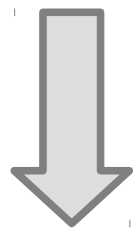
miniboxing

```
def identity(t: Object): Object = t  
def identity_M(..., t: long): long = t
```

Miniboxing



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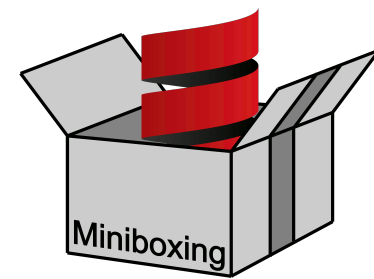


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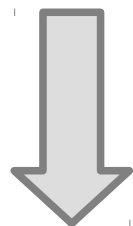
```
def identity(t: Object): Object = t  
def identity_M(..., t: long): long = t
```

long **encodes** all
primitive types

Miniboxing



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

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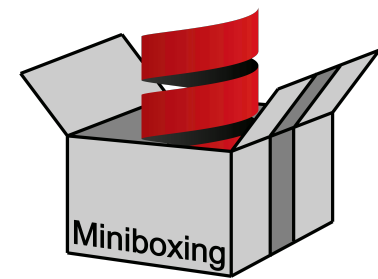
Only 2^n variants

Miniboxing

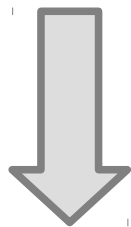


identity(3)

Miniboxing



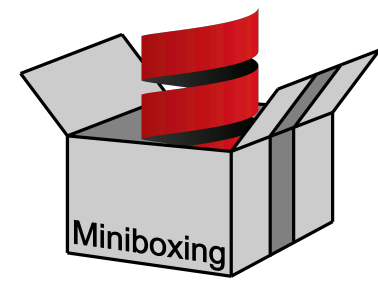
identity(3)



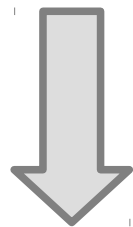
miniboxing

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Miniboxing



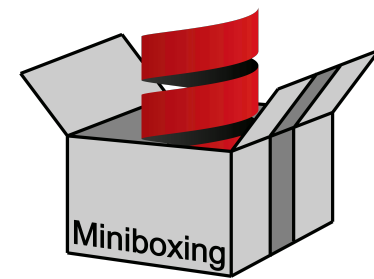
identity(3)



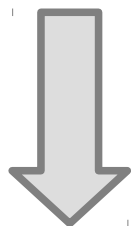
miniboxing

identity_M(..., int2minibox(3))

Miniboxing



identity(3)

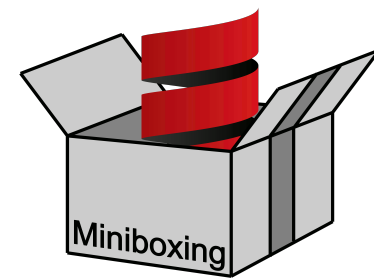


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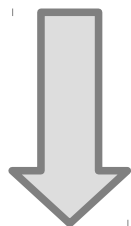
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The miniboxed
variant of identity

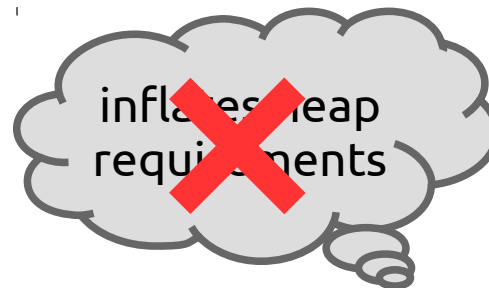
Miniboxing



identity(3)



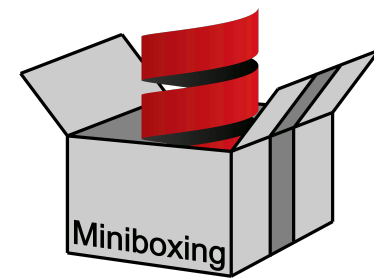
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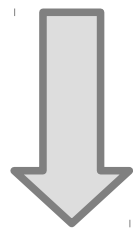
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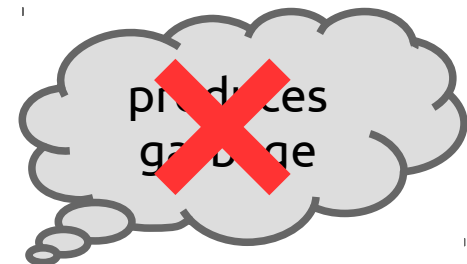
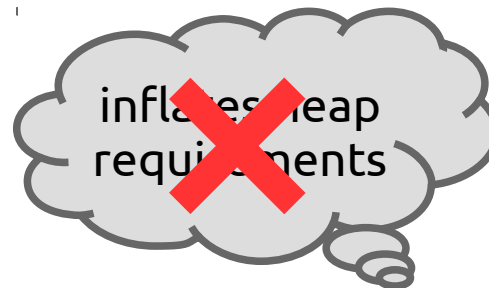
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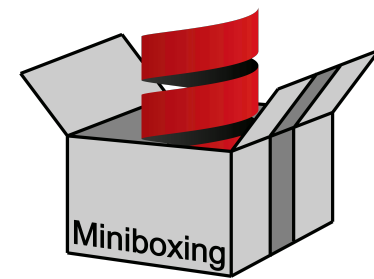
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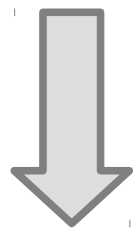
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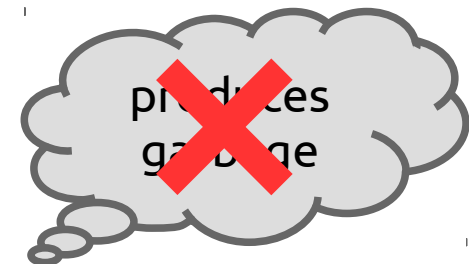
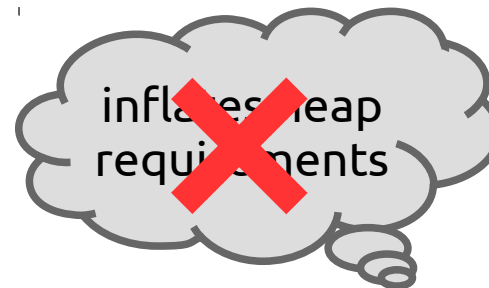
Miniboxing



identity(3)

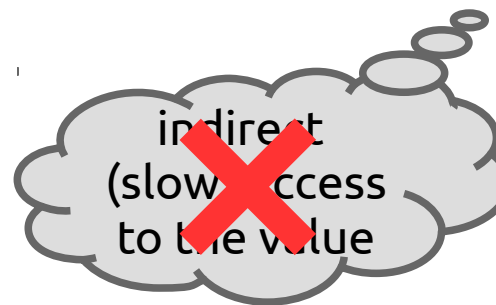


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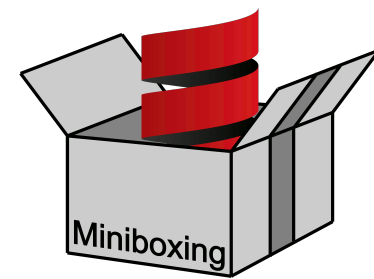


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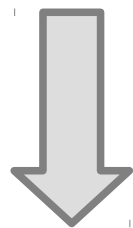
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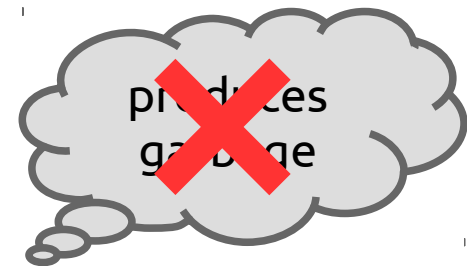
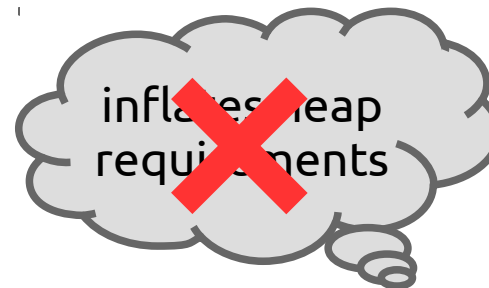
Miniboxing



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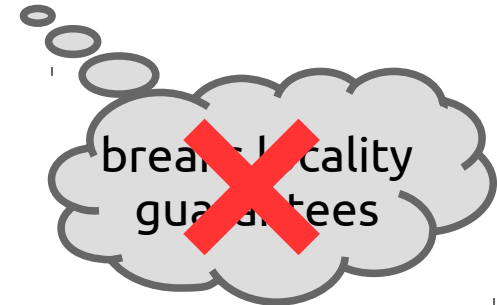
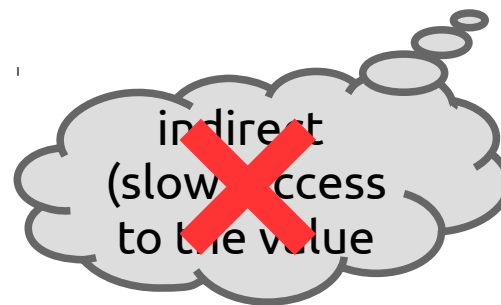


miniboxing



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The miniboxed
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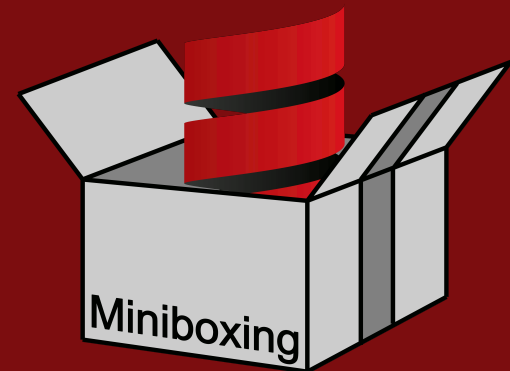
What is miniboxing?

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How to use it?

Benchmarks

Conclusion



PUREIMAGE: RASTER IM- AGE PROCESSING FOR SCALA

<http://stephenjudkins.github.io/pureimage-presentation/#/>

Stephen, are
you around?

PUREIMAGE: RASTER IM- AGE PROCESSING FOR SCALA

<http://stephenjudkins.github.io/pureimage-presentation/#/>

IN PRODUCTION, NO SINGLE OPTIMIZATION PROVED AS FRUITFUL AS AVOIDING BOXING

PureImage

- has very nice abstractions
 - generalizes over input, output format
 - generalizes over pixel format
 - provides collection-like mapping over images
- liked it a lot

PureImage

- took the usual path to using miniboxing
 - code up a mock-up
 - become familiar with the problem
 - try out miniboxing on a small scale
 - then extend to the whole program [not yet]

PureImage Mock-up



This repository Search

Explore Gist Blog Help



VladUreche



VladUreche / image-example

forked from miniboxing/miniboxing-example

Unwatch 1

Star 0

Fork 2

An example of using the miniboxing plugin. <http://scala-miniboxing.org> — Edit

27 commits

1 branch

0 releases

2 contributors



branch: master

image-example / +



This branch is 4 commits ahead of miniboxing:master

Pull Request

Compare

Even better



VladUreche authored 4 hours ago

latest commit [ecbaf78d8f](#)

project	Impl	a day ago
src/main/scala/image/example	Even better	4 hours ago
.gitignore	Impl	a day ago
.travis.yml	No cross compilation	7 months ago
LICENSE	Doc	a year ago
README.md	Update to 0.3 and scala 2.11	5 months ago

README.md

Code

Pull Requests 0

Wiki

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Graphs

Settings

SSH clone URL

<git@github.com:VladUreche:image-example.git>

You can clone with [HTTPS](#), [SSH](#), or [Subversion](#).

Download ZIP

PureImage Mock-up

```
abstract class Image[Repr: Pixel] {  
  def width: Int  
  def height: Int  
  def apply(x: Int, y: Int): Repr  
  def map[Repr2: Pixel](f: Image[Repr] =>  
    Generator[Repr2]): Image[Repr2]  
}
```


PureImage Mock-up

```
abstract class Image[Repr: Pixel] {  
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  def apply(x: Int, y: Int): Repr  
  def map[Repr2: Pixel](f: Image[Repr] =>  
    Generator[Repr2]): Image[Repr2]  
}
```



What's a generator?

PureImage Mock-up

```
abstract class Generator[Repr: Pixel] {  
  def width: Int  
  def height: Int  
  def generate(x: Int, y: Int): Repr  
}
```

PureImage Mock-up

Why generic? What is pixel?

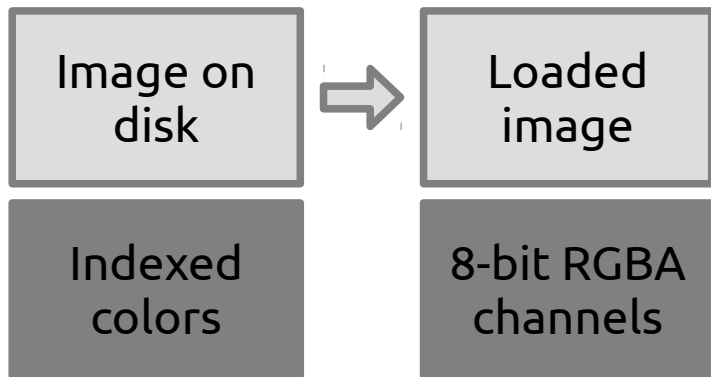
```
abstract class Generator[Repr: Pixel] {  
  def width: Int  
  def height: Int  
  def generate(x: Int, y: Int): Repr  
}
```

PureImage Mock-up

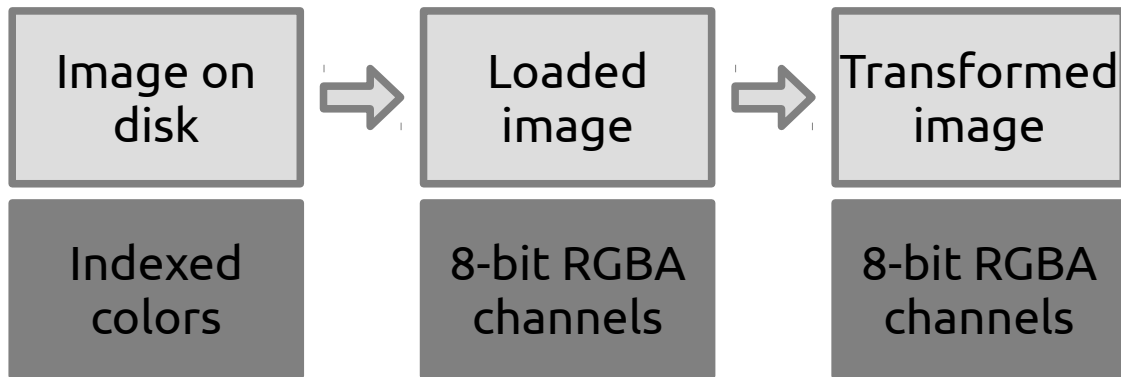
Image on
disk

Indexed
colors

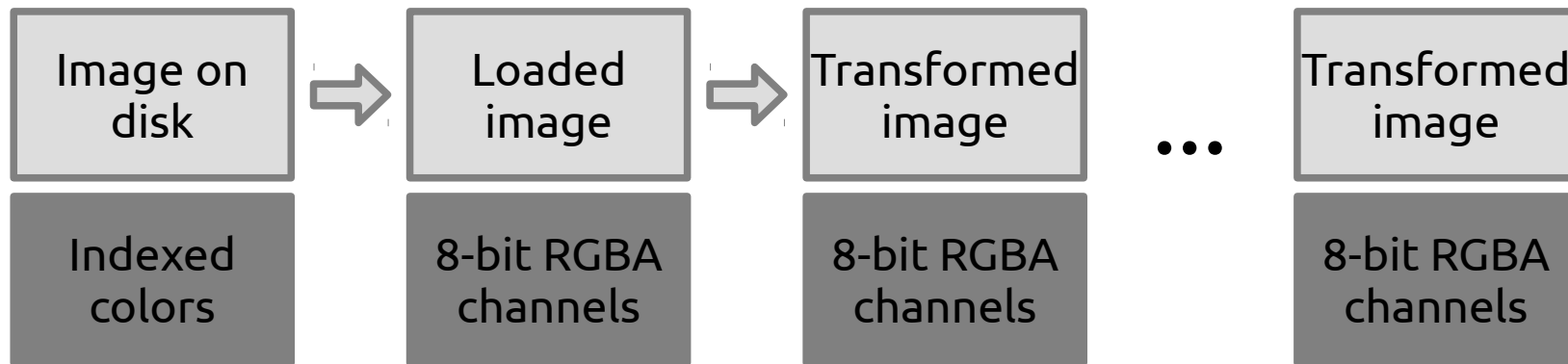
PureImage Mock-up



PureImage Mock-up



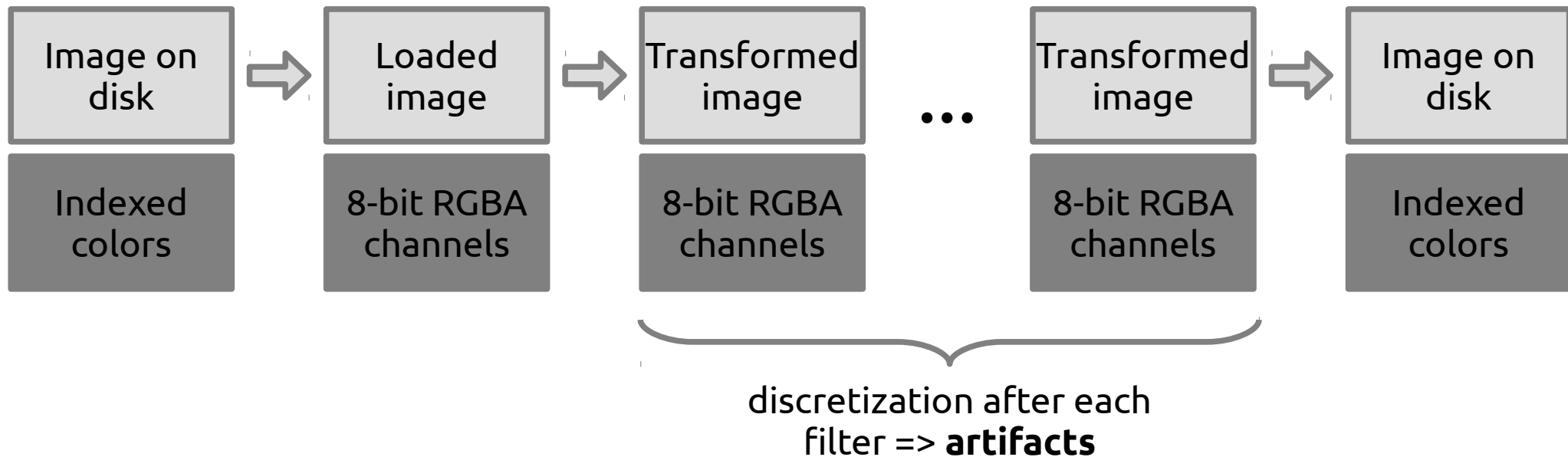
PureImage Mock-up



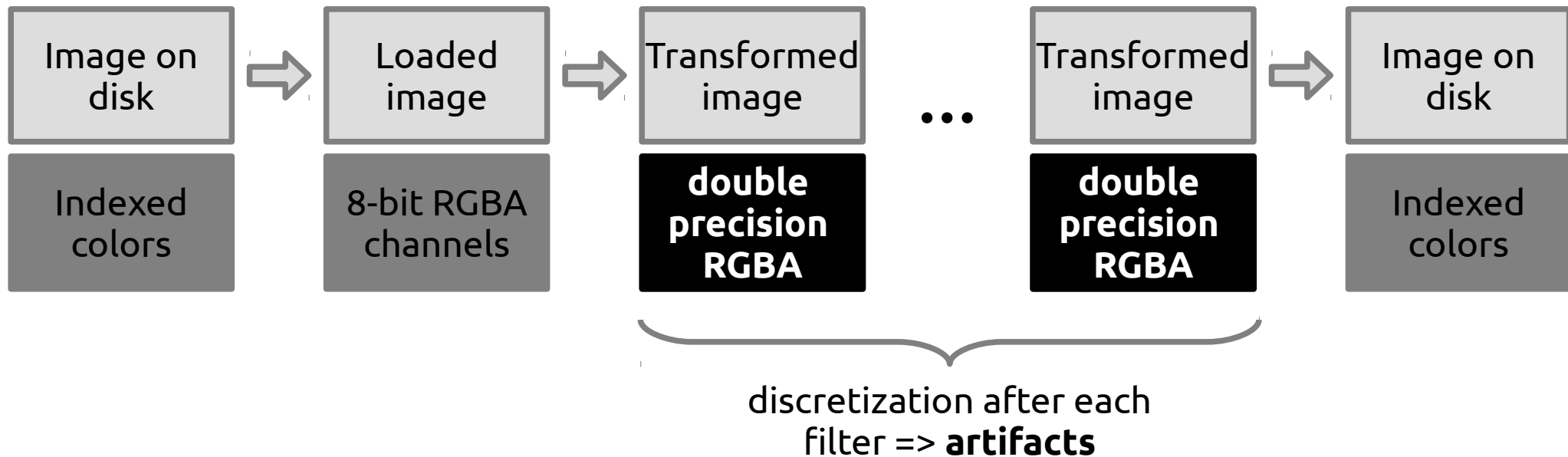
PureImage Mock-up



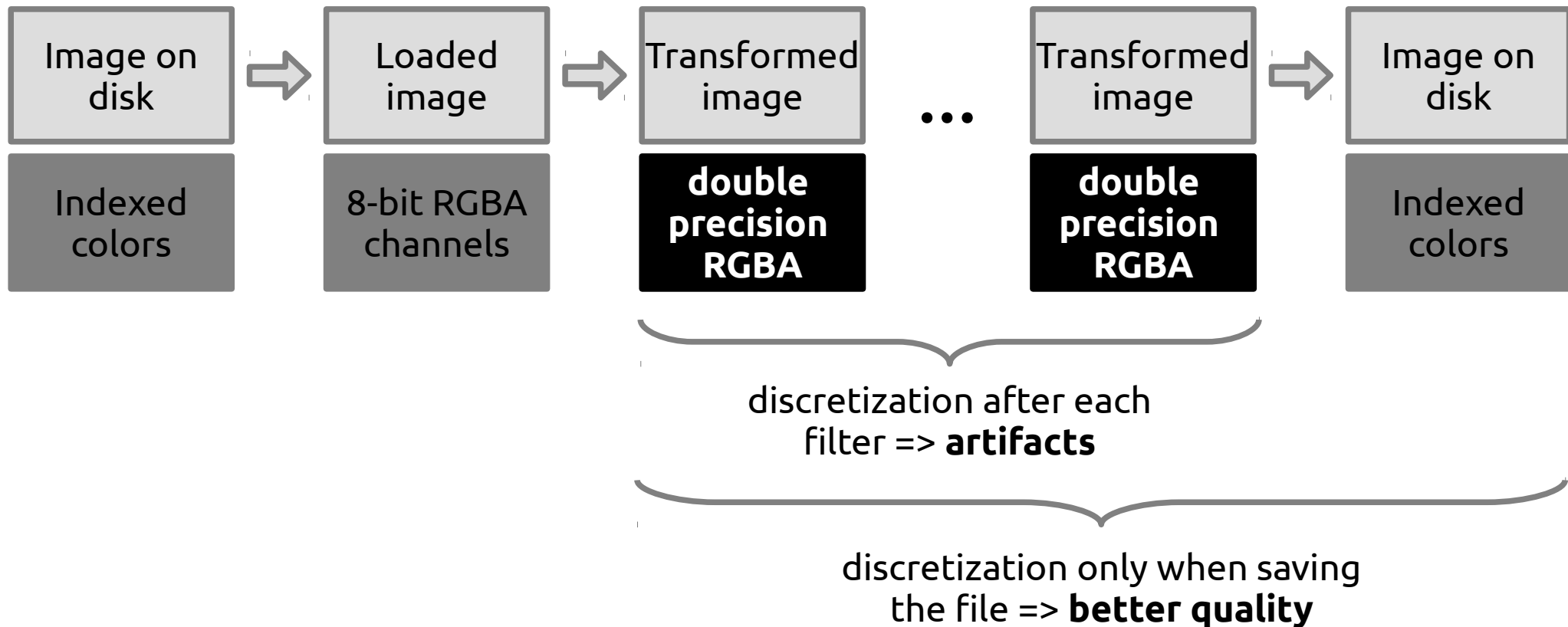
PureImage Mock-up



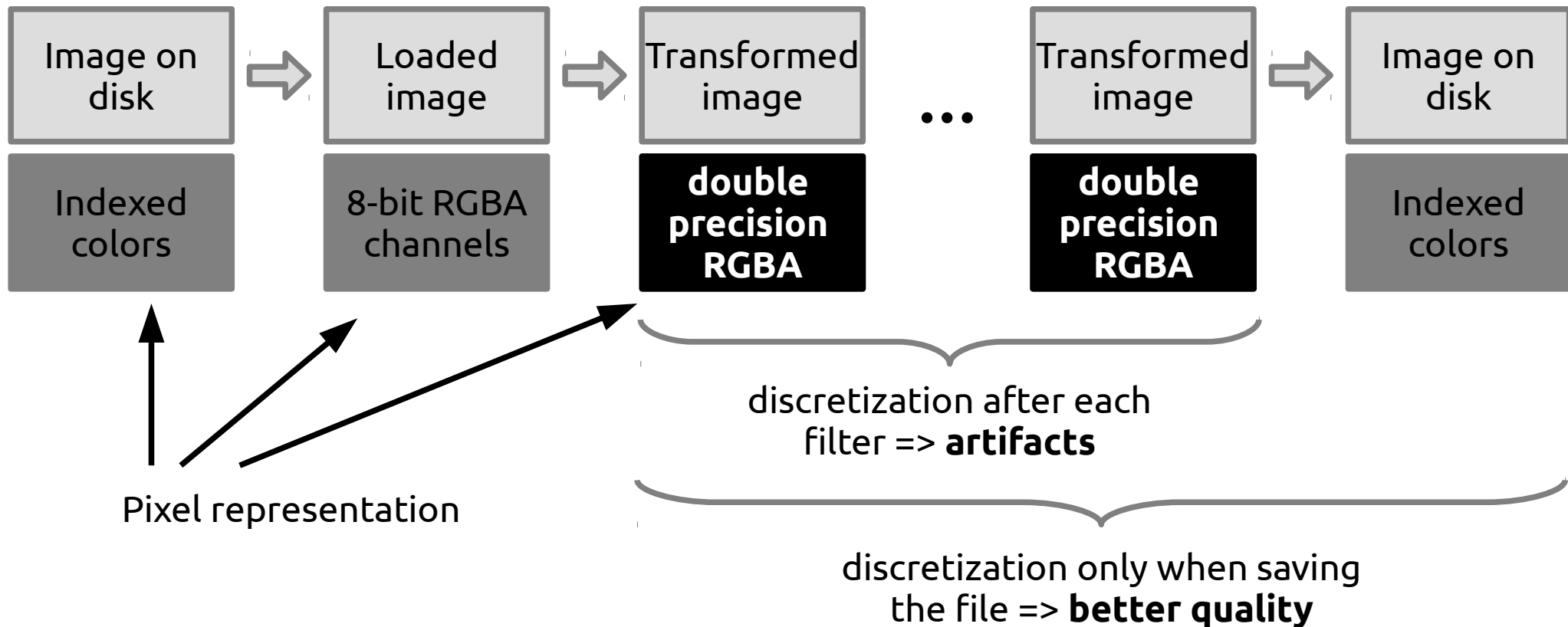
PureImage Mock-up



PureImage Mock-up



PureImage Mock-up



PureImage Mock-up

```
abstract class Pixel[Repr: Manifest] {  
  def r(t: Repr): Double // red  
  def g(t: Repr): Double // green  
  def b(t: Repr): Double // blue  
  def a(t: Repr): Double // alpha  
  def pack(r: Double,  
           g: Double,  
           b: Double,  
           a: Double): Repr  
  ...  
}
```

PureImage Mock-up

```
abstract class Pixel[Repr: Manifest] {  
  def r(t: Repr): Double // red  
  def g(t: Repr): Double // green  
  def b(t: Repr): Double // blue  
  def a(t: Repr): Double // alpha  
  def pack(r: Double,  
           g: Double,  
           b: Double,  
           a: Double): Repr  
  ...  
}
```

All transformations work
on double precision FP
numbers

PureImage Mock-up

```
abstract class Pixel[Repr: Manifest] {  
  def r(t: Repr): Double // red  
  def g(t: Repr): Double // green  
  def b(t: Repr): Double // blue  
  def a(t: Repr): Double // alpha  
  def pack(r: Double,  
           g: Double,  
           b: Double,  
           a: Double): Repr  
  ...  
}
```

All transformations work
on double precision FP
numbers

But the data can be
encoded differently

PureImage Mock-up

```
object RGBA extends Pixel[Int] { ... }  
object RGBAEExtended extends Pixel[Long] { ... }
```


PureImage Mock-up



Encoding all channels

```
object RGBA extends Pixel[Int] { ... }  
object RGBAEExtended extends Pixel[Long] { ... }
```

PureImage Mock-up



Encoding all channels

```
object RGBA extends Pixel[Int] { ... }  
object RGBAExtended extends Pixel[Long] { ... }
```

```
case class DiscreteChannels[T](r: T, g: T, b: T, a: T)  
object FullPixel extends FourChannelPixel[Double]  
object HalfPixel extends FourChannelPixel[Float]
```

PureImage Mock-up

Encoding all channels

```
object RGBA extends Pixel[Int] { ... }  
object RGBAExtended extends Pixel[Long] { ... }
```

Storing channels individually

```
case class DiscreteChannels[T](r: T, g: T, b: T, a: T)  
object FullPixel extends FourChannelPixel[Double]  
object HalfPixel extends FourChannelPixel[Float]
```

PureImage Mock-up

DEMO



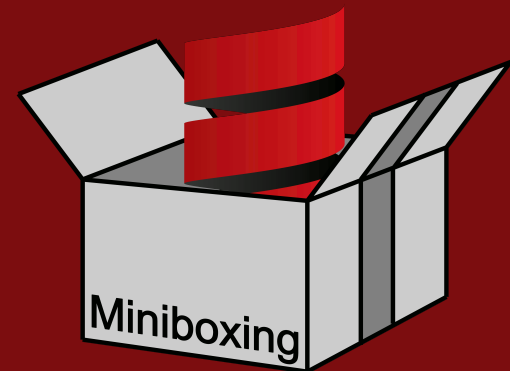
What is miniboxing?

Why use it?

How to use it?

Benchmarks

Conclusion



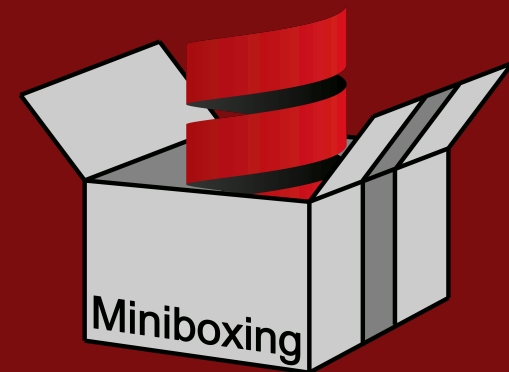
○ How to use it?

○ Sbt Configuration

○ Guidance

○ Website

scala-miniboxing.org

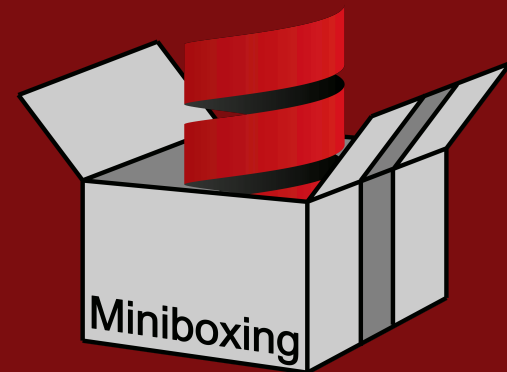


○ How to use it?

● Sbt Configuration

○ Guidance

○ Website



build.sbt

```
resolvers += Resolver.sonatypeRepo("snapshots")
```

```
libraryDependencies += "org.scala-miniboxing.plugins" %%  
    "miniboxing-runtime" % "0.4-SNAPSHOT"
```

```
addCompilerPlugin("org.scala-miniboxing.plugins" %%  
    "miniboxing-plugin" % "0.4-SNAPSHOT")
```


build.sbt

```
resolvers += Resolver.sonatypeRepo("snapshots")
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```
addCompilerPlugin("org.scala-miniboxing.plugins" %%  
  "miniboxing-plugin" % "0.4-SNAPSHOT")
```



Release 0.4 in the works now

build.sbt

scalacOptions ++=

```
"-P:minibox:hijack" :: // transform @specialized into @miniboxed  
"-P:minibox:mark-all" :: // mark all type parameters as @miniboxed  
"-P:minibox:log" :: // explain how classes are transformed  
"-P:minibox:warn" :: // warn for suboptimal code  
"-P:minibox:warn-all" :: // warn for suboptimal code across projects  
Nil
```

build.sbt

scalacOptions ++=

```
"-P:minibox:hijack" :: // transform @specialized into @miniboxed  
"-P:minibox:mark-all" :: // mark all type parameters as @miniboxed  
"-P:minibox:log" :: // explain how classes are transformed  
"-P:minibox:warn" :: // warn for suboptimal code  
"-P:minibox:warn-all" :: // warn for suboptimal code across projects  
Nil
```

Huh? What's the difference?

warn vs warn-all

```
scala> 3 :: Nil // under -P:minibox:warn  
res0: List[Int] = List(3)
```

warn vs warn-all

```
scala> 3 :: Nil // under -P:minibox:warn  
res0: List[Int] = List(3)
```

```
scala> 3 :: Nil // under -P:minibox:warn-all  
<console>:8: warning: The method List.: would benefit from miniboxing  
type parameter B, since it is instantiated by a primitive type.  
    3 :: Nil  
      ^  
res0: List[Int] = List(3)
```

warn vs warn-all

```
scala> 3 :: Nil // under -P:minibox:warn  
res0: List[Int] = List(3)
```

```
scala> 3 :: Nil // under -P:minibox:warn-all
```

```
<console>:8: warning: The method List.: would benefit from miniboxing  
type parameter B, since it is instantiated by a primitive type.
```

```
  3 :: Nil  
    ^
```

```
res0: List[Int] = List(3)
```

warn vs warn-all

```
scala> 3 :: Nil // under -P:minibox:warn  
res0: List[Int] = List(3)
```

```
scala> 3 :: Nil // under -P:minibox:warn-all
```

```
<console>:8: warning: The method List.:: would benefit from miniboxing  
type parameter B, since it is instantiated by a primitive type.
```

```
  3 :: Nil  
    ^
```

```
res0: List[Int] = List(3)
```

Warning for the scala library :)

warn vs warn-all

```
scala> 3 :: Nil // under -P:minibox:warn  
res0: List[Int] = List(3)
```

```
scala> 3 :: Nil // under -P:minibox:warn-all
```

```
<console>:8: warning: The method List.:: would benefit from miniboxing  
type parameter B, since it is instantiated by a primitive type.
```

```
  3 :: Nil  
    ^
```

```
res0: List[Int] = List(3)
```

Warning for the scala library :)

Across projects, not limited to
the program being compiled.

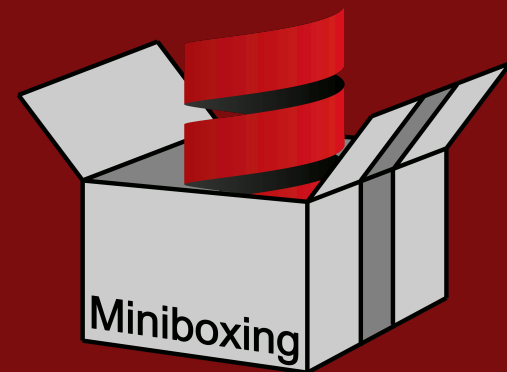
○ How to use it?

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scala-miniboxing.org



Quirks of Scala Specialization

posted by Alex, 03.11.2013.

Having used specialization a lot and having fixed some of its issues, I came across a couple of useful tricks – I want to document them both for myself and others. Specialization is the feature that allows you to generate separate versions of generic classes for primitive types, thus avoiding boxing in most cases. First introduced in Scala 2.8 by Iulian Dragos, by Scala 2.11 specialization has become a pretty robust language feature, and a lot of its issues have been fixed, but there are places where it might stab you in the back if you don't watch out. Problem is, specialization interacts with some edge-cases in the language and obscure language features in ways that are not expected. Sometimes, these are just unresolved bugs. Here are some tips and tricks that might help you.

Note: when used correctly, this is a powerful and extremely useful feature few JVM languages (if any) can parallel these days. Don't get scared by these tips.

Know the conditions for method specialization

Perhaps you're not aware of this, but even if a method is a part of a specialized class and contains specializable code, it will not really be specialized unless the specialized type appears in its argument list or its return type. For example:

```
def getValue[@specialized T]: T = ???

class Foo[@specialized T] {
  var value: T = _
  def reset() {
    value = getValue
  }
}
```

Above, `reset` is not specialized. This is an elaborate design decision taken in specialization. If you want

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Alex Prokopec, [axel22.github.io](https://github.com/axel22)

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- performance (on the JVM) is **magic**

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Note: while specialization doesn't really help with parallelism (if any) can parallel these days. Don't get scared by these tips.

- performance (on the JVM) is **magic**
- specialization (in scalac) is **black magic**

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Note: while specialization does not generate code for parallel collections (if any) can parallel these days. Don't get scared by these tips.

- performance (on the JVM) is **magic**
- specialization (in scalac) is **black magic**
 - “know the conditions of specialization”
 - point n: “Use Traits”
 - point n+1: “Don't use Traits”

Know the conditions for method specialization

Perhaps you're not aware of this, but even if a method is a part of a specialized class and contains specializable code, it will not be specialized if the type appears in its argument list or its return type. For example:

```
def getValue@specialized(): T = ...  
  
class Foo[T] {  
  var value: T = ...  
  def reset() {  
    value = getValue  
  }  
}
```

- ... and other 10 pieces of advice ...
- is your code running at max performance?
 - who knows?

Above, `reset` is not specialized. This is an elaborate design decision taken by the compiler. If you want

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posted by Alex, 03.11.2013.

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designer of the parallel collections

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Note: while specialization is a powerful tool, it can be a bit tricky to use. It's not always clear when it's the right tool for the job. Sometimes, using traits or other techniques can be a better choice. Don't get scared by these tips.

- performance (on the JVM) is **magic**
- specialization (in scalac) is **black magic**
 - “know the conditions of specialization”
 - point n: “Use Traits”
 - point n+1: “Don't use Traits”

Know the conditions for method specialization

Perhaps you're not aware of this, but even if a method is a part of a specialized class and contains specializable code, it might not be specialized. If a non-primitive type appears in its argument list or its return type. For example:

```
def getValue@specialized(): T = ...

class Foo[T] {
  var value: T = ...
  def reset() {
    value = getValue
  }
}
```

– ... and other 10 pieces of advice ...

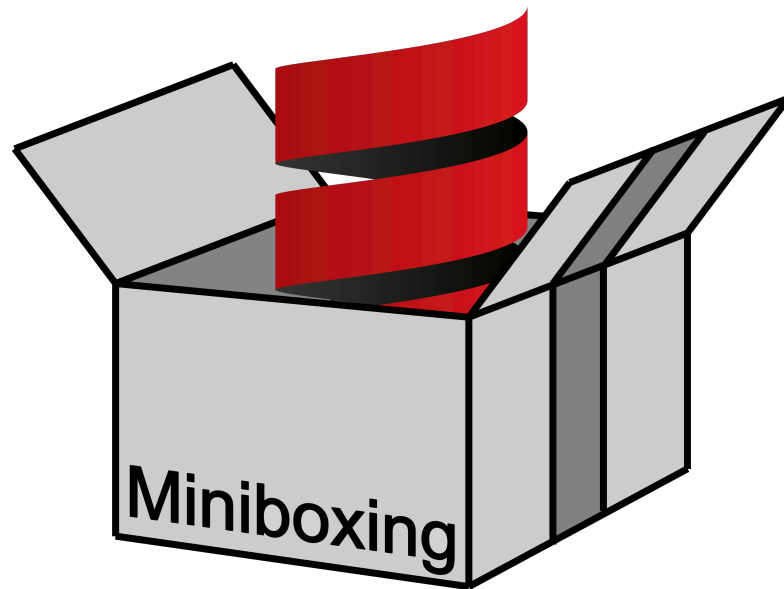
– is your code running at max performance?

- who knows?

Can we do something about this?

Above, `reset` is not specialized. This is an elaborate design decision taken by the compiler. If you want

Guidance



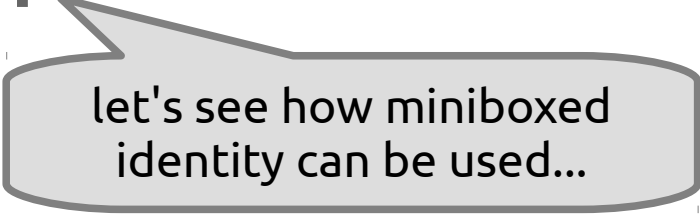
-P:minibox:warn

Guidance

```
scala> def identity[@miniboxed T](t: T) = t  
foo: [T](t: T)T
```

Guidance

```
scala> def identity[@miniboxed T](t: T) = t  
foo: [T](t: T)T
```



let's see how miniboxed
identity can be used...

Guidance

Guidance

```
scala> identity(3)  
res1: Int = 3
```

Guidance

```
scala> identity(3)
```

```
res1: Int = 3
```

```
scala> identity("3")
```

```
res2: String = 3
```

Guidance

```
scala> identity(3)  
res1: Int = 3
```

```
scala> identity("3")  
res2: String = 3
```

```
scala> identity[Any](3)  
<console>:9: warning: Using the type argument "Any" for the miniboxed type  
parameter T of method identity is not specific enough, as it could mean  
either a primitive or a reference type. Although method foo is miniboxed, it  
won't benefit from specialization:  
    identity[Any](3)  
      ^  
res3: Any = 3
```

Guidance

```
scala> identity(3)  
res1: Int = 3
```

```
scala> identity("3")  
res2: String = 3
```

```
scala> identity[Any](3)
```

<console>:9: warning: Using the type argument "Any" for the miniboxed type parameter T of method identity is not specific enough, as it could mean either a primitive or a reference type. Although method foo is miniboxed, it won't benefit from specialization:

```
    identity[Any](3)  
      ^
```

```
res3: Any = 3
```

what if identity wasn't miniboxed?

Guidance

Guidance

```
scala> def foo[T](t: T) = t  
foo: [T](t: T)T
```

Guidance

```
scala> def foo[T](t: T) = t  
foo: [T](t: T)T
```

```
scala> def bar[T](t: T) = foo(t)  
bar: [T](t: T)T
```

Guidance

```
scala> def foo[T](t: T) = t  
foo: [T](t: T)T
```

```
scala> def bar[T](t: T) = foo(t)  
bar: [T](t: T)T
```

```
scala> bar(3)
```

```
<console>:10: warning: The method bar would benefit from miniboxing type  
parameter T, since it is instantiated by a primitive type.
```

```
    bar(3)  
    ^
```

```
res1: Int = 3
```

Guidance

```
scala> def foo[T](t: T) = t  
foo: [T](t: T)T
```

```
scala> def bar[T](t: T) = foo(t)  
bar: [T](t: T)T
```

```
scala> bar(3)
```

<console>:10: warning: The method bar would benefit from miniboxing type parameter T, since it is instantiated by a primitive type.

```
    bar(3)  
    ^
```

```
res1: Int = 3
```

bar is generic, let's
add **@miniboxed**

Guidance

```
scala> def foo[T](t: T) = t  
foo: [T](t: T)T
```

Guidance

```
scala> def foo[T](t: T) = t  
foo: [T](t: T)T
```

```
scala> def bar[@miniboxed T](t: T) = foo(t)  
<console>:8: warning: The method foo would benefit from miniboxing type  
parameter T, since it is instantiated by miniboxed type parameter T of method  
bar.
```

```
    def bar[@miniboxed T](t: T) = foo(t)  
                                ^
```

```
bar: [T](t: T)T
```

Guidance

```
scala> def foo[T](t: T) = t  
foo: [T](t: T)T
```

```
scala> def bar[@miniboxed T](t: T) = foo(t)  
<console>:8: warning: The method foo would benefit from miniboxing type  
parameter T, since it is instantiated by miniboxed type parameter T of method  
bar.
```

```
    def bar[@miniboxed T](t: T) = foo(t)  
                                ^
```

```
bar: [T](t: T)T
```

```
scala> bar(3)  
res1: Int = 3
```


Guidance

```
scala> def foo[T](t: T) = t  
foo: [T](t: T)T
```

```
scala> def bar[@miniboxed T](t: T) = foo(t)
```

<console>:8: warning: The method foo would benefit from miniboxing type parameter T, since it is instantiated by miniboxed type parameter T of method bar.

```
    def bar[@miniboxed T](t: T) = foo(t)
```

```
bar: [T](t: T)T
```

```
scala> bar(3)  
res1: Int = 3
```

Why? Because the miniboxed bar should call miniboxed foo, but foo is not miniboxed...

Guidance

```
scala> def foo[@miniboxed T](t: T) = t  
foo: [T](t: T)T
```

Guidance

```
scala> def foo[@miniboxed T](t: T) = t  
foo: [T](t: T)T
```

```
scala> def bar[@miniboxed T](t: T) = foo(t)  
bar: [T](t: T)T
```

Guidance

```
scala> def foo[@miniboxed T](t: T) = t  
foo: [T](t: T)T
```

```
scala> def bar[@miniboxed T](t: T) = foo(t)  
bar: [T](t: T)T
```

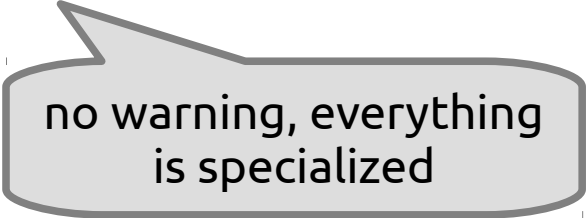
```
scala> bar(3)  
res1: Int = 3
```

Guidance

```
scala> def foo[@miniboxed T](t: T) = t  
foo: [T](t: T)T
```

```
scala> def bar[@miniboxed T](t: T) = foo(t)  
bar: [T](t: T)T
```

```
scala> bar(3)  
res1: Int = 3
```



no warning, everything
is specialized

Guidance

- “optimized trace”
 - one miniboxed method calling another
 - data uses miniboxing encoding
 - three patterns
 - initiator – starts an optimized trace
 - propagator – propagates it
 - inhibitor – goes back to boxed :(

Guidance

- “optimized trace”
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Full tutorial on the website

○ How to use it?

○ Sbt Configuration

○ Guidance

● Website

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Miniboxing is a compilation scheme that improves the performance of generics in [the Scala programming language](#). The miniboxing transformation is generic enough to be potentially useful for any statically typed language running on one of the Java Virtual Machines, such as [Managed X10](#), [Kotlin](#) or [Ceylon](#).

We'll start by following what happens to a generic class, as it gets compiled. Let's take `class C` as an example:

```
class C[T](t: T)
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After compiling this class to Java Virtual Machine bytecode, under the [erasure transformation](#) one would get bytecode which roughly corresponds to:

```
class C {  
  var t: Object = _      // field  
  def C(t: Object): C = { // constructor  
    this.t = t  
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}
```

As you can see, erasure transformed `t` from a generic value into a pointer to a heap object. While this is perfectly suited for storing a string or another class inside `class C`, it becomes suboptimal when dealing with primitive value types, such as booleans, bytes, integers and floating point numbers.

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value classes, staging and many more transformations

...on scheme that improves the performance of generics in the Scala programming language. This transformation is generic enough to be potentially useful for any statically typed language, including the Java Virtual Machines, such as Managed X10, Kotlin or Ceylon.

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Linked List

Benchmarks

on the linked list

- work with Aymeric Genet (github: @MelodyLucid)
- mock-up of Scala linked list
 - Function1 / Function2 / Tuple2
 - Traversable / TraversableLike
 - Iterator / Iterable / IterableLike
 - LinearSeqOptimized
 - Builder / CanBuildFrom

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All the things you hate about the library are there!

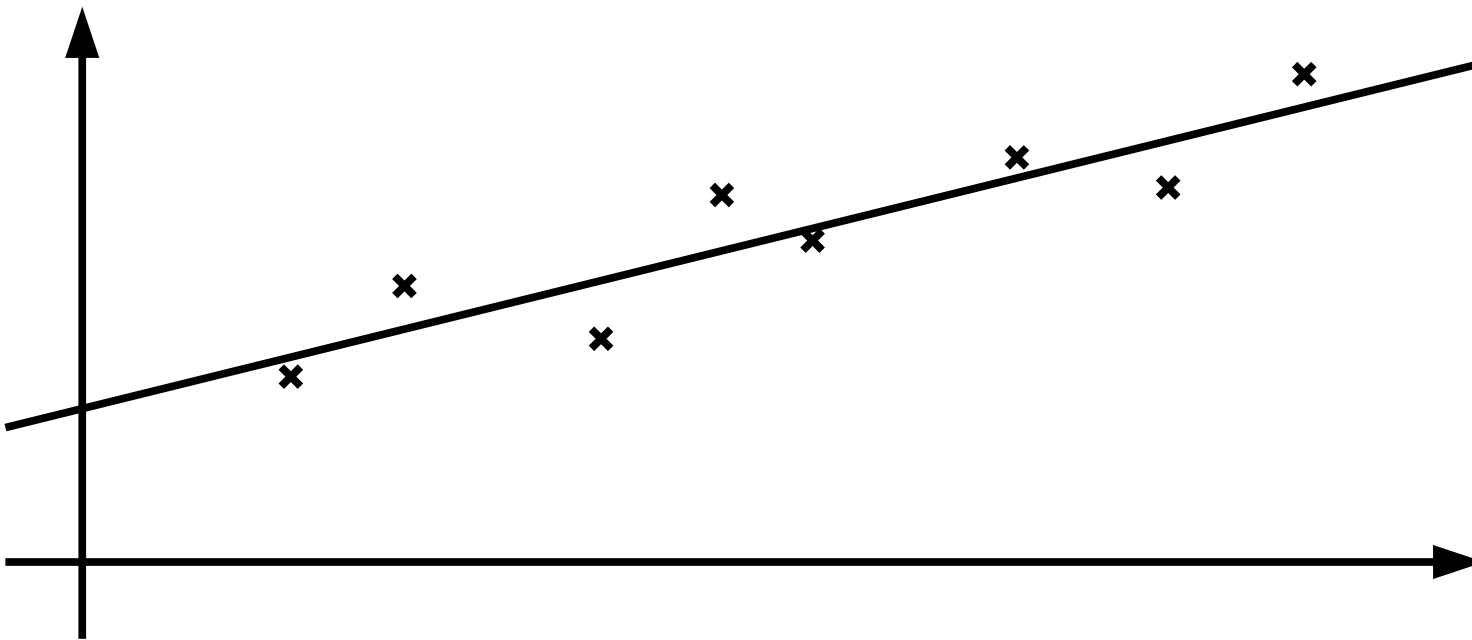
Benchmarks

on the linked list

- benchmark: Least Squares Method

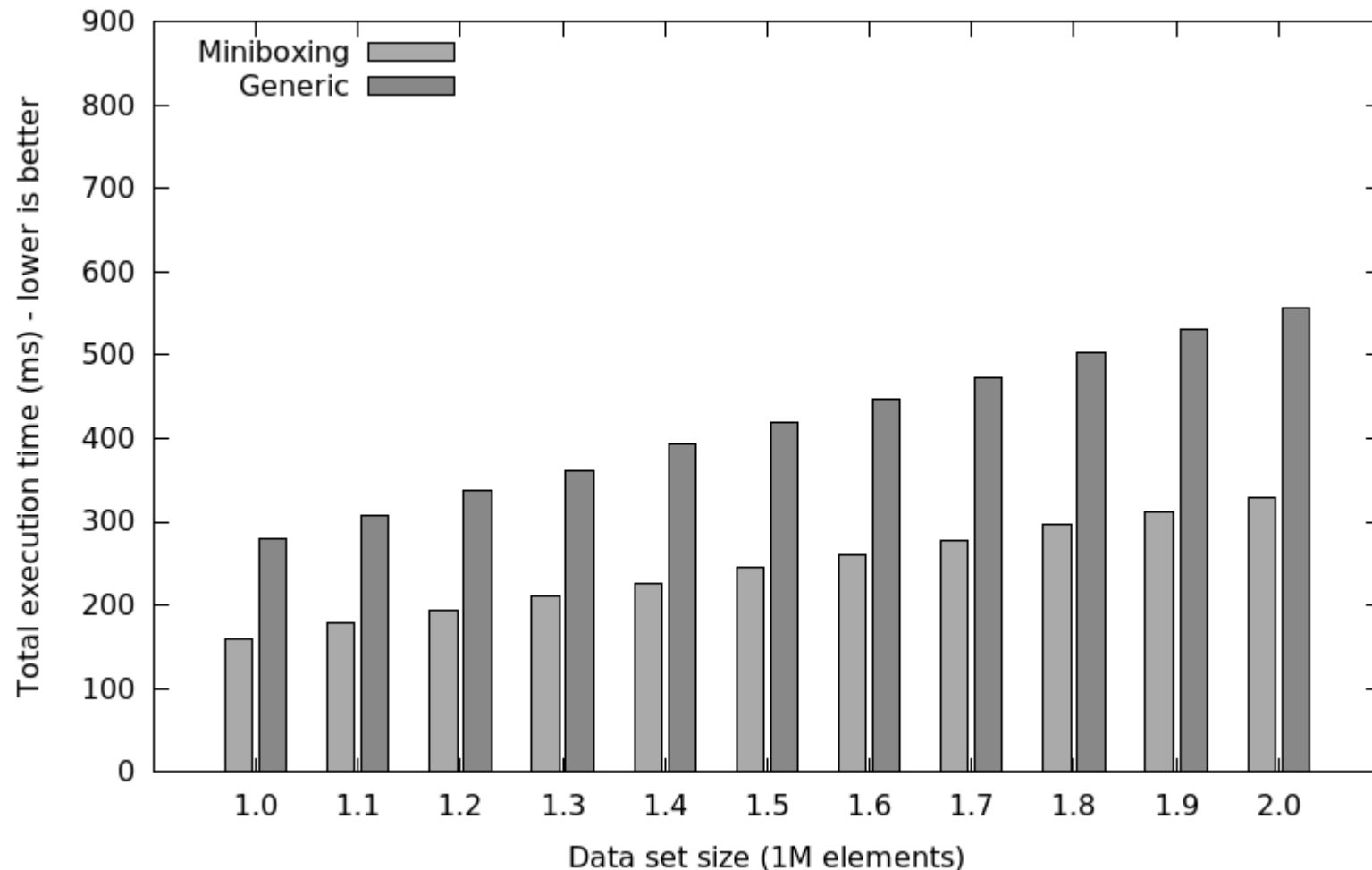
Benchmarks on the linked list

- benchmark: Least Squares Method



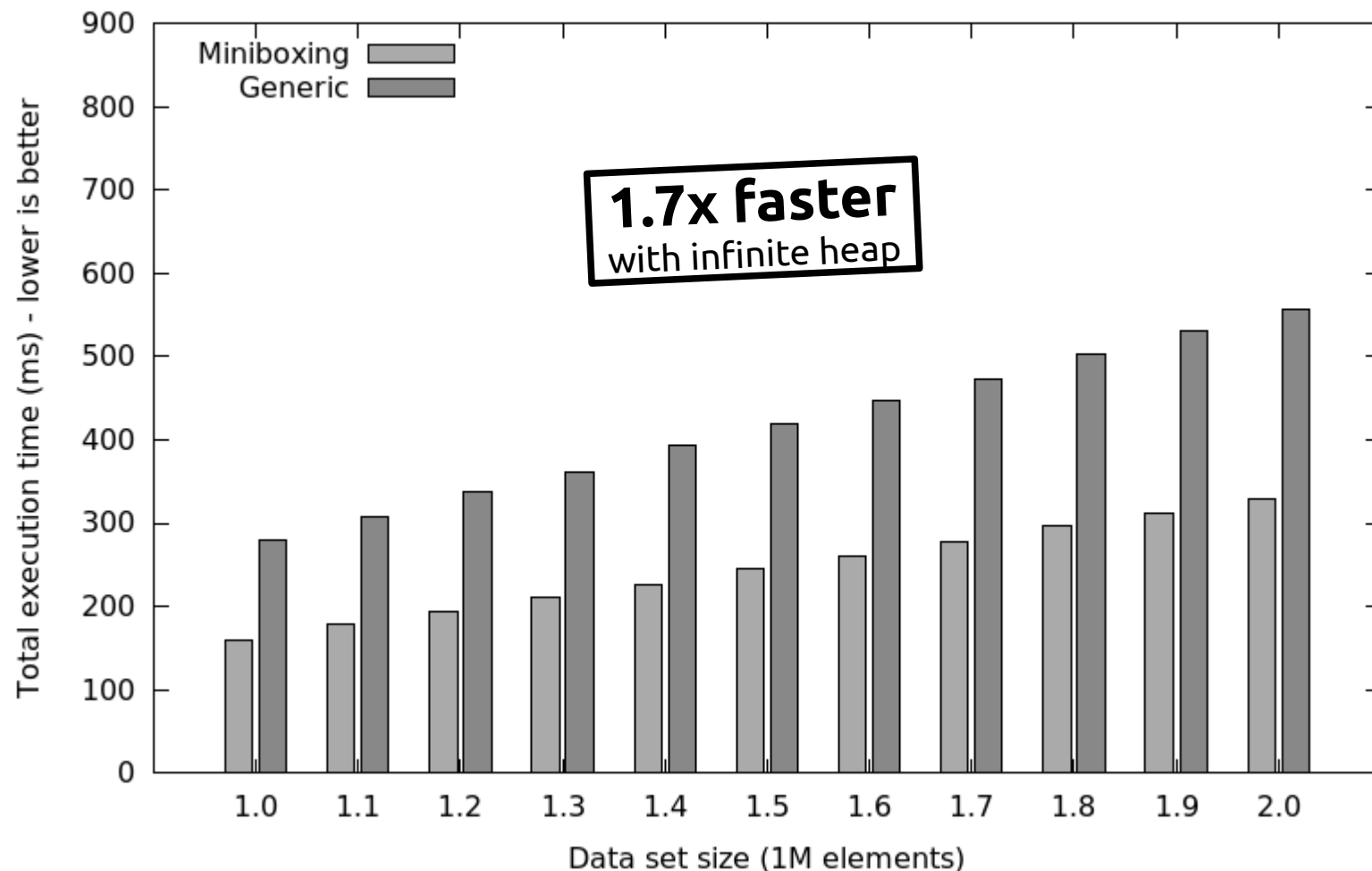
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on the linked list (infinite heap)



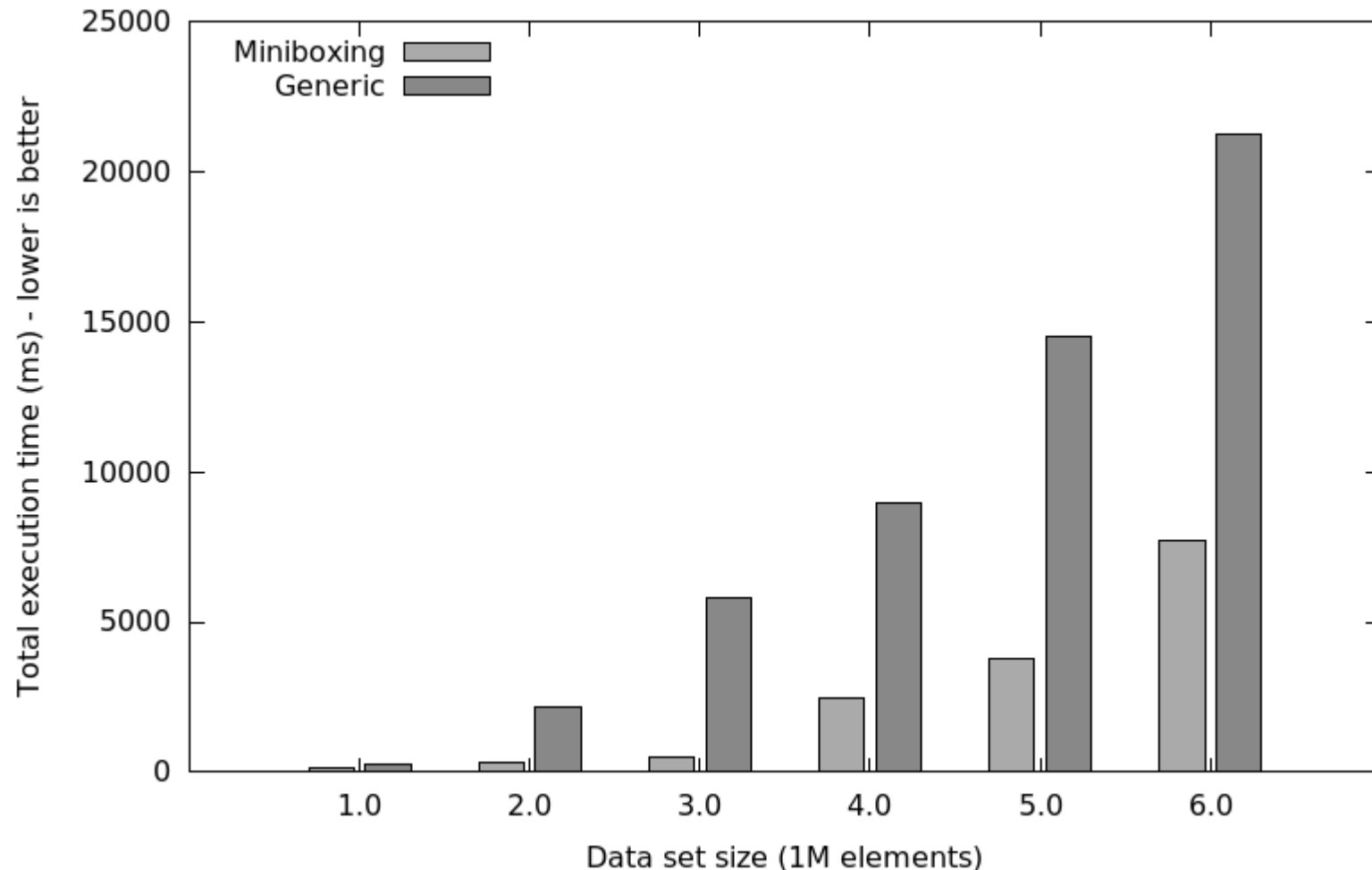
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on the linked list (infinite heap)



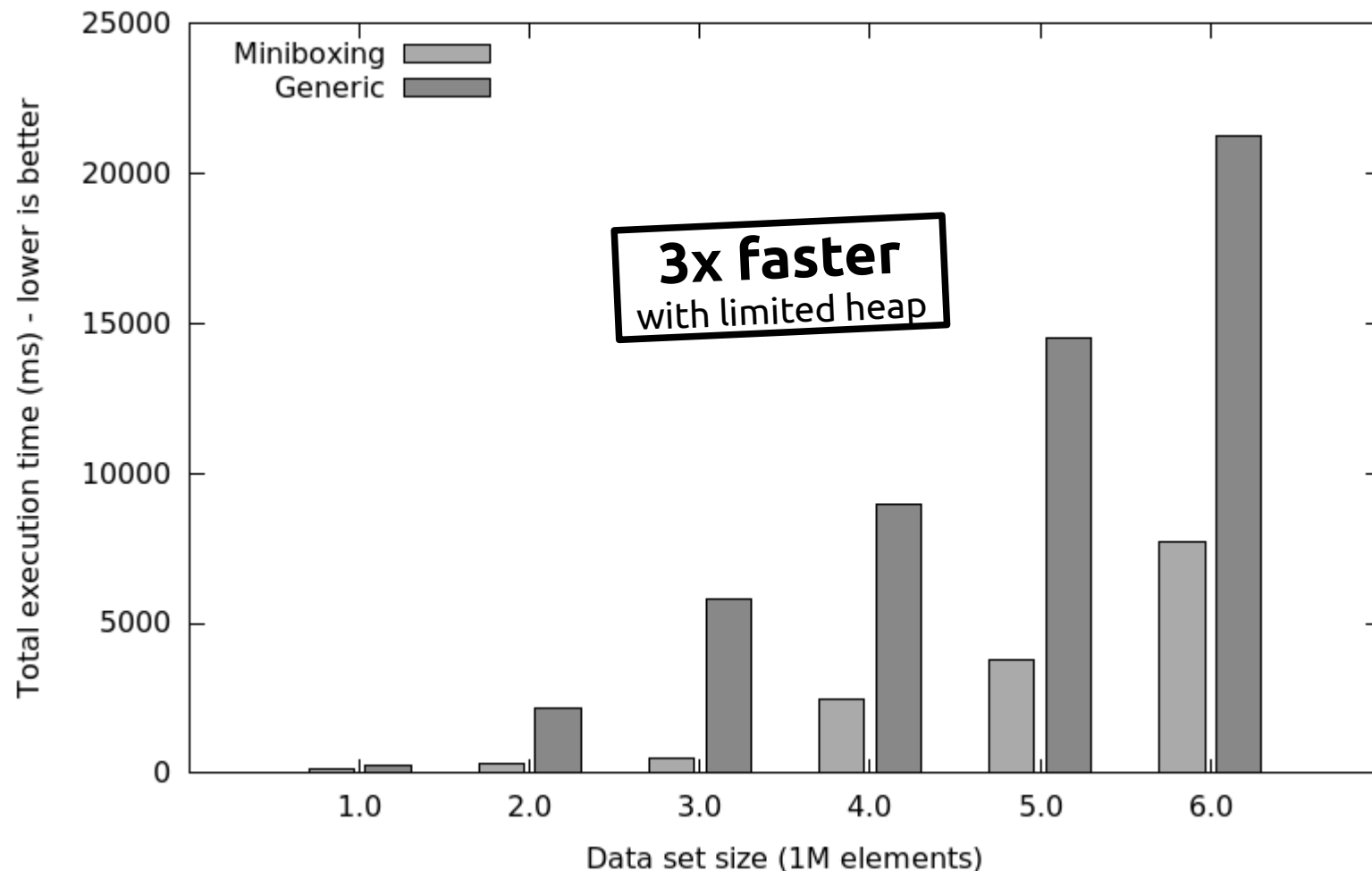
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on the linked list (limited heap)



Benchmarks

on the linked list (limited heap)

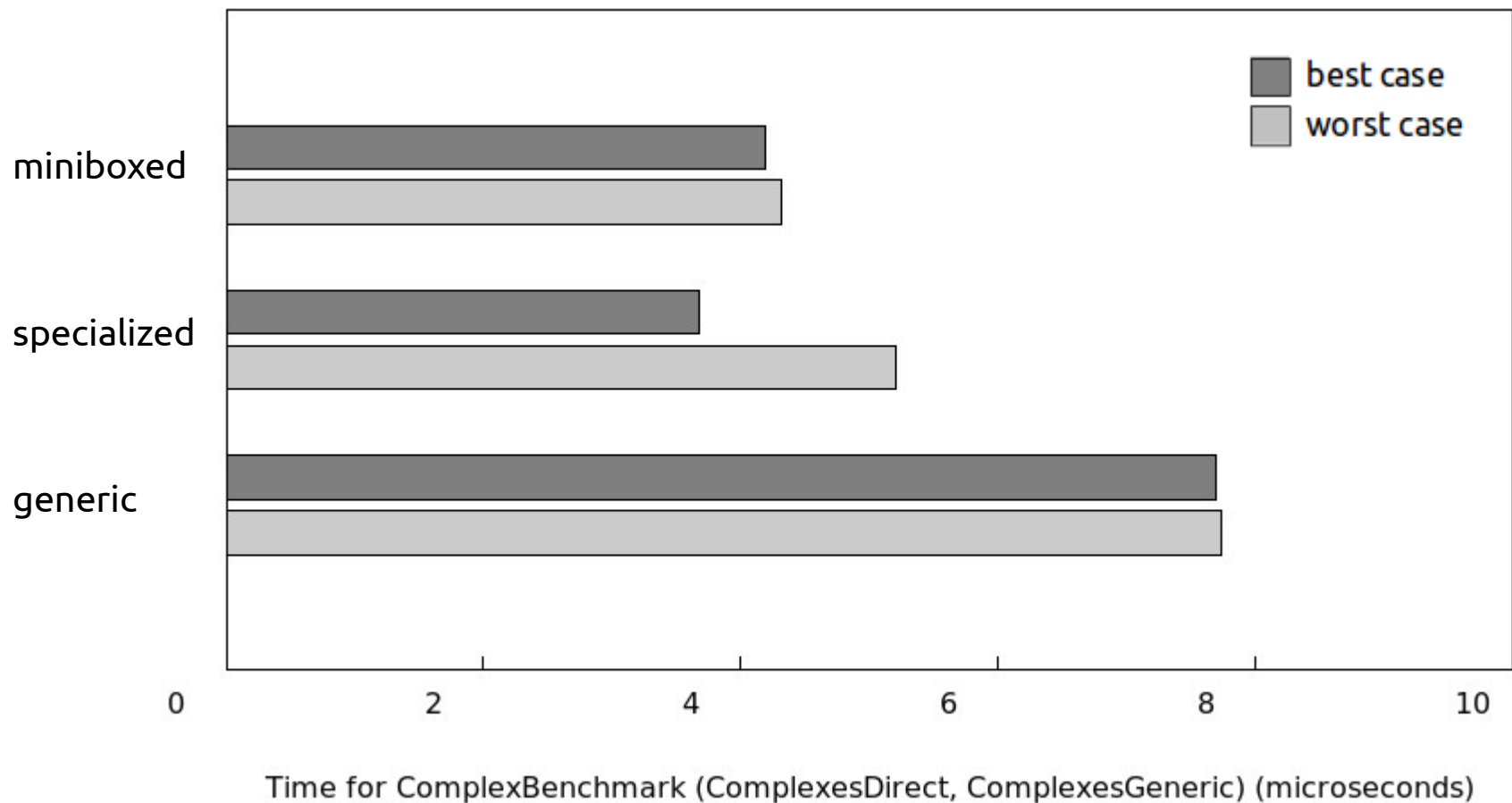


non/spire

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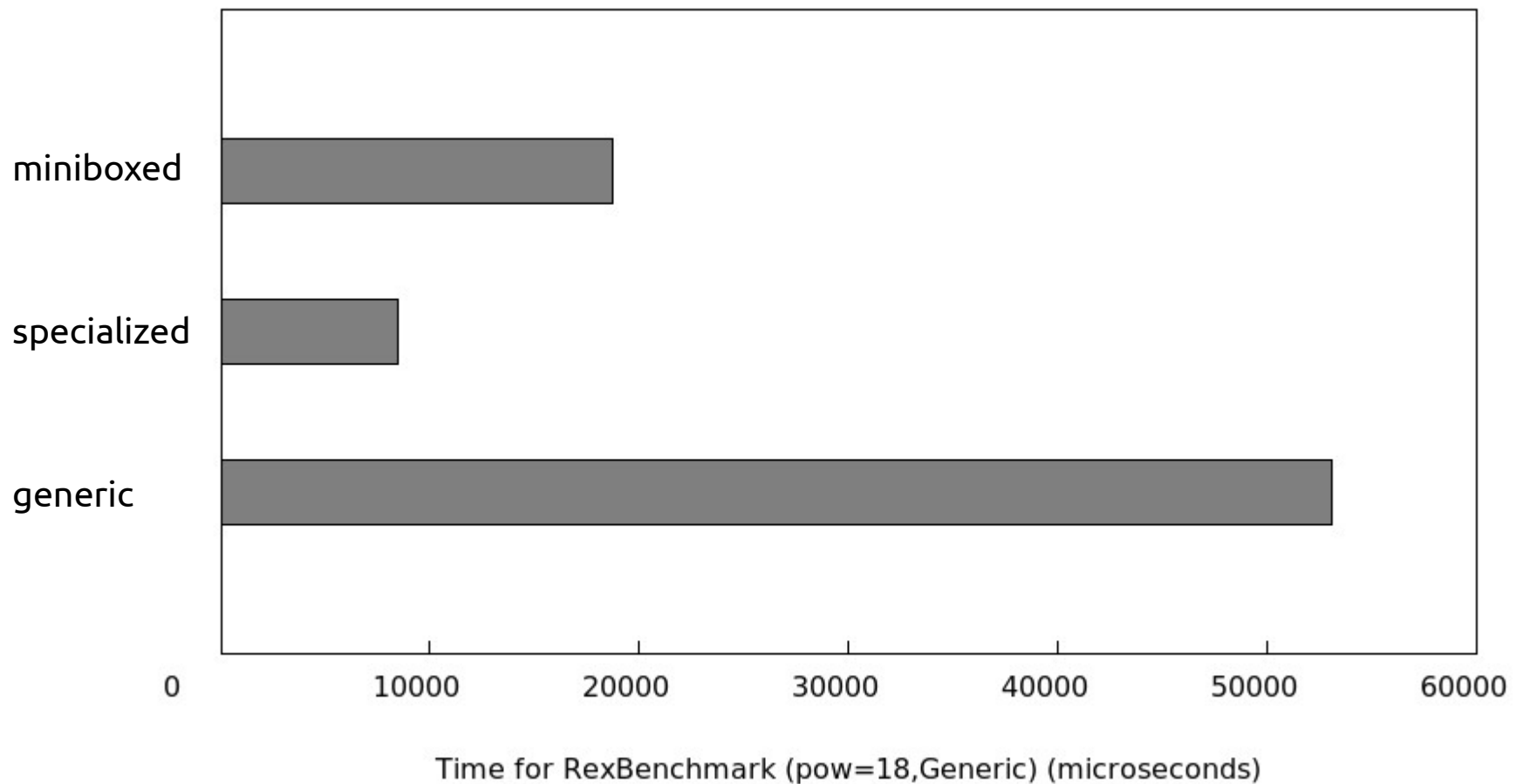
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on the Spire library (Complex)



Benchmarks

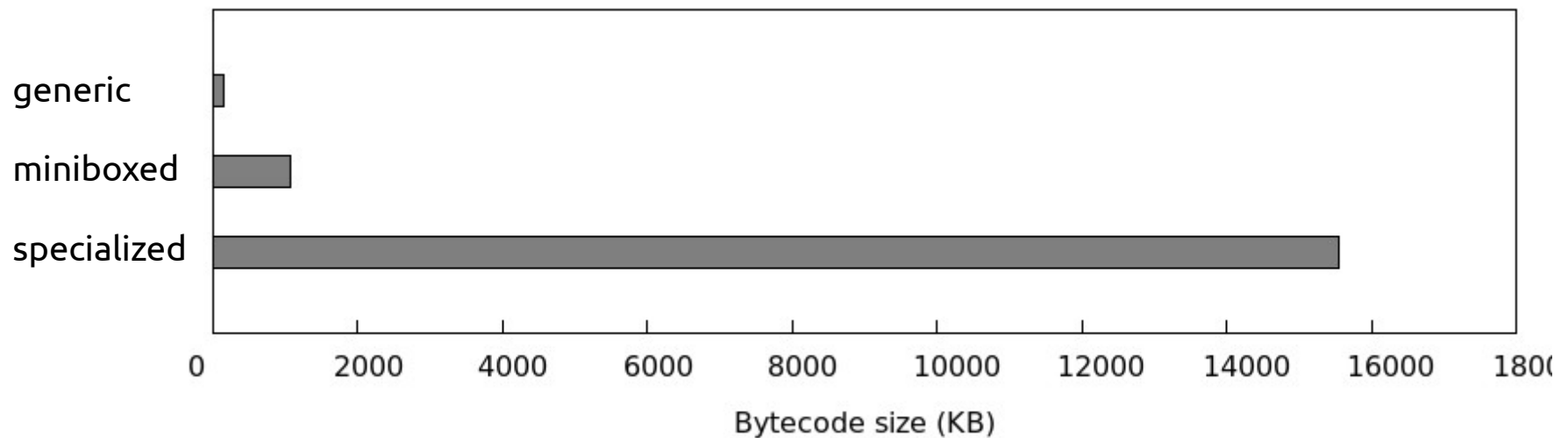
on the Spire library (RexBench)



bytecode

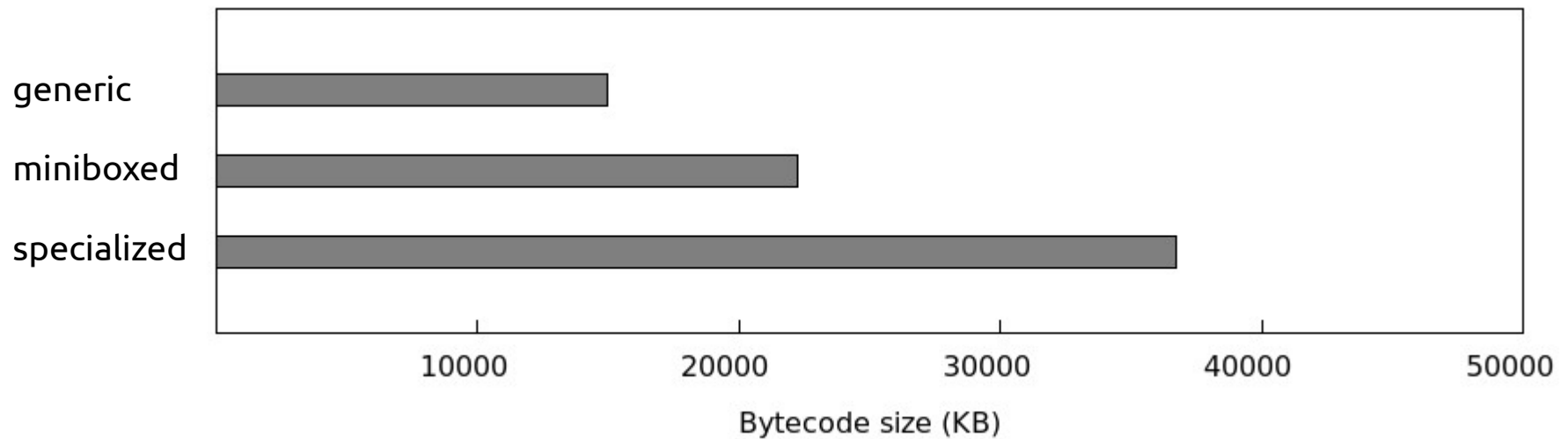
Benchmarks

on the linked list (bytecode)



Benchmarks

on the Spire library (bytecode)





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Credits and Thank you-s

- Cristian Talau - developed the initial prototype, as a semester project
- Eugene Burmako - the value class plugin based on the LDL transformation
- Aymeric Genet - developing collection-like benchmarks for the miniboxing plugin
- Martin Odersky, for his patient guidance
- Eugene Burmako, for trusting the idea enough to develop the value-plugin based on the LDL transformation
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- Michel Schinz, for his wonderful comments and enlightening ACC course
- Andrew Myers and Roland Ducournau for the discussions we had and the feedback provided
- Heather Miller for the eye-opening discussions we had
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- Thierry Coppey, Vera Salvisberg and George Nithin, who patiently listened to many presentations and provided valuable feedback
- Grzegorz Kossakowski, for the many brainstorming sessions on specialization
- Erik Osheim, Tom Switzer and Rex Kerr for their guidance on the Scala community side
- OOPSLA paper and artifact reviewers, who reshaped the paper with their feedback
- Sandro, Vojin, Nada, Heather, Manohar - reviews and discussions on the LDL paper
- Hubert Plociniczak for the type notation in the LDL paper
- Denys Shabalin, Dmitry Petrashko for their patient reviews of the LDL paper

Special thanks to the Scala Community for their support!

(@StuHood, @vpatryshev and everyone else!)





Miniboxed Encoding

- ScalaDays 2014 Talk
<https://www.parleys.com/play/53a7d2d0e4b0543940d9e567>
- OOPSLA '13 Paper
<http://infoscience.epfl.ch/record/188060>



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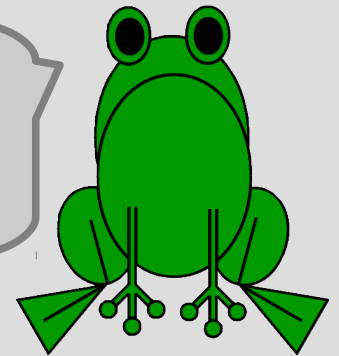
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Code Transformation

- OOPSLA Talk
<https://speakerdeck.com/vladureche/late-data-layout-ooplsa-talk>
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- OOPSLA '14 Paper
<http://infoscience.epfl.ch/record/200963>

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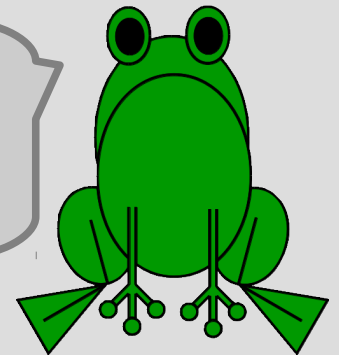
Other Considerations

- Function Encoding (Bucharest FP)
<https://github.com/miniboxing/miniboxing-plugin/blob/wip/docs/2014-08-miniboxing-bjug.pdf>
- The Quirks of Miniboxing (PDXScala)
<https://www.youtube.com/watch?v=g5yFlQySQ5k>

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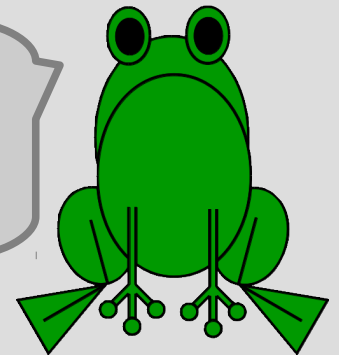
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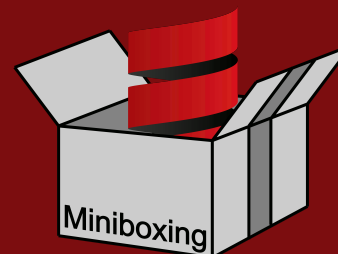
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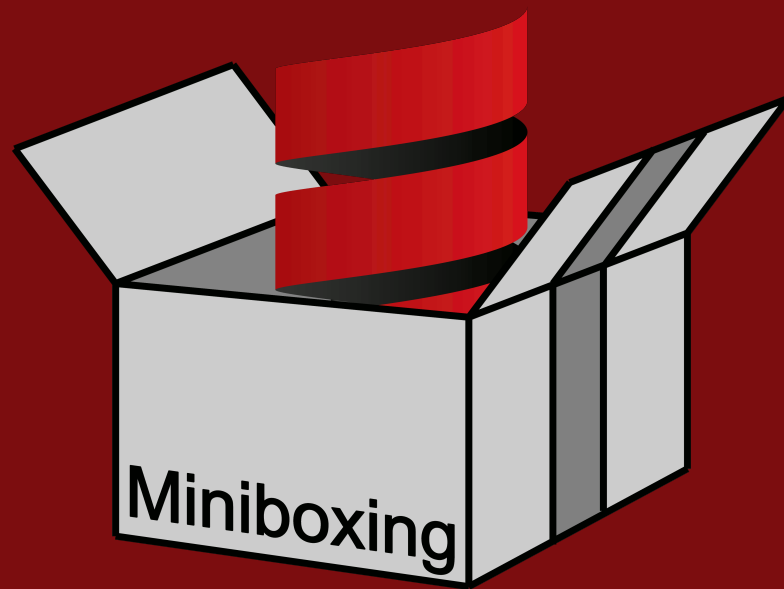
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- **YinYang** frontend multi-stage execution
 - based on macro transformations
 - Vojin Jovanovic, Sandro Stucki



<https://github.com/vjovanov/yin-yang>

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- **Scala.js** backend
 - compiles Scala to JavaScript
 - Sébastien Doeraene, Tobias Schlatter



<http://www.scala-js.org/>

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- **Lightweight Modular Staging**
 - program optimization
 - Tiark Rompf + pretty much everyone

 <http://scala-lms.github.io/>

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- **Dependent Object Types** calculus
 - core type system of the **dotty** compiler
 - Nada Amin, Tiark Rompf



<https://github.com/TiarkRompf/minidot>



<https://github.com/lampepfl/dotty>

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- **Pickling** framework and **Spores**
 - support for **distributed programming**
 - Heather Miller, Philipp Haller + others



<https://github.com/scala/pickling>



<https://github.com/heathermiller/spores>

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- **Staged Parser-combinators**
 - fast parser combinators through staging
 - Manohar Jonnalagedda + others



<https://github.com/manojo/experiments>

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- **dotty** compiler
 - compiler for Scala but with the DOT type system
 - Martin Odersky, Dmitry Petrashko + many others



<https://github.com/lampepfl/dotty>

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- **scala.meta** metaprogramming support
 - Improved reflection, macros, and many more
 - Eugene Burmako, Denys Shabalin + others

 <http://scalameta.org/>

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- **scaladyno** plugin
 - giving Scala a dynamic language look and feel
 - Cédric Bastin, Vlad Ureche



<https://github.com/scaladyno/scaladyno-plugin>

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- **miniboxing** specialization
 - LDL transformation
 - Vlad Ureche, Aymeric Genêt + others

[www http://scala-miniboxing.org/](http://scala-miniboxing.org/)

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- **ScalaBlitz** optimization framework
 - macro-based collection optimization
 - Dmitry Petrashko, Aleksandar Prokopec

www

<http://scala-blitz.github.io/>

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- **LMS-Kappa** protein simulator
 - using multi-stage programming for performance
 - Sandro Stucki



<https://github.com/sstucki/lms-kappa>

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- **Odds** probabilistic programming framework
 - using scala-virtualized and macros
 - Sandro Stucki



<https://github.com/sstucki/odds>

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- **Type debugger** for Scala
 - debugging aid for Scala type errors
 - Hubert Plociniczak



[http://lampwww.epfl.ch/~plocinic/
type-debugger-tutorial/](http://lampwww.epfl.ch/~plocinic/type-debugger-tutorial/)

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- **ScalaMeter** benchmarking framework
 - google caliper for scala
 - Aleksandar Prokopec

[www http://scalameter.github.io/](http://scalameter.github.io/)

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- **Vector** implementation using RRB trees
 - improved performance for Scala collections
 - Nicolas Stucki



<https://github.com/nicolasstucki/scala-rrb-vector>



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