# Functional Forkshop: Part 1

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# About the Forkshop

- Basic forkshop is split into several parts:
  - 1. Type classes, Semigroups and Monoids.
  - 2. Functors and Applicative Functors.
  - 3. Monads.
  - 4. Readers.
  - 5. Comonads.
- Theory and practice. Make sure that you are ready to write the code.
- Forkshop is duplicated in Haskell.

# Whys

- Functional programming roams (a bit).
  - More projects are using functional programming techniques and idioms (at different scale).
- Some people are still confused by all these functional talks (OptionT, type lambdas etc).
- Having a common language and understanding of some fundamental stuff is important.

# Agenda

- Type classes
- Semigroups
- Monoids
- 3 interesting<sup>™</sup> tasks

# Application definition

- We are writing a game.
- With multiple different creatures.
- Everyone introduces themselves.
- Introduction consists of animations and text showing in a bubble.

#### Meet the hero

```
case class Hero(name: String, job: String, level: Int) {
  def introduce(): String = s"Hi! My name is $name. I am $level level $job."
}

object Game extends App {
  val player = Hero("Valik", "Black Mage", 20)

  someRealShitSounds()
  drawBubble(player.introduce())
  someRealShitAnimations()
}

// Hi! My name is Valik. I am 20 level Black Mage.
```

### Every hero needs a monster

```
case class Orc(name: String, level: Int) {
  def introduce(): String =
    s"Lok-tar ogar! Me be $name. Me be strong. Level $level strong!"
}
case class Ooze(level: Int) {
  def introduce(): String = 1.to(level).map(_=>"brlup").mkString("-")
}
```

#### Game

```
object Game extends App {
  val player = Hero("Valik", "Black Mage", 20)
  val orc = Orc("Garrosh", 105)
  val coze = \log_{10}(2)
  // Introduce player
  someRealShitSounds()
  drawBubble(player.introduce())
  someRealShitAnimations()
  // Introduce orc
  someRealShitSounds()
  drawBubble(orc.introduce())
  someRealShitAnimations()
  // Introduce ooze
  someRealShitSounds()
  drawBubble(ooze.introduce())
  someRealShitAnimations()
// Hi! My name is Valik. I am 20 level Black Mage.
// Lok-tar ogar! Me be Garrosh. Me be strong. Level 105 strong!
// brlup-brlup
```

#### Game

```
object Game extends App {
  val player = Hero("Valik", "Black Mage", 20)
  val orc = Orc("Garrosh", 105)
  val coze = \log_{10}(2)
  // Introduce player
  someRealShitSounds()
  drawBubble(player.introduce())
  someRealShitAnimations()
  // Introduce orc
  someRealShitSounds()
  drawBubble(orc.introduce())
  someRealShitAnimations()
  // Introduce ooze
  someRealShitSounds()
  drawBubble(ooze.introduce())
  someRealShitAnimations()
// Hi! My name is Valik. I am 20 level Black Mage.
// Lok-tar ogar! Me be Garrosh. Me be strong. Level 105 strong!
// brlup-brlup
```

#### Issues with this code:

- 1. Repetition
- 2. Noise

# Introducing abstractions

```
case class Hero(...) {
  def introduce(): String = s"..."
}
case class Orc(...) {
  def introduce(): String = s"..."
}
case class Ooze(...) {
  def introduce(): String = s"..."
}
```

### Introducing abstractions

```
case class Hero(...) {
  def introduce(): String = s"..."
}
case class Orc(...) {
  def introduce(): String = s"..."
}
case class Ooze(...) {
  def introduce(): String = s"..."
}
```

```
trait Introducible {
    def introduce(): String
}

case class Hero(...) extends Introducible {
    override def introduce(): String = s"..."
}

case class Orc(...) extends Introducible {
    override def introduce(): String = s"..."
}

case class Ooze(...) extends Introducible {
    override def introduce(): String = s"..."
```

#### Game with trait

```
def introduce(phrase: String): Unit = {
   someRealShitSounds()
   drawBubble(phrase)
   someRealShitAnimations()
}

object Game extends App {
   /* ... */
   introduce(player.introduce())
   introduce(orc.introduce())
   introduce(ooze.introduce())
```

```
def introduce(creature: Introducible): Unit = {
   someRealShitSounds()
   drawBubble(creature.introduce())
   someRealShitAnimations()
}

object Game extends App {
   /* ... */
   introduce(player)
   introduce(orc)
   introduce(ooze)
}
```

#### Game with trait

```
def introduce(phrase: String): Unit = {
                                                            def introduce(creature: Introducible): Unit = {
  someRealShitSounds()
                                                              someRealShitSounds()
  drawBubble(phrase)
                                                              drawBubble(creature.introduce())
  someRealShitAnimations()
                                                              someRealShitAnimations()
object Game extends App {
                                                            object Game extends App {
  /* ... */
                                                              /* ... */
  introduce(player.introduce())
                                                              introduce(player)
  introduce(orc.introduce())
                                                              introduce(orc)
  introduce(ooze.introduce())
                                                              introduce(ooze)
```

- No more introduce(\_.introduce()).
- We are adaptive. Less code needs to be changed if we need something new in the introduce function (e.g. sound name) just add new 'method' to the trait.
- Refactoring becomes easier.

#### Here comes the cockatrice

#### Shawarma to the rescue



```
import io.proprietary.monsters.cockatrice._
/* ... */
case class CockatriceWrapper(cockatrice: Cockatrice) extends Introducible {
  override def introduce(): String = {
    import cockatrice._
    s"Haha. I am a ${element.shortName} cockatrice of level ${level}."
object Game extends App {
  /* ... */
  val cockatrice = Cockatrice(level = 666, element = Element.Fire)
  val cockatriceW = CockatriceWrapper(cockatrice)
  introduce(cockatriceW)
 /* ... */
// Haha. I am a fire cockatrice of level 666.
```

### Calm down and reevaluate our goal

 Abstraction - caring about what you can do and not what you are. E.g. separation of data and behaviour.

# Calm down and reevaluate our goal

- Abstraction caring about what you can do and not what you are. E.g. separation of data and behaviour.
- Composition having a way to express something that can do several things at once.

# Calm down and reevaluate our goal

- Abstraction caring about what you can do and not what you are. E.g. separation of data and behaviour.
- Composition having a way to express something that can do several things at once.
- Extensibility extending all kind of types:
  - types we own
  - types we don't own
  - even built-in types

### trait + wrapper: abstraction

Abstraction holds. Proof is the introduce function itself.

```
def introduce(creature: Introducible): Unit = {
   someRealShitSounds()
   drawBubble(creature.introduce())
   someRealShitAnimations()
}
```

# trait + wrapper: composition

Composition holds thanks to with keyword.

#### trait + wrapper: composition

Composition holds thanks to with keyword.

```
trait CanAttack {
   def attack(): Unit
}

def patheticAttack[A <: Introducible with CanAttack](creature: A): Unit</pre>
```

#### trait + wrapper: composition

Composition holds thanks to with keyword.

```
trait CanAttack {
  def attack(): Unit
}
def patheticAttack[A <: Introducible with CanAttack](creature: A): Unit</pre>
```

with keyword is not commutative

Introducible with CanAttack != CanAttack with Introducible.

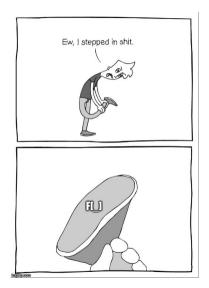
#### trait + wrapper: extensibility

Extensibility holds, but with several caveats:

- 1. No consistency we wrap only types we don't own.
- 2. Wrappers don't compose very well. You might even wrap your wrappers.
- 3. Bad usability:
  - 3.1 You can't interchangeably use wrapper and the underlying value.
  - 3.2 You can't plug in different behaviour implementations.

You know where it's going to, right?

# You know where it's going to, right?



# Dividing data and behaviour

```
trait Introducible {
  def introduce(): String
}

def introduce(creatute: Introducible): Unit = {
  /* ... */
  drawBubble(creatute.introduce())
  /* ... */
}
```

# Dividing data and behaviour

```
trait Introducible {
  def introduce(): String
}

def introduce(creatute: Introducible): Unit = {
  /* ... */
  drawBubble(creatute.introduce())
  /* ... */
}
```

```
// Define new trait
trait Introducible[A] {
  def introduce(a: A): String
}
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// Remove behaviour from data
case class Hero(name: String, job: String, level: Int)
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// Define new trait
trait Introducible [A] {
  def introduce(a: A): String
// Remove behaviour from data
case class Hero(name: String, job: String, level: Int)
// Implement behaviour as a value in companion object
object Hero {
  val introducibleHero: Introducible[Hero] = new Introducible[Hero] {
    override def introduce(a: Hero): String =
      s"..."
```

```
// Define new trait
trait Introducible [A] {
  def introduce(a: A): String
// Remove behaviour from data
case class Hero(name: String, job: String, level: Int)
// Implement behaviour as a value in companion object
object Hero {
  val introducibleHero: Introducible[Hero] = new Introducible[Hero] {
    override def introduce(a: Hero): String =
      s"..."
// Pass data and behaviour separately
object Game extends App {
  /* ... */
  introduce(
    creature = hero.
   impl = Hero.introducibleHero
```

### External types? Pff...

### External types? Pff. . .

```
import io.proprietary.monsters.cockatrice._
// Implement behaviour as a value in companion object
object CockatriceInstances {
  val introducibleCockatrice: Introducible[Cockatrice] = new Introducible[Cockatrice] {
    override def introduce(a: Cockatrice): String =
      s"..."
// Pass data and behaviour separately
object Game extends App {
  /* ... */
  introduce(
    creature = cockatrice.
   impl = CockatriceInstances.introducibleCockatrice
```

# But passing implementation around is. . .



Cucumbersome

# So implicits:(

```
object Hero {
  val introducibleHero:
      Introducible[Hero] = ???
object CockatriceInstances {
  val introducibleCockatrice:
      Introducible[Cockatrice] = ???
def introduce[A] (creature: A.
                 impl: Introducible[A]): Unit = {
  /* ... */
  drawBubble(impl.introduce(creature))
  /* ... */
object Game extends App {
  /* ... */
  introduce(hero, introducibleHero)
  introduce(cockatrice, introducibleCockatrice)
```

# So implicits:(

```
object Hero €
  val introducibleHero:
      Introducible[Hero] = ???
object CockatriceInstances {
  val introducibleCockatrice:
      Introducible[Cockatrice] = ???
def introduce[A] (creature: A.
                 impl: Introducible[A]): Unit = {
  /* ... */
  drawBubble(impl.introduce(creature))
  /* ... */
object Game extends App {
  /* ... */
  introduce(hero, introducibleHero)
  introduce(cockatrice, introducibleCockatrice)
```

```
object Hero €
  implicit val introducibleHero:
      Introducible[Hero] = ???
object CockatriceInstances {
  implicit val introducibleCockatrice:
      Introducible[Cockatrice] = ???
def introduce[A](creature: A)
             (implicit impl: Introducible[A]): Unit = {
  /* ... */
  drawBubble(impl.introduce(creature))
  /* ... */
object Game extends App {
  /* ... */
  introduce(hero)
  introduce(cockatrice)
```

# Summoning the summoner

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```
trait Introducible[A] {
                                                           trait Introducible [A] {
  def introduce(a: A): String
                                                             def introduce(a: A): String
                                                           object Introducible {
                                                             def apply[A: Introducible]: Introducible[A] =
                                                               implicitly[Introducible[A]]
def introduce[A](creature: A)
                                                           def introduce[A: Introducible](creature: A): Unit = {
             (implicit impl: Introducible[A]): Unit = {
  /* ... */
                                                             /* ... */
  drawBubble(impl.introduce(creature))
                                                             drawBubble(Introducible[A].introduce(creature))
  /* ... */
                                                             /* ... */
```

#### What have we done?

Type class is just a construct that supports ad hoc polymorphism. E.g. allows one to define polymorphic functions that can be applied to arguments of different types and behave differently based the type of the arguments.

In other words, type classes are solution for supporting function overloading.

#### What have we done?

Type class is just a construct that supports ad hoc polymorphism. E.g. allows one to define polymorphic functions that can be applied to arguments of different types and behave differently based the type of the arguments.

In other words, type classes are solution for supporting function overloading.

In Scala this can be achieved in several ways:

- Class inheritance or traits.
- Type classes (traits + implicits).

# Type classes: abstraction

Abstraction holds. Proof is the introduce function itself.

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Abstraction holds. Proof is the introduce function itself.

```
def introduce(creature: Introducible): Unit = {
   /* ... */
   drawBubble(creature.introduce())
   /* ... */
```

```
def introduce[A: Introducible](creature: A): Unit = {
   /* ... */
   drawBubble(Introducible[A].introduce(creature))
   /* ... */
}
```

## Type classes: abstraction

Abstraction holds. Proof is the introduce function itself.

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def introduce(creature: Introducible): Unit = {
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```

We gain literal data and behaviour separation.

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```
def patheticAttack[A <: Introducible with CanAttack](creature: A): Unit</pre>
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But with type classes we don't care about the order.

## Type classes: extensibility

#### Extensibility holds with some gains:

- 1. Consistency we treat our own type the same way we treat external types.
- 2. Usability no wrappers, no interchangeability problem.

# Type classes: final thoughts

- 1. Simple idea giving us good properties.
- 2. Found a good use for controversial implicits feature.
- 3. Literal separation of data and behaviour.
- 4. Good for overloading.
- 5. + more abstraction, more code

# Time for a quiz!

#### What is common between:

- 1. Int
- 2. String
- 3. List
- 4. PartialFunction
- 5. HttpMapping

# Time for a quiz!

#### What is common between:

- 1. Int
- 2. String
- 3. List
- 4. PartialFunction
- 5. HttpMapping

#### They can be composed!

- 1. Int + Int = Int
- 2. String + String = String
- 3. List ::: List = List
- 4. PartialFunction or Else PartialFunction = PartialFunction
- HttpMapping + HttpMapping = HttpMapping

# Associativity

- 1. Int + Int + Int = Int + (Int + Int) = (Int + Int) + Int
- 2. String + String + String = String + (String + String) = (String + String) + String
- 3. etc...

# Semigroup

Semigroup is a set S with binary closed operation  $\cdot: S \times S \to S$  that satisfies associativity property:

$$\forall a, b, c \in S : (a \cdot b) \cdot c = a \cdot (b \cdot c)$$

Operation is closed when  $\forall a, b \in S : a \cdot b \in S$ .

# But it's not that scary

```
package object typeclass {

//
// Laws:
// 1. \forall a, b, c \in A : (a \cdot b) \cdot c = a \cdot (b \cdot c)
//
trait Semigroup[A] {
    def combine(x: A, y: A): A
}

object Semigroup {
    def apply[A: Semigroup]: Semigroup[A] =
        implicitly[Semigroup[A]]
}
```

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```
package object typeclass {

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        implicitly[Semigroup[A]]
}
```

In simple words, semigroup is a set with means of combining elements of that set.

# But it's not that scary

```
package object typeclass {

//
// Laws:
// 1. ∀a,b,c ∈ A: (a·b)·c = a·(b·c)
//
trait Semigroup[A] {
  def combine(x: A, y: A): A
}

object Semigroup {
  def apply[A: Semigroup]: Semigroup[A] =
   implicitly[Semigroup[A]]
}
```

In simple words, semigroup is a set with means of combining elements of that set.



#### Important!

Semigroup is a pair of the set and the operation.

You can't say that string is a semigroup, you must provide an operation.

And in many cases there is more than one operation for a set to form a semigroup.

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- In programming world it's just a contract.
- Operations in the type classes are very generic.
   def combine(x: A, y: A): A
- So type classes should have some associated laws.
- Laws describe properties of these operations and connection between operations in one type class.
- Contract of the interface gives us confidence when we write generic code.
- And as you will see, we really care about these laws.

#### Instance example

```
package object implicits {
  implicit val stringSemigroup: Semigroup[String] = new Semigroup[String] {
    override def combine(x: String, y: String): String = x + y
  }
}
```

# Checking laws - pen and paper in comments

```
package object implicits {
  implicit val stringSemigroup: Semigroup[String] = new Semigroup[String] {
    override def combine(x: String, y: String): String = x + y
}
}

/*
combine(a, combine(b, c))
= combine(a, b + c)
= a + (b + c)
= (associativity of +)
= (a + b) + c = combine(a + b, c)
= combine(combine(a, b), c)
*/
```



# Question on the interview: property based testing

```
object SemigroupSpecification extends Properties("Semigroup") with SemigroupSpecificationSupport {
 include(semigroup[String](stringSemigroup))
trait SemigroupSpecificationSupport {
 def semigroup[A](sg: Semigroup[A])(implicit ar: Arbitrary[A], tag: ClassTag[A]): Properties =
   new Properties(s"Semigroup[${tag.toString}]") {
     // \forall a, b, c \in A : (a \cdot b) \cdot c = a \cdot (b \cdot c)
     property("associativity") = forAll { (a: A, b: A, c: A) =>
       sg.combine(sg.combine(a, b), c) =? sg.combine(a, sg.combine(b, c))
/*
+ Semigroup. Semigroup[java.lang. String]. associativity: OK. passed 100 tests
*/
```

#### More than one valid instance

```
package object implicits {
  implicit val stringSemigroup: Semigroup[String] = new Semigroup[String] {
    override def combine(x: String, y: String): String = x
  }
}
```

## More examples

- Numbers with +, \*, min, max
- Booleans with conjunction, disjunction, implication etc.
- Square nonnegative matrices with multiplication.
- Lists, Strings, Maps etc. with concatenation/union
- We will see even more examples during practical part.

## Contra-examples

- $\{\mathbb{N}, /\}$  is not a Semigroup, because / is not associative.
- The same goes for  $\{\mathbb{N}, a^b\}$ .
- $\{\mathbb{N}, -\}$  is not a Semigroup, because is not a closed operation, e.g.  $\exists a, b \in \mathbb{N} : a b \notin \mathbb{N}$ , for example  $10 15 = -5 \notin \mathbb{N}$ .

# Coding time

- 1. Clone git@github.com:d12frosted/wax.git
- 2. Import it as sbt project.
- 3. Go to scala/src/main

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- 4. Task 1
  - 4.1 Implement missing Semigroup instances in wax.typeclass.semigroup.cats.implicits
  - 4.2 Run wax.typeclass.semigroup.laws.cats.SemigroupSpec

## Coding time

- 1. Clone git@github.com:d12frosted/wax.git
- 2. Import it as sbt project.
- 3. Go to scala/src/main
- 4. Task 1
  - 4.1 Implement missing Semigroup instances in wax.typeclass.semigroup.cats.implicits
  - 4.2 Run wax.typeclass.semigroup.laws.cats.SemigroupSpec
- 5. Task 2
  - 5.1 Implement missing Semigroup instances in wax.typeclass.semigroup.manual.implicits
  - 5.2 Run wax.typeclass.semigroup.laws.manual.SemigroupSpec

- Sometimes you want to compose n elements where  $n \ge 0$ .
- Semigroup works only for n > 0.
- We need a default element to use if n = 0.

One does not simply become a default element:

- Int + 0 = 0 + Int = Int
- String + "" = "" + String = String
- etc...

Back to fancy words.

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A monoid is a set S with binary closed operation  $\cdot: S \times S \to S$  that satisfies associativity property:

$$\forall a, b, c \in S : (a \cdot b) \cdot c = a \cdot (b \cdot c)$$

and identity element e that satisfies

$$\forall a \in S : e \cdot a = a \cdot e = a$$

Operation is closed when  $\forall a, b \in S : a \cdot b \in S$ .



Back to fancy words.

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$$\forall a, b, c \in S : (a \cdot b) \cdot c = a \cdot (b \cdot c)$$

and identity element e that satisfies

$$\forall a \in S : e \cdot a = a \cdot e = a$$

Operation is closed when  $\forall a, b \in S : a \cdot b \in S$ .

In other words, monoid is just a semigroup with identity element.



# Again, it's not that scary

```
package object typeclass {

//
// Laws:
// 1.  \forall a, b, c \in S: (a \cdot b) \cdot c = a \cdot (b \cdot c)
// 2.  \forall a \in S: e \cdot a = a \cdot e = a

//
trait Monoid[A] extends Semigroup[A] {
    def empty: A
}

object Monoid {
    def apply[A: Monoid]: Monoid[A] = implicitly[Monoid[A]]
}
```

### Examples

- $\{\mathbb{N}_0, +\}$ , where 0 is the identity element.
- $\{\mathbb{N}, *\}$ , where 1 is the identity element.
- Boolean with XOR, XNOR, OR, AND.
- String with concatenation (empty string is identity element).

### Examples

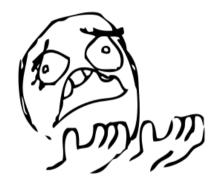
- $\{\mathbb{N}_0, +\}$ , where 0 is the identity element.
- $\{\mathbb{N}, *\}$ , where 1 is the identity element.
- Boolean with XOR, XNOR, OR, AND.
- String with concatenation (empty string is identity element).

But not every Semigroup forms a Monoid (we are not talking about free monoids here):

BigNumber practically doesn't have identity element for min.

The most important question

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Why did we learn this?

### The Fibonacci numbers

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On the interview we ask people to write a function that returns the nth Fibonacci number.

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On the interview we ask people to write a function that returns the nth Fibonacci number.

$$F_0 = 0$$
  
 $F_1 = 1$   
 $F_n = F_{n-1} + F_{n-2}, \forall n > 1$ 

### Solution

### What we expect

```
def fib(n: Int): Int = {
  def fibTail(n: Int, a: Int, b: Int): Int = n match {
    case 0 => a
    case _ => fibTail(n - 1, b, a + b)
}
fibTail(n, 0, 1)
}
```

### Solution

### What we expect

```
def fib(n: Int): Int = {
  def fibTail(n: Int, a: Int, b: Int): Int = n match {
    case 0 => a
    case _ => fibTail(n - 1, b, a + b)
  }
  fibTail(n, 0, 1)
}
```

#### Ideal solution

$$F_{n} = \frac{\phi^{n} - (-\phi)^{-n}}{\sqrt{5}}$$
$$= \frac{\phi^{n} - (-\phi)^{-n}}{2\phi - 1}$$

$$\phi = \frac{1+\sqrt{5}}{2}$$

### Solution

### What we expect

```
def fib(n: Int): Int = {
  def fibTail(n: Int, a: Int, b: Int): Int = n match {
    case 0 => a
    case _ => fibTail(n - 1, b, a + b)
  }
  fibTail(n, 0, 1)
}
```

#### Ideal solution

$$F_n = \frac{\phi^n - (-\phi)^{-n}}{\sqrt{5}}$$
$$= \frac{\phi^n - (-\phi)^{-n}}{2\phi - 1}$$

$$\phi = \frac{1 + \sqrt{5}}{2}$$

As they say, truth is somewhere in the logarithm.

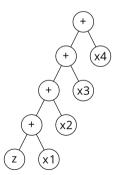
# Two folds (mod)

• def foldl[A, B](xs: Seq[A])(z: B)(op: B => A => B): B

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• def fold1[A, B](xs: Seq[A])(z: B)(op: B => A => B): B

$$+: B \to A \to B$$
  
(((z+x1)+x2)+x3)+x4



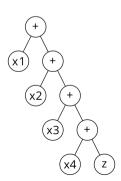
### Two folds

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- def foldr[A, B](xs: Seq[A])(z: B)(op: A  $\Rightarrow$  B  $\Rightarrow$  B): B

$$+: A \to B \to B$$
  
  $\times 1 + (\times 2 + (\times 3 + (\times 4 + z)))$ 

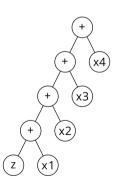


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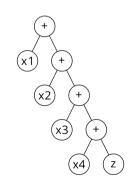
- def foldl[A, B](xs: Seq[A])(z: B)(op: B => A => B): B
- def foldr[A, B](xs: Seq[A])(z: B)(op: A => B => B): B
- Since combining function is asymmetrical in its types:
  - It's impossible to place parentheses in the arbitrary fashion or even just change the direction of the fold
  - It's impossible to implement a total fold without default value of type B

### foldr

$$+: B \to A \to B$$
  
(((z + x1) + x2) + x3) + x4



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  - def foldMonoid[A: Monoid](xs: Seq[A]): A
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- Associativity law says that we can put parentheses in an arbitrary fashion.

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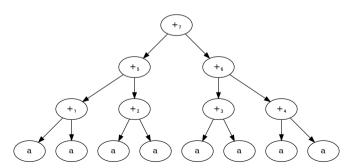
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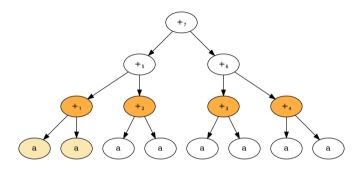
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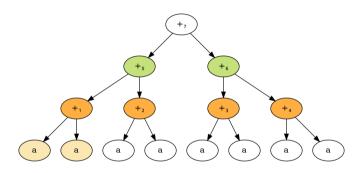
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Since we can reorder the parentheses, we can arrange them like this.





Evaluating a + a always yields the same result. So there is no point in repeating this calculation 4 times.



The same thing with the upper level. In this particular example, we can avoid 4 operations out of 7. In general, this optimisation leads to the result in  $\log n$  operations.

All this means that we can define a function exp:

```
def exp[A: Monoid](a: A, n: Int): A = {
    ???
}
```

#### Back to Fibonacci

Fibonacci number can be defined in a different way.

$$\begin{pmatrix} F_{n+1} & F_n \\ F_n & F_{n-1} \end{pmatrix} = \begin{pmatrix} 1 & 1 \\ 1 & 0 \end{pmatrix}^n$$

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$$\begin{pmatrix} F_4 & F_3 \\ F_3 & F_2 \end{pmatrix} = \begin{pmatrix} 1 & 1 \\ 1 & 0 \end{pmatrix}^3 = \begin{pmatrix} 2 & 1 \\ 1 & 1 \end{pmatrix} \cdot \begin{pmatrix} 1 & 1 \\ 1 & 0 \end{pmatrix} = \begin{pmatrix} 3 & 2 \\ 2 & 1 \end{pmatrix}$$

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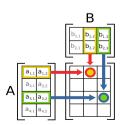
- The Fibonacci number can be calculated using square nonnegative matrix multiplication.
- Square nonnegative matrices form Monoid with multiplication.
- So we can put parentheses in a way we like it.

- Open wax.exercise.fibonacci.Main object.
  - Main runs two implementations and profiles them.
  - Fib contains implementation of tailrec and matrix approaches.
  - ExpUtils implements generic exp function.
- Task is to implement monoid for Matrix2x2 in the Fib object.
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$$\begin{pmatrix} a_{11} & a_{12} \\ a_{21} & a_{22} \end{pmatrix} \cdot \begin{pmatrix} b_{11} & b_{12} \\ b_{21} & b_{22} \end{pmatrix} =$$

$$\begin{pmatrix} a_{11} \cdot b_{11} + a_{12} \cdot b_{21} & a_{11} \cdot b_{12} + a_{12} \cdot b_{22} \\ a_{21} \cdot b_{11} + a_{22} \cdot b_{21} & a_{21} \cdot b_{12} + a_{22} \cdot b_{22} \end{pmatrix}$$



# Profiling results

N	Matrix	Tailrec
10	60	0
100	0	0
1000	1	1
10000	5	6
100000	46	168
1000000	888	15211
10000000	11266	-

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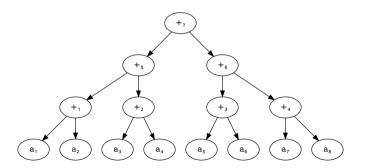
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- You forgot how matrix multiplication works, but now you remember, right?

#### Folds with Monoids

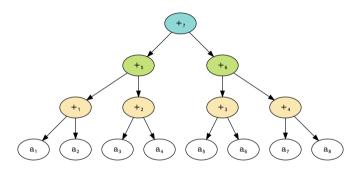
- We already know that Monoids give us an ability to place parentheses in any fashion.
- We already saw that when it comes to folding the list of the same elements we gain performance.
- But what if the elements are not equal? Do we gain anything?

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### Folds with Monoids



Every expression on each level does not depend on other expressions from the same level, which means that we can evaluate them in parallel.

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- There is a strange accent, where people pronounce 'fold' as 'reduce'.
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- Just think about it, mapReduce is possible thanks to Monoid and its laws.

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  - 1. Implement monoid instance for MapReduce.Result[Int].
  - 2. Implement the job function to find the most used word.
- Use helpers from FileUtils:
  - readTokens to get the list of words from the file.
  - authorBooks to get the list of books (files) by author (e.g. authorBooks("boris")).
  - allBooks to get the list of all book among all available authors.

### **Benchmarks**

```
Par
duration = 65633 ms
result = List(..., (people,37798), ...)
Seq
duration = 396530 ms
result = List(..., (people,37798), ...)
```

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- Google used it to regenerate index of World Wide Web.

## Homework

 ${\tt mapReduce} \ is \ really \ interesting!$ 

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mapReduce is really interesting!

So play with it after the forkshop.

# Many monoids

We dealt with some trivial monoids here:

- Integers with addition.
- Strings and lists with concatenation.
- Matrix with multiplication.
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- But what if A is a monoid?
- Hell, veah!

```
case class Wrapper[A](value: A)

object Wrapper {
  implicit def wrapperMonoid[A: Monoid]: Monoid[Wrapper[A]] = new Monoid[Wrapper[A]] {
    override def empty: Wrapper[A] = Wrapper(Monoid[A].empty)

  override def combine(x: Wrapper[A], y: Wrapper[A]): Wrapper[A] =
    Wrapper(Monoid[A].combine(x.value, y.value))
}
```

Since IO is a wrapper (in some sense), it IO can also be a monoid.
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- So Logger forms a monoid.
- So we can combine loggers
  - fileLogger |+| consoleLogger logs both into file and to console

```
def consoleLogger: IO[Logger] = IO { input =>
    IO {
        print(input)
    }
}
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def fileLogger(filePath: String): IO[Logger] = IO {
    val stream = new FileOutputStream(filePath)
    input => IO(stream.write(input.getBytes))
}
```

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      print(input)
def fileLogger(filePath: String): IO[Logger] = IO {
  val stream = new FileOutputStream(filePath)
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val program: IO[Unit] = for {
  logger <- consoleLogger |+| fileLogger("logging.log")</pre>
         <- logger("I am the log")
} yield ()
```

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- Have fun!

### Bonus questions

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- What about Unit?

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- Function can also be monoid. This is really cool by itself.
- Some of you probably gonna write new colog lib (but for Scala).

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- Monoids are everywhere. They act like a plague, once something forms a monoid, something else also begins to form a monoid.
- We want some rest after a long session of forkshop.

Questions?

 $\epsilon \rho \omega \tau \eta \sigma \eta \varsigma$ ?

Thank you very much!

We hope you enjoyed this session.