



# Recursion schemes

avec Scala



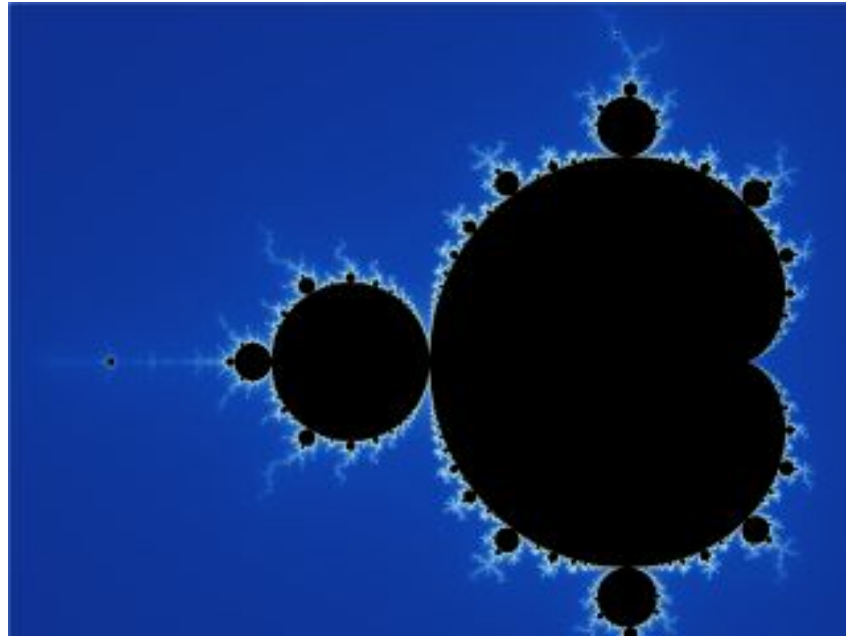
# Recursion

Élément qui se contient lui même



# Scheme

Un pattern, une structure



# Recursion schemes

Un pattern qui se contient lui même.

Scala: FP + OOP

- Fonction
- Objet

# Factorial

$$n! = n * (n-1) * (n-2) * \dots * 2 * 1$$

$$0! = 1$$

$$4! = 4 * 3 * 2 * 1 = 24$$

```
def factorial(n: Int): Int = {  
  if(n==0) 1  
  else {  
    val r = factorial(n-1)  
    n * r  
  }  
}
```

# Sum

$$\sum n = n + (n-1) + (n-2) + \dots + 1 + 0$$

$$\sum 0 = 0$$

$$\sum 4 = 4 + 3 + 2 + 1 + 0 = 10$$

```
def sum(n: Int): Int = {  
  if(n==0) 0  
  else {  
    val r = sum(n-1)  
    n + r  
  }  
}
```



# isPair

$\%n = !(\%(n-1))$

$\%0 = \text{true}$

$\%3 = !(!(!(\text{true})))$

```
def isPair(n: Int): Boolean = {  
  if(n==0) true  
  else {  
    val r = isPair(n-1)  
    !r  
  }  
}
```

# Un schéma de récursion apparaît

```
def isPair(n: Int): Boolean = {  
  if(n==0) true  
  else {  
    val r = isPair(n-1)  
    !r  
  }  
}
```

```
def sum(n: Int): Int = {  
  if(n==0) 0  
  else {  
    val r = sum(n-1)  
    n + r  
  }  
}
```

```
def factorial(n: Int): Int = {  
  if(n==0) 1  
  else {  
    val r = factorial(n-1)  
    n * r  
  }  
}
```

```
def scheme[A](baseCase: A, rec: (Int, A)  $\Rightarrow$  A)(n: Int): A = {  
  if (n == 0) baseCase  
  else {  
    val r = scheme(baseCase, rec)(n - 1)  
    rec(n, r)  
  }  
}
```

```
def scheme[A](baseCase: A, rec: (Int, A) => A)(n: Int): A
```

```
def factorial(n: Int): Int = scheme[Int](1, _*_)(n)
```

```
def sum(n: Int): Int    = scheme[Int](0, _+_)(n)
```

```
def isPair(n: Int)      = scheme[Boolean](true, (_, b: Boolean) => !b)(n)
```

# Optimisons la fonction

```
def scheme[A](baseCase: A, rec: (Int, A)  $\Rightarrow$  A)(n: Int): A = {  
  var res = baseCase  
  var i = 1  
  while (i <= n) {  
    res = rec(i, res)  
    i += 1  
  }  
  res  
}
```

```
def scheme[A](baseCase: A, rec: (Int, A) => A)(n: Int): A = {  
  var res = baseCase  
  var i = 1  
  while (i <= n) {  
    res = rec(i, res)  
    i += 1  
  }  
  res  
}
```

```
schema(Nil, (i: Int, xs: List[Int]) => i +: xs)(10)
```

```
// List(10, 9, 8, 7, 6, 5, 4, 3, 2, 1)
```

```
schema("", (i: Int, xs: String) => s"$i/$xs")(10)
```

```
// 10/9/8/7/6/5/4/3/2/1/
```

# Matryoshka

Les poupées russes



*“Generalized folds, unfolds, and traversals for fixed point data structures in Scala.”*



# Recursion Schemes

**folds** (tear down a structure)

$algebra\ f\ a \rightarrow Fix\ f \rightarrow a$

**unfolds** (build up a structure)

$coalgebra\ f\ a \rightarrow a \rightarrow Fix\ f$

<b>generalized</b> $(f\ w \rightarrow w\ f) \rightarrow (f\ (w\ a) \rightarrow \beta)$	<b>catamorphism</b> $f\ a \rightarrow a$	<b>anamorphism</b> $a \rightarrow f\ a$	<b>generalized</b> $(m\ f \rightarrow f\ m) \rightarrow (a \rightarrow f\ (m\ \beta))$
	<b>prepromorphism*</b> ... after applying a NatTrans $(f\ a \rightarrow a) \rightarrow (f \rightarrow f)$	<b>postpromorphism*</b> ... before applying a NatTrans $(a \rightarrow f\ a) \rightarrow (f \rightarrow f)$	
	<b>paramorphism*</b> ... with primitive recursion $f\ (Fix\ f\ \times\ a) \rightarrow a$	<b>apomorphism*</b> ... returning a branch or single level $a \rightarrow f\ (Fix\ f\ \vee\ a)$	
	<b>zygomorphism*</b> ... with a helper function $(f\ b \rightarrow b) \rightarrow (f\ (b\ \times\ a) \rightarrow a)$	<b>g apomorphism</b> $(b \rightarrow f\ b) \rightarrow (a \rightarrow f\ (b\ \vee\ a))$	
<b>g histomorphism</b> $(f\ h \rightarrow h\ f) \rightarrow (f\ (w\ a) \rightarrow a)$	<b>histomorphism</b> ... with prev. answers it has given $f\ (w\ a) \rightarrow a$	<b>futomorphism</b> ... multiple levels at a time $a \rightarrow f\ (m\ a)$	<b>g futumorphism</b> $(h\ f \rightarrow f\ h) \rightarrow (a \rightarrow f\ (m\ a))$

**refolds** (build up then tear down a structure)

$algebra\ g\ b \rightarrow (f \rightarrow g) \rightarrow coalgebra\ f\ a \rightarrow a \rightarrow b$

<b>others</b>
<b>synchronorphism</b> ???
<b>exomorphism</b> ???
<b>mutumorphism</b> ???

<b>hylomorphism</b> cata; ana		<b>generalized</b> apply the generalizations for both the relevant fold and unfold
<b>dynamorphism</b> histo; ana	<b>codynamorphism</b> cata; futu	
<b>chronomorphism</b> histo; futu		
<b>Elgot algebra</b> ... may short-circuit while building cata; $a \rightarrow b \vee fa$	<b>coElgot algebra</b> ... may short-circuit while tearing $a \times gb \rightarrow b; ana$	

**reunfolds** (tear down then build up a structure)

$coalgebra\ g\ b \rightarrow (a \rightarrow b) \rightarrow algebra\ f\ a \rightarrow Fix\ f \rightarrow Fix\ g$

<b>metamorphism</b> ana; cata	<b>generalized</b> apply ... both ... [un]fold
----------------------------------	---

**combinations** (combine two structures)

$algebra\ f\ a \rightarrow Fix\ f \rightarrow Fix\ f \rightarrow a$

<b>zippamorphism</b> $f\ a \rightarrow a$
<b>mergamorphism</b> ... which may fail to combine $(f\ (Fix\ f) \times f\ (Fix\ f)) \vee f\ a \rightarrow a$

Stolen from Edward Kmett's <http://comonad.com/reader/2009/recursion-schemes/>

\* This gives rise to a family of related recursion schemes, modeled in recursion-schemes with distributive law combinators

These can be combined in various ways. For example, a "zygohistomorphic prepromorphism" combines the zygo, histo, and prepro aspects into a signature like  $(f\ b \rightarrow b) \rightarrow (f \rightarrow f) \rightarrow (f\ (w\ (b\ \times\ a)) \rightarrow a) \rightarrow Fix\ f \rightarrow a$

```
sealed trait IntList[T]  
case class Empty[T]() extends IntList[T]  
case class Cons[T](head: Int, tail: T) extends IntList[T]
```

## But

- Construire des structures récursives
- Pour faire du calcul récursif
- Manipuler facilement des types complexes

# Remarque

```
val intList: ??? = Cons(1, Cons(2, Cons(3, Empty())))
```

# Remarque

```
val intList: IntList[Cons[Cons[Empty[Nothing]]]] =  
Cons(1, Cons(2, Cons(3, Empty())))
```

# Fixed Points

- Il faut un point fixe de IntList
- Idéalement un type T tel que  $T == \text{IntList}[T]$
- $\text{Fix}[\_] : \text{Fix}[\text{IntList}] == \text{IntList}[\text{Fix}[\text{IntList}]] == \text{IntList}[\text{IntList}[\text{Fix}[\text{IntList}]]]$
- On a bien  $\text{Fix}[\text{IntList}]$  point fixe de IntList

```
final case class Fix[F[_]](unFix: F[Fix[F]])
```

```
val fixIntList: Fix[IntList] =
```

```
Fix(Cons(1, Fix(Cons(2, Fix(Cons(1, Fix(Cons(2, Fix(Empty())))))))))
```

```
fixIntList.unFix
```

```
// Cons(1,Fix(Cons(2,Fix(Cons(1,Fix(Cons(2,Fix(Empty()))))))))
```

# Etape 1: Functor

```
implicit val listFunc = new Functor[IntList] {  
  
  override def map[A, B](fa: IntList[A])(f: A ⇒ B): IntList[B] = fa match {  
    case Empty()           ⇒ Empty[B]()  
    case Cons(head: Int, tail: A) ⇒ Cons(head, f(tail))  
  }  
  
}
```

# Anamorphism

Du haut vers le bas

Généralisation du unfold

```
type Coalgebra[F[_], A] = A => F[A]
```



# Etape 2: Coalgebra

```
val coalgebraInt: Coalgebra[IntList, Int] = {  
  case 0 ⇒ Empty()  
  case n ⇒ Cons(n, n - 1)  
}
```

```
type Coalgebra[F[], A] = A => F[A]
```

# Etape 2: Coalgebra

```
def apply[F[_]: Functor] (f: Coalgebra[F, A])(implicit T: Corecursive.Aux[T, F]) : T
```

```
type Coalgebra[F[_], A] = A => F[A]
```

```
val coalgebraInt: Coalgebra[IntList, Int] = {  
  case 0 => Empty()  
  case n => Cons(n, n - 1)  
}
```

```
4.ana[Fix[IntList]](coalgebraInt)
```

```
// Fix(Cons(4,Fix(Cons(3,Fix(Cons(2,Fix(Cons(1,Fix(Empty())))))))))
```

# Catamorphism

Du bas vers le haut

Généralisation du fold sur les ADT

```
type Algebra[F[_], A] = F[A] => A
```

# Etape 2: Algebra

```
val algebraProduct: Algebra[IntList, Int] = {  
  case Empty()           ⇒ 1  
  case Cons(head, tail) ⇒ head * tail  
}
```

```
val algebraSum: Algebra[IntList, Int] = {  
  case Empty()           ⇒ 0  
  case Cons(head, tail) ⇒ head + tail  
}
```

```
val algebraBool: Algebra[IntList, Boolean] = {  
  case Empty()           ⇒ true  
  case Cons(_, tail)     ⇒ !tail  
}
```

**type** Algebra[F[], A] = F[A] => A

# Etape 2: Algebra

```
val fixIntList: Fix[IntList] =  
Fix(Cons(1, Fix(Cons(2, Fix(Cons(1, Fix(Cons(2, Fix(Empty())))))))))
```

```
def cata[A](f: Algebra[F, A])(implicit BF: Functor[F]): A
```

```
fixIntList.cata(algebraProduct) // 4
```

```
fixIntList.cata(algebraSum)      // 6
```

```
fixIntList.cata(algebraBool)    // true
```

# Etape 3: Hylomorphism

```
def hylo[F[_]: Functor, B](f: Algebra[F, B], g: Coalgebra[F, A]): B = matryoshka.hylo(self)(f, g)
def hylo[F[_]: Functor, A, B](a: A)(φ: Algebra[F, B], ψ: Coalgebra[F, A]): B = φ(ψ(a) ◦ (hylo(_)(φ, ψ)))
final def ◦[B](f: A => B): F[B] = F.map(self)(f)
```

```
val algebraBool: Algebra[IntList, Boolean]
```

```
val algebraProduct: Algebra[IntList, Int]
```

```
val algebraSum: Algebra[IntList, Int]
```

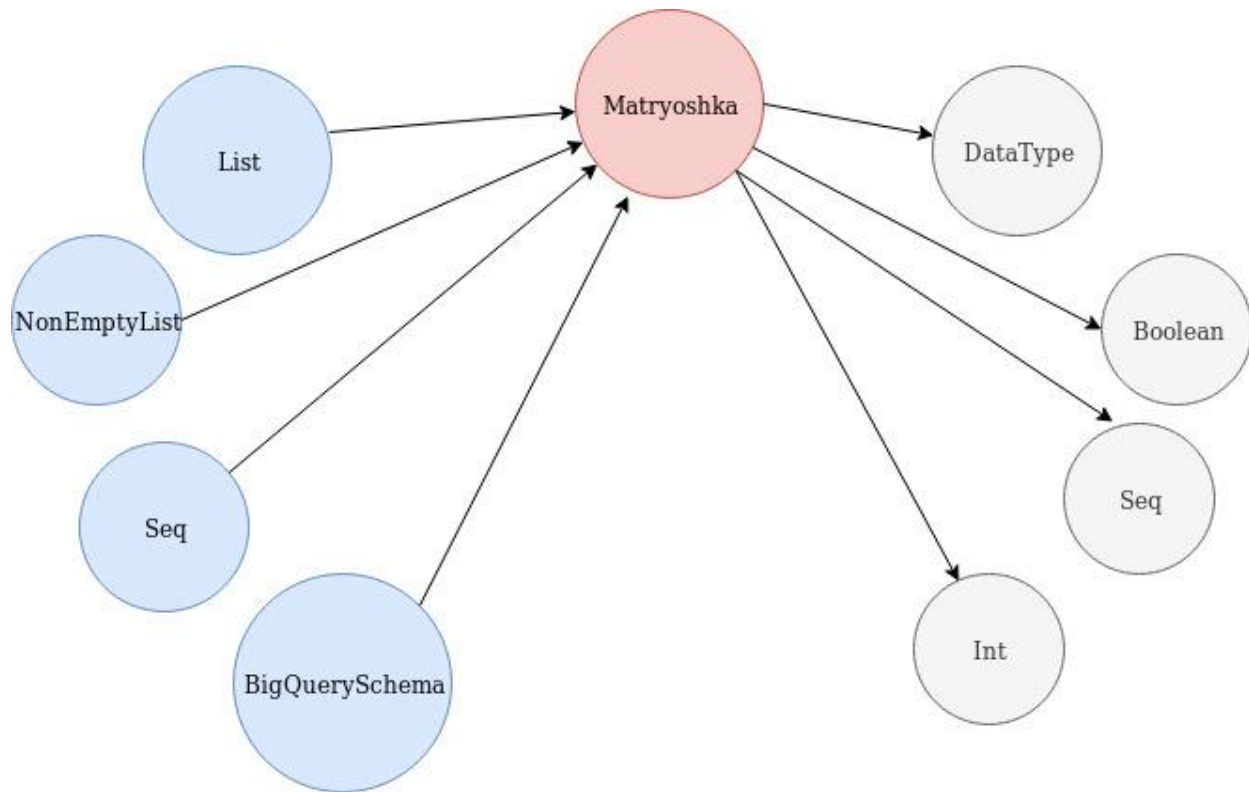
```
val coalgebraInt: Coalgebra[IntList, Int]
```

```
def even(n: Int): Boolean    = n.hylo(algebraBool, coalgebraInt)
```

```
def factorial(n: Int): Int   = n.hylo(algebraProduct, coalgebraInt)
```

```
def sum(n: Int): Int        = n.hylo(algebraSum, coalgebraInt)
```

*factorial*(4)    // 24  
*sum*(4)        // 10  
*even*(4)        // true



# Problématique

- Ne pas écrire 100 objets si on a 100 data sources (ou si la requête change)
  - Inférer n'importe quel schéma
- Mapping de schéma
  - BigQuery ⇔ Spark
  - Json ⇔ Avro



**sealed trait** SchemaR[T]

**final case class** StructR[T](fields: Map[String, T]) **extends** SchemaR[T]

**final case class** ArrayR[T](element: T) **extends** SchemaR[T]

**final case class** IntR[T]() **extends** SchemaR[T]

**final case class** StringR[T]() **extends** SchemaR[T]

**final case class** TimestampR[T]() **extends** SchemaR[T]

**final case class** DoubleR[T]() **extends** SchemaR[T]

**final case class** BooleanR[T]() **extends** SchemaR[T]

```
implicit val schemaRFunctor: Functor[SchemaR] = new Functor[SchemaR] {
```

```
  override def map[A, B](fa: SchemaR[A])(f: A ⇒ B): SchemaR[B] = fa match {
```

```
    case StructR(fields) ⇒ StructR(fields.map { case (k, v) ⇒ k -> f(v) })
```

```
    case ArrayR(e)       ⇒ ArrayR(f(e))
```

```
    case IntR()          ⇒ IntR[B]()
```

```
    case StringR()       ⇒ StringR[B]()
```

```
    case TimestampR()    ⇒ TimestampR[B]()
```

```
    case DoubleR()       ⇒ DoubleR[B]()
```

```
    case BooleanR()      ⇒ BooleanR[B]()
```

```
  }
```

```
}
```

# Unfold

*/\* Construct SchemaR from List[Field] \*/*

```
val coalgebra: Coalgebra[SchemaR, List[Field]] = {  
  case Nil          ⇒ StructR(Map.empty)  
  case x :: Nil     ⇒ x.getType match {  
    case LegacySQLTypeName.STRING      ⇒ StringR()  
    case LegacySQLTypeName.INTEGER     ⇒ IntR()  
    case LegacySQLTypeName.TIMESTAMP   ⇒ TimestampR()  
    case LegacySQLTypeName.NUMERIC     ⇒ DoubleR()  
    case LegacySQLTypeName.FLOAT       ⇒ DoubleR()  
    case LegacySQLTypeName.BOOLEAN     ⇒ BooleanR()  
    case LegacySQLTypeName.RECORD      ⇒ StructR(Map(x.getName -> List(x)))  
  }  
  case x :: xs      ⇒ StructR((x :: xs).map { f ⇒ f.getName -> List(f) }.toMap)  
}
```

# Fold

*/\* Deconstruct SchemaR to DataType \*/*

```
val algebra: Algebra[SchemaR, DataType] = {  
  case StructR(fields) ⇒ StructType(fields.map { case (k, v) ⇒ StructField(k, v) }.toSeq)  
  case ArrayR(e)       ⇒ ArrayType(e)  
  case IntR()          ⇒ IntegerType  
  case StringR()       ⇒ StringType  
  case TimestampR()    ⇒ TimestampType  
  case DoubleR()       ⇒ DoubleType  
  case BooleanR()      ⇒ BooleanType  
}
```

```
implicit val schemaRFunctor: Functor[SchemaR]  
val coalgebra: Coalgebra[SchemaR, List[Field]] // List[Field] => SchemaR[List[Field]]  
val algebra: Algebra[SchemaR, DataType] // SchemaR[DataType] => DataType
```

```
public final class Field implements Serializable {  
  private final String name;  
  private final LegacySQLTypeName type;  
  private final FieldList subFields;  
  private final String mode;  
  private final String description;  
}
```

```
def getDataType(listField: List[Field]): DataType = listField.hylo(algebra, coalgebra)
```

<https://speakerdeck.com/ogirardot/high-performance-privacy-by-design-using-matryoshka-and-spark>

<https://www.youtube.com/watch?v=HyHRI5LzVMk>