

# Compositional programming

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# Category Theory

Category Theory:  
the abstract study of  
*compositionality*

Software is *compositional* to the extent that we can understand the **whole** by understanding the **parts** and the rules of **composition**.

- A *compositional* expression is a nested structure.
- Each subexpression has a *meaning*.
- The meaning of the whole is *composed* of the meanings of the parts.

The **composition** of the **meanings**  
is the **meaning** of the **composition**.

*Composability* vs  
*Compositionality*

# A Small Example



```
val fr = new FileReader("thefile.txt")
val br = new BufferedReader(fr)

var line = br.readLine()

var count = 0

while (line ≠ null) {
    val words = line.split("\\s")
    for (w ← words) {
        count += 1
    }
    line = br.readLine()
}

br.close()

println(count)
```

```
io.linesR("thefile.txt")  
  .flatMap(s => emits(s.split("\\s")))  
  .map(_ => 1)  
  .fold(0)(_ + _)  
  .to(stdout)
```

```
io.linesR("thefile.txt")  
  .flatMap(s => emits(s.split("\\s"))) )  
  .map(_ => 1)  
  .fold(0)(_ + _)  
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```

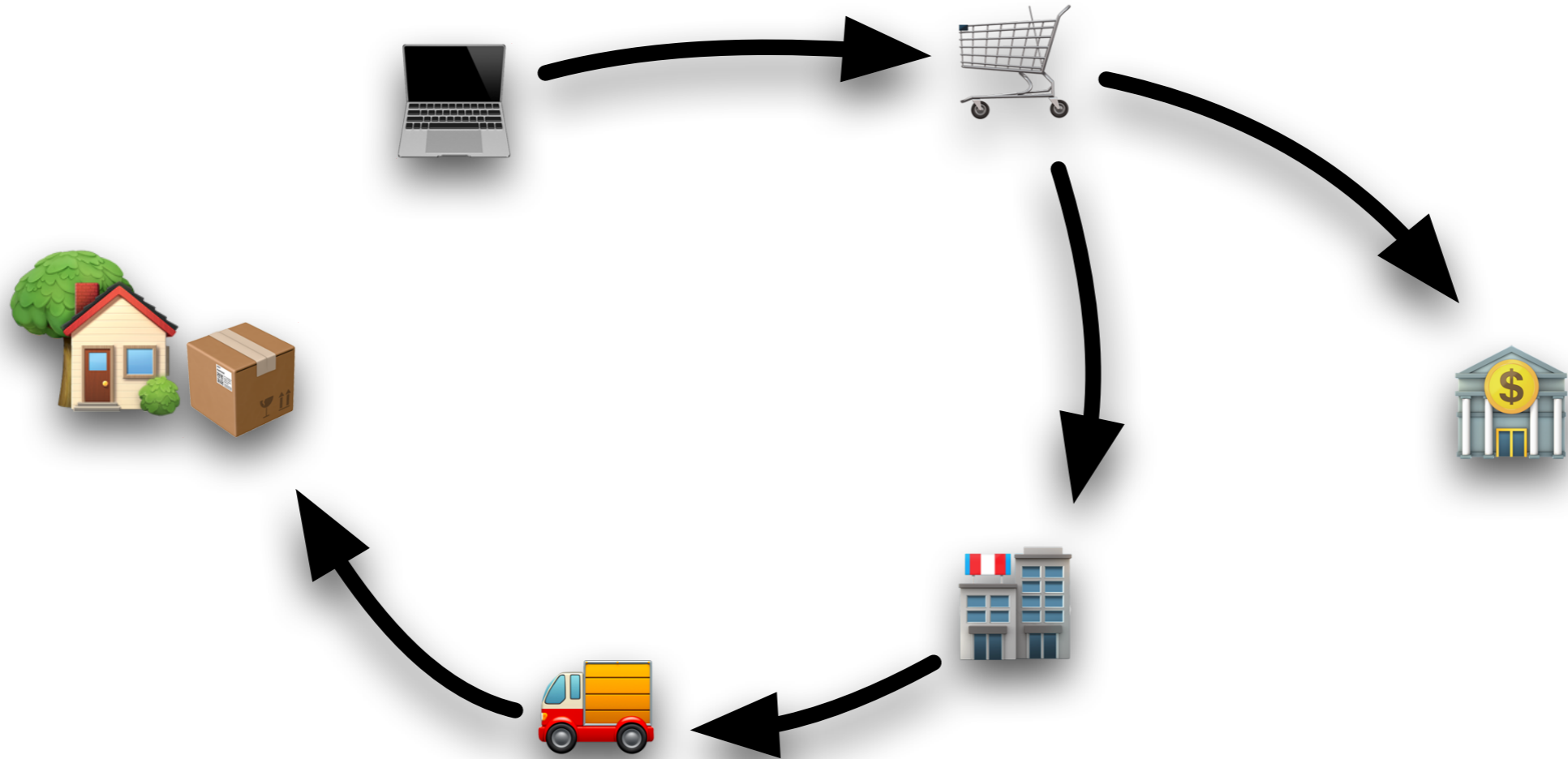
```
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  .flatMap(s => emits(s.split("\\s")))  
  .map(_ => 1)  
  .fold(0)(_ + _)  
  .to(stdout)
```





```
val lines = io.linesR("thefile.txt")
val words = _.flatMap(s => emits(s.split("\\s")))
val ones = _.map(_ => 1)
val sum = _.fold(0)(_ + _)
val print = _.to(stdout)

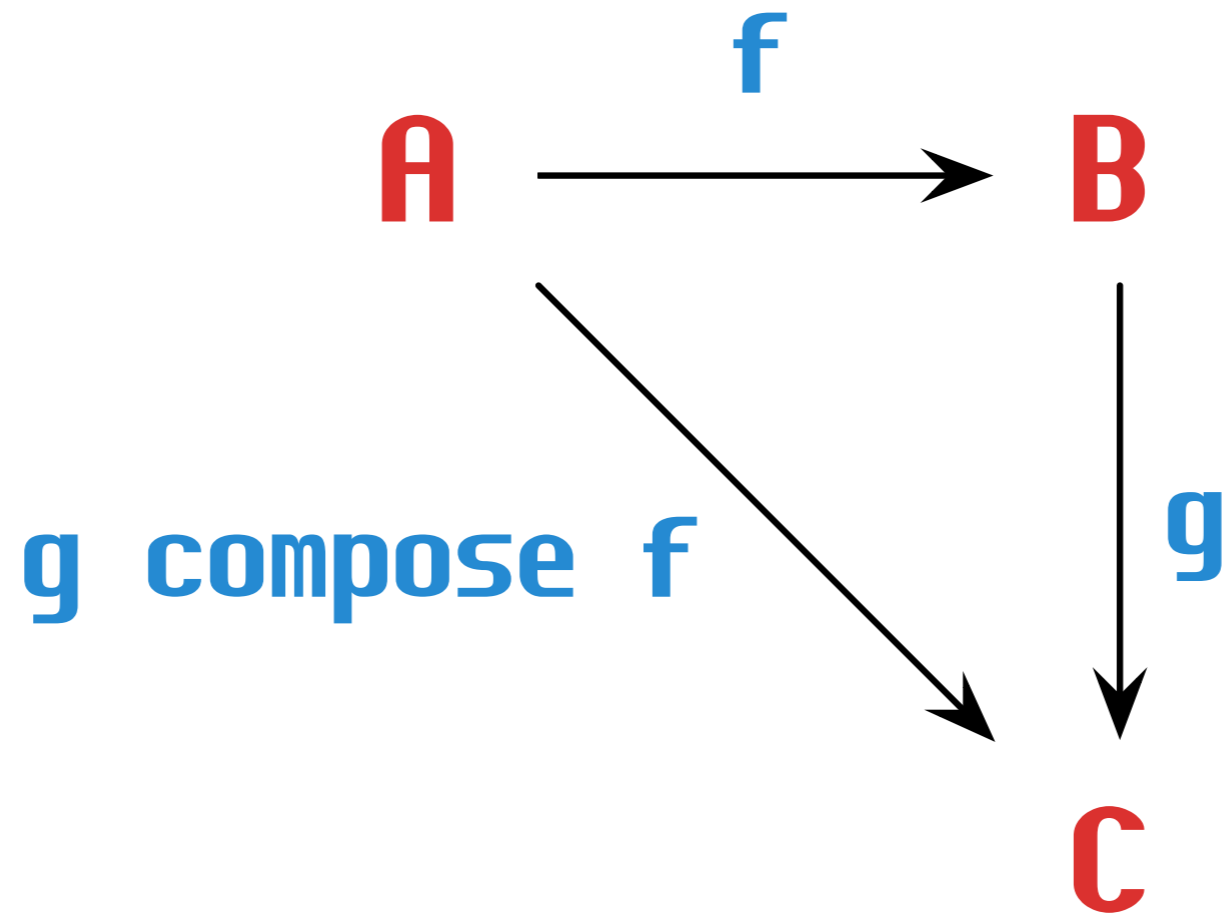
val prg = print(sum(ones(words(lines))))
```

```
val f = print  
    compose sum  
    compose ones  
    compose words
```

```
val prg = f(lines)
```

Functional programming is really the study of *compositional software*

Functions are  
compositional



$$(x:A) \Rightarrow g(f(x))$$

# Category

- Objects
- Arrows between objects
- Composition of arrows
  - Which is associative
  - And has an identity

# The Scala Category

- Objects: Scala types
- Arrows: Scala functions
- Composition: function composition
- **f compose g compose h =**  
**(x ⇒ f(g(h(x))))**
- **identity = (x ⇒ x)**



# Another Scala Category

- Objects: Scala types
- Arrows: Subtype relationships
- Composition: transitivity

**A <: B <: C**

**A <: A**

```
trait Monoid[M] {  
  def empty: M  
  def append(m1: M, m2: M): M  
}
```

# Monoid

1. A type
2. An associative binary operation
3. An identity element for that operation

## Examples

- **Int** with  $(+, 0)$
- **Int** with  $(*, 1)$
- **Boolean** with  $(\&\&, \text{true})$
- **String** with  $(++, "")$
- **$A \Rightarrow A$**  with  $(\text{compose}, \text{identity}[A])$

# A monoid is a category with one object

- Objects: The type **M**
- Arrows: Values of type **M**
- Composition: **append**
- Identity: **empty**

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**append(wc(s1), wc(s2)) = wc(s1 ++ s2)**

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WC("Lorem", 39, "")

massa quis enim; Donec pede justo, fringilla vel, aliquet nec, vulputate eget, arcu? In enim justo, rhoncus ut, imperdiet a, venenatis vitae, justo; Nullam dictum felis eu pede mollis pretium! Integer tincidunt? Cras dapibus! Vivamus elementum semper nisi; Aenean vulputate eleifend tellus. Aenean leo ligula, porttitor eu, consequat vitae, eleifend ac, enim. Aliquam lorem ante, dapibus in, viverra quis, feugiat a, tellus; Phasellus viverra nulla ut metus varius laoreet; Quisque rutrum? Aenean imperdiet; Etiam ultricies nisi vel augue! Curabitur ullamcorper ultricies nisi; Nam eget dui; Lorem ipsum dolor sit amet, consectetur adipiscing elit. Aenean commodo ligula eget dolor? Aenean massa. Cum sociis natoque penatibus et magnis dis parturient montes, nascetur ridiculus mus! Donec quam felis, ultricies nec, pellentesque eu, pretium quis, sem? Nulla consequat massa quis enim! Donec pede justo, fringilla vel, aliquet nec, vulputate eget, arcu! In enim justo, rhoncus ut, imperdiet a, venenatis vitae, justo! Nullam dictum felis eu pede mollis pretium!

**WC("Lorem", 39, "")**

**WC("massa", 49, "vi")**

tae, eleifend ac, enim. Aliquam lorem ante, dapibus in, viverra quis, feugiat a, tellus; Phasellus viverra nulla ut metus varius laoreet; Quisque rutrum? Aenean imperdiet; Etiam ultricies nisi vel augue! Curabitur ullamcorper ultricies nisi; Nam eget dui; Lorem ipsum dolor sit amet, consectetur adipiscing elit. Aenean commodo ligula eget dolor? Aenean massa. Cum sociis natoque penatibus et magnis dis parturient montes, nascetur ridiculus mus! Donec quam felis, ultricies nec, pellentesque eu, pretium quis, sem? Nulla consequat massa quis enim! Donec pede justo, fringilla vel, aliquet nec, vulputate eget, arcu! In enim justo, rhoncus ut, imperdiet a, venenatis vitae, justo! Nullam dictum felis eu pede mollis pretium!

**WC**( "Lorem" , 39 , "" )

**WC**( "massa" , 49 , "vi" )

**WC**( "tae" , 55 , "pena" )

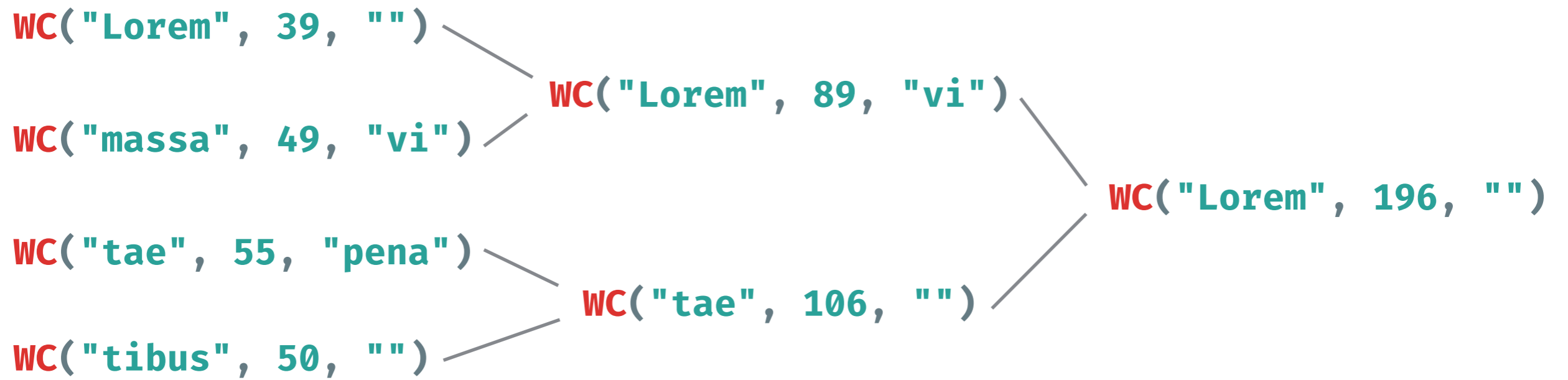
tibus et magnis dis parturient montes, nascetur ridiculus mus!  
Donec quam felis, ultricies nec, pellentesque eu, pretium quis,  
sem? Nulla consequat massa quis enim! Donec pede justo,  
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rhoncus ut, imperdiet a, venenatis vitae, justo! Nullam dictum felis  
eu pede mollis pretium!

**WC**("Lorem", 39, "")

**WC**("massa", 49, "vi")

**WC**("tae", 55, "pena")

**WC**("tibus", 50, "")



# Compositional reasoning

$\text{append}(\text{wc}(s1), \text{wc}(s2)) = \text{wc}(s1 ++ s2)$

$\text{append}(\text{wc}(s), \text{wc}("")) = \text{wc}(s)$

$\text{append}(\text{wc}(""), \text{wc}(s)) = \text{wc}(s)$

# Monoid homomorphism

$$\text{append}(\text{wc}(s1), \text{wc}(s2)) = \text{wc}(s1 ++ s2)$$

$$\text{append}(\text{wc}(s), \text{wc}("")) = \text{wc}(s)$$

$$\text{append}(\text{wc}(""), \text{wc}(s)) = \text{wc}(s)$$

# Homomorphism



## Monoid homomorphism

$$s1.length + s2.length = (s1 ++ s2).length$$

$$"".length = 0$$

Category Theory is really the  
study of *homomorphisms*

# The category *Mon* of monoids

- Objects: monoids
- Arrows: monoid homomorphisms
- Composition: function composition

# The category *Cat* of categories

- Objects: categories
- Arrows: *category homomorphisms*
- Composition: ?

# The category *Cat* of categories

- Objects: categories
- Arrows: *functors*
- Composition: functor composition

# Functor

$$F: C \rightarrow D$$

- Takes every object in  $C$  to an object in  $D$
- Takes every arrow in  $C$  to an arrow in  $D$
- Composition and identity are preserved

```
trait Functor[F[_]] {  
  def map[A,B](h: A => B): F[A] => F[B]  
}
```

```
trait Functor[F[_]] {  
  def map[A,B](f: A => B): F[A] => F[B]  
}
```

`map(f compose g) = map(f) compose map(g)`  
`map(identity) = identity`



```
implicit val optionF = new Functor[Option] {  
  def map[A,B](f: A => B): Option[A] => Option[B] =  
    { case Some(a) => Some(f(a))  
      case None => None  
    }  
}
```

**f** : **A**  $\Rightarrow$  **B**

If **f** has a side effect, composition is impossible.

**f**: **A**  $\Rightarrow$  **Option[B]**

Effect: the function **f** might not  
return any **B**

**f**: **A**  $\Rightarrow$  **Option[B]**

**g**: **B**  $\Rightarrow$  **Option[C]**

Problem:

**f andThen g**

**f**: **A**  $\Rightarrow$  **Option[B]**

**g**: **B**  $\Rightarrow$  **Option[C]**

Solution:

**f andThen ( \_ flatMap g )**

**f** : **A**  $\Rightarrow$  **Option[B]**

**g** : **B**  $\Rightarrow$  **Option[C]**

**f**  $\Rightarrow$  **g** : **A**  $\Rightarrow$  **Option[C]**

# Kleisli Category

- Objects: Scala types
- An arrow from **A** to **B** is a function of type **A ⇒ Option[B]**
- Composition: Kleisli composition
  - **f >=> g >=> h =**  
**(x => h(x) flatMap g flatMap f)**
  - **identity(x) = Some(x)**

# Kleisli Category

- Objects: types **A**, **B**, **F[T]** etc.
- An arrow from **A** to **B** is a function of type **A => M[B]** for some functor **M**.
- Composition: Kleisli composition (**flatMap**)
- Identity: **unit: A => M[A]**



```
trait Monad[M[_]] {  
  def flatMap[A,B](h: A ⇒ M[B]): M[A] ⇒ M[B]  
  def unit[A]: A ⇒ M[A]  
}
```

**flatMap(f ⇒ g) = flatMap(f) compose flatMap(g)**  
**flatMap(unit) = identity**

# Things that prevent compositionality

# Side effects

```
class Cafe {  
  def buyCoffee(cc: CreditCard): Coffee = {  
    val cup = new Coffee()  
    cc.charge(cup.price)  
    cup  
  }  
}
```

# Side effects

```
class Cafe {  
  def buyCoffee(cc: CreditCard): (Coffee, Charge) = {  
    val cup = new Coffee()  
    (cup, new Charge(cc, cup.price))  
  }  
}
```

# Side effects

**`map(f compose g) = map(f) compose map(g)`**

**`f(x) + f(y) = f(x + y)`**

# Connected sequences

The meaning of the whole is not a combination the meaning of the parts

```
MOV    AH, 01h  
INT    21
```

# Dependencies

The meaning of one part depends on the meaning of some or all the other parts.

**Rhe1 d4**

**Nd5 Nbd5**

**ed5 Qd6**

**Rd4 cd4**

# Leaky abstractions

```
val query = """  
  select a, b, c  
  from foo  
  where a = ?  
  """
```



# Leaky abstractions

```
val query = """  
  select a, b, c, d  
  from foo  
  where a = ?  
  and b = ?  
  """
```

# Entropy and Perplexity











Without compositionality,  
language is literally  
meaningless.

Without compositionality,  
software is literally  
meaningless.

# Language without composition

- Totally nonuniform
- Absolutely unambiguous
- Maximally perplexed
- Literally meaningless



**Big Wins**

# Productivity

Understand things we've never seen before by understanding the the components.

# Productivity

- Break a problem into parts.
- Solve the parts with simple programs.
- Compose the solution from the smaller programs.

Compositionality lets  
us reason about really  
big systems and ideas.

# Systematicity

If we understand  $f(x)$  and  $g(y)$ ,  
we also understand  $f(y)$  and  $g(x)$ .

# Systematicity

If we can solve problems with *p*, *q*, and *r* individually, we can solve any problem whose solution is any combination of of *p*, *q*, and *r*.

***Pragmatics:***  
**Compositionality**  
**works.**

***Pragmatics:***

Compositionality is the  
***only*** thing that works.



***Æsthetics:***

Compositional software  
is delightful.

ad

Functional Programming

ad

CS

SI

IN

Paul Chiusano  
Rúnar Bjarnason  
Foreword by Martin Odersky



Write delightful,  
meaningful,  
compositional code.