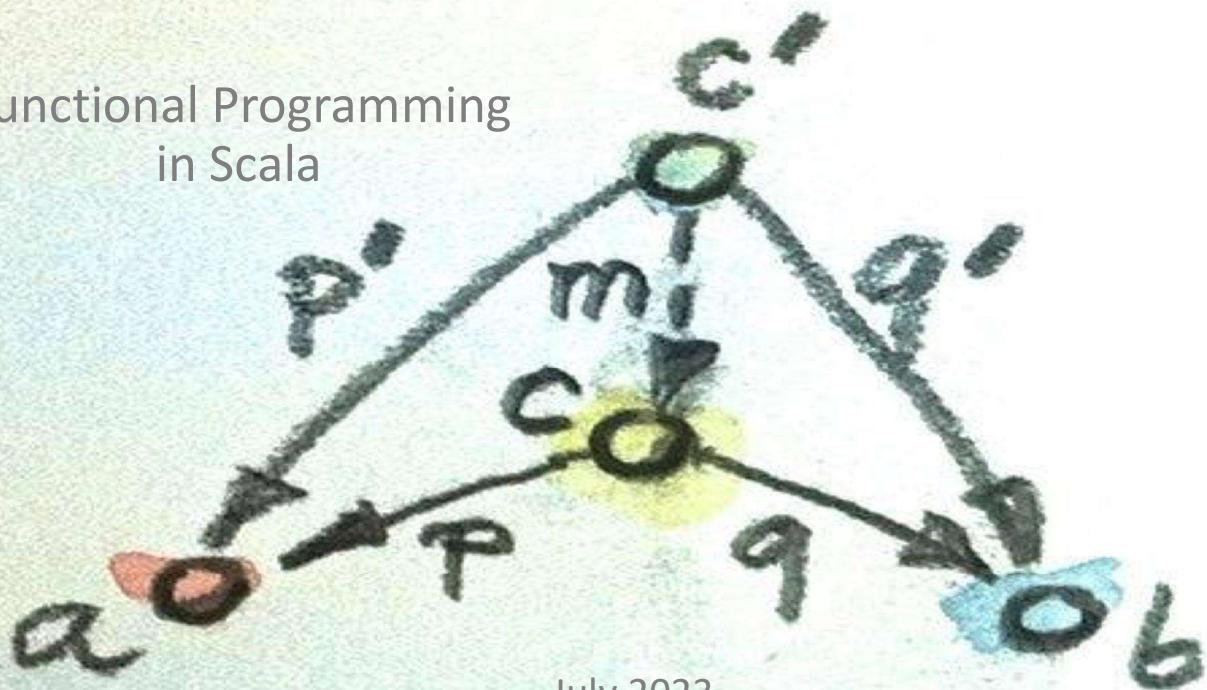


Functional Programming in Scala



July 2023

1



2

Prerequisites – Not Really 😊

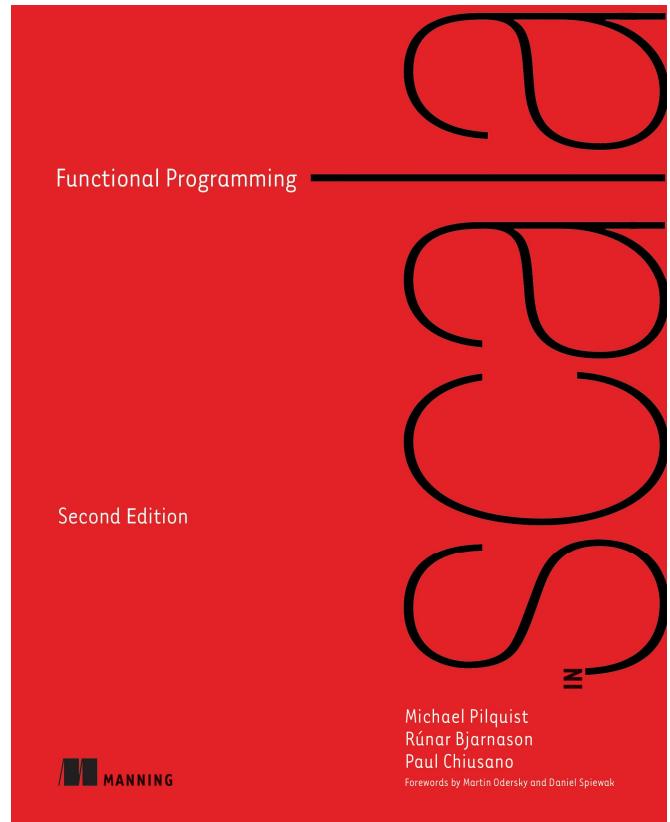
- A reasonable background in functional programming, especially in Scala
- Recommended prerequisite course: “**Principles of Functional Programming in Scala**”, Coursera Course by Martin Odersky
- Other experiences in some other functional programming languages, such as Haskell, F#, Clojure, etc. would be fine.



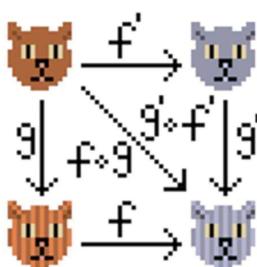
3

Textbook

Functional Programming in Scala,
2nd Edition,
Michael Pilquist,
Rúnar Bjarnason, and
Paul Chiusano,
Manning, 2023



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Tools

- Scala Language 3.3.0
- SBT: Build tool, v.1.9.2
- IDE: VS Code or IntelliJ

A screenshot of the official Scala website. The header features the Scala logo and navigation links for LEARN, INSTALL, PLAYGROUND, FIND A LIBRARY, COMMUNITY, and BLOG. Below the header, a banner for "The Scala Programming Language" highlights its combination of object-oriented and functional programming. A code editor window shows Scala code for functional programming with immutable collections, including a snippet for counting the occurrences of a character in a list of fruits. At the bottom, there are calls to action for "GET STARTED" and "LEARN SCALA", along with links to API Docs, Migrate to Scala 3, and Scala Book/Tour/Courses. A footer section titled "Scala in a Nutshell" encourages users to click buttons to see Scala in action or visit the documentation.

Functional Programming

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Functional programming

- FP is a *declarative-style* programming.
- Functional programs are composed of nested *pure functions*.
- A pure function is one with *referential transparency* (and therefore *no side effects*).
- Everything is basically *immutable*.
 - Use *recursions* instead of loops
- FP is based on *lambda calculus* and *category theory*.

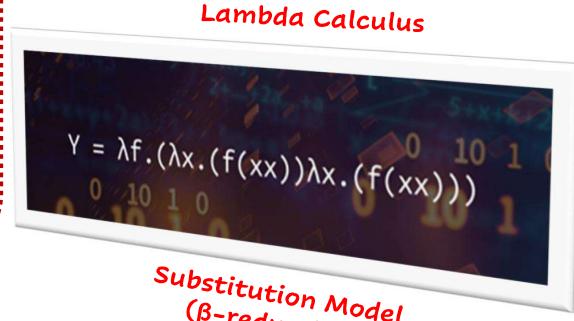


Alonzo Church
(1903-1995)

8

Core Concepts of Functional Programming

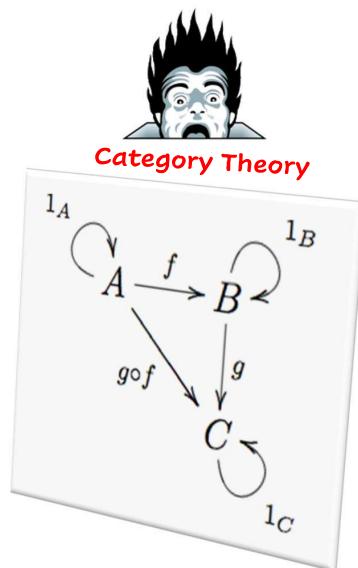
Pure Functions
Referential Transparency
Composition
High-Order Functions
Immutability
Currying
Recursions
Parametric Polymorphism
Algebraic Data Types
Higher Kind Types
Lazy evaluation



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Functional Patterns

Semigroup/Monoid
Functor
Applicative
Monad
Natural Transformation
 $\{\text{Cata, Ana, Hylo}\}$ morphisms
Lens
Adjunction
 F -Algebra



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Imperative Programming

- Tell **how** to do it.



- **Mutability**

Root of all
Evils!



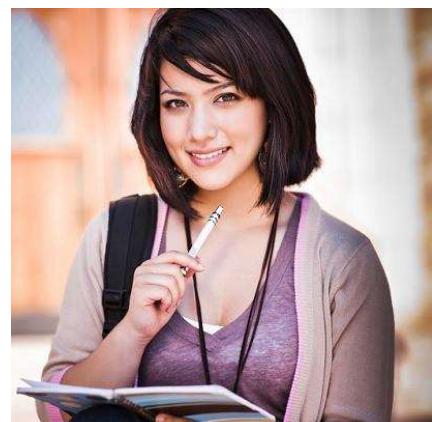
```
def qsort(xs: Array[Int], low: Int, high: Int) {  
  def swap(i: Int, j: Int) = {  
    val temp = xs(i)  
    xs(i) = xs(j)  
    xs(j) = temp  
  }  
  
  val pivot = xs((low + high) / 2)  
  var i = low  
  var j = high  
  while (i <= j) {  
    while (pivot < xs(j)) j -= 1  
    while (pivot > xs(i)) i += 1  
    if (i <= j) {  
      swap(i, j)  
      i += 1  
      j -= 1  
    }  
  }  
  if (low < j) qsort(xs, low, j)  
  if (i < high) qsort(xs, i, high)  
}
```

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Declarative Programming

- Tell **what** to do.
- **Immutability**

```
def qsort(xs: List[Int]): List[Int] = {  
  if (xs.size <= 1) xs  
  else {  
    val pivot = xs(xs.length / 2)  
    val (l, e, r) = partition(xs, pivot)  
    List.concat(qsort(l), e, qsort(r))  
  }  
}
```



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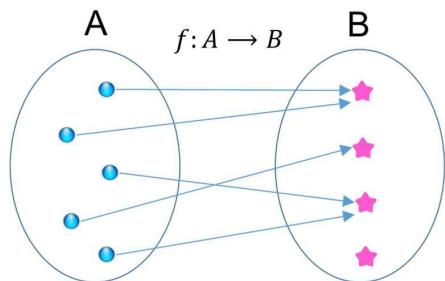
Pure Functions

FP means programming with **pure functions**.

A pure function is one with **no side effects**.

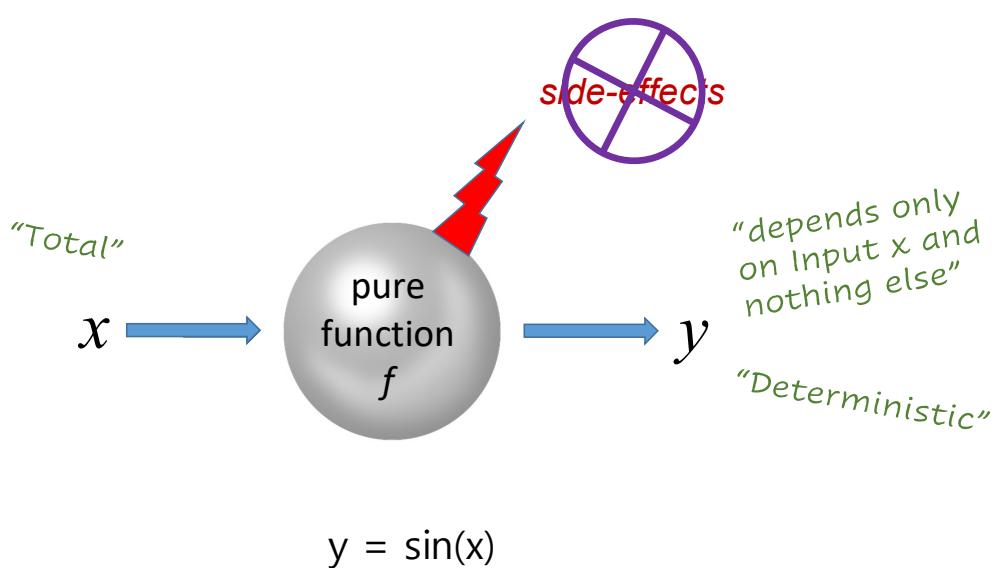
$f : A \Rightarrow B$

- Relates every value a of type **A** to exactly one value b of type **B** such that b is determined solely by the value of a .



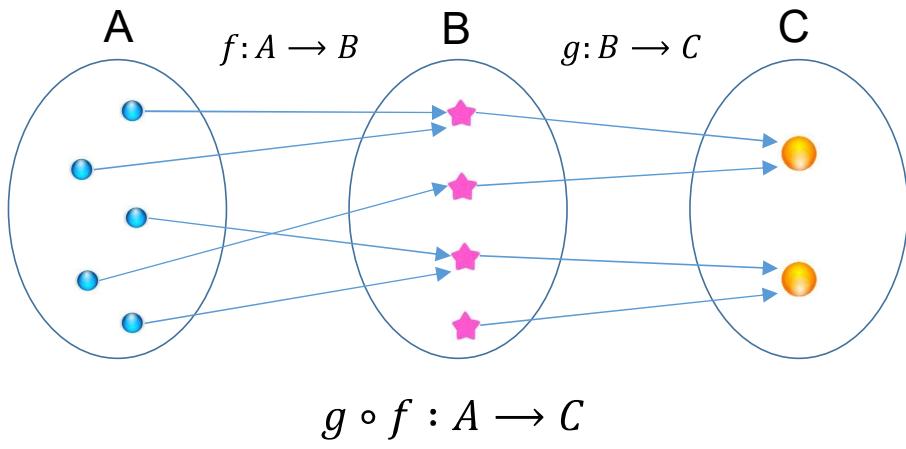
A **pure function** has **no observable effect** on the execution of the program **other than to compute a result given its inputs**.

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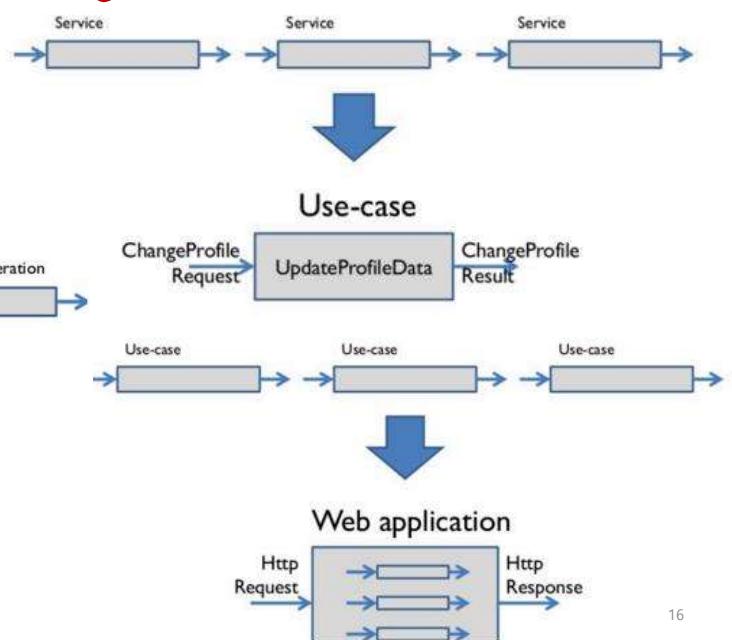
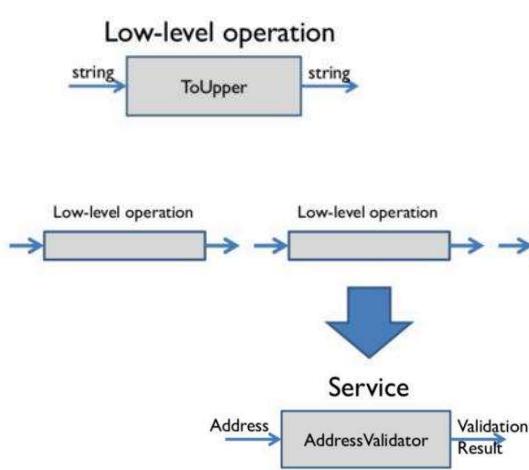
Functions and Types (Morphisms and Sets)



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Modular and Scale

composition is everywhere!



by Scott Wlaschin

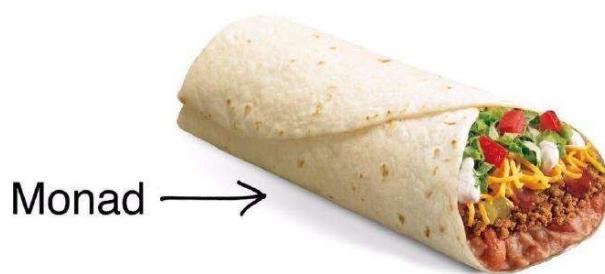
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Side Effects

- Modifying a variable
 - Modifying a data structure in place
 - Setting a field on an object
 - Throwing an exception or halting with an error
 - Printing to the console or reading user input
 - Reading from or writing to a file
 - Drawing on the screen
- etc.

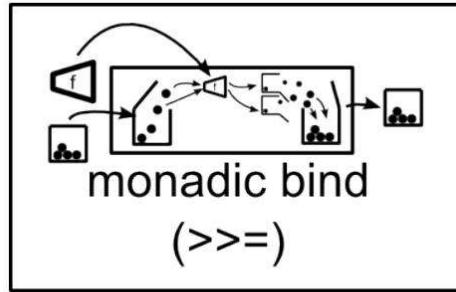
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Monads are like Burritos



From <https://twitter.com/monadburritos/status/915624691829587968>

18

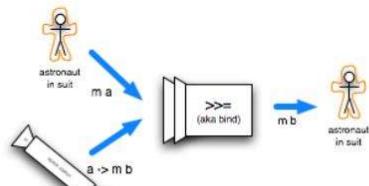
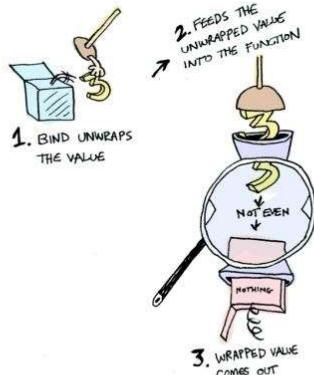


monads are burritos?

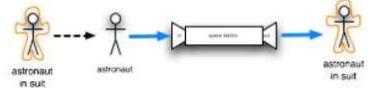
$$\text{monad} \rightarrow (a \rightarrow \text{monad}) \rightarrow \text{monad}$$

and functors?

$$(a \rightarrow b) \rightarrow \text{monad} \rightarrow \text{monad}$$

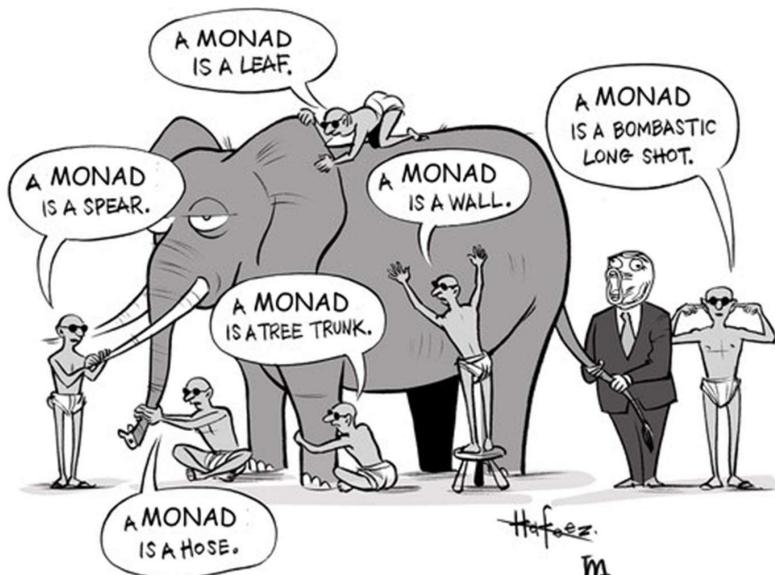


1. remove astronaut from suit
2. put naked astronaut in station
3. send out whatever the station sends out (well... almost)



<https://homepages.inf.ed.ac.uk/wadler/papers/yow/monads-haskell.pdf>

Let's face it: all monad tutorials suck. So here's another one:



A monad is just a monoid
in the category of endofunctors.



What's the problem?

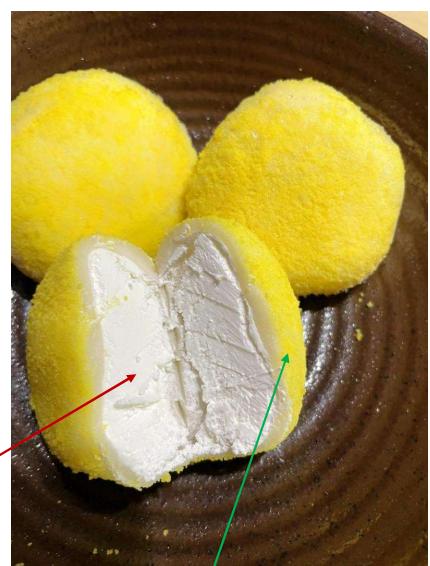
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Functional Programming

생크림 찹쌀떡 프로그래밍

- Functional programming is a restriction on *“how” we write programs*, but not on what programs we can express.
- Over the course of this tutorial, we’ll learn how to express all of our programs without side effects, and that includes programs that perform I/O, handle errors, and modify data.
- **General guideline:** Implement programs with a pure core and a thin layer on the outside that handles effects.

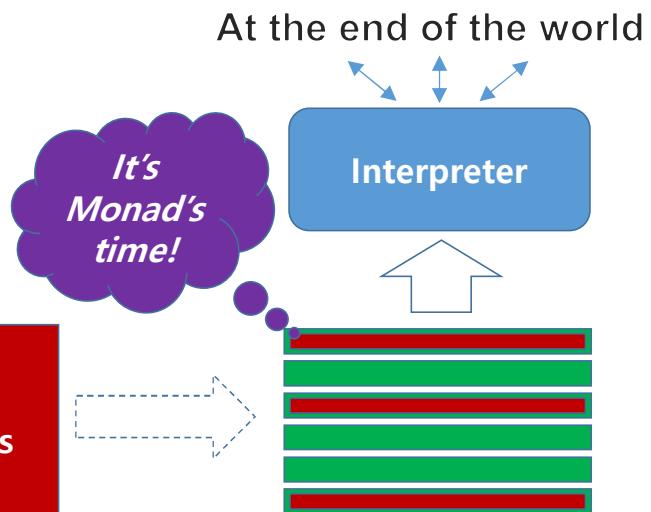
Pure core



Outer thin layer 22

Pits of Success

- Functional Programming
- Domain Driven Design
- Hexagonal Architecture



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A Scala Program with Side Effects

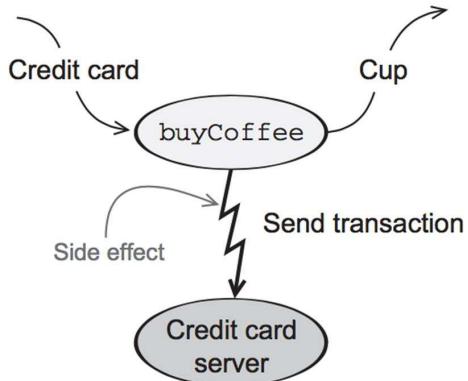
```
class Cafe {  
  def buyCoffee(cc: CreditCard): Coffee = {  
    val cup = Coffee()  
    cc.charge(cup.price)  
    cup  
  }  
}
```

Side effect.
Actually charges
the credit card.

Charging a credit card involves some interaction with the outside world.

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Problem Due to Side Effects



Can't test `buyCoffee`
without credit card server.
Can't combine two
transactions into one.

The code is difficult to test.
It's difficult to reuse `buyCoffee`.

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Adding a Payment Object ... but ...

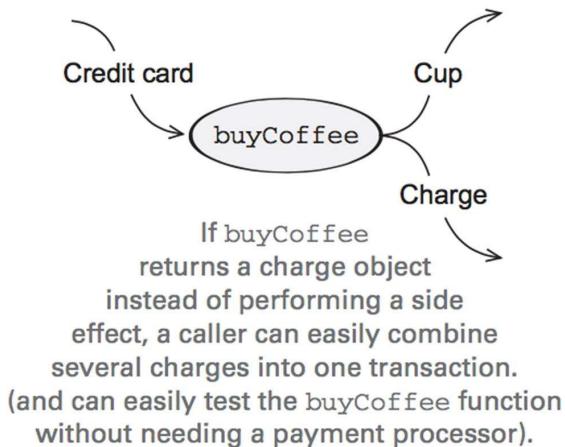
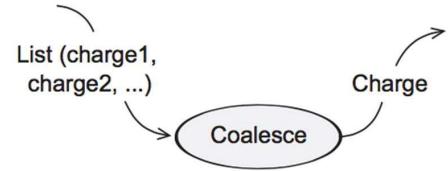
```
class Cafe {  
    def buyCoffee(cc: CreditCard, p: Payments): Coffee = {  
        Side effect.    val cup = Coffee()  
                      p.charge(cc, cup.price)  
                      cup  
    }  
}
```

It's still difficult to reuse `buyCoffee`.

Though side effects still occur when we call `p.charge(cc, cup.price)`, at least regained some testability via **Payment interface** or mock objects.

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Functional Solution



The functional solution is to eliminate side effects and have **buyCoffee return the charge as a value** in addition to returning the **Coffee**.

Separated the concern of *creating* a charge from the *processing or interpretation* of that charge.

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Functional Solution

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

buyCoffee now returns a pair of a Coffee and a Charge, indicated with the type (Coffee, Charge). Whatever system processes payments is not involved at all here.

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Charge as a First-Class Value

```
case class Charge(cc: CreditCard, amount: Double) {  
    def combine(other: Charge): Charge =  
        if cc == other.cc then  
            Charge(cc, amount + other.amount)  
        else  
            throw new Exception("Can't combine charges to different cards")  
    }  
  
class Cafe {  
    def buyCoffee(cc: CreditCard): (Coffee, Charge) = ???  
  
    def buyCoffees(cc: CreditCard, n: Int): (List[Coffee], Charge) = {  
        val purchases: List[(Coffee, Charge)] = List.fill(n)(buyCoffee(cc))  
        val (coffees, charges) = purchases.unzip  
        (coffees, charges.reduce((c1,c2) => c1.combine(c2)))  
    }  
}
```

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Additional Benefit of First-Class Value

Making **Charge** into a first-class value has other benefits:

→ more easily assemble business logic for working with these charges

```
def coalesce(charges: List[Charge]): List[Charge] =  
    charges.groupBy(_.cc).values.map(_.reduce(_ combine _)).toList
```

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Referential Transparency and Purity

An expression e is referentially transparent if, for all programs p , all occurrences of e in p can be replaced by the result of evaluating e without affecting the meaning of p .

A function f is **pure** if the expression $f(x)$ is referentially transparent for all referentially transparent x .

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```
scala> val x = "Hello, World"
x: java.lang.String = Hello, World

scala> val r1 = x.reverse
r1: String = dlrow ,olleH

scala> val r2 = x.reverse    ← r1 and r2 are the same.
r2: String = dlrow ,olleH
```

Suppose we replace all occurrences of x with the expression referenced by x .

```
scala> val r1 = "Hello, World".reverse
r1: String = dlroW ,olleH

scala> val r2 = "Hello, World".reverse    ← r1 and r2 are still the same.
r2: String = dlroW ,olleH
```

What's more, $r1$ and $r2$ are referentially transparent as well.

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```

scala> val x = new StringBuilder("Hello")
x: java.lang.StringBuilder = Hello

scala> val y = x.append(", World")
y: java.lang.StringBuilder = Hello, World

scala> val r1 = y.toString
r1: java.lang.String = Hello, World

scala> val r2 = y.toString
r2: java.lang.String = Hello, World ← r1 and r2 are the same.

```

Replacing all occurrences of `y` with the expression referenced by `y`:

```

scala> val x = new StringBuilder("Hello")
x: java.lang.StringBuilder = Hello

scala> val r1 = x.append(", World").toString
r1: java.lang.String = Hello, World

scala> val r2 = x.append(", World").toString
r2: java.lang.String = Hello, World, World ← r1 and r2 are no longer the same.

```

We conclude that `StringBuilder.append` is
not a pure function.

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Non RT Example

For `buyCoffee` to be pure, it must be the case that

$$p(\text{buyCoffee}(\text{aliceCreditCard})) == p(\text{Coffee}())$$

for any p .

```

class Cafe {
  def buyCoffee(cc: CreditCard): Coffee = {
    val cup = Coffee()
    cc.charge(cup.price) // return value is ignored here
    cup
  }
}

```

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RT and Substitution Model

- Referential transparency forces the invariant that **everything a function does is represented by the value that it returns**, according to the result type of the function.
- This constraint enables a *simple and natural mode of reasoning* about program evaluation called the **substitution model**.

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Benefits of Purity, Substitution Model

- A **pure function** is **modular**.
 - because it separates the logic of the computation itself from “*what to do with the result*” and “*how to obtain the input*”; it’s a black box.
- Modular programs allows **local reasoning** and **independent reuse**.
 - the meaning of the whole depends only on the meaning of the components and the rules governing their composition
- Hence, pure functions are **composable**.

36



- Rich Hickey
- Creator of Clojure

“Simplicity is prerequisite
for reliability”

- Edgser W. Dijkstra



Why Functional Programming matters?

Referential transparency that allows you to modularize your program in new ways, and helps answer these questions by making things as simple as possible!

OO patterns/principles

- Single Responsibility Principle
- Open Closed Principle
- Interface Segregation Principle
- Dependency Inversion Principle
- Factory Pattern
- Strategy Pattern
- Decorator Pattern
- Visitor Pattern
- ...

FP equivalents

- Functions
- Functions
- Functions also
- Functions
- You will be assimilated!
- Function again
- Functions
- Resistance is futile!
- ...

ScottWlaschin's slide

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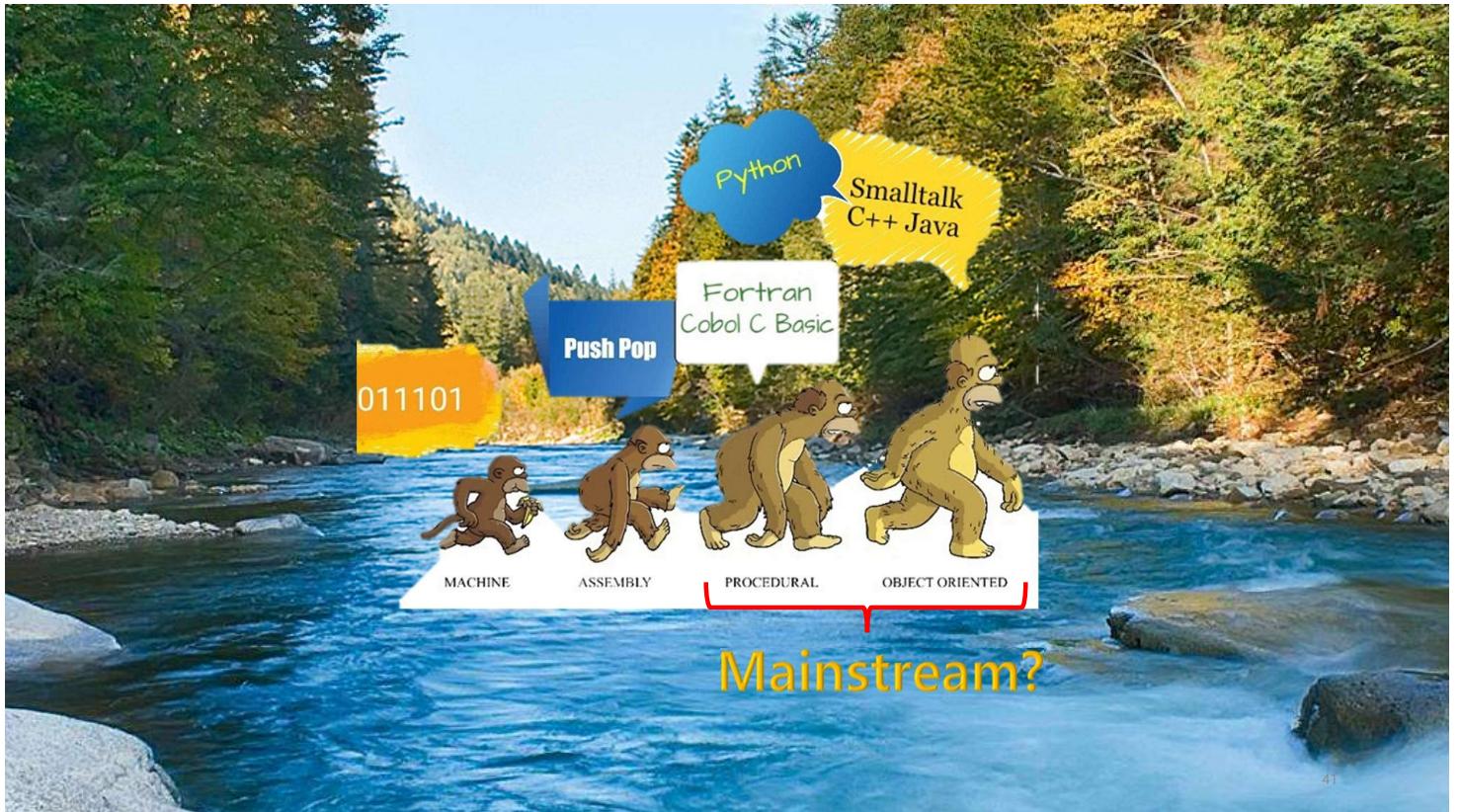
Summary:

Benefits of Functional Programming

Enables **local reasoning** and is more **modular** and **composable**.

- Easier to test
- Easier to reuse
- Easier to **parallelize**
- Easier to optimize
 - Compile-time optimization, Lazy evaluation, Memoization, etc.
- Less prone to bugs
- Easier to generalize

40



41

But unfortunately it's often more like this



How many FP
people see OOP



How many OOP
people see FP



And that's where we are 😊

