

# Comp 311

# Functional Programming

Eric Allen, Two Sigma Investments  
Robert “Corky” Cartwright, Rice University  
Sagnak Tasirlar, Two Sigma Investments

# Clarification on Homework Assignments

- Really, there are no extensions
  - The real world is no different than this
- We are not providing you with any substantial tests
  - The real world is no different than this

# Clarification on Homework Assignments

- Ambiguous sections of the homework are open to your interpretation
  - Make a reasonable interpretation and document it
  - Above all else, stick to functional programming constructs and the design recipe and templates discussed in class
- Take instructions concerning file and package names seriously

# Filters in For Expressions

```
for (x <- xs if x >= 0)  
  yield square(x) + 1
```

*This is a filter*



# Filters in For Expressions

- Filters are attached to generators
- A given generator can have zero or more filters

# Filters in For Expressions

```
for (  
  x <- XS  
  if x >= 0  
  if x % 2 == 0  
) yield square(x) + 1
```

# Clauses Can Be Enclosed in Braces Instead of Parentheses

```
for {  
  x <- xs  
  if x >= 0  
  if x % 2 == 0  
} yield square(x) + 1
```

# For Expressions Can Include Multiple Generators

```
for {  
  x <- xs  
  if x >= 0  
  y <- ys  
  if y % 2 == 0  
} yield x * y
```



# For Expressions Can Include Local Bindings

```
for {  
  x <- xs  
  if x >= 0  
  square = x * x  
  y <- ys  
  if y % square == 0  
} yield x * y
```

# Generators Can Specify Arbitrary Patterns

```
val xs = Cons(Square(4),  
              Cons(Circle(3),  
                  Cons(Rectangle(2,3),  
                      Empty)))
```

```
for {  
  Rectangle(x,y) <- xs  
} yield x * y
```

↳

```
Cons(6.0, Empty)
```

# Generators Can Specify Arbitrary Patterns

- Elements of the collection that do not match the pattern are filtered
- Effectively, a pattern in a **for** expression serves as part of a generator and a filter

# Guidelines on Using For Expressions

- Prefer `for` expressions to maps and filters
- They tend to be easier to read:
  - All bindings and collections iterated over are listed up front

# For vs Map

- Compare:

```
for (x <- xs if x >= 0)  
  yield square(x) + 1
```

- To:

```
map(square(_) + 1, xs.filter(_ >= 0))
```

# For Expressions and Database Queries

- **For** expressions are similar to standard database queries
- Consider a simple in-memory database of books, represented as a list of Book instances (*Odersky et al 2012*):

```
case class Book(title: String, authors: String*)
```

# For Expressions and Database Queries

```
val books: List[Book] =  
  Cons(  
    Book(  
      "Structure and Interpretation of Computer Programs",  
      "Abelson, Harold", "Sussman, Gerald J."  
    ),  
    Book(  
      "How to Design Programs",  
      "Felleisen, Matthias", "Findler, Robert Bruce",  
      "Flatt, Mathew", "Krishnamurthi, Shriram"  
    ),  
    Book(  
      "Programming in Scala",  
      "Odersky, Martin", "Spoon, Lex", "Venners, Bill"  
    )  
  )  
  ...  
)
```

# Finding All Books Whose Author Has Last Name “Sussman”

```
for {  
  b <- books  
  a <- b.authors  
  if z startsWith “Sussman”  
} yield b.title
```



# Finding All Books That Have The String “Program” In the Title

```
for {  
  b <- books  
  if (b.title indexOf “Program” >= 0)  
} yield b.title
```

# Finding All Authors That Have Written More Than One Book in the Database

```
for {  
  b1 <- books  
  b2 <- books if b1 != b2  
  a1 <- b1.authors  
  a2 <- b2.authors  
  if a1 == a2  
} yield a1
```

# Translating For Expressions

- It turns out that for expressions are translated to maps, flatMaps, and filters!
- Translation occurs *before* type checking
  - Why is this preferable?
- We start by considering only for expressions with generators that bind simple names (no patterns)

# Translating For Expressions With A Single Generator

```
for (x <- expr1) yield expr2
```

↳

```
expr1.map(x => expr2)
```

# Translating For Expressions With a Generator and a Filter

```
for (x <- expr1 if expr2) yield expr3
```

↳

```
for (x <- expr1 withFilter (x => expr2)) yield expr3
```

# Translating For Expressions With a Generator and a Filter

```
for (x <- expr1 if expr2) yield expr3
```

↳

```
for (x <- expr1 withFilter (x => expr2)) yield expr3
```

↳

```
expr1 withFilter (x => expr2) map (x => expr3)
```



*For now, read this as “filter”. We will return to it.*

# Translating For Expressions Starting With a Generator and a Filter

```
for (x <- expr1 if expr2; seq) yield expr3
```

↳

```
for (x <- expr1 withFilter (x ==> expr2); seq)  
  yield expr3
```

# Translating For Expressions Starting With Two Generators

```
for (x <- expr1; y <- expr2; seq) yield expr3
```

↳

```
expr1.flatMap(x => for (y <- expr2; seq) yield expr3)
```



# Translating For Expressions

## Example

```
for (b1 <- books; b2 <- books if b1 != b2;  
     a1 <- b1.authors; a2 <- b2.authors if a1 == a2)  
yield a1
```

↳

```
books flatMap (b1 =>  
  books withFilter (b2 => b1 != b2) flatMap (b2 =>  
    b1.authors flatMap (a1 =>  
      b2.authors withFilter (a2 => a1 == a2)  
      map (a2 => a1))))
```

# Translating Patterns in Generators

```
for (pat <- expr1) yield expr2
```

↳

```
expr1 withFilter { _ match {  
  case pat => true  
  case _ => false  
}} map {  
  case pat => expr2  
}
```

# Translating Patterns in Generators

```
for (pat <- expr1) yield expr2
```

↳

```
expr1 withFilter { _ match {  
  case pat => true  
  case _ => false  
}} map {  
  case pat => expr2  
}
```

Other cases with patterns and for expressions are  
similar

# Generalizing For Expressions

- Because for expressions are simply translated to expressions involving `map`, `flatMap`, and `withFilter`, we can use `for` expressions over our own collections
- We need only define `map`, `flatMap`, `withFilter`
- Because translation occurs before type checking, there is no particular type that our collection must subtype

# Generalizing For Expressions

- We can even define a subset of these methods and use our collection only in **for** expressions that translate to our subset!
- For example, if we do not define **withFilter**, we cannot use our collection in a for expression with a filter

# Generalizing For Expressions

- Because translation occurs before type checking, there is no particular signature that our methods `map`, `flatMap`, `withFilter` must satisfy!
- All that is required is that the resulting, translated program passes type checking

# The WithFilter Function

- In our own List implementation, we could simply define `withFilter` as `filter`, and our collection would work with `for` expressions
- The idea behind `withFilter` is that it is often advantageous to simply wrap the collection in a view that performs the given filter on the next `map`
- Because no particular type signature is required, we need only define `map` and `flatMap` on our wrapper

# The WithFilter Function

```
abstract class List[+T] {  
  ...  
  def withFilter[S >: T, U](p: S => Boolean) =  
    WithFilter[S](p, this)  
}
```



# The WithFilter Function

```
case class WithFilter[T](p: T => Boolean, xs: List[T]) {  
  def map[U](f: T => U): List[U] = {  
    xs match {  
      case Empty => Empty  
      case Cons(y,ys) => {  
        val rest = WithFilter(p,ys) map f  
        if (p(y)) Cons(f(y), rest)  
        else rest  
      }  
    }  
  }  
  ..  
}
```

# The WithFilter Function

- Because results of `withFilter` are immediately taken apart by a `map` or a `flatMap`, we can still think of the result of a `withFilter` as being an instance of the original collection

# Typical Structure of a Class That Works With For Expressions

```
abstract class C[A] {  
  def map[B](f: A => B): C[B]  
  def flatMap[B](f: A => C[B]): C[B]  
  def withFilter(p: A => Boolean): C[A]  
}
```

# Monads

- In functional programming, a *monad* can be defined as a type for which we can formulate
  - The functions `map`, `flatMap`, and `withFilter`
  - A “unit constructor” which produces a monad from an element value
  - In an object-oriented language, we can think of the “unit constructor” simply as a constructor or a factory method

# Monads

- Because **for** expressions work over precisely those datatypes for which we can formulate the functions that characterize monads, we can think of **for** expressions as syntax for computing with monads

# Monads

- But monads are able to characterize far more than just collections:
  - I/O
  - State
  - Transactions
  - Options
  - etc.

# Monads

- Thus, **for** expressions can be used in far more general contexts than simply walking over collections
- When looking at library classes, watch for implementations of **map**, **flatMap**, **withFilter**
- When these functions are defined, consider expressing your computation with **for** expressions

# The Environment Model of Reduction



# Limitations of the Substitution Model of Reduction

- Consider the following function definition:

```
def makeOddBooster(n: Int) = {  
  require(n >= 0)  
  def isEven(n: Int): Boolean = {  
    (n == 0) || isOdd(n - 1)  
  }  
  def isOdd(n: Int): Boolean = {  
    !isEven(n)  
  }  
  (m: Int) => if (isEven(m)) m else m + n  
}
```

# Limitations of the Substitution Model of Reduction

- Our `makeOddBooster` function cannot be expanded before it is returned
- It must remember the context in which it was formed

# The Environment Model of Reduction

- Name environments map names to values
- Every expression is evaluated in the context of a name environment

# The Environment Model of Reduction

- To evaluate a name, simply reduce to the value it is mapped to in the environment

# The Environment Model of Reduction

- To evaluate a function, reduce it to a *closure*, which consists of two parts:
  - The body of the function
  - The environment in which the body occurs

# The Environment Model of Reduction

- To evaluate an application of a closure
  - Extend the environment of the closure, mapping the function's parameters to argument values
  - Evaluate the body of the closure in this new environment

# Example Evaluation

```
makeOddBooster(3)(1), ENV  $\mapsto$   
(m: Int) => if (isEven(m)) m else m + n)(1)  
  {n: Int = 3,  
   isEven = Closure(..),  
   isOdd = Closure(..)}; ENV  $\mapsto$   
if (isEven(m)) m else m + n,  
  {m: Int = 1, n: Int = 3, ..}; ENV  $\mapsto^*$   
if (false) m else m + n,  
  {m: Int = 1, n: Int = 3, ..}; ENV  $\mapsto$   
m + n  
  {m: Int = 1, n: Int = 3, ..}; ENV  $\mapsto$   
4, ENV
```