

Why I Like Functional Programming

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Machine Learning @ Box, Inc.

Let's go back..



<http://gauss.cs.ucsb.edu/home/images/UCSB-from-air.jpg>

2011

2011

```
void insert(Node* &tree, int value) {  
    if (!tree) return;  
  
    Node *trav = tree, *parent;  
    while (trav) {  
        parent = trav;  
        if (value < trav->data) trav = trav->left;  
        else if (value > trav->data) trav = trav->right;  
        else break;  
    }  
    if (value < parent->data)  
        parent->left = new Node(value);  
    else  
        parent->right = new Node(value);  
}
```

Physics and Math

Physics and Math

- Simplicity and consistency across problems

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Physics and Math

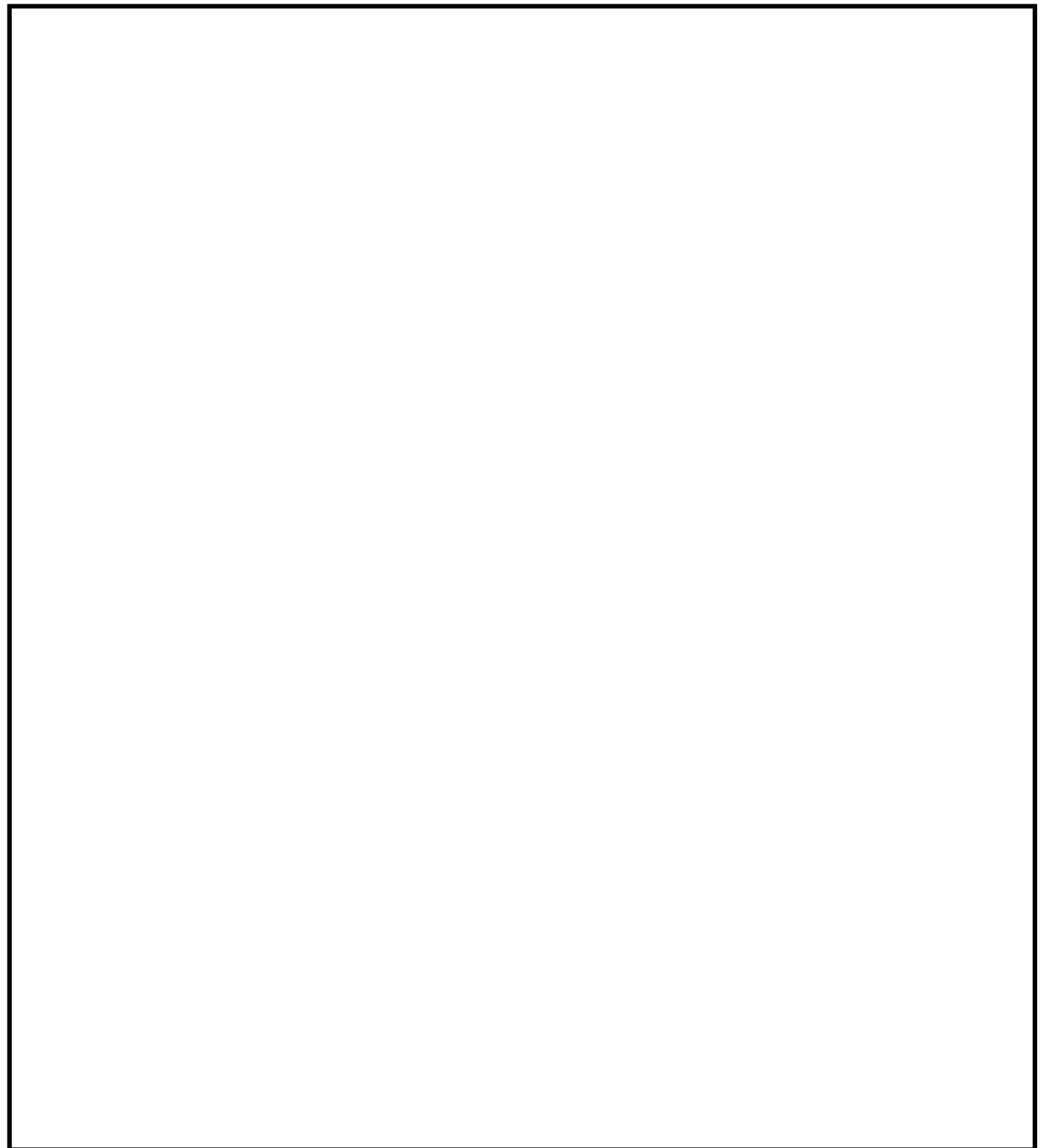
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 - $v_f = v_0 + a \Delta t$
 - $v_{avg} = v_0 + \frac{1}{2}a\Delta t$

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- Example: Deriving laws of motion from first principles
 - $v_f = v_0 + a \Delta t$
 - $v_{avg} = v_0 + \frac{1}{2}a\Delta t$
 - $x = x_0 + v_0 t + \frac{1}{2}at^2$

Physics and Math

Deriving $x = x_0 + v_0t + \frac{1}{2}at^2$



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$$x_0 + v_0 t + \frac{1}{2} a t^2$$

2012

2012

```
sealed abstract class Tree
case class Branch(data: Int, left: Tree, right: Tree)
  extends Tree
case class Leaf() extends Tree

def insert(tree: Tree, value: Int): Tree =
  tree match {
    case Leaf() => Branch(value, Leaf(), Leaf())
    case b@Branch(d, l, r) =>
      if (value < d) Branch(d, insert(l, value), r)
      else if (value > d) Branch(d, l, insert(r, value))
      else b
  }
```

Hmm.. functional programming seems pretty cool.

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But is it as cool as physics and math?

Functional Programming

Functional Programming

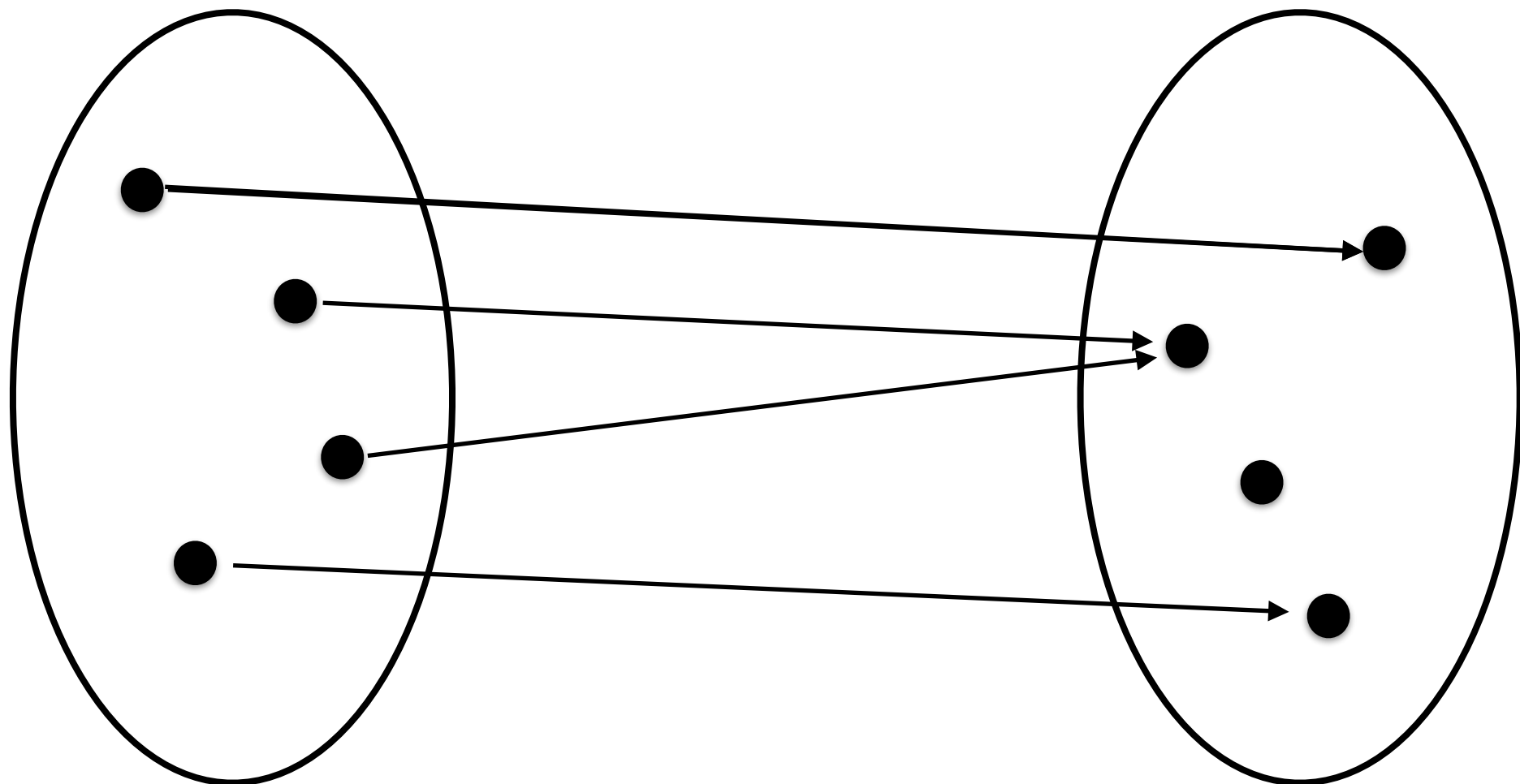
programming with functions

Functional Programming

programming with **pure** functions

Functional Programming

programming with **pure** functions



Functions

Functions

```
def parseIntPartial(s: String): Int =  
    s.toInt // can throw NumberFormatException
```

Functions

```
def parseIntPartial(s: String): Int =  
    s.toInt // can throw NumberFormatException
```

```
def parseIntTotal(s: String): Option[Int] =  
    try {  
        Some(s.toInt)  
    } catch {  
        case nfe: NumberFormatException => None  
    }
```

Functions

Functions

```
class Rng(var seed: Long) {  
  def nextInt(): Int = {  
    val int = getInt(seed)  
    mutate(seed)  
    int  
  }  
}
```

Functions

```
class Rng(var seed: Long) {  
  def nextInt(): Int = {  
    val int = getInt(seed)  
    mutate(seed)  
    int  
  }  
}
```

```
case class Rng(seed: Long) {  
  def nextInt: (Rng, Int) = {  
    val int = getInt(seed)  
    val newSeed = f(seed)  
    (Rng(newSeed), int)  
  }  
}
```

Referential Transparency

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An expression **e** is referentially transparent if

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An expression **e** is referentially transparent if
for all programs **p**
every occurrence of **e** in **p**
can be replaced with the result of evaluating **e**
without changing the result of evaluating **p**.*

Referential Transparency

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$$x^4 - 12x^2 + 36 = 0$$

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$$y = x^2$$

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$$a = 1$$

$$b = -12$$

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$$12 / 2$$

Referential Transparency

$$x^4 - 12x^2 + 36 = 0$$

$$y = x^2$$

$$y^2 - 12y + 36 = 0$$

$$y = 6$$

$$ax^2 + bx + c = 0$$

$$(-b \pm \sqrt{b^2 - 4ac}) / 2a$$

$$a = 1$$

$$b = -12$$

$$c = 36$$

$$(-(-12) \pm \sqrt{(-12)^2 - 4(1)(36)}) / 2(1)$$

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$$x^4 - 12x^2 + 36 = 0$$

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$$y = 6$$

$$x^2 = 6$$

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Referential Transparency

$$x^4 - 12x^2 + 36 = 0$$

$$y = x^2$$

$$y^2 - 12y + 36 = 0$$

$$y = 6$$

$$x^2 = 6$$

$$x = \pm \sqrt{6}$$

$$ax^2 + bx + c = 0$$

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```
def userInfo(id: UserId): Future[UserData]

val userId = . . .

val fetchData = userInfo(userId)

fetchData.retry {
  case StatusCode(429) => fetchData
}
```

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fetchData.retry {  
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Referential Transparency

```
def userInfo(id: UserId): Task[UserData]

val userId = . . .

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fetchData.retry {
  case StatusCode(429) => fetchData
}
```

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```

```
val userId = . . .
```

```
val fetchData = userInfo(userId)
```

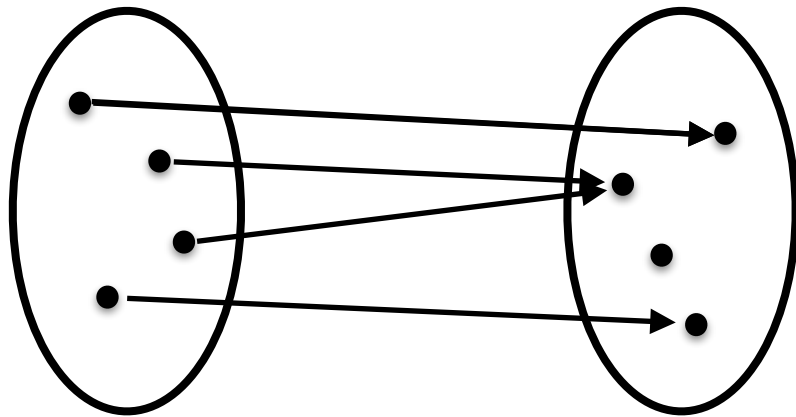
```
fetchData.retry {  
  case StatusCode(429) => fetchData  
}
```

```
trait Task[A] {  
  def unsafeRun(): A  
}
```

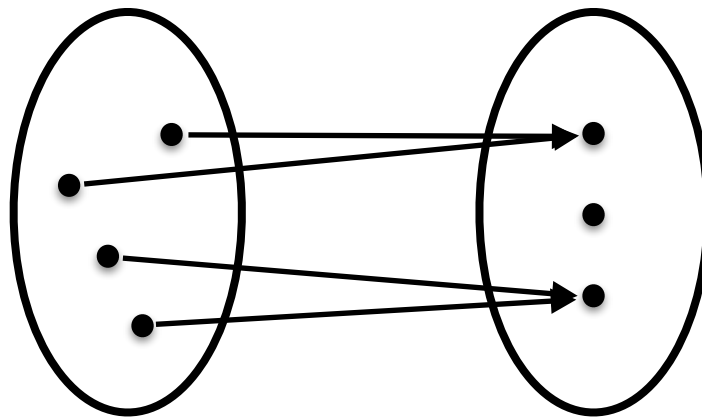

Functions

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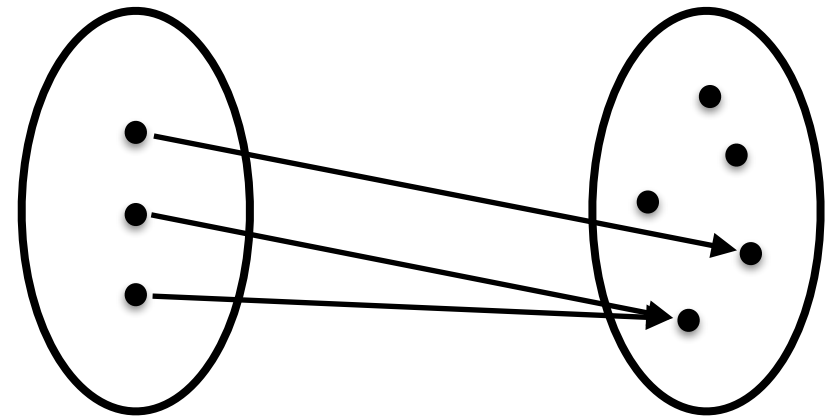
foo: $A \Rightarrow B$



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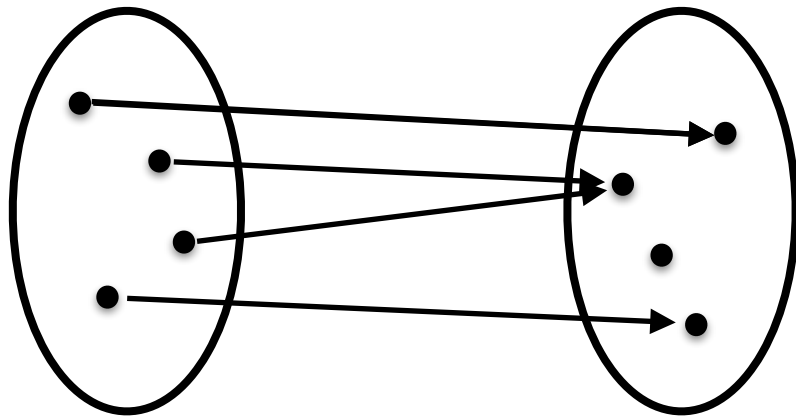


baz: $C \Rightarrow D$

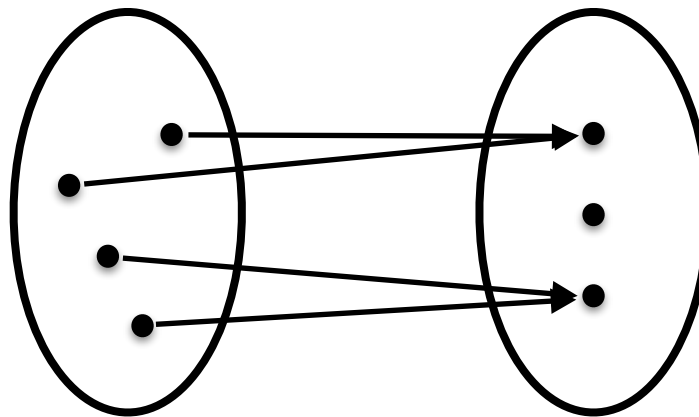


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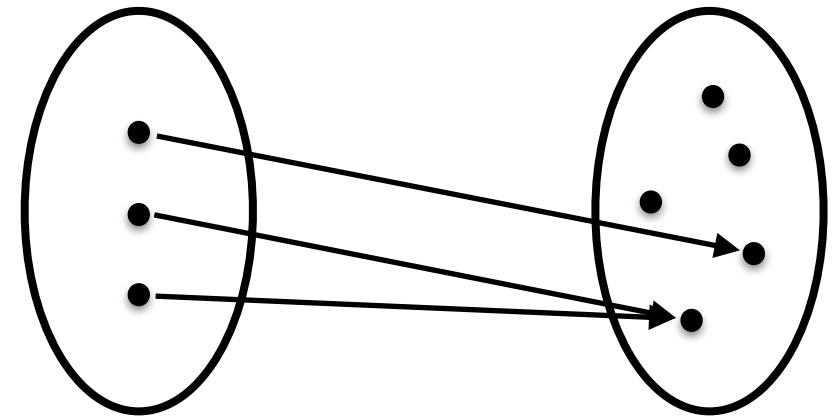
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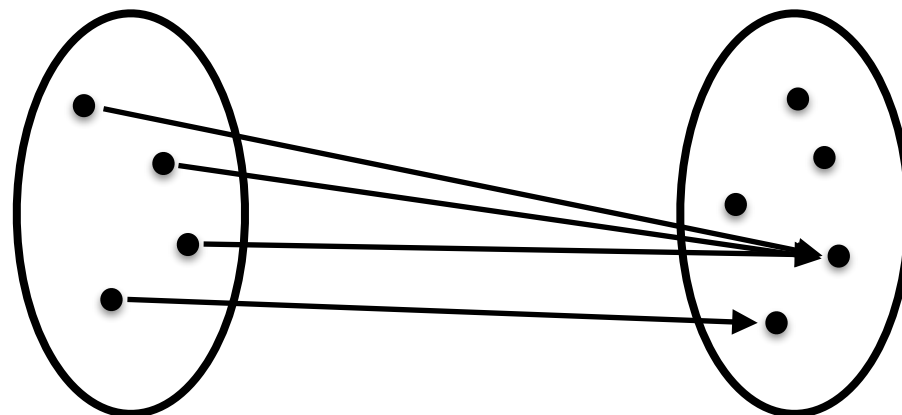
bar: $B \Rightarrow C$



baz: $C \Rightarrow D$



$baz.compose(bar).compose(foo): A \Rightarrow D$



Tracking Effects

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 - Optional values, error handling, asynchronous computation, input/output
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Solution:

Reify effects as values.

Missing values

Missing values

// A value that might exist is either..

sealed abstract class `Option[A]`

// ..there

final case class `Some[A](a: A)` extends `Option[A]`

// .. or not there

final case class `None[A]()` extends `Option[A]`

Missing values

```
def lookup(map: Map[Foo, Bar], foo: Foo): Option[Bar] =  
  if (map.contains(foo)) Some(map(foo))  
  else None
```

Errors

```
sealed abstract class Either[+E, +A]
```

```
final case class Success[+A](a: A) extends Either[Nothing, A]
```

```
final case class Failure[+E](e: E) extends Either[E, Nothing]
```

Errors

```
sealed abstract class Error
final case object UserDoesNotExist extends Error
final case object InvalidToken      extends Error

def userInfo(uid: UserId,
               tk: Token): Either[Error, UserInfo] = . . .
```

Manipulating Effects

Manipulating Effects

- The type signature of our functions reflect the effects involved

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```
def tokenFor(uid: UserId): Option[EncryptedToken]
```

```
def decrypt(token: EncryptedToken): Token
```

```
/** Client side */
```

```
val encrypted: Option[EncryptedToken] =  
  tokenFor(. . .)
```

```
// Want EncryptedToken, have Option[EncryptedToken]
```

```
val decrypted = decrypt(???)
```

Manipulating Effects

```
/** Apply a pure function to an effectful value */  
trait Functor[F[_]] {  
  def map[A, B](fa: F[A])(f: A => B): F[B]  
}
```


Manipulating Effects

*/** Apply a pure function to an effectful value */*

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

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

Manipulating Effects

```
def tokenFor(uid: UserId): Option[EncryptedToken]
```

```
def decrypt(token: EncryptedToken): Token
```

```
/** Client side */
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```
val encrypted: Option[EncryptedToken] =  
  tokenFor(. . .)
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```
val decrypted = encrypted.map(tk => decrypt(tk))
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Manipulating Effects

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def tokenFor(uid: UserId): Option[EncryptedToken]
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def decrypt(token: EncryptedToken): Token
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/** Client side */
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  tokenFor(. . .)
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val decrypted = encrypted.map(tk => decrypt(tk))
```

- Similar mechanisms for manipulating multiple effects

Lens

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 - Getter: get an **A** field in an object **S**
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```
trait Lens[S, A] {  
  def get(s: S): A  
  
  def set(s: S, a: A): S  
}
```


Lens

```
trait Lens[S, A] { outer =>
  def get(s: S): A

  def set(s: S, a: A): S

  def modify(s: S, f: A => A): S =
    set(s, f(get(s)))

  def compose[B](other: Lens[A, B]): Lens[S, B] =
    new Lens[S, B] {
      def get(s: S): B = other.get(get(s))

      def set(s: S, b: B): S =
        set(s, other.set(outer.get(s), b))
    }
}
```

Lens

```
case class Employee(position: Position)
```

```
object Employee {  
  val position: Lens[Employee, Position] = . . .  
}
```

```
case class Team(manager: Employee, . . .)
```

```
object Team {  
  val manager: Lens[Team, Employee] = . . .  
}
```

Lens

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```
object Employee {  
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}
```

```
case class Team(manager: Employee, . . .)
```

```
object Team {  
  val manager: Lens[Team, Employee] = . . .  
}
```

```
/** Client side */
```

```
val l: Lens[Team, Position] =  
  Team.manager.compose(Employee.position)  
l.set(someTeam, somePosition)
```

Lens

Lens

- Effect-ful modifications can be useful
 - Possibly failing: $A \Rightarrow \text{Option}[A]$
 - Many possible values: $A \Rightarrow \text{List}[A]$
 - Async: $A \Rightarrow \text{Task}[A]$

Lens

- Effect-ful modifications can be useful
 - Possibly failing: $A \Rightarrow \text{Option}[A]$
 - Many possible values: $A \Rightarrow \text{List}[A]$
 - Async: $A \Rightarrow \text{Task}[A]$

```
trait Lens[S, A] {  
  def modifyOption(s: S, f: A => Option[A]): Option[S]  
  
  def modifyList(s: S, f: A => List[A]): List[S]  
  
  def modifyTask(s: S, f: A => Task[A]): Task[S]  
}
```

Lens

```
trait Lens[S, A] {  
  def modifyOption(s: S, f: A => Option[A]): Option[S] =  
    f(get(s)).map(a => set(s, a))  
  
  def modifyList(s: S, f: A => List[A]): List[S] =  
    f(get(s)).map(a => set(s, a))  
  
  def modifyTask(s: S, f: A => Task[A]): Task[S] =  
    f(get(s)).map(a => set(s, a))  
}
```

Lens

```
trait Lens[S, A] {  
  def modifyF[F[_] : Functor](s: S, f: A => F[A]): F[S] =  
    f(get(s)).map(a => set(s, a))  
}
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- Example functors:

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 - Option, Either, Future, List, IO

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```

- Example functors:
 - Option, Either, Future, List, IO
- What if we want to just modify without any effect?
 - We want the F[A] to just be a plain A
 - Type-level identity function

```
def identity[A](a: A): A = a
```

Id

```
type Id[A] = A
```

Id

```
type Id[A] = A
```

```
new Functor[Id] {  
  def map[A, B](fa: Id[A])(f: A => B): Id[B] =  
}
```


Id

```
type Id[A] = A
```

```
new Functor[Id] {  
  def map[A, B](fa: Id[A])(f: A => B): Id[B] =  
}
```

Id

```
type Id[A] = A
```

```
new Functor[Id] {  
  def map[A, B](fa: A)(f: A => B): B =  
}
```

Id

```
type Id[A] = A
```

```
new Functor[Id] {  
  def map[A, B](fa: A)(f: A => B): B = f(fa)  
}
```

Id

```
trait Lens[S, A] {  
  def modifyF[F[_] : Functor](s: S, f: A => F[A]): F[S] =  
    f(get(s)).map(a => set(s, a))  
  
  def modify(s: S, f: A => A): S = modifyF[Id](s, f)  
}
```

Setting

```
trait Lens[S, A] {  
  def modifyF[F[_] : Functor](s: S, f: A => F[A]): F[S] =  
    f(get(s)).map(a => set(s, a))  
  
  def modify(s: S, f: A => A): S = modifyF[Id](s, f)  
  
  def set(s: S, a: A): S = modify(s, const(a))  
}
```

Setting

```
trait Lens[S, A] {  
  def modifyF[F[_] : Functor](s: S, f: A => F[A]): F[S] =  
    f(get(s)).map(a => set(s, a))  
  
  def modify(s: S, f: A => A): S = modifyF[Id](s, f)  
  
  def set(s: S, a: A): S = modify(s, const(a))  
}  
  
def const[A, B](a: A)(b: B): A = a
```

Setting

```
trait Lens[S, A] {  
  def modifyF[F[_] : Functor](s: S, f: A => F[A]): F[S] =  
    f(get(s)).map(a => set(s, a))  
  
  def modify(s: S, f: A => A): S = modifyF[Id](s, f)  
  
  def set(s: S, a: A): S = modify(s, const(a))  
}
```

```
def const[A, B](a: A)(b: B): A = a
```

Setting

```
trait Lens[S, A] {  
  def modifyF[F[_] : Functor](s: S, f: A => F[A]): F[S]  
  
  def get(s: S): A  
  
  def modify(s: S, f: A => A): S = modifyF[Id](s, f)  
  
  def set(s: S, a: A): S = modify(s, const(a))  
}  
  
def const[A, B](a: A)(b: B): A = a
```


Getting

```
trait Lens[S, A] {  
  def modifyF[F[_] : Functor](s: S, f: A => F[A]): F[S]  
  
  def get(s: S): A  
}
```

Getting

```
trait Lens[S, A] {  
  def modifyF[F[_] : Functor](s: S, f: A => F[A]): F[S]  
  
  def get(s: S): A  
}
```

- Can we define `get` in terms of `modify`?

Getting

```
trait Lens[S, A] {  
  def modifyF[F[_] : Functor](s: S, f: A => F[A]): F[S]  
  
  def get(s: S): A  
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```

- Can we define `get` in terms of `modify`?
 - `modifyF` gives us some $F[S]$.. but we want an A

Getting

```
trait Lens[S, A] {  
  def modifyF[F[_] : Functor](s: S, f: A => F[A]): F[S]  
  
  def get(s: S): A  
}
```

- Can we define `get` in terms of `modify`?
 - `modifyF` gives us some $F[S]$.. but we want an A
 - We need some way of "ignoring" the S parameter and still get an A back

Getting

```
trait Lens[S, A] {  
  def modifyF[F[_] : Functor](s: S, f: A => F[A]): F[S]  
  
  def get(s: S): A  
}
```

- Can we define `get` in terms of `modify`?
 - `modifyF` gives us some $F[S]$.. but we want an A
 - We need some way of "ignoring" the S parameter and still get an A back
 - Type-level constant function

Getting

```
trait Lens[S, A] {  
  def modifyF[F[_] : Functor](s: S, f: A => F[A]): F[S]  
  
  def get(s: S): A  
}
```

- Can we define `get` in terms of `modify`?
 - `modifyF` gives us some $F[S]$.. but we want an A
 - We need some way of "ignoring" the S parameter and still get an A back
 - Type-level constant function

```
def const[A, B](a: A)(b: B): A = a
```

Getting

* `Const[Z, ?]` syntax is valid due to kind-projector plugin <https://github.com/non/kind-projector>

Getting

```
type Const[Z, A] = Z
```

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Getting

```
type Const[Z, A] = Z
```

```
new Functor[Const[Z, ?]] { // *  
  def map[A, B](fa: Const[Z, A])(f: A => B): Const[Z, B]  
}
```

* Const[Z, ?] syntax is valid due to kind-projector plugin <https://github.com/non/kind-projector>

Getting

```
type Const[Z, A] = Z
```

```
new Functor[Const[Z, ?]] { // *  
  def map[A, B](fa: Const[Z, A])(f: A => B): Const[Z, B]  
}
```

Getting

```
type Const[Z, A] = Z
```

```
new Functor[Const[Z, ?]] { // *  
  def map[A, B](fa: Z)(f: A => B): Z =  
}
```

Getting

```
type Const[Z, A] = Z
```

```
new Functor[Const[Z, ?]] { // *  
  def map[A, B](fa: Z)(f: A => B): Z = fa  
}
```

Getting

```
type Const[Z, A] = Z
```

```
new Functor[Const[Z, ?]] { // *  
  def map[A, B](fa: Z)(f: A => B): Z = fa  
}
```

```
trait Lens[S, Z] {  
  def modifyF[F[_] : Functor](s: S, f: Z => F[Z]): F[S]  
  
  def get(s: S): Z = {  
    val const: Const[Z, S] =  
      modifyF[Const[Z, ?]](s, z => z) // *  
    const  
  }  
}
```

* Const[Z, ?] syntax is valid due to kind-projector plugin <https://github.com/non/kind-projector>

Lens

```
trait Lens[S, A] {  
  /** Abstract */  
  def modifyF[F[_] : Functor](s: S, f: A => F[A]): F[S]  
  
  /** Implemented */  
  def modify(s: S, f: A => A): S  
  
  def get(s: S): A  
  
  def set(s: S, a: A): S  
  
  def compose[B](other: Lens[A, B]): Lens[S, B]  
}
```

Are Id and Const just party tricks?

Traverse

```
trait Traverse[F[_]] {  
  def traverse[G[_] : Applicative, A, B]  
    (fa: F[A])(f: A => G[B]): G[F[B]]  
}
```


Traverse

```
trait Traverse[F[_]] {  
  def traverse[G[_] : Applicative, A, B]  
    (fa: F[A])(f: A => G[B]): G[F[B]]  
}
```

```
def validate[A]  
  (data: List[A])(f: A => Option[B]): Option[List[B]]
```

Traverse

```
trait Traverse[F[_]] {  
  def traverse[G[_] : Applicative, A, B]  
    (fa: F[A])(f: A => G[B]): G[F[B]]  
}
```

```
def validate[A]  
  (data: List[A])(f: A => Option[B]): Option[List[B]]
```

```
def scatterGather[A]  
  (data: List[A])(f: A => Task[B]): Task[List[B]]
```

Traverse

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Traverse

traverse: $F[A] \Rightarrow (A \Rightarrow G[B]) \Rightarrow G[F[B]]$

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traverse[Id, A, B]

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Interested?

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- Functional Programming
 - Cats, Scalaz
 - Argonaut, Atto, Monocle, Shapeless

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- Systems
 - Doobie, HTTP4S, Remotely, Scalaz-stream

EOF