# Ozma: Extending Scala with Oz Concurrency



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- Let us compute two difficult numbers, add them, and display the result
- Sequential (aka, obsolete) version:

```
val x = computeToughNumber1()
val y = computeToughNumber2()
val z = x+y
println(z)
```

- Let us now compute x and y concurrently, in the hope that a modern computer (or network of computers) can parallelize the computations
  - A bit of history ...



```
private final TestMonitors self = this;
private boolean xDone = false;
private int xValue = 0;
private boolean yDone = false;
private int yValue = 0;
private boolean zDone = false:
private int zValue = 0;
private void run()
     throws InterruptedException {
 new ComputeX().start();
 new ComputeY().start();
 new ComputeZ().start();
 final int z;
 synchronized (this) {
   while (!zDone)
     wait();
    z = zValue;
 System.out.println(z);
```

```
private class ComputeX extends Thread {    private class ComputeZ extends Thread {
  public void run() {
                                            public void run() {
    final int x = 1;
                                             try {
    synchronized (self) {
                                                final int x, y;
     xValue = x;
                                                synchronized (self) {
     xDone = true;
      self.notifyAll();
                                                  while (!xDone || !yDone)
                                                    wait();
    }
                                                  x = xValue;
}
                                                  y = yValue;
                                                }
private class ComputeY extends Thread {
  public void run() {
                                                final int z = x + y;
    final int y = 2;
    synchronized (self) {
                                                synchronized (self) {
     yValue = y;
                                                  zValue = z;
      yDone = true;
                                                  zDone = true;
      self.notifyAll();
                                                  self.notifyAll();
                                              } catch (InterruptedException error) {
                                                // arg... what do I do now?
```



#### Java executors and futures

```
private void run() throws Exception {
  ExecutorService executor =
    Executors.newFixedThreadPool(4);
  Future<Integer> xFuture =
    executor.submit(new ComputeX());
  Future<Integer> yFuture =
    executor.submit(new ComputeY());
  Future<Integer> zFuture =
    executor.submit(new ComputeZ(
      xFuture, yFuture));
  System.out.println(zFuture.get());
}
private class ComputeX
    implements Callable<Integer> {
  public Integer call() {
    return 1;
```

```
private class ComputeY
    implements Callable<Integer> {
  public Integer call() {
    return 2;
private class ComputeZ
    implements Callable<Integer> {
  private final Future<Integer> xFuture;
  private final Future<Integer> yFuture;
  public ComputeZ(Future<Integer> xFuture,
      Future<Integer> yFuture) {
    this.xFuture = xFuture;
    this.yFuture = yFuture;
  public Integer call() throws Exception {
    return xFuture.get() + yFuture.get();
```

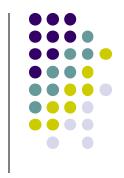




```
val x = future(1)
val y = future(2)
val z = future(x() + y())
println(z())
```

- Much better!
- Two remaining issues
  - Need to write x() instead of just x to read the value
  - Blocking: this example uses 4 OS threads on its own, but they are blocking most of the time





```
val xFut = future(1)
val yFut = future(2)
val zFut = for {
  x <- xFut
  y <- yFut
} yield {
  X + V
}
zFut onSuccess {
  println(_)
```

- Designed to solve the blocking issue
- However, the syntax gets trickier again
- Forces the programmer to think asynchronously

Challenge: can we do better?

#### **Ozma**



```
val x = future(1)
val y = future(2)
val z = future(x+y)
println(z)
```

- Easy as can be
- No need for x(): the type of x is Int, not Future[Int]
  - The future behavior is inside the language (dataflow)
- Ozma threads are lightweight, i.e., they are not OS threads
  - The blocking issue does not appear
  - What appears to be blocking is actually posting to the dataflow variable a continuation with the remaining of the thread's job

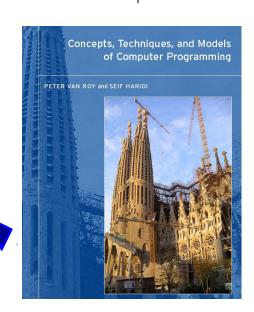




- Scala + Oz ⇒ Ozma
- Declarative dataflow
  - Lightweight threads and the wonders of single assignment val
  - Three powerful principles
- Message passing and nondeterminism
  - This is also very important, so let's add it cleanly
- Implementation on the JVM
  - Issues, solutions and work-arounds
- Conclusion
  - The future of Ozma, distribution, and fault tolerance



- Oz is a multiparadigm language that has been used for language experiments by a bunch of smart but eccentric language researchers since the early 1990s (see www.mozart-oz.org)
  - Constraint programming, network-transparent distributed programming, declarative/procedural GUI programming, concurrent programming
  - Textbook "Concepts, Techniques, and Models of Computer Programming", MIT Press, 2004
- Oz supports concurrent programming based on a declarative dataflow core with lightweight threads
- → Ozma extends Scala with a new concurrency model based on the Oz dataflow ideas



One third of the book is about concurrency

## Ozma implementation

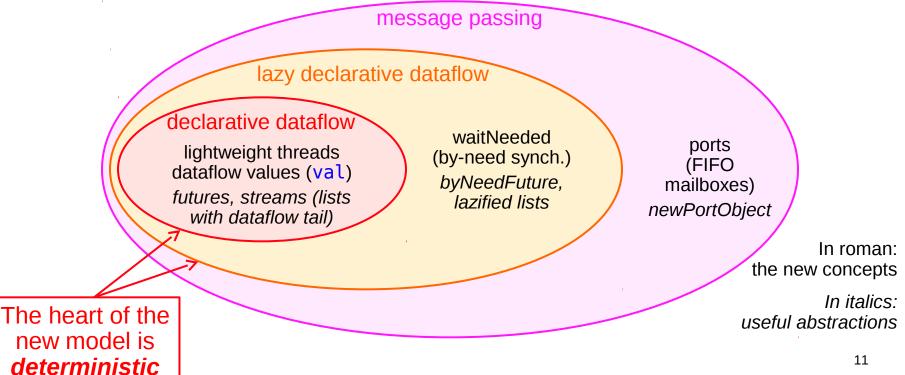


- Ozma's implementation combines a modified Scala compiler and a modified Oz compiler, and targets the Oz VM (Mozart).
   It was first released in June 2011.
  - The Oz VM has efficient support for lightweight threads, dataflow synchronization, by-need synchronization, and failed values
- Full source and binaries (with open-source license) available at: https://github.com/sjrd/ozma
- Full documentation available at: http://www.info.ucl.ac.be/~pvr/MemoireSebastienDoeraene.pdf
- Download the compiled binaries and try it out!
  - Or compile it yourself with Scala  $\geq$  2.9.0, Mozart  $\geq$  1.4.0, and Ant  $\geq$  1.6
  - It runs under Linux, Mac OS X, and maybe Windows
- All the Ozma examples in this talk are running code

## Ozma extends Scala with a new concurrency model

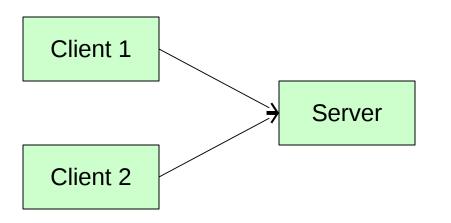


- The heart of the model is declarative dataflow
  - Further extended with laziness (still declarative) and ports (for nondeterminism)
  - This allows adding nondeterminism exactly where needed and no more









This client/server can't be written in a deterministic model!

It's because the server accepts requests nondeterministically from the two clients

- Determinism has strong limitations!
  - Any concurrent execution always gives the same results
  - Even a simple client/server can't be written
- But determinism has big advantages too
  - Race conditions are impossible by design
  - With determinism as default, we can reduce the need for nondeterminism (in the client/server: it's needed only at the point where the server accepts requests)
  - Any functional program can be made concurrent without changing the result

# Deterministic concurrency: the right default?



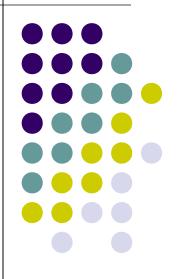
- Parallel programming has finally arrived
  - Multicore processors: dual and quad today, a dozen tomorrow, a hundred in a decade, most apps will do it
  - Distributed computing: data-intensive with tens of nodes today (NoSQL, MapReduce), hundreds and thousands tomorrow, most apps will do it
- Something fundamental will have to change
  - Sequential programming can't be the default (it's a centralized bottleneck)
  - Libraries can only hide so much (interface complexity, distribution structure)
- Concurrency will have to get a lot easier
  - Deterministic concurrency is functional programming!
  - It can be extended cleanly to distributed computing
    - Open network transparency (implemented in Oz since 1999)
    - Modular fault tolerance (implemented in Oz since 2007)
    - Large-scale distribution (on the way...)

# Such an old idea, why isn't it used already?



- Deterministic concurrency has a long history that starts in 1974
  - Gilles Kahn. The semantics of a simple language for parallel programming. In IFIP Congress, pp. 471-475, 1974. Deterministic concurrency.
  - Gilles Kahn and David B. MacQueen. Coroutines and networks of parallel processes. In IFIP Congress, pp. 993-998, 1977. Lazy deterministic concurrency.
- Why was it forgotten for so long?
  - Message passing and monitors arrived at about the same time:
    - Carl Hewitt, Peter Bishop, and Richard Steiger. A universal modular ACTOR formalism for artificial intelligence. In 3<sup>®</sup> International Joint Conference on Artificial Intelligence (IJCAI), pp. 235-245, Aug. 1973.
    - Charles Antony Richard Hoare. Monitors: An operating system structuring concept. Communications of the ACM, 17(10):549-557, Oct. 1974.
  - Actors and monitors handle nondeterminism, so they are better. Right?
- Dataflow computing also has a long history that starts in 1974
  - Jack B. Dennis. First version of a data flow procedure language. *Springer Lecture Notes in Computer Science*, vol. 19, pp. 362-376, 1974.
  - Dataflow remained a fringe subject since it was always focused on parallel programming, which only became mainstream with the arrival of multicore processors in mainstream computing (e.g., IBM POWER4, the first dual-core processor, in 2001).

## **Declarative Dataflow**



#### **Declarative dataflow**



```
val x: Int x = 1
val y: Int y = 2
val z: Int
```

Thread execution (executes from left to right)

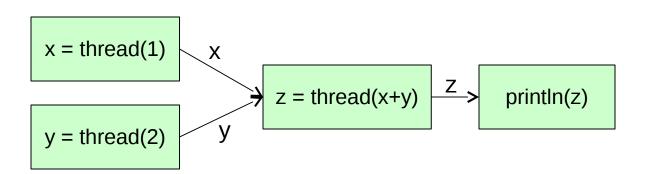
..... Dataflow synchronization

- thread { x = 1 } thread { y = 2 } thread { z = x+y }
- println(z)

- All val values can do dataflow
- They are single assignment
- The addition operation waits until both x and y are bound
- This does both synchronization and communication
- Programs with declarative dataflow are always deterministic
- This program will always print 3, independent of the scheduler

## Using the thread statement as an expression





Each green box is a concurrent agent

Each arrow is a shared dataflow value

```
val x = thread(1)
val y = thread(2)
val z = thread(x+y)
println(z)
```

- Exactly the same behavior as the previous example
- Using the thread statement in this way can often simplify the syntax of concurrent programs

# Handling exceptions in asynchronous computations



```
try {
  val list: List[Int] = Nil
  val x = thread(list.head) // list is empty!
  println(x)
} catch {
  case _: java.util.NoSuchElementException =>
    println("The list was empty")
}
```

- What happens if the asynchronous computation (in thread) throws an exception?
- The only reasonable possibility is to raise the exception where x is needed
  - Well-known behavior of futures





- If the evaluation of value throws an exception, the exception is wrapped in a failed value using the Ozma primitive makeFailedValue
- Waiting for a failed value throws the wrapped exception
- A failed value has type Nothing, the bottom type of Scala
- Now we can write:

```
val x = future(list.head)
and the exception will be properly propagated to the current thread
```

## Declarative dataflow extensions to Scala



• Lightweight threads: hundreds of thousands of threads can be active simultaneously (like Erlang, by the way)

```
thread { println("New lightweight thread") }
```

Dataflow values: every val can be a single-assignment variable.
 Operations that need the value will wait until it is available.

```
val x = thread(1) // binds x in its own thread
println(x+10) // the addition waits for x
```

By-need (lazy) execution: wait until value is needed

```
val x: Int
thread { waitNeeded(x); x = factorial(69) }
println(x) // need to print causes calculation of x
```

## Streams: lists as dataflow communication channels



```
val x: List[Int]
val ints = 1 :: 2 :: 3 :: 4 :: x // unbound tail

thread { ints foreach println } // a printing agent

val y: List[Int]
x = 5 :: 6 :: 7 :: y // the agent will print these
```

- A stream is a list with an unbound dataflow tail
  - It can be extended indefinitely or terminated with Nil
- Any list function can read a stream (it's exactly like reading a list)
  - It will automatically wait when it finds an unbound tail
    - Like the foreach operation in this example
  - If put inside a thread, the list function becomes a concurrent agent

## The magic of declarative dataflow



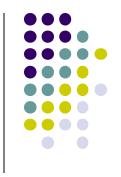
```
object Test {
  def main(args: Array[String]) {
    val range = gen(1, 10) // sequential version
    val result = range map (x => x*x)
    result foreach println

    val range2 = thread(gen(1, 10)) // concurrent version
    val result2 = thread(range map (x => x*x))
    result2 foreach println
}

def gen(from: Int, to: Int): List[Int] = {
    sleep(1000)
    if (from > to) Nil
    else from :: gen(from+1, to) // tail-recursive in Ozma
}
}
```

- Both versions print the same final result 1, 4, 9, 16, ..., 100
  - So what's the difference? What does concurrency buy you?
- The sequential version: nothing is output for 10 seconds, and then the whole list
- The concurrent version: a new result is output every second
- Declarative dataflow turns batch programs into incremental programs

### Pipelines using streams



```
generateFrom integers filter evens take 10 foreach println

def generateFrom(n: Int): List[Int] = n :: generateFrom(n+1)

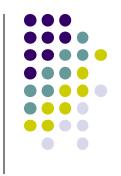
val integers = thread(generateFrom(0))
val evens = thread(integers filter (_ % 2 == 0))
val tenFirst = thread(evens take 10)
```

- A list function put in a thread becomes a concurrent agent
- List functions must be tail-recursive for this to work

tenFirst foreach println

This is automatically true in Ozma (ensured by compiler transformation)





- Any functional program can be made concurrent without changing the result by adding calls to thread
  - Threads can be added anywhere in the program
  - Turns batch into incremental (removes roadblocks)
- Any list function can become a concurrent agent by executing it in a thread
  - Because list functions in Ozma are tail-recursive, the agent has no memory leak (stack size and heap size are constant)
- Any computation, functional or not, can be made lazy by adding calls to waitNeeded
  - Syntactic sugar is provided with byNeedFuture and .lazified



### From map to concurrent map

```
def map[A, B](list: List[A], f: A => B): List[B] = {
   if (list.isEmpty) Nil
   else f(list.head) :: map(list.tail, f)
}

def concMap[A, B](list: List[A], f: A => B): List[B] = {
   if (list.isEmpty) Nil
   else thread(f(list.head)) :: concMap(list.tail, f)
}
```

- In concMap, all evaluations of f execute concurrently
- It is even possible to call concMap when f is not known (unbound). This will create a list containing unbound values, like futures: they will be evaluated as soon as f is known (bound to a function).



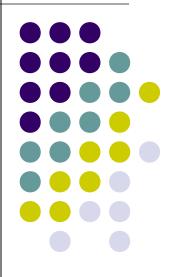


```
def gen(from: Int): List[Int] = from :: gen(from+1)

def displayEvenSquares() {
   val integers = thread(gen(0))
   val evens = thread(integers filter (_ % 2 == 0))
   val evenSquares = thread(evens map (x => x*x))
   evenSquares foreach println
}
Concurrent agent
```

- Wrapping the calls to gen, filter, and map within threads turns them into concurrent agents
  - Note that foreach is also an agent, living in the main thread
- As new elements are added to the input stream, new computed elements will appear on the output stream

# Message Passing and Nondeterminism



# Managing nondeterminism with ports



- So far, all our programs have been deterministic
  - Determinism is a good default, but for real programs we need nondeterminism too!
- Let's add nondeterminism in a nice way
  - One way is to allow multiple producers (or clients) to add messages in a single stream (read by an agent, or server)
- A port is comparable to an unbounded FIFO mailbox
  - Any thread can send a value to a port
  - There is no receive operation; all messages appear in an associated stream
  - The senders and the receivers of a port can themselves be deterministic computations; the only nondeterminism is the order in which sent values appear on the port's stream





- The values 1, 2, and 3 will be displayed in some order (nondeterminism)
  - The actual order depends on the thread scheduler
- No memory leak: garbage collection will remove the parts of the stream already read

# Merging two streams that are fed concurrently (broken)



```
def mergeStreams[A](s1: List[A], s2: List[A]): List[A] = {
    (s1, s2) match {
      case (h1 :: t1, h2 :: t2) =>
        h1 :: h2 :: mergeStreams(t1, t2)
    }
}
```

- Does not work if the two streams do not grow exactly at the same pace
- Fundamental issue: we cannot know a priori from which stream the following value will come (nondeterminism)
- A port solves exactly this problem

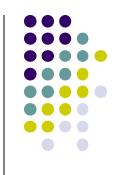
# Merging two streams that are fed concurrently (correct)



```
def mergeStreams[A](s1: List[A], s2: List[A]): List[A] = {
  val (result, p) = newPort[A]
  thread { s1 foreach p.send }
  thread { s2 foreach p.send }
  result
}
```

- Two declarative agents read the input streams, and forward messages into the port
- The port accepts elements from both inputs in a nondeterministic order (dependent on time and scheduler)

# Building nondeterministic agents with ports



```
def newPortObject[A, B](init: B)(
   handler: (B, A) => B) = {
  val (s, p) = Port.newPort[A]
  thread { s.foldLeft(init)(handler) }
  p
}
Initial state

State updater
```

- A port object is an actor. It reads messages sequentially from the stream and uses the messages to update its internal state.
- The foldLeft operation updates the internal state as messages are received (note:  $s_i$  is a received message):

```
(...((init handler <math>s_0) handler s_1) handler s_2) ...)
```

- The current value of the accumulator of foldLeft is the agent's internal state
- Neat trick: foldLeft is a function used as a concurrency pattern

## **Agents playing ball**

```
object BallGame {
  type Ball = Unit
  val ball: Ball = ()
  type Player = Port[Ball]
                                           Player 1
  def main(args: Array[String]) {
    val player1: Player
    val player2: Player
    val player3: Player
    player1 = makePlayer("Player 1", Seg(player2, player3))
    player2 = makePlayer("Player 2", Seq(player3, player1))
    player3 = makePlayer("Player 3", Seg(player1, player2))
    player1.send(ball)
    while (true) sleep(1000)
  def makePlayer(id: Any,
      others: Seq[Player]): Player = {
    Port.newPortObject(0) { (st: Int, b: Ball) =>
      println("%s received the ball %d times"
        format (id, st+1))
      Random.rand(others).send(b)
      st+1
```

 Each player receives the ball and sends it to a randomly chosen other player

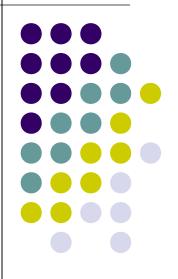
Player 3

 Each player counts the number of balls received

Player 2

 The port allows a player to receive from either of the others (nondeterminism)

## Ozma on the JVM







- Every val must be dataflow-enabled
  - Single-assignment
  - Implicit synchronization
  - Failed values
- Threads should be lightweight
  - Programming techniques of Ozma encourage to spawn many threads
  - Blocking should be avoided: waiting for an unbound value should post a continuation to the value's suspension list
  - As far as we know, there is no way to emulate lightweight threads with the current JVM
  - Ideas welcome!

## Implementing dataflow



```
trait Dataflow[@specialized +A] {
  def ask: A
class DataflowVar[@specialized A] extends Dataflow[A] {
  private var value: A =
  private var bound = false
  def this(v: A) {

    A Dataflow[T] looks like a

    this()
                                blocking Future[T]
    value = v

    A DataflowVar[T] looks like

    bound = true
                                a Promise[T] (plus the
                                corresponding Future[T])
  def tell(v: A): Unit = ???
  def ask: A = ???
```

## Implementing dataflow



```
def tell(v: A) {
  synchronized {
    if (!bound) {
      value = v
      bound = true
      notifyAll()
    } else if (value == v) {
      // telling twice the same thing is OK
    } else {
      // failure (not declarative!)
      throw new FailureError(value, v)
```

## Implementing dataflow

```
def ask: A = {
    synchronized {
      while (!bound)
        wait()
      value
def thread(body: => Unit) {
  new Thread() {
    override def run() = body
  }.start()
```

## **Using DataflowVar[A]**

```
val x = new DataflowVar[Int]
val y = new DataflowVar[Int]
val z = new DataflowVar[Int]

thread { x.tell(1) }
thread { y.tell(2) }
thread { z.tell(x.ask + y.ask) }

println(z.ask)
x.tell(x.ask + y.ask)
y.tell(2)
```

- We lose transparency, of course
- Can be improved with implicit conversions of A to DataflowVar[A] and from Dataflow[A], but it is still limited

## Implementing thread

```
def thread[@specialized A](
    body: => Dataflow[A]): Dataflow[A] = {
    val result = new DataflowVar[A]
    new Thread() {
       override def run() = result.tell(body.ask)
    }.start()
    result
}
```

## **Implementing Port**



```
class Port[-A] private (
    stream: DataflowVar[DataflowList[A]] {
  private var tail: DataflowVar[DataflowList[A
                            @uncheckedVariance]] = stream
 def send(element: A) {
    val newTail = new DataflowVar[DataflowList[A]]
    val cons = element :: newTail
    synchronized {
      tail.tell(cons)
      tail = newTail
```

A DataflowList[A] is akin to a List[A], but its tail
is itself a Dataflow[DataflowList[A]]

## **Implementing Port**

```
object Port {
  def newPort[A]: (Stream[A], Port[A]) = {
    val stream = new DataflowVar[DataflowList[A]]
    val port = new Port[A](stream)
    (stream, port)
  }
}

type Stream[+A] = Dataflow[DataflowList[A]]
```





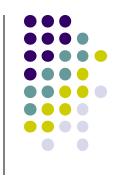
- Every val must be dataflow-enabled
  - Every variable of type T should be a Dataflow[T]
  - Every single-assignment val of type T should be a DataflowVar[T]
  - Consequence: no need for DataflowList[A], since the tail of List[A] is implicitly a Dataflow[List[A]].
- Can be achieved by compiler transformations!
  - Modify scalac to add these transformations





- The Scala compiler consists of several transformation phases
- Front-end phases
  - The parser builds an untyped AST from the source code
  - namer, packageobjects and typer yield a typed AST
- Simplifying phases
  - Various phases successively simplify the typed AST until only Java-like classes and constructs remain
  - One particular phase is worth mentioning: erasure, which eliminates all the generic types
- Back-end phases
  - icode turns the simplified typed AST into a portable stack-based bytecode called the I-code
  - Several optimization phases
  - genjvm turns the I-code into JVM bytecode and .class files

#### **Naive transformation**



- Add a phase dataflow in the compiler between tailcalls and specialize (the latter being itself just before erasure).
- Do not touch subclasses of AnyVal, nor Dataflow[A] and DataflowVar[A] themselves.
- Retype all Scala-declared variables, fields, parameters and return values from their type T to Dataflow[T].
- Retype single-assignment val's of type T to DataflowVar[T], and initialize them with a new DataflowVar[T].
- Turn assignments to single-assignment val's into calls to tell().
- Prefix all method calls by .ask. Also add .ask in if's and while's.
- When calling a native method (e.g., Int.+), add .ask to all parameters, and wrap the result into a DataflowVar.
- And let subsequent phases of the compiler deal with all this.





- Basic fact: after erasure, all entities of type Dataflow[T] will be retyped as Dataflow.
- Type tests with isInstanceOf and asInstanceOf are broken.
- Pattern matching is therefore also broken.
- Overloads with the same number of arguments, but different types of parameters, erase to the same signature and clash:
  - foo(x: Int) -> foo(x: Dataflow[Int]) -> foo(x: Dataflow)
  - foo(x: Bar) -> foo(x: Dataflow[Bar]) -> foo(x: Dataflow)

## Working after erasure



- We do not want to mess with the types before erasure
  - Let us do it after ... actually the later the better (could be just before icode)
- Retype all variables, fields, parameters and return values of reference types to Dataflow, of type Int to DataflowInt, etc. (manual specialization)
  - Overload clashes due to the return value are supposed to be only bridge methods, which can be removed in this case
  - We still get overload clashes with parameter types!
- Retype single assignment val's in a similar way to DataflowVar
  - No overloading clash here: they are all local variables
- Actually we can forget the Dataflow abstraction, and use only DataflowVar. Variance checks are behind us anyway.





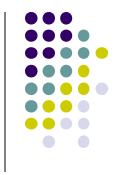
- We still have the following clash:
  - foo(x: String) -> foo(x: Dataflow)
  - foo(x: List) -> foo(x: Dataflow)
- Three possible workarounds
  - foo(x: String) -> foo(x: Dataflow, x': String)
    - Double the number of parameters just for the sake of avoiding overloading clashes
  - foo(x: String) -> foo(x: DataflowString)
    - Have a specialized DataflowT class for every class T in the system
  - foo(x: String) -> foo\$java.lang.String(x: Dataflow)
    - Rename the method to get rid of overloading
    - Probably the best choice





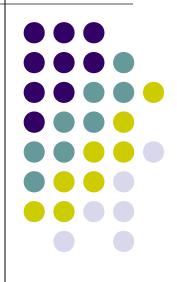
- We have no power over Java-defined classes
  - We cannot change their internals to support dataflow
- When calling a Java method from Ozma code
  - Add .ask to parameters and wrap the result in a DataflowVar
  - Java classes are considered "native"
- To support calls to Ozma methods from Java code
  - Instead of renaming and retyping methods, duplicate them
  - Keep the original method, and make it call the dataflow-enabled version with the appropriate wrappings and unwrappings in DataflowVar's.
- Interfaces must be duplicated: the original version and the version with dataflow-enabled methods

#### Ozma on the JVM: is it viable?



- It seems possible to implement Ozma on the JVM
  - Possible, but with an incredible overhead
- Wrapping of all values in DataflowVar's
  - Calls to methods of DataflowVar will likely be inlined by the JVM, but it is a small consolation
- Double the number of methods of every class, to support interoperability with Java classes
  - This includes basic overriding of Java-defined methods
- Threads are not lightweight: we kept the JVM threads
  - The main benefit of Ozma is lost, compared to the existing blocking futures of Scala
- => possible, but probably not practical

## Conclusion







- Ozma makes concurrent programming simpler
  - The heart of a concurrent program is deterministic.
     Nondeterminism is added just where it's needed.
  - Correctness is easy: the deterministic part is purely functional and the nondeterministic part uses message passing
- The implementation uses the Oz virtual machine (Mozart)
  - It's a complete implementation of Scala on a new VM that's not the JVM nor .NET, so you can see it as a new implementation of Scala
  - It's not interoperable with Java, though. The Mozart VM was used because of its support for fine-grain threads, dataflow, and failed values.
  - The upcoming release of Mozart 2 should interoperate a little better with Java.





- Ozma could be implemented on JVM
  - But with so many restrictions that it would probably not be worth it
- It is still interesting, though
  - Scripting languages like Python are rather slow, and yet used
  - These languages often already have lightweight threads
  - The concepts of Oz and Ozma could be implemented for scripting languages without so much downsides
- Clarke's second law
  - "The only way of discovering the limits of the possible is to venture a little way past them into the impossible."

# Generalizing dataflow for distribution and fault tolerance



- Language support for distributed programming in Oz
  - Network transparency: a program executed over several nodes gives the same result as if it were executed on a single node, provided network delays are ignored and no failure occurs
    - Exact same source code is run independent of distribution structure
  - Network awareness: a program can predict and control its physical distribution and network behavior
  - Fully implemented in Oz (Mozart 1.4.0)
- Modular fault tolerance in Oz using fault streams
  - Exceptions and RMI: synchronous, not modular, requires changing code at each possible distribution point
  - Fault streams on language entities: asynchronous, modular, just add new code with no changes to existing code



## Thank you!