



Programming a Concurrent World

- How to compose programs handling
 - asynchronous events?
 - streams of asynchronous events?
 - distributed events?
- Programming abstractions for concurrency!

Overview

- Futures, promises
- Async/await
- Actors

 Concurrency not a solved problem → development of new programming models

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Which one is going to "win"?

- Authored or co-authored:
 - Scala Actors (2006)
 - Scala futures and promises (2011/2012)
 - Scala Async (2013)

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Other proposals and research projects:

- Scala Joins (2008)
- FlowPools (2012)
- Spores (safer closures)
- Capabilities and uniqueness
- ..

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- Classes: class C extends D { .. }

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```
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Pattern matching:
case class Person(name: String, age: Int)
val isAdult = p match { case Person(_, a) => a >= 18 case Alien(_, _) => false }
```

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import scala.util.parsing.json._

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def sendReq(json: JSONType): Future[JSONType]
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Ousterhout et al. Making sense of performance in data analytics frameworks. NSDI '15

Callbacks

- How to respond to asynchronous completion event?
- → Register callback

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```
val person = Person("Tim", 25)

val fut: Future[JSONType] = convert(person)

fut.foreach { json =>
  val resp: Future[JSONType] = sendReq(json)
  ...
}
```

Exceptions

- Serialization to JSON may fail at runtime
 - Closure passed to foreach not executed in this case
 - How to handle asynchronous exceptions?

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```
val fut: Future[JSONType] = convert(person)

fut.onComplete {
   case Success(json) =>
     val resp: Future[JSONType] = sendReq(json)
   case Failure(e) =>
     e.printStackTrace()
}
```

Partial Functions

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case Success(json) => ..
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case Success(json) => ..
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}
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... creates an instance of PartialFunction[T, R]:

```
val pf: PartialFunction[Try[JSONType], Any] = {
  case Success(json) => ..
  case Failure(e) => ..
}
```

Type of Partial Functions

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Success and Failure

```
package scala.util

abstract class Try[+T]

case class Success[+T](v: T) extends Try[T]

case class Failure[+T](e: Throwable) extends Try[T]
```

Nested Exceptions

Exception handling tedious and not compositional:

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```
val fut: Future[JSONType] = convert(person)
fut.onComplete {
  case Success(json) =>
    val resp: Future[JSONType] = sendReq(json)
    resp.onComplete {
      case Success(jsonResp) => .. // happy path
      case Failure(e1) =>
        e1.printStackTrace(); ???
  case Failure(e2) =>
    e2.printStackTrace(); ???
```

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Encapsulates failure

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```
abstract class Future[+T] extends Awaitable[T] {
  def map[S](f: T => S)(implicit ..): Future[S]
  // ..
}
```

Future Composition

Future Composition

```
val fut: Future[JSONType] = convert(person)

val processed = fut.map { json =>
  val resp: Future[JSONType] = sendReq(json)
  resp.map { jsonResp =>
    . // happy path
  }
}
```

Encapsulates all failures

Future Composition

Encapsulates all failures

Problem: processed has type
Future[Future[T]]

Future Pipelining

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Future pipelining: the result of the inner future (result of map) determines the result of the outer future (processed)

FlatMap Combinator

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```
def flatMap[S](f: T => Future[S])(implicit ..): Future[S]
```

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   def apply[T](body: => T)(implicit ..): Future[T]
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Singleton object
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"Unrelated"
to the singleton
```

object!

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val firstGoodDeal = Future {
  usedCars.find(car => isGoodDeal(car))
}
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Short syntax for:

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val firstGoodDeal = Future.apply({
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})
```

Type inference:

```
val firstGoodDeal = Future.apply[Option[Car]]({
  usedCars.find(car => isGoodDeal(car))
})
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```

Short syntax for:

```
val firstGoodDeal = Future.apply({
  usedCars.find(car = Type
})
}
Future[Option[Car]]
```

Type inference:

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val firstGoodDeal = Future.apply[Option[Car]]({
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})
```

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- An execution context is an object capable of executing tasks, typically using a thread pool
- Future tasks are submitted to the current implicit execution context

```
Welcome to Scala version 2.11.6 (Java HotSpot(TM) ..).
Type in expressions to have them evaluated.
Type :help for more information.

scala> import scala.concurrent._
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scala> val fut = Future { 40 + 2 }
```

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Example

Function for creating a Future that is completed with value after delay milliseconds

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Example

Function for creating a Future that is completed with value after delay milliseconds

```
def after[T](delay: Long, value: T): Future[T]
```

```
def after1[T](delay: Long, value: T) =
   Future {
    Thread.sleep(delay)
    value
   }
```

How does it behave?

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Quiz: when is "later" completed?

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Answer: after either ~1 s or ~2 s (most often)

```
object Promise {
  def apply[T](): Promise[T]
}
```

Promise

```
object Promise {
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}
```

```
trait Promise[T] {
  def success(value: T): Promise[T]
  def failure(cause: Throwable): Promise[T]
  def future: Future[T]
}
```

"after", Version 2

```
def after2[T](delay: Long, value: T) = {
  val promise = Promise[T]()

  timer.schedule(new TimerTask {
    def run(): Unit = promise.success(value)
  }, delay)

  promise.future
}
```

"after", Version 2

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def after2[T](delay: Long, value: T) = {
  val promise = Promise[T]()

  timer.schedule(new TimerTask {
    def run(): Unit = promise.success(value)
  }, delay)

  promise.future
}
```

Much better behaved!

What is Async?

- Scala module
 - "org.scala-lang.modules" %% "scala-async"
- Purpose: simplify programming with futures
- Scala Improvement Proposal SIP-22
- Releases for Scala 2.10 and 2.11

What Async Provides

- Future and Promise provide types and operations for managing data flow
 - Very little support for control flow
- Async complements Future and Promise with constructs to manage control flow

Programming Model

Basis: **suspendible computations**

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• async { .. } — *delimit* suspendible computation

Programming Model

Basis: **suspendible computations**

- async $\{ ... \}$ **delimit** suspendible computation
- await(future) suspend computation until future is completed

Async

Async

```
object Async {
   def async[T](body: => T): Future[T]
   def await[T](future: Future[T]): T
}
```

Example

```
val fstGoodDeal: Future[Option[Car]] = ..
val sndGoodDeal: Future[Option[Car]] = ..

val goodCar = async {
  val car1 = await(fstGoodDeal).get
  val car2 = await(sndGoodDeal).get
  if (car1.price < car2.price) car1
  else car2
}</pre>
```

Futures vs. Async

- "Futures and Async: When to Use Which?", Scala Days 2014, Berlin
 - Video: https://www.parleys.com/tutorial/futures-async-when-use-which

Async in Other Languages

Constructs similar to async/await are found in a number of widely-used languages:

- C#
- Dart (Google)
- Hack (Facebook)
- ECMAScript 7¹

¹ http://tc39.github.io/ecmascript-asyncawait/

From Futures to Actors

- Limitations of futures:
 - At most one completion event per future
 - Overhead when creating many futures
- How to model distributed systems?

• *Model of concurrent computation* whose universal primitive is the "actor" [Hewitt et al. '73]

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- Actors = concurrent "processes" communicating via asynchronous messages

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 the "actor" [Hewitt et al. '73]

Related to active objects

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- Upon reception of a message, an actor may
 - change its behavior/state
 - send messages to actors (including itself)
 - create new actors

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- Upon reception of a message, an actor may
 - change its behavior/state
 - send messages to actors (including itself)
 - create new actors
- Fair scheduling
- Decoupling: message sender cannot fail due to receiver

Example

```
class ActorWithTasks(tasks: ...) extends Actor {
 def receive = {
   case TaskFor(workers) =>
     val from = sender
      val requests = (tasks zip workers).map {
        case (task, worker) => worker ? task
      val allDone = Future.sequence(requests)
      allDone andThen { seq =>
        from ! seq.mkString(",")
```

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     val from = sender
     val requests = (tasks zip workers).map {
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     val allDone = Future.sequence(requests)
      allDone andThen { seq =>
       from ! seq.mkString(",")
                   Using Akka (http://akka.io/)
```

Anatomy of an Actor (1)

- An actor is an active object with its own behavior
- Actor behavior defined by:
 - subclassing Actor
 - implementing def receive

```
class ActorWithTasks(tasks: List[Task]) extends Actor {
   def receive = {
      case TaskFor(workers) => // send `tasks` to `workers`
      case Stop => // stop `self`
   }
}
```

Anatomy of an Actor (2)

- Exchanged messages should be immutable
 - And serializable, to enable remote messaging
- Message types should implement structural equality
- In Scala: *case classes* and *case objects*
 - Enables pattern matching on the receiver side

```
case class TaskFor(workers: List[ActorRef])
case object Stop
```

Anatomy of an Actor (3)

- Actors are isolated
 - Strong encapsulation of state
- Requires restricting access and creation
- Separate Actor instance and ActorRef
 - ActorRef public, safe interface to actor

```
val system = ActorSystem("test-system")
val actor1: ActorRef = system.actorOf[ActorWithTasks]
actor1 ! TaskFor(List()) // async message send
```

Reason 1: simplified concurrency

"Share nothing": strong isolation of actors → no race conditions

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- Actors handle at most one message at a time sequential reasoning
- Asynchronous message handling > less risk of deadlocks
- No "inversion of control": access to own state and messages in safe, direct way

Reason 2: actors model reality of distributed systems

Message sends truly asynchronous

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Therefore, actors well-suited as a foundation for distributed systems

Concurrency benefits from growable languages

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- The actor model faithfully models distributed systems