



Scalable Data Science

Lecture 18: Spark

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In the previous lectures:

- Outline:
 - What is Big Data and Hadoop?
 - What is Map Reduce ?
 - Map Reduce programmming.
 - Map Reduce implementation details





In this Lecture:

- Outline:
 - Scala
 - Var and Val
 - Classes and objects
 - Functions and higher order functions
 - Lists





SCALA





Scala

- Scala is both functional and object-oriented
 - every value is an object
 - every function is a value--including methods
- Scala is interoperable with java.
- Scala is statically typed
 - includes a local type inference system:



Var and Val

- ☐ Use var to declare variables:
 - \square var x = 3;
 - \square x += 4;
- ☐ Use val to declare values (final vars)
 - \square val y = 3;
 - \square y += 4; // error
- Notice no types, but it is statically typed
 - \square var x = 3;
 - \square x = "hello world"; // error
- ☐ Type annotations:
 - \square var x : Int = 3;



Class definition

```
class Point(val xc: Int, val yc: Int) {
 var x: Int = xc
 var y: Int = yc
 def move(dx: Int, dy: Int) {
   x = x + dx
   y = y + dy
   println ("Point x location: " + x);
   println ("Point y location: " + y);
```



Scala

☐ Class instances ■val c = new IntCounter[String]; Accessing members □ println(c.size); // same as c.size() ☐ Defining functions: \square def foo(x : Int) { println(x == 42); } \square def bar(y : Int): Int = y + 42; // no braces // needed! \square def return42 = 42; // No parameters either!



Functions are first-class objects

- Functions are values (like integers, etc.) and can be assigned to variables, passed to and returned from functions, and so on
- Wherever you see the => symbol, it's a literal function
- Example (assigning a literal function to the variable foo):

```
- scala> val foo =
    (x: Int) => if (x % 2 == 0) x / 2 else 3 * x + 1
    foo: (Int) => Int = <function1>
    scala> foo(7)
    res28: Int = 22
```

- The basic syntax of a function literal is
 parameter_list => function_body
- In this example, foreach is a function that takes a function as a parameter:
 - myList.foreach(i => println(2 * i))





Functions as parameters

• To have a function parameter, you must know how to write its type:

```
- (type1, type2, ..., typeN) => return_type
- type => return_type // if only one parameter
- () => return_type // if no parameters
```

• Example:

```
- scala> def doTwice(f: Int => Int, n: Int) = f(f(n))
doTwice: (f: (Int) => Int,n: Int)Int

scala> def collatz(n: Int) = if (n % 2 == 0) n / 2 else 3 * n + 1
collatz: (n: Int)Int

scala> doTwice(collatz, 7)
res2: Int = 11

scala> doTwice(a => 101 * a, 3)
res4: Int = 30603
```



Scala

- ☐ Defining lambdas nameless functions (types sometimes needed)
 - \square val f = x :Int => x + 42;
- ☐ Closures (context sensitive functions)
 - \square var y = 3;
 - \square val g = {x : Int => y += 1; x+y; }
- ☐ Maps (and a cool way to do some functions)
 - \square List(1,2,3).map(+10).foreach(println)
- ☐ Filtering (and ranges!)
 - \square 1 to 100 filter (% 7 == 3) foreach (println)

Lists

- Scala's Lists are more useful, and used more often, than Arrays
 - val list1 = List(3, 1, 4, 1, 6)
 - val list2 = List[Int]() // An empty list must have an explicit type
- By default, Lists, like Strings, are immutable
 - Operations on an immutable List return a new List
- Basic operations:
 - list.head (or list head) returns the first element in the list
 - list.tail (or list tail) returns a list with the first element removed
 - list(i) returns the ith element (starting from 0) of the list
 - list(i) = value is illegal (immutable, remember?)
- There are over 150 built-in operations on Lists—use the API!





Higher-order methods on Lists

• map applies a one-parameter function to every element of a List, returning a new List

```
- scala> def double(n: Int) = 2 * n
    double: (n: Int)Int
- scala> val ll = List(2, 3, 5, 7, 11)
    ll: List[Int] = List(2, 3, 5, 7, 11)
- scala> ll map double
    res5: List[Int] = List(4, 6, 10, 14, 22)
- scala> ll map (n => 3 * n)
    res6: List[Int] = List(6, 9, 15, 21, 33)
```

- **filter** applies a one-parameter test to every element of a List, returning a List of those elements that pass the test
 - scala> ll filter(n => n < 5)
 res10: List[Int] = List(2, 3)</pre>
 - scala> ll filter (_ < 5) // abbreviated function where parameter is used once res11: List[Int] = List(2, 3)





More higher-order methods

- def filterNot(p: (A) => Boolean): List[A]
 - Selects all elements of this list which do not satisfy a predicate
- def count(p: (A) => Boolean): Int
 - Counts the number of elements in the list which satisfy a predicate
- def forall(p: (A) => Boolean): Boolean
 - Tests whether a predicate holds for every element of this list
- def exists(p: (A) => Boolean): Boolean
 - Tests whether a predicate holds for at least one of the elements of this list
- def find(p: (A) => Boolean): Option[A]
 - Finds the first element of the list satisfying a predicate, if any
- def sortWith(lt: (A, A) => Boolean): List[A]
 - Sorts this list according to a comparison function





SPARK





Spark

Spark is an In-Memory Cluster Computing platform for Iterative and Interactive Applications.

http://spark.apache.org





Spark

- ☐ Started in AMPLab at UC Berkeley.
- ☐ Resilient Distributed Datasets.
- ☐ Data and/or Computation Intensive.
- ☐ Scalable fault tolerant.
- ☐ Integrated with SCALA.
- ☐ Straggler handling.
- ☐ Data locality.
- ☐ Easy to use.





Background

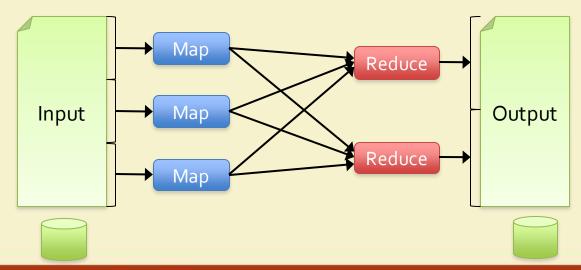
- Commodity clusters have become an important computing platform for a variety of applications
 - In industry: search, machine translation, ad targeting, ...
 - In research: bioinformatics, NLP, climate simulation, ...
- High-level cluster programming models like MapReduce power many of these apps
- Theme of this work: provide similarly powerful abstractions for a broader class of applications



Motivation

Current popular programming models for clusters transform data flowing from stable storage to stable storage

E.g., MapReduce:







Motivation

- Current popular programming models for clusters transform data flowing from stable storage to stable storage
- E.g., MapReduce:

Benefits of data flow: runtime can decide where to run tasks and can automatically recover from failures

Mah





Motivation

- Acyclic data flow is a powerful abstraction, but is not efficient for applications that repeatedly reuse a *working set* of data:
 - Iterative algorithms (many in machine learning)
 - Interactive data mining tools (R, Excel, Python)
- Spark makes working sets a first-class concept to efficiently support these apps



Spark Goal

- Provide distributed memory abstractions for clusters to support apps with working sets
- Retain the attractive properties of MapReduce:
 - Fault tolerance (for crashes & stragglers)
 - Data locality
 - Scalability

Solution: augment data flow model with "resilient distributed datasets" (RDDs)



Conclusion:

- We have seen:
 - Scala
 - Var and Val
 - Classes and objects
 - Functions and higher order functions
 - Lists



References:

Any book on scala.





Thank You!!



