

ISIT312 Big Data Management

Spark Data Model

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Introduction to Spark

Outline

Resilient Distributed Data Sets (RDDs)

DataFrames

SQL Tables/View

Datasets

Resilient Distributed Data Sets (RDDs)

Resilient Distributed Datasets (RDDs) is the lowest level (and the oldest) data abstraction available to the users

An RDD represents an immutable, partitioned collection of elements that can be operated on in parallel

Every row in an RDD is a Java object

RDD does not need to have any schema defined in advance

It makes RDD very flexible for various applications but in the same moment makes the manipulations on data more complicated

Users must implement their own functions to perform simple tasks like for example aggregation functions: average, count, maximum, etc

RDDs provide more control on how data is distributed over a cluster and how it is operated

Resilient Distributed Data Sets (RDDs)

RDD is characterized by the following properties

- A list of partitions
- A function for computing each split
- A list of dependencies on other RDDs
- Optionally, a Partitioner for **key-value RDDs**
- Optionally, a list of preferred locations to compute each split

Specification of custom partitions may provide significant performance improvements when using **key-value RDDs**

The properties of **RDDs** determine how Spark schedules and processes the applications

Different **RDDs** may use different properties depending on the required outcomes

Resilient Distributed Data Sets (RDDs)

RDD can be created from a list

```
val strings = "hello hello !".split(" ")
strings: Array[String] = Array(hello, hello, !)
```

Creating a list of strings

```
val rdset = spark.sparkContext.parallelize(strings);
rdset: org.apache.spark.rdd.RDD[String] = ParallelCollectionRDD[1] at parallelize
at :26
```

Creating RDD

Listing RDD

```
rdset.collect()
res1: Array[String] = Array(hello, hello, !)
```

Listing RDD

Resilient Distributed Data Sets (RDDs)

Creating RDD from a file by reading line-by-line

Creating RDD

```
val lines = spark.sparkContext.textFile("sales.txt")
lines: org.apache.spark.rdd.RDD[String] = sales.txt MapPartitionsRDD[1] at textFile at :24
```

Listing RDD

```
lines.collect()
res0: Array[String] = Array(bolt 45, bolt 5, drill 1, drill 1, screw 1, screw 2, screw 3)
```

Creating key-value pairs

```
val pairs = lines.map(s => (s, 1))
pairs: org.apache.spark.rdd.RDD[(String, Int)] = MapPartitionsRDD[2] at map at :26)
```

Counting

```
val counts = pairs.reduceByKey((a, b) => a + b)
counts: org.apache.spark.rdd.RDD[(String, Int)] = ShuffledRDD[3] at reduceByKey at :28)
```

Listing RDD

```
counts.collect()
res1: Array[(String, Int)] = Array((bolt 5,1), (drill 1,2), (bolt 45,1), (screw 2,1), (screw 3,1),
(screw 1,1))
```

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DataFrames

A **DataFrame** is a table of data with rows and columns

A list of columns in **DataFrame** together with the types of columns is called as a schema

A **DataFrame** can span over many systems in a cluster

The concepts similar to **DataFrame** has been used in **Python** and **R**

A **DataFrame** is the simplest data model available in Spark

A **DataFrame** consist of zero or more **partitions**

- To parallelize data processing all data are divided into chunks called as **partitions**
- A **partition** is a collection of rows located on a single system in a cluster
- When operating **DataFrame** Spark simultaneously processes all relevant **partitions**
- **Shuffle operation** is performed to share data among the systems in a cluster

DataFrames

A **DataFrame** can be created in the following way

```
val dataframe = spark.read.json("/bigdata/people.json")
```

Creating a DataFrame

The contents of a DataFrame can be listed in the following way

```
dataframe.show()
```

```
+----+-----+
| age|  name |
+----+-----+
| null|Michael|
|  30 |  Andy  |
|  19 | Justin |
+----+-----+
```

Listing results

DataFrames

A schema of a **DataFrame** can be listed in the following way

```
dataFrame.printSchema()
```

```
root
```

```
|-- age: long (nullable = true)
```

```
|-- name: string (nullable = true)
```

Listing a schema

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SQL Tables/Views

SQL can be used to operate on DataFrames

It is possible to register any DataFrame as a table or view (a temporary table) and apply SQL to it

There is no performance overhead when registering a DataFrame as SQL Table and when processing it

A DataFrame `dataFrame` can be registered as SQL temporary view `people` in the following way

```
dataFrame.createOrReplaceTempView("people")
val sqlDF = spark.sql("SELECT * FROM people")
sqlDF.show()
```

DataFrame as SQL Table

```
+----+-----+
| age|  name |
+----+-----+
| null|Michael|
| 30  |Andy   |
| 19  |Justin |
+----+-----+
```

Results

SQL Tables/Views

SQL Tables are logically equivalent to **DataFrames**

A difference between **SQL Tables** and **DataFrames** is such that **DataFrames** are defined within the scope of a programming language while **SQL Tables** are defined within a database

When created, **SQL table** belongs to a **default database**

SQL table can be created in the following way

```
CREATE TABLE flights(  
  DEST_COUNTRY_NAME STRING,  
  ORIGIN_COUNTRY_NAME STRING, count LONG)  
  USING JSON OPTIONS ( path '/mnt/defg/chapter-1-data/json/2015-summary.json' )
```

CREATE TABLE

SQL view can be created in the following way

```
CREATE VIEW just_usa_view AS  
  SELECT *  
  FROM flights  
  WHERE dest_country_name = 'United States'
```

CREATE VIEW

SQL Tables/Views

Global SQL view can be created in the following way

```
CREATE GLOBAL VIEW just_usa_global AS
SELECT *
FROM flights
WHERE dest_country_name = 'United States'
```

CREATE VIEW

Temporary SQL view can be created in the following way

```
CREATE TEMP VIEW just_usa_global AS
SELECT *
FROM flights
WHERE dest_country_name = 'United States'
```

CREATE VIEW

Global and Temporary SQL view can be created in the following way

```
CREATE GLOBAL TEMP VIEW just_usa_global AS
SELECT *
FROM flights
WHERE dest_country_name = 'United States'
```

CREATE VIEW

SQL Tables/Views

Spark SQL view includes three core complex types: [sets](#), [lists](#), and [structs](#)

[Structs](#) allow to create nested data

```
CREATE VIEW nested_data AS
SELECT (DEST_COUNTRY_NAME, ORIGIN_COUNTRY_NAME) as country, count
FROM flights
```

CREATE VIEW

The functions [collect_set](#) and [collect_list](#) functions create [sets](#) and [lists](#)

```
SELECT DEST_COUNTRY_NAME as new_name,
       collect_list(count) as flight_counts,
       collect_set(ORIGIN_COUNTRY_NAME) as origin_set
FROM flights
GROUP BY DEST_COUNTRY_NAME
```

CREATE VIEW

SQL Tables/Views

Managed versus unmanaged tables

- **Managed table** is a table that stored data and metadata, it is equivalent to an **internal** table in **Hive**
- **Unmanaged table** is a table that stores only data, it is equivalent to an **external** table in **Hive**

Creating **unmanaged** (**external**) table in Spark

```
CREATE EXTERNAL TABLE hive_flights(  
  DEST_COUNTRY_NAME STRING,  
  ORIGIN_COUNTRY_NAME STRING,  
  count LONG)  
  ROW FORMAT DELIMITED FIELDS TERMINATED BY ','  
  LOCATION '/mnt/defg/flight-data-hive/'
```

CREATE EXTERNAL TABLE

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Datasets

A **Dataset** is a distributed collection of data

A **DataFrame**, is a **Dataset** of type **Row**

Datasets consists of the objects included in the rows; one object per row

Datasets are a strictly JVM language feature that only work with **Scala** and **Java**

A **Dataset** can be constructed from JVM and then manipulated using functional transformations

In **Scala** a **case class** object defines a schema of an object

Datasets use a specialized **Encoder** to serialize the objects for processing or transmitting over the network

Dataset supports all operations of **DataFrame**

Datasets

A **Dataset** can be defined, created, and used in the following way

Creating Dataset Schema

```
case class Person(name: String, age: Long)
```

Creating Dataset

```
val caseClassDS = Seq(Person("Andy", 32)).toDS()
```

Listing Dataset

```
caseClassDS.show()
```

Results

```
+----+----+
| name | age |
+----+----+
| Andy | 32  |
+----+----+
```

Using a Dataset

```
caseClassDS.select($"name").show()
```

Results

```
+-----+
| name |
+-----+
| James |
```

References

A Gentle Introduction to Spark, Databricks, (Available in **READINGS** folder)

[RDD Programming Guide](#)

[Spark SQL, DataFrames and Datasets Guide](#)

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