Spark SQL. It provides a programming abstraction called DataFrame and can act as distributed SQL query engine.

Features of Spark SQL

- ➤ Integrated Seamlessly mix SQL queries with Spark programs. Spark SQL lets you query structured data as a distributed dataset (RDD) in Spark, with integrated APIs in Python, Scala and Java. This tight integration makes it easy to run SQL queries alongside complex analytic algorithms.
- ➤ Unified Data Access Load and query data from a variety of sources. Schema-RDDs provide a single interface for efficiently working with structured data, including Apache Hive tables, parquet files and JSON files.
- ➤ Hive Compatibility Run unmodified Hive queries on existing warehouses. Spark SQL reuses the Hive frontend and MetaStore, giving you full compatibility with existing Hive data, queries, and UDFs. Simply install it alongside Hive.
- Standard Connectivity Connect through JDBC or ODBC. Spark SQL includes a server mode with industry standard JDBC and ODBC connectivity.
- > Scalability Use the same engine for both interactive and long queries. Spark SQL takes advantage of the RDD model to support mid-query fault tolerance, letting it scale to large jobs too. Do not worry about using a different engine for historical data.
- A DataFrame is a distributed collection of data, which is organized into named columns. Conceptually, it is equivalent to relational tables with good optimization techniques.
- A DataFrame can be constructed from an array of different sources such as Hive tables, Structured Data files, external databases, or existing RDDs.

Features of DataFrame

- Ability to process the data in the size of Kilobytes to Petabytes on a single node cluster to large cluster.
- Supports different data formats (Avro, csv, elastic search, and Cassandra) and storage systems (HDFS, HIVE tables, mysql, etc).
- > State of art optimization and code generation through the Spark SQL Catalyst optimizer (tree transformation framework).
- Can be easily integrated with all Big Data tools and frameworks via Spark-Core.
- Provides API for Python, Java, Scala, and R Programming.

SQLContext

SQLContext is a class and is used for initializing the functionalities of Spark SQL. SparkContext class object (sc) is required for initializing SQLContext class object.

Task 3

Dataset link

https://drive.google.com/open?id=1oWb_IxIzb5PkFgf6P6lwbHXubAMI-HvK

1. What is the distribution of the total number of air-travelers per year

Step 1: Added main function and created the spark object as below

```
// Set the log level to only print errors
Logger.getLogger("org").setLevel(Level.ERROR)
//Let us create a spark session object

//Create a case class globally to be used inside the main method

val spark = SparkSession
   .builder()
   .master("local")
   .appName("Spark SQL Assignment 20")
   .config("spark.some.config.option", "some-value")
   .getOrCreate()
   println("spark session object is created")
```

Step 2: We will be using below datasets for this assignment

```
a. Holiday Details
   dataset_Holidays - Notepad
                                                 File Edit Format View Help
   10, AUS, CHN, airplane, 200, 1993
   1,AUS,CHN,airplane,200,1993
   2,CHN,IND,airplane,200,1993
   3,CHN,IND,airplane,200,1993
   4, IND, AUS, airplane, 200, 1991
   5,AUS,IND,airplane,200,1992
   6,RUS,CHN,airplane,200,1993
   7,CHN,RUS,airplane,200,1990
   8,AUS,CHN,airplane,200,1990
   9, IND, AUS, airplane, 200, 1991
   10, RUS, CHN, airplane, 200, 1992
   1,PAK,IND,airplane,200,1993
   2, IND, RUS, airplane, 200, 1991
   3,CHN,PAK,airplane,200,1991
   4,CHN,PAK,airplane,200,1990
   5, IND, PAK, airplane, 200, 1991
   6,PAK,RUS,airplane,200,1991
   7,CHN,IND,airplane,200,1990
   8, RUS, IND, airplane, 200, 1992
   9, RUS, IND, airplane, 200, 1992
   10,CHN,AUS,airplane,200,1990
   1,PAK,AUS,airplane,200,1993
   5,CHN,PAK,airplane,200,1994
```

- b. Columns are UserID, Country departure from, Country where User is arriving, mode of travel, distance and year
- c. Transport Details

```
dataset_User_details - Notepad

File Edit Format View Help

1,mark,15

2,john,16

3,luke,17

4,lisa,27

5,mark,25

6,peter,22

7,james,21

8,andrew,55

9,thomas,46

10,annie,44
```

- d. Columns are Mode of Travel, Travel Expenses
- e. User Details
- f. Columns are UserID, Name, age

```
mildataset_Iransport - Notepad
File Edit Format View Help
airplane,170
car,140
train,120
ship,200
```

Step 3 : To Complete the assignment first we have to load the data from these local files to Dataframes in Spark SQL as below

- a. Created the case class to map the details in Dataframe from text files
- i. Case Class for Holiday Details

```
//Case Class for Holidays

case class Holidays (UserID:Int,Country_Name_Dept:String,Country_Name_Arrival:String,modeOfTravel:String,Distance:
```

ii. Case Class for Transport Details

```
//Case Class for Transport Details

case class Transport_Details(Transport_Mode: String, Transport_Exp:Int)
```

iii. Case Class for User Details

```
//Case Class for User Details
case class User_Details(UserID:Int,User_Name:String,Age:Int)
```

b. Loaded data in frames

i. Loaded Holiday details

```
//Create Holdiays DF
//Here we have mentioned name of Attributes to be mapped , however it is not mandatory to do So.
//If Attribute names are not mentioned then follow sequence of attributes
//toDF() without any column names indicates , need to take all columns from dataset.
val holidaysDF = data.map( .split(",")).map(x=>Holidays(UserID = x(0).toInt,Country Name Dept = x(1),Country Name modeOfTravel = x(3),Distance = x(4).toInt,Year = x(5).toInt)).toDF()
//Printing data of Holidays DF
holidaysDF.show()
```

OUTPUT:

· +			+	+	+
UserID	Country_Name_Dept	Country_Name_Arrival	modeOfTravel	Distance	Year
1	CHN	IND	airplane	200	1990
2	IND	CHN	airplane	200	1991
3	IND	CHN	airplane	200	1992
4	RUS	IND	airplane	200	1990
5	CHN	RUS	airplane	200	1992
6	AUS	PAK	airplane	200	1991
7	RUS	AUS	airplane	200	1990
8	IND	RUS	airplane	200	1991
9	CHN	RUS	airplane	200	1992
10	AUS	CHN	airplane	200	1993
1	AUS	CHN	airplane	200	1993
2	CHN	IND	airplane	200	1993
3	CHN	IND	airplane	200	1993
4	IND	AUS	airplane	200	1991
5	AUS	IND	airplane	200	1992
6	RUS	CHN	airplane	200	1993
7	CHN	RUS	airplane	200	1990
8	AUS	CHN			1990
9	IND	AUS	airplane	200	1991
10	RUS	CHN			1992
+	+		+	+	+

only showing top 20 rows

ii. Loaded Transport Details

```
//Create Transport Details DF by loading the Transport_Details file

val transportDetailsDF = spark.sparkContext.textFile("E:/dataset Transport.txt").

map(_.split(",")).map(x=>Transport_Details(Transport_Mode = x(0),Transport_Exp = x(1).toInt)).toDF()

//Printing data of Transport Mode DF

transportDetailsDF.show()
```

OUTPUT:

<terminated> sparkSql1\$ [Scala Application] C:\Program Files\Java\jre1.8.0_171\bin\javaw.e

4	
Transport_Mode	Transport_Exp
airplane car train ship	140 120
+	

iii. Loaded User Details

```
//Create USer Details DF by loading the User file
val userDetailsDF = spark.sparkContext.textFile(path = "E:/dataset Userdet.txt").
map(_.split(",")).map(x=>User_Details(UserID = x(0).toInt,User_Name = x(1),Age = x(2).toInt)).toDF()
//Printing data of Transport Mode DF
userDetailsDF.show()
```

OUTPUT:

```
+----+
|UserID|User_Name|Age|
   1 mark 15
       john| 16|
    2
        luke | 17
    4
        lisa 27
    5
        mark 25
       peter 22
    6
       james 21
    7
       andrew 55
    9|
       thomas 46
       annie 44
```

Explanation Of Above Codes:

- 1. Read the text file from local path by using spark context textfile() method which created
- 2. An appeal those created RDD to Dataframe by split function (separator is ',') and mapped function and further mapped to case class.

- 3. While mapping to case class, we can mention the attribute name to be mapped, if we are not mentioning it then we have to maintain the sequence of the same.
- 4. 4. Data type casting is required if datatype from RDD is not matching what has been defined in case class. e.g. Age, Year, Distance etc.

Task 1. 1 What is the distribution of the total number of air-travelers per year

Solution Approach –

1. We have to query holiday details dataframe where mode of travel should be 'airplane' and need to group by 'Year'

```
//Task 1.1 : What is the distribution of the total number of air-travelers per year
//We have get the count of Users travelled vai air per year
//Need to query on Holidays DF with grouped on Year and transport mode should be airplane
//This is by using filter and group by operations on DataFrame
holidaysDF.filter("modeOfTravel='airplane'").groupBy("Year").count().show()
```

OUTPUT:

```
+---+---+
|Year|count|
+---+----+
|1990| 8|
|1994| 1|
|1991| 9|
|1992| 7|
|1993| 7|
```

2. Using SQL queries in spark.sqp operation a. We have create view for this dataframe which can be achieved by 'createOrReplaceTempView'

```
//Below approach is by using SQL in spark
holidaysDF.createOrReplaceTempView("Holiday_Data")
println("Using SQL & Temp View")
spark.sql("Select year, count(Year) a from Holiday_Data where modeOfTravel='airplane' group By Year ").show()
```

```
Using SQL & Temp View +---+--+ | year | a | +---+--+ | 1990 | 8 | | 1994 | 1 | | 1991 | 9 | | 1992 | 7 | | 1993 | 7 | +---+---+
```

Task 1.2 What is the total air distance covered by each user per year

Solution Approach -

- 1. We need group on holiday details on user id and year to get total sum of air distance covered
- 2. Here we have to join two DFs to get user name as well

Approach 1: Using SQL Queries

```
|User_Name|Year| a|
     mark | 1990 | 200 |
      mark | 1993 | 600 |
     peter | 1991 | 400 |
     peter | 1993 | 200 |
       luke | 1992 | 200 |
       luke | 1993 | 200 |
       luke | 1991 | 200 |
       mark | 1992 | 400 |
       mark | 1991 | 200 |
       mark | 1994 | 200 |
    thomas | 1992 | 400 |
    thomas | 1991 | 200 |
       lisa|1990|400|
       lisa|1991|200|
    andrew | 1991 | 200 |
    andrew | 1990 | 200 |
    andrew | 1992 | 200 |
     james | 1990 | 600 |
     annie | 1993 | 200 |
     annie | 1992 | 200 |
+----+
```

Approach 2: Using SPARK SQL Operations -> GroupBy , sum and join for joining two DFs

//Approach 2: By joinging two DFs

```
println("Below Result is after joining two Data frames")
 holidaysDF.as('HD).join(userDetailsDF.as('UD),$"UD.UserID"===$"HD.UserID")
     .groupBy("HD.UserID","HD.Year","UD.User_Name").sum("Distance").show()
OUTPUT:
Below Result is after joining two Data frames
+----+
|UserID|Year|User Name|sum(Distance)|
+----+
    1|1990| mark|
                         600
400
    1 1993
             mark
    6|1991| peter|
                         200
200
    6 1993 peter
            luke
luke
    3 1992
    3 1993
                         200
             luke
                          200
    3 1991
                         400
    5 1992
             mark
    5 1991
             mark
                         200
    5 1994
             mark
                          200
    9|1992| thomas|
                          400
    9|1991| thomas|
                          200
             lisa
    4 1990
                          400
            lisa
    4 1991
                          200
    8 | 1991 | andrew |
                          200
    8 | 1990 | andrew |
                          200
    8 | 1992 | andrew |
                          200
    7|1990| james|
                          600
            annie
    10 | 1993 |
                          200
    10|1992| annie|
                          200
only showing top 20 rows
```

Task 1.3 Which user has travelled the largest distance till date

Solution Approach -

- 1. We need group on holiday details on user id and year to get total sum of air distance covered
- 2. Here we have to join two DFs to get user name as well
- 3. Then we have order above data in descending order to take first row as max distance travelled

Approach 1 : Using SPARK SQL Operations -> GroupBy , sum , join, with CoulmnRenamed, ort, take for joining two DFs

withCoulmnRenamed ->this is to rename the any existing column. In this case we are renaming the column generated after using sum function.

Sort->this sorts the result Dataframe on given column and given order.

Take-> this takes the no. of rows from dataframe as mentioned in parameter

```
//Task 1.3 : Which user has travelled the largest distance till date
 //Approach 1: Using Spark SQL Operations
   val result3 = holidaysDF.as('HD).join(userDetailsDF.as('UD),$"UD.UserID"===$"HD.UserID").
   groupBy("HD.UserID","HD.Year","UD.User_Name").sum("Distance")
   .withColumnRenamed("sum(Distance)", "MaxDistance")
   .sort(desc("MaxDistance")).take(1).mkString(",")
    println(result3)
OUTPUT:
           ---- ---
 [1,1993,mark,600]
Approach 2: Using SQL Queries
//Approach 2: Using SQL Statements
   val result4 = spark.sql("Select User Name, Year, sum(Distance) as MaxDistance from Holiday Data HD JOIN Users [
   "HD.UserID==UD.UserID group By HD.UserID, HD.Year, UD.User_Name order by MaxDistance desc").take(1).mkString(
   println(result4)
OUTPUT:
```

Task 1.4 What is the most preferred destination for all users.

Solution Approach -

[mark,1993,600]

- 1. We have to group holiday details on Country of Arrival and take count of the same.
- 2. Order above dataframe in descending order and get the top most row which has maximum count and so the preferred localtion

Approach 1: Using SPARK SQL Operations -> GroupBy , count, sort, show Show(number)-> is used to display top 'n' rows.

Approach 2: Using SQL Queries

```
//Approach 2: Using SQL
spark.sql("Select Country_Name_Arrival,count(Country_Name_Arrival) as Fav_Destination from Holiday_Data " +
    "group by Country_Name_Arrival order by Fav_Destination desc").show(1)
```

OUTPUT:

Task 1. 5 Which route is generating the most revenue per year

Solution Approach -

- 1. In this case we have different columns for Country Arrival and Country Departure. So group on route we must combine these in one column and group on that column.
- 2. Get the count of above grouping per year
- 3. To get expenses join to Transport Details on Mode Of Travel

Created new DF with new column using withColumn and combined two columns using struct **Approach 1:** Using SPARK SQL Operations ②join , groupby,WithColumnRenamed,sort,sho

```
//Task 1.5 : Which route is generating the most revenue per year

//Need to join DF for Transport Mode and Holidays on Transport mode as key and group on transport mode

//get the sum of fair for that transport

//Approach 1: Using Spark SQL Operations

//First create a new DF where two columns Dept Country and Arrival country should be kep in one column to get dist

val routesDF= holidaysDF.withColumn("Route",struct("Country_Name_Dept","Country_Name_Arrival")).toDF()

routesDF.as('HD).join(transportDetailsDF.as('TD),$"TD.Transport Mode"===$"HD.modeOfTravel")

.groupBy("HD.Route").sum("Transport_Exp").

withColumnRenamed("sum(Transport_Exp"),"Total_Exp").sort(desc("Total_Exp")).show(1)
```

```
+----+
| Route|Total_Exp|
+----+
|[CHN, IND]| 680|
+----+
only showing top 1 row
```

Approach 2: Using SQL Queries

OUTPUT:

```
+-----+
| Route|sum(Transport_Exp)|
+-----+
|[CHN, IND]| 680|
+-----+
only showing top 1 row
```

Task 1. 6 What is the total amount spent by every user on air-travel per year

Solution Approach -

- 1. Join all the dataframes and group on user and year and get the count of air travel
- 2. Sum the travel expendes from Transport details and get amount spent every year.

Approach 1: Using SPARK SQL Operations ->join,groupby,sum,sort,show

+	+	+	++			
UserID	User_Name	Year	sum(Transport_Exp)			
+	+	+	++			
1		1990				
1	mark	1993	510			
2	john	1991	340			
2	john	1993	170			
3	luke	1991	170			
3	luke	1992	170			
3	luke	1993	170			
4	lisa	1990	340			
4	lisa	1991	170			
5	mark	1991	170			
5	mark	1992	340			
5	mark	1994	170			
6	peter	1991	340			
6	peter	1993	170			
7	james	1990	510			
8	andrew	1990	170			
8	andrew	1991	170			
8	andrew	1992	170			
9	thomas	1991	170			
j 9	thomas	:				
+	+	+	++			
only showing top 20 rows						

Task 1. 7 Considering age groups of < 20, 20-35, 35 > ,Which age group is travelling the most every year.

Solution Approach -

- 1. We have to join user details and holiday details to get age and count of travel based / grouped on user age group.
- 2. However we don't have any column which has groups categorized inside it. There are two approaches to resolve this

Approach 1: Write three different queries based on age criteria as mentioned in given task and get the three different dataframes with newly added column as 'AgeGroup' and union those datasets and then do grouping on newly added column 'AgeGroup' and get the desired result

```
//Task 1.7 Considering age groups of < 20 , 20-35, 35 > ,Which age group is travelling the most
 //every year.
//We need to join holidays and user details and get three result set for different age groups
// join those and get the final result based on travelling count is more
 //Get result (DF) for group less 20
 val grpBelow20 = holidaysDF.as('HD).join(userDetailsDF.as('UD),$"UD.UserID"===$"HD.UserID")
                  .filter("UD.Age<20").withColumn("AgeGroup",lit("Less20")).toDF()
 grpBelow20.show()
 //Get result (DF) for group between 20 and 35
 val grpBet20And35 = holidaysDF.as('HD).join(userDetailsDF.as('UD), $\frac{\text{"UD}}{\text{UD}} \text{.serID"} ===\frac{\text{"HD.UserID"}}{\text{US}}
   .filter("UD.Age between 20 And 35").withColumn("AgeGroup",lit("Between20And35")).toDF()
 grpBet20And35.show()
 //Get result (DF) for group greater than 35
 val grpAbove35 = holidaysDF.as('HD).join(userDetailsDF.as('UD),$"UD.UserID"===$"HD.UserID")
   .filter("UD.Age>35").withColumn("AgeGroup",lit("above35")).toDF()
OUTPUT:
 |UserID|Country_Name_Dept|Country_Name_Arrival|modeOfTravel|Distance|Year|UserID|User_Name|Age|AgeGroup|
                       CHN
                                             IND
                                                      airplane
                                                                     200 | 1990 |
                                                                                           mark| 15|
                       AUS
                                             CHN İ
                                                                     200 1993
                                                      airplane
                                                                                           mark
                                                                                                 15
                                                                                                      Less20
      1
                                                                                   11
                                             IND
                                                      airplane
                                                                     200 1993
                                                                                                      Less20
                       PAK
                                                                                           mark 15
      1
                                                                                   1
                       PAK
                                             AUS
                                                      airplane
                                                                     200 1993
                                                                                                      Less20
      1
                                                                                   1
                                                                                           mark
                                                                                                 15
                       IND
                                             CHN
                                                      airplane
                                                                     200 | 1992 |
                                                                                           lukel
                                                                                                 17
                                                                                                      Less20
       3
                                                                                   31
                                             IND
                                                                     200 1993
       3
                       CHN
                                                      airplane
                                                                                           lukel
                                                                                                 17
                                                                                                      Less20
                                                                                   31
                                             PAK
                                                                     200 1991
       3
                       CHN
                                                      airplane
                                                                                   3
                                                                                           luke | 17
                                                                                                      Less20
       2
                        IND
                                             CHN
                                                                     200 1991
                                                                                   2
                                                                                           john
                                                                                                      Less20
                                                      airplane
                                                                                                 16
                       CHN
                                             IND
                                                                     200 | 1993 |
                                                                                           john
                                                                                                      Less20
                                                      airplane
                                                                                                 16
       2
                        IND
                                             RUS
                                                                     200 1991
                                                                                           john 16
                                                                                                      Less20
                                                      airplane|
                                                                                   2
 |UserID|Country_Name_Dept|Country_Name_Arrival|modeOfTravel|Distance|Year|UserID|User_Name|Age|
                                                                                                         AgeGroup
       6
                        AUS
                                                      airplane|
                                                                     200 | 1991 |
                                                                                                 22 Between 20 And 35
                                                                                          peter
       6
                                             CHN
                                                      airplane
                                                                     200 1993
                                                                                          peter
                                                                                                 22 Between20And35
       6
                       PAK
                                             RUS
                                                      airplane
                                                                     200 | 1991 |
                                                                                          peter
                                                                                                 22 Between20And35
                       CHN
                                                                     200 1992
                                             RUS
                                                      airplane
                                                                                           mark
                                                                                                 25 Between20And35
       5
                       AUS
                                             IND
                                                                     200 1992
                                                                                   5
                                                                                                 25 Between20And35
                                                      airplane
                                                                                           mark
       5
                                             PAK
                                                                     200 1991
                        IND
                                                      airplane
                                                                                           mark
                                                                                                 25 Between20And35
                                                      airplane
       5
                        CHN
                                             PAK
                                                                     200 1994
                                                                                   5
                                                                                           mark
                                                                                                 25 Between20And35
       4
                       RUS
                                             IND
                                                      airplane
                                                                     200 1990
                                                                                   4
                                                                                                 27 Between20And35
                                                                                           lisa
       4
                       IND
                                             AUS
                                                      airplane
                                                                     200 1991
                                                                                   4
                                                                                           lisa
                                                                                                 27 Between20And35
       4
                       CHN
                                             PAK
                                                      airplane
                                                                     200 | 1990 |
                                                                                   4
                                                                                          lisa
                                                                                                 27 Between20And35
       7
                       RUS
                                             AUS
                                                      airplane
                                                                     200 | 1990 |
                                                                                   7
                                                                                          james|
                                                                                                 21 Between20And35
       7
                        CHN
                                             RUS
                                                      airplane
                                                                     200 | 1990 |
                                                                                          james
                                                                                                 21 Between20And35
                       CHN
                                             IND
                                                      airplane
                                                                     200 | 1990 |
                                                                                          james | 21 | Between20And35
 |UserID|Country_Name_Dept|Country_Name_Arrival|modeOfTravel|Distance|Year|UserID|User_Name|Age|AgeGroup|
       91
                          CHN
                                                  RUSI
                                                           airplane|
                                                                           200 | 1992 |
                                                                                                 thomas | 46 | above 35 |
       9
                          IND
                                                  AUS
                                                           airplane|
                                                                           200 | 1991 |
                                                                                           9|
                                                                                                 thomas | 46 | above35
       9
                                                           airplane
                                                                           200 1992
                                                                                           9
                          RUS
                                                  IND
                                                                                                 thomas
                                                                                                          46
                                                                                                              above35
                                                           airplane
       8
                         IND
                                                  RUS İ
                                                                           200 | 1991 |
                                                                                           8
                                                                                                 andrew| 55| above35|
       81
                          AUS
                                                  CHN
                                                           airplane|
                                                                           200 | 1990 |
                                                                                           81
                                                                                                 andrew 55
                                                                                                              above35
       8
                          RUS
                                                  IND
                                                           airplane
                                                                           200 | 1992 |
                                                                                           8
                                                                                                 andrew 55
                                                                                                               above35
      10
                          AUS
                                                  CHN
                                                           airplane|
                                                                           200 | 1993 |
                                                                                          10
                                                                                                 annie 44 above35
      10
                          RUS
                                                  CHN I
                                                           airplane|
                                                                           200 | 1992 |
                                                                                          10
                                                                                                  annie 44
                                                                                                              above35
      101
                          CHN
                                                  AUS
                                                           airplane|
                                                                           200 | 1990 |
                                                                                          10
                                                                                                  annie | 44 | above35 |
```

Approach 2: Another approach is write case statement to add new column in existing Dataframe and do the grouping on newly added column.