

Spark DataFrame

DSCI 551

Wensheng Wu

Create & display dataframes

- `country = spark.read.json('country.json')` # also supports `read.csv(...)`
- `city = spark.read.json('city.json')`
- `cl = spark.read.json('countrylanguage.json')`
- `country.show()` # show top 20 rows as a table
 - Similar to `country.head()` in Pandas
- `country.show(5)`
- Also has `head(5)/take(5)`, `tail(5)`, `collect()`
 - return `Row(...)`'s instead

Creating data frames

- `df = spark.createDataFrame([('Tom', 80), ('Alice', None)], ["name", "height"])`

Projection

- Selecting a subset of columns
- `country[['Continent', 'Region']]` # similar to Pandas
- Alternative:
 - `country[[country.Continent, country.Region]]`
 - `country.select('Continent', 'Region')` # this returns a dataframe
 - `country.select(country.LifeExpectancy.alias('le'))` # with renaming
 - `country['Continent', 'Region']` # this returns a dataframe
 - `country['Continent']` # this returns a column

Renaming columns

- `country.withColumnRenamed('Name', 'CountryName').show()`

Adding a new column => a new dataframe

- `import pyspark.sql.functions as fc`
- `df = spark.createDataFrame([(1,1), (1,2), (1,3)], ['a', 'b'])`
- `>>> df.show()`

```
+---+---+
|  a|  b|
+---+---+
|  1|  1|
|  1|  2|
|  1|  3|
+---+---+
```

- `df1 = df.withColumn('c', fc.col('b'))`
- `df1.show()`

```
+---+---+---+
|  a|  b|  c|
+---+---+---+
|  1|  1|  1|
|  1|  2|  2|
|  1|  3|  3|
+---+---+---+
```

More examples

- `df.withColumn('c', fc.when(df.b > 2, 1).otherwise(-1)).show()`

```
+---+---+---+
| a| b| c|
+---+---+---+
| 1| 1| -1|
| 1| 2| -1|
| 1| 3| 1|
+---+---+---+
```

- `df.withColumn('c', fc.lit(1)).show()`

```
+---+---+---+
| a| b| c|
+---+---+---+
| 1| 1| 1|
| 1| 2| 1|
| 1| 3| 1|
+---+---+---+
```

Selection/filtering

- Selecting a subset of rows
- `country[country.GNP > 10000]` # similar to Pandas
- Alternative:
 - `country.filter(country.GNP > 10000)`
 - `country.filter("GNP > 10000")`
 - `country.filter('GNP > 10000 and GNP < 50000')` # filter takes SQL style where-condition
 - `country.where('GNP > 10000')`
- `country[(country.GNP > 10000) & (country.GNP < 50000)]` # similar to Pandas
 - Other logical operators: `|`, `~`

Distinct

- `country[['Continent', 'Region']].distinct()`
- Alternative:
 - `country[['Continent', 'Region']].dropDuplicates()`
 - Similar to `drop_duplicates()/unique()` in Pandas

Groupby without aggregation

- `country.groupBy('Continent')` or `country.groupby('Continent')`
 - Similar to `groupby` in Pandas
- Need to aggregate so that we can show the grouping details
 - `country.groupBy('Continent').count()[['Continent']].show()`
- May also use:
 - `country[['Continent']].distinct()`

Aggregation w/o groupby

- `country.agg({'GNP': 'max'})`
- `import pyspark.sql.functions as fc`
- `country.agg(fc.max('GNP').alias('max_gnp'))`
 - Similar to `agg(max_gnp = pd.NamedAgg('GNP', 'max'))` in Pandas
在pandas还能使用: `max_gnp = country['GNP'].max()`
- `country.agg(fc.max('GNP').alias('max_gnp'),
fc.min('GNP').alias('min_gnp')).show()`

```
+-----+-----+
|  max_gnp|min_gnp|
+-----+-----+
|8510700.0|    0.0|
+-----+-----+
```

Group by with aggregation

- `import pyspark.sql.functions as fc`
- `country.groupBy('Continent').agg(fc.max("GNP").alias("max_gnp"),\nfc.count("*").alias("cnt")).show()`

=>

Select Continent, max(GNP) max_gnp, count(*) cnt

From country

Group by Continent

Group by with having

- `import pyspark.sql.functions as fc`
- `country.groupBy('Continent').agg(fc.max("GNP").alias("max_gnp"),
fc.count("*").alias("cnt")).filter('cnt > 5').show()`

=>

```
select Continent, max(GNP) max_gnp, count(*) cnt
from country
group by Continent
having cnt > 5
```

Counting w/o group by

- `country.count()`
 - Note different from Pandas `count()`

=>

```
select count(*)  
from country
```

Aggregating one or more columns

- `country.groupBy('Continent').max('GNP').show()`
- `country.groupBy(['Continent', 'Region']).max('GNP').show()`

Order by

- `import pyspark.sql.functions as fc`
- `country.orderBy('Continent')`
- `country.orderBy(fc.desc('Continent'))`
 - Alternative: `country.orderBy(country.Continent.desc())`
- `country.orderBy(['Continent', 'GNP'], ascending=[True, False])`
- Alternatives: replacing `orderBy` with `sort`
 - `country.sort(fc.desc('Continent'), fc.desc('GNP'))`
 - `country.sort(['Continent', 'GNP'], ascending=[True, False])`

Aggregation function

- count
- max,min
- avg/mean
- sum

Example: putting them together

- `country[(country.GNP > 1000) & (country.GNP < 10000)].groupBy('Continent', 'Region').agg(fc.mean('LifeExpectancy').alias('avg_le'), fc.count('*').alias('cnt')).filter('cnt > 5').orderBy(fc.desc('avg_le')).show()`

 , Region

=> `select Continent, avg(LifeExpectancy) avg_le, count(*) cnt`

`from country`

`group by Continent , Region`

`having cnt > 5`

`order by avg_le desc`

少了一个where-condition:

`where country.GNP > 1000 and country.GNP < 10000`

Limit

- `res = country[(country.GNP > 1000) & (country.GNP < 10000)].groupBy('Continent', 'Region').agg(fc.mean('LifeExpectancy').alias('avg_le'), fc.count('*').alias('cnt'))`
- `res[res.cnt > 5].orderBy(fc.desc('avg_le')).limit(2)`

=>

```
select Continent, Region, avg(LifeExpectancy) avg_le, count(*) cnt
from country
group by Continent, Region
having cnt > 5
order by avg_le desc
limit 2
```

Join

- `country.join(city, country.Capital == city.ID)`
- `country.join(city, (country.Capital == city.ID) & (country.Population > city.Population))`
- Alternative:
 - `country.join(city, [country.Capital == city.ID, country.Population > city.Population])`

Natural join

- `cl.join(city, 'CountryCode')`
 - Equivalent to: `cl.join(city, cl.CountryCode == city.CountryCode)`

\Rightarrow `select *`
`from countrylanguage natural join city`

Outer join

- `country.join(city, country.Capital == city.ID, how='left').filter("ID is null")`
 - Or `filter(city.ID.isNull())`

=>

`select *`

`from country left outer join city on country.Capital = city.ID`

`where city.ID is null`

Union

- `usa = cl[(cl.CountryCode == 'USA')][['Language', 'IsOfficial']]`
- `can = cl[(cl.CountryCode == 'CAN')][['Language', 'IsOfficial']]`
- `usa_can = cl[(cl.CountryCode == 'USA') | (cl.CountryCode == 'CAN')][['Language', 'IsOfficial']]`
- Bag union
 - `usa.union(can)` or `usa.unionAll(can)`
- Set union
 - `usa.union(can).distinct()`

```
>>> usa.orderBy('Language').show()
```

Language	IsOfficial
Chinese	F
English	T
French	F
German	F
Italian	F
Japanese	F
Korean	F
Polish	F
Portuguese	F
Spanish	F
Tagalog	F
Vietnamese	F

```
>>> can.orderBy('Language').show()
```

Language	IsOfficial
Chinese	F
Dutch	F
English	T
Eskimo Languages	F
French	T
German	F
Italian	F
Polish	F
Portuguese	F
Punjabi	F
Spanish	F
Ukrainian	F

Intersection

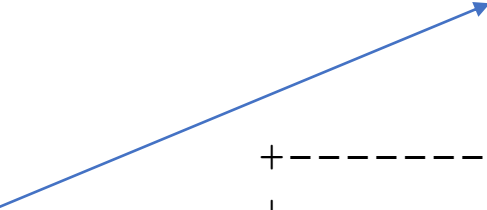
- Bag intersection:
 - `usa_can.intersectAll(usa_can)`
- Set intersection:
 - `usa_can.intersect(usa_can)`
 - Note it removes duplicates

+-----+-----+	
Language	IsOfficial
+-----+-----+	
Chinese	F
Chinese	F
Dutch	F
English	T
English	T
Eskimo Languages	F
French	F
French	T
German	F
German	F
Italian	F
Italian	F
...	

+-----+-----+	
Language	IsOfficial
+-----+-----+	
Chinese	F
Dutch	F
English	T
Eskimo Languages	F
French	F
French	T
German	F
Italian	F
...	

Subtract (set semantics)

- `uc = usa_can.union(usa_can)`
- `uc.orderBy('Language').show()`
- `uc.subtract(can).show()`



Language	IsOfficial
Japanese	F
Tagalog	F
French	F
Vietnamese	F
Korean	F

French	F
French	T
French	T
French	F

Language	IsOfficial
Chinese	F
Dutch	F
English	T
Eskimo Languages	F
French	T
German	F
Italian	F
Polish	F
Portuguese	F
Punjabi	F
Spanish	F
Ukrainian	F

CAN

Accessing Spark from Python

- Interactive shell:
 - `bin/pyspark`
 - A `SparkSession` object `spark` will be automatically created
- `bin/pyspark --master local[4]`
 - This starts Spark on local host with 4 threads
 - "`--master`" specifies the location of Spark master node

Accessing Spark from Python

- Standalone program
 - Executed using spark-submit script
 - E.g., bin/spark-submit <your Python Spark script>
- You may find many Python Spark examples under
 - examples/src/main/python

Dataframe to RDD and back

- `df.rdd.toDF()`
- `df.rdd.map(lambda r: (r['a'], r['b'], 1)).toDF(['a', 'b', 'c']).show()`

```
+---+---+---+  
|  a|  b|  c|  
+---+---+---+  
|  1|  1|  1|  
|  1|  2|  1|  
|  1|  3|  1|  
+---+---+---+
```

Spark SQL

- `country.createOrReplaceTempView('country')`
- `spark.sql('select Name from country limit 5').show()`

```
+-----+
|      Name|
+-----+
|      Aruba|
|Afghanistan|
|      Angola|
|    Anguilla|
|      Albania|
+-----+
```

Resources

- Important classes of Spark SQL and DataFrames
 - <https://spark.apache.org/docs/latest/api/python/pyspark.sql.html>
- `read.csv(...)`, `read.json(...)`
 - <https://spark.apache.org/docs/latest/api/python/pyspark.sql.html#pyspark.sql.DataFrameReader>