SparkSQL

重难点

• 重点: DataFrame的创建以及操作

难点: Spark和Hive整合扩展: 数据处理分析部分

快速入门

• 什么是SparkSQL

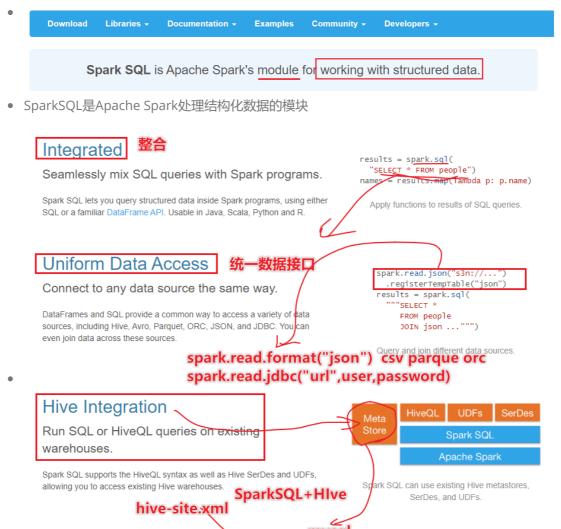


Standard Connectivity

Connect through JDBC or ODBC

business intelligence tools.

A server mode provides industry standard JDBC and ODBC connectivity for

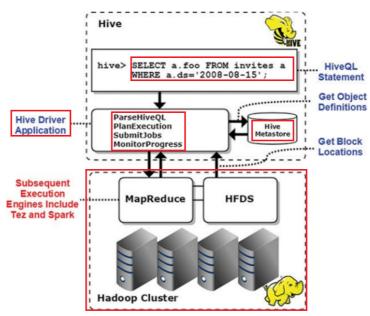


BI Tools

Use your existing BI tools to query big data.

- 为什么学习SparkSQL
- 1-Spark的RDD算子还是比较复杂
- 2-Spark计算相比较MR更快,使用SparkSQL完成结构化数据统计分析
- SparkSQL和HIVE的关系

首先回顾SQL On Hadoop框架: Hive (可以说Hive是大数据生态系统中第一个SQL框架),架构如下所示:



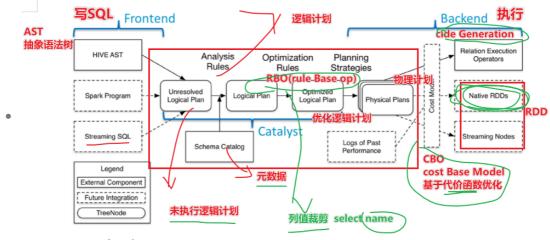
• 将HiveQL语句翻译成基于RDD操作,此时Shark框架诞生了

Spark SQL的前身是Shark,它发布时Hive可以说是SQL on Hadoop的唯一选择(Hive负责将SQL编译成可扩展的MapReduce作业),鉴于Hive的性能以及与Spark的兼容,Shark由此而生。Shark即Hive on Spark,本质上是通过Hive的HQL进行解析,把HQL翻译成Spark上对应的RDD操作。然后通过Hive的Metadata获取数据库里表的信息,实际为HDFS上的数据和文件,最后有Shark获取并放到Spark上计算。

但是 Shark框架更多是对Hive的改造,替换了Hive的物理执行引擎,使之有一个较快的处理速度。 然而不容忽视的是Shark继承了大量的Hive代码,因此给优化和维护带来大量的麻烦。为了更好的发展,Databricks在2014年7月1日。park Summit上宣布终止对Shark的开发,将重点放到SparkSQL模块上。

文档: https://databricks.com/blog/2014/07/01/shark-spark-sql-hive-on-spark-and-the-future-of-sql-on-spark.html





- SparkSession应用入口
- *SparkSession: 这是一个新入口,取代了原本的SQLContext与HiveContext*
- spark.sparkcontext

```
from pyspark.sql import SparkSession {
    spark = SparkSession \
    .builder \
    .appName("Python Spark SQL basic example") \
    .config("spark.some.config.option", "some-value") \
    .getOrCreate()
```

[了解]SparkSQL概述

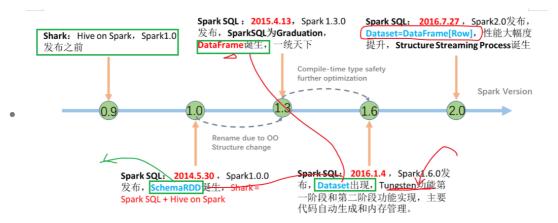
案例实操:

```
# -*- coding: utf-8 -*-
# Program function: 学会创建SparkSession
from pyspark.sql import SparkSession
from pyspark import SparkConf
if __name__ == '__main__':
   # TODO 1-引入SparkSession的环境
   conf = SparkConf().setAppName("sparksession").setMaster("local[*]")
   spark = SparkSession.builder.config(conf=conf).getOrCreate()
   # TODO 2-利用Spark环境变量生成SparkContext
   sc = spark.sparkContext
   # TODO 3-读取一个文件
   fileDF = spark.read.text("/export/data/pyspark_workspace/data/words.txt")
   # TODO 4-查看数据有多少行
   print("fileDF counts value is:{}".format(fileDF.count())) # fileDF counts
value is:2
   fileDF.printSchema() # 字段的名称和字段的类型
   # root
   # |-- value: string (nullable = true)
   fileDF.show(truncate=False)
   # +----+
   # |value
```

```
# +-----+
# |hello you Spark Flink |
# |hello me hello she Spark|
# +-----+
# TODO 5-查看数据有多少行
spark.stop()
```

- SparkSession
- spark.read.text 形成的DataFrame(数据框)
- df.printScheme() 打印出的是dataframe的数据字段名和字段类型
- df.show(truncate=False) 如何打印,截断式打印

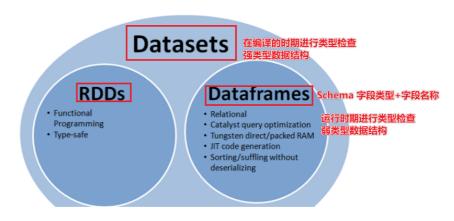
SparkSQL数据抽象



- SparkSQL中数据抽象称之为DataFrame, DataSet, **DataFrame=DataSet[Row]**
- 什么是Row对象,代表一行数据
- 在PySpark中,仅提供了DataFrame的API,Python语言是弱类型的语言

PySpark中的数据结构

• 关系如下:



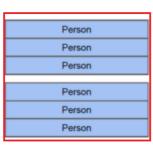
在SparkSQL当中,Spark为我们提供了两个操作SparkSQL的抽象,分别是DataFrame和DataSet。也就是说我们操作SparkSQL一般都是使用DataFrame或者DataSet来实现的,就类似于我们SparkCore模块当中,我们的抽象是RDD,我们使用SparkContext来实现操作RDD一样。

对于在版本上面,Spark也有一些历史变动
RDD(Spark1.0) ==> DataSet(1.6)

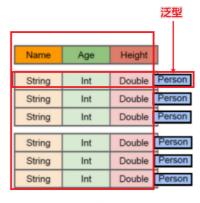
- DataFrame
- 泛型: 比如Person类
- Person中很多字段, name: String, age: int
- DataFrame ==> RDD 泛型 + Schema + 方便的SQL操作 + 优化
 DataFrame是特殊的RDD

DataFrame是一个分布式的表

- 如何从dataframe转化为rdd?
- 如何从rdd转化为dataframe?
- •结构图解



Name	Age	Height
String	Int	Double



RDD[Person]

DataFrame

DataSet[Person]

- RDD[Person] rdd数据结构
- DataFrame=RDD-泛型+scheme+方便SQL操作+SQL优化
- DataSet=DataFrame+泛型
- 在未来的学习中主要以DataFrame为主的学习,因为无论哪个版本Spark的DataSet仍然处于 试验阶段

[掌握]DataFrame构建

- SparkSQL的数据结构
 - o RDD: 弹性分布式数据集
 - o DataFrame: RDD-泛型+Scheme+方便SQL操作+SQL优化
 - DataSet: 更加高阶API, 为了统一RDD和DataFrame
- 这里使用PySpark考虑
 - 。 1-从RDD如何转化为DataFrame
 - 1-使用Row对象的方法结合spark.createDataFrame()
 - 2-使用StructType和StructField方法结合使用,spark.createDataFrame
 - 3-使用toDF方法直接生成dataframe
 - 4-从pandas的dataframe转化为spark的dataframe
 - 5-从外部数据源读取转化为df
 - 。 2-从DataFrame如何转化为rdd
 - df.rdd.collect
- 注意:

```
| StructType | St
```

DataFrame是什么

• DataFrame是数据框, RDD-泛型+Schema+方便操作SQL+SQL优化

Schema信息

- 字段的类型和字段名称
- df.schema

Row信息

- 一行数据构成Row对象
- df1.first查看第一行数据,显示以Row(name=xxx,age=xxx)

RDD转DF

• 1-Row对象方式转化为toDF

```
# -*- coding: utf-8 -*-
# Program function: 第一种方式处理rdd转化为df
1.1.1
 1-准备好上下文环境SparkSession
 2-读取数据, sc.textFile()
 3-使用Row对象对每行数据进行操作 Row(name=zhangsan,age=18)
 4-使用spark.createDataFrame(schema)创建DataFrame
 5-直接使用printSchema查看Scheme
 6-使用show展示数据
 from pyspark.sql import SparkSession
 from pyspark.sql.types import Row
 if __name__ == '__main__':
  # 1 - 准备好上下文环境SparkSession
     spark =
SparkSession.builder.master("local[*]").appName("testPi").getOrCreate()
    sc = spark.sparkContext
     sc.setLogLevel("WARN")
     # 2 - 读取数据, sc.textFile()
     rdd_file =
sc.textFile("/export/data/pyspark_workspace/data/sql/people.txt")
     file_map_rdd = rdd_file.map(lambda record: record.split(","))
     # print(file__map.collect())
     # 3 - 使用Row对象对每行数据进行操作Row(name=zhangsan, age=18)
     df = file_map_rdd.map(lambda line: Row(name=line[0],
age=int(line[1]))).toDF()
     # 4 - 使用spark.createDataFrame(schema)创建DataFrame
     # 5 - 直接使用printSchema查看Scheme
    df.printSchema()
     # 6 - 使用show展示数据
     df.show()
```

• 2-Row结合spark.createDataFrame()

```
# -*- coding: utf-8 -*-
# Program function: 第一种方式处理rdd转化为df
'''
1-准备好上下文环境SparkSession
2-读取数据, sc.textFile()
3-使用Row对象对每行数据进行操作 Row(name=zhangsan,age=18)
```

```
4-使用spark.createDataFrame(schema)创建DataFrame
5-直接使用printSchema查看Scheme
6-使用show展示数据
from numpy.distutils.system_info import dfftw_info
from pyspark.sql import SparkSession
from pyspark.sql.types import Row
if __name__ == '__main__':
 # 1 - 准备好上下文环境SparkSession
 spark =
SparkSession.builder.master("local[*]").appName("testPi").getOrCreate()
 sc = spark.sparkContext
 sc.setLogLevel("WARN")
 # 2 - 读取数据, sc.textFile()
 rdd_file =
sc.textFile("/export/data/pyspark_workspace/data/sql/people.txt")
 file_map_rdd = rdd_file.map(lambda record: record.split(","))
 # print(file__map.collect())
 # 3 - 使用Row对象对每行数据进行操作Row(name=zhangsan, age=18)
 scheme_people = file_map_rdd.map(lambda line: Row(name=line[0],
age=int(line[1])))
 # 4 - 使用spark.createDataFrame(schema)创建DataFrame
 df = spark.createDataFrame(scheme_people)
 # 5 - 直接使用printSchema查看Scheme
 df.printSchema()
 # 6 - 使用show展示数据
 df.show()
 spark.stop()
```

• 3-通过StructType和StructFiled一起实现df

```
# -*- coding: utf-8 -*-
# Program function: 第一种方式处理rdd转化为df
'''
1-准备好上下文环境SparkSession
2-读取数据, sc.textFile()
3-使用StructType和StructFiled创建Schema
4-使用spark.createDataFrame(schema)创建DataFrame
5-直接使用printSchema查看Scheme
6-使用show展示数据
'''
from pyspark.sql import SparkSession
from pyspark.sql.types import *

if __name__ == '__main__':
    # 1 - 准备好上下文环境SparkSession
```

```
spark =
SparkSession.builder.master("local[*]").appName("testPi").getOrCreate()
    sc = spark.sparkContext
   sc.setLogLevel("WARN")
   # 2 - 读取数据, sc.textFile()
    rdd_file =
sc.textFile("/export/data/pyspark_workspace/data/sql/people.txt")
   file_map_rdd = rdd_file.map(lambda record: record.split(","))
   # print(file__map.collect())
   # 3 - 使用Row对象对每行数据进行操作Row(name=zhangsan, age=18)
    peoplerdd = file_map_rdd.map(lambda line: (line[0],
int(line[1].strip()))
    # 使用StructType和StructFiled创建Schema
    schema = StructType([StructField("name", StringType(), True),
StructField("age", IntegerType(), True)])
    # 4 - 使用spark.createDataFrame(schema)创建DataFrame
   df = spark.createDataFrame(peoplerdd, schema)
   # 5 - 直接使用printSchema查看Scheme
   df.printSchema()
   # root
   # | -- name: string(nullable=true)
   # | -- age: integer(nullable=true)
   # 6 - 使用show展示数据
   df.show()
```

• 更改的方式

```
# 使用StructType和StructFiled创建Schema
schemaName = "name,age"
split_ = [StructField(scheme, StringType(), True) for scheme in
schemaName.split(",")]
schema = StructType(split_)
# 4 - 使用spark.createDataFrame(schema)创建DataFrame
df = spark.createDataFrame(peoplerdd, schema)
```

- 4-直接toDF
- 类似toDF("name","age")

```
# -*- coding: utf-8 -*-

# Program function: 第一种方式处理rdd转化为df
'''

1-准备好上下文环境SparkSession

2-读取数据, sc.textFile()

3-使用Row对象对每行数据进行操作 Row(name=zhangsan,age=18)

4-使用spark.createDataFrame(schema)创建DataFrame

5-直接使用printSchema查看Scheme

6-使用show展示数据
'''

from pyspark.sql import SparkSession
from pyspark.sql.types import Row

if __name__ == '__main__':

# 1 - 准备好上下文环境SparkSession
    spark =

SparkSession.builder.master("local[*]").appName("testPi").getOrCreate()
```

```
sc = spark.sparkContext
   sc.setLogLevel("WARN")
   # 2 - 读取数据, sc.textFile()
   rdd_file =
sc.textFile("/export/data/pyspark_workspace/data/sql/people.txt")
   file_map_rdd = rdd_file.map(lambda record: record.split(","))
   # print(file__map.collect())
   # 3 - 使用Row对象对每行数据进行操作Row(name=zhangsan, age=18)
   df = file_map_rdd.map(lambda line: Row(name=line[0],
age=int(line[1]))).toDF()
   # 4 - SparkSQL提供了两种风格查询数据
   # 4-1第一种风格DSL 领域查询语言df.select.filter
   print("=======df.select DSL-====="")
   df.select("name").show()
   df.select(["name", "age"]).show()
   df.select(df.name, (df.age + 10).alias('age')).show()
   # 4-2第二种风格SQL 写SQL实现
   print("=======spark.sql- SQL======"")
   df.createOrReplaceTempView("t_table")
   spark.sql("select * from t_table").show()
   spark.sql("select name from t_table").show()
   spark.sql("select name,age from t_table").show()
   spark.sql("select name,age + 10 from t_table").show()
   # 5 - 直接使用printSchema查看Scheme
   df.printSchema()
   spark.sql("desc t_table").show()
   # 6 - 使用show展示数据
   df.show()
```

• 完毕

5-外部数据源读取

- 读取json
- 读取csv
- 读取parquet

```
# -*- coding: utf-8 -*-

# Program function: 读取csv数据

# csv 以逗号作为分隔符的文本

from pyspark.sql import SparkSession

if __name__ == '__main__':
    spark =

SparkSession.builder.appName("readData").master("local[*]").getOrCreate()
    sc = spark.sparkContext
    sc.setLogLevel("WARN")
```

```
# 读取csv数据
 csv_data=spark.read.format("csv")\
      .option("header",True)\
      .option("sep",";")\
      .option("inferSchema",True)\
      .load("/export/data/pyspark_workspace/data/sql/people.csv")
 csv_data.printSchema()
 csv_data.show()
 print(type(csv_data))#<class 'pyspark.sql.dataframe.DataFrame'>
 # 读取Json数据
 json__load =
spark.read.format("json").load("/export/data/pyspark_workspace/data/sql/peop
le.json")
 json__load.printSchema()
 json__load.show()
 # 读取Parquet数据
 parquet__load =
spark.read.format("parquet").load("/export/data/pyspark_workspace/data/sql/u
sers.parquet")
 parquet__load.printSchema()
 parquet__load.show()
```

- 结束
- 完成RDD到DataFrame的转换?
- 1-Row(name=p[0],age=p[1])+spark.createDataFrame
- 2-Row(name=p[0],age=p[1])+toDF()
- 3-StrcutType和StructFiled,需要结合spark.createDataFrame
- 4-直接toDF(["name","age"])
- 5-使用外部数据读取json, csv, parquet
- 读取csv的时候,使用option参数,帮助提供分隔符,header,inferschema(是否会根据字段类型自动映射类型)
- 了解10 min to Pandas
- https://pandas.pydata.org/pandas-docs/version/1.3.2/user_guide/10min.html#grouping

```
# -*- coding: utf-8 -*-
# Program function: 回顾Pandas
import pandas as pd
import numpy as np
print("=============="")
d = \{ 'a': 1, 'b': 2, 'c': 3 \}
ser = pd.Series(data=d, index=['a', 'b', 'c'])
ser1 = pd.Series(data=d)
print(ser)
print(ser1)
print("shape:", ser1.shape)
print("value:", ser1.values) # [1 2 3]
print("type:", type(ser1.values)) # <class 'numpy.ndarray'>
print("======df======"")
d = {'col1': [1, 2], 'col2': [3, 4]}
df1 = pd.DataFrame(d)
print(df1)
```

```
# col1 col2
# 0 1 3
# 1
     2
print(df1.shape)
print(df1.ndim)
print(df1.size)
print(df1.values) # ndarray
to_numpy = dfl.to_numpy()
print(to_numpy)
print(df1.sort_values(by="col2", ascending=False))
df1 = pd.DataFrame(d)
print(df1)
print(df1.loc[:, "col1"])
print(df1.loc[:, ["col1", "col2"]])
print(df1.iloc[:, 0])
print(df1.iloc[:, 0:1])
# print(df1.ix[0,0])
df1["col3"] = df1["col2"] * 2
print(df1)
# col1 col2 col3
# 0 1 3 6
# 1
     2
          4
df1["col4"] = [np.nan, 1]
print(df1)
print(df1.dropna(axis="columns"))
df3 = df1.fillna(5)
print(df3)
print(df3.apply(lambda x: x.max() - x.min()))
df4 = pd.DataFrame(
   {
      "A": ["foo", "bar", "foo", "bar", "foo", "bar", "foo", "foo"],
      "B": ["one", "one", "two", "three", "two", "two", "one",
"three"],
      "C": np.random.randn(8),
      "D": np.random.randn(8),
print(df4.groupby("A").sum())
# C D
# A
# bar 0.594927 2.812386
# foo -1.085532 -1.889890
# df.groupby('A').agg({'B': ['min', 'max'], 'C': 'sum'})
```

- 完毕
- Pandas转化为Spark的DataFrame

```
# -*- coding: utf-8 -*-
# Program function: 回顾Pandas
import pandas as pd
import numpy as np
import pandas as pd
from pyspark.sql import SparkSession
from datetime import datetime, date
if __name__ == '__main__':
  spark =
SparkSession.builder.appName("readData").master("local[*]").getOrCreate
()
  sc = spark.sparkContext
  sc.setLogLevel("WARN")
  df_csv =
pd.read_csv("/export/data/pyspark_workspace/data/sql/people.csv",sep=";
",header='infer')
  #schema
  print(df_csv.info())
   # # Column Non-Null Count Dtype
   # --- -----
  # 0 name 2 non-null object
# 1 age 2 non-null int64
# 2 job 2 non-null object
  # dtypes: int64(1), object(2)
  # memory usage: 176.0+ bytes
  #前两行
   print(df_csv.head(2))
  # name age job
  # 0 Jorge 30 Developer
   # 1 Bob 32 Developer
  df_csv = spark.createDataFrame(df_csv)
  df_csv.printSchema()
```

• 案例2:

```
# -*- coding: utf-8 -*-
# Program function: pandas转化为DF
import pandas as pd
from pyspark.sql import SparkSession
from datetime import datetime, date
if __name__ == '__main__':
 spark =
SparkSession.builder.appName("readData").master("local[*]").getOrCreate()
 sc = spark.sparkContext
 sc.setLogLevel("WARN")
pandas_df = pd.DataFrame({
     'a': [1, 2, 3],
      'b': [2., 3., 4.],
      'c': ['string1', 'string2', 'string3'],
      'd': [date(2000, 1, 1), date(2000, 2, 1), date(2000, 3, 1)],
      'e': [datetime(2000, 1, 1, 12, 0), datetime(2000, 1, 2, 12, 0),
datetime(2000, 1, 3, 12, 0)]
 })
 print(pandas_df)
       b
 # 0 1 2.0 string1 2000-01-01 2000-01-01 12:00:00
 # 1 2 3.0 string2 2000-02-01 2000-01-02 12:00:00
 # 2 3 4.0 string3 2000-03-01 2000-01-03 12:00:00
 print(pandas_df.shape) # (3, 5)
 # print(pandas_df.values)
 # from an :class:`RDD`, a list or a :class:`pandas.DataFrame`.
 df_pandas = spark.createDataFrame(pandas_df)
 df_pandas.printSchema()
 # root
 # | -- a: long(nullable=true)
 # | -- b: double(nullable=true)
 # | -- c: string(nullable=true)
 # | -- d: date(nullable=true)
 # | -- e: timestamp(nullable=true)
 df_pandas.show()
```

• 完毕

[操作]DataFrame常用操作

```
DSL风格
```

df.select().filter()

SQL风格

spark.sql().show()

花式查询

```
# -*- coding: utf-8 -*-
# Program function: DSL & SQL
from pyspark.sql import SparkSession
if __name__ == '__main__':
 # 1-准备环境变量
 spark =
SparkSession.builder.appName("readData").master("local[*]").getOrCreate()
  sc = spark.sparkContext
 sc.setLogLevel("WARN")
 # 2-读取数据
 dataDF = spark.read.format("csv") \
      .option("header", "true") \
      .option("inferSchema", True) \
      .option("sep", ";") \
      .load("/export/data/pyspark_workspace/data/sql/people.csv")
  # 3-查看数据
 dataDF.show(2, truncate=False)
 dataDF.printSchema()
  # 4-执行DSL的操作
  from pyspark.sql.functions import col, column
  # 查看name字段的数据
 dataDF.select("name").show()
 dataDF.select(col("name")).show()
  # dataDF.select(column("name")).show()
 dataDF.select(dataDF.name).show()
 dataDF.select(dataDF["name"]).show()
  # 查看name,age字段的数据
 dataDF.select(["name", "age"]).show()
 dataDF.select(col("name"), col("age")).show()
 dataDF.select(dataDF["name"], col("age")).show()
  dataDF.select(dataDF.name, col("age")).show()
  # 过滤personDF的年龄大于21岁的信息
 dataDF.filter("age >30").show()
 dataDF.filter(dataDF["age"] > 30).show()
 dataDF.filter(col("age") > 30).show()
 # groupBy统计
  dataDF.groupby("age").count().orderBy("count").withColumnRenamed("count",
"countBig").show()
  from pyspark.sql import functions as F
 dataDF.groupby("age").agg(F.count(dataDF.age)).show()
  dataDF.groupby("age").agg({"age": "count"}).show()
 # SQL
 dataDF.createOrReplaceTempView("t_table")
  spark.sql("select name from t_table").show()
  spark.sql("select name,age from t_table").printSchema()
  spark.sql("select Name,age from t_table").printSchema()
  # root
  # | -- Name: string(nullable=true)
  # | -- age: integer(nullable=true)
  spark.sql("select name ,age from t_table where age>30").show()
  spark.sql("select name ,age from t_table order by age limit 2").show()
```

spark.stop()

- DSL:
- 这里因为DataFrame没有泛型信息,比如这里的wordcount的每个行,并不知道是String类型
- 无法使用map(x.split(","))
- 借助F.explode(F.split("Value",","))

```
# -*- coding: utf-8 -*-
# Program function: DSL wordcount
from pyspark.sql import SparkSession
 if __name__ == '__main__':
     # 1-准备环境变量
     spark =
SparkSession.builder.appName("readData").master("local[*]").getOrCreate
     sc = spark.sparkContext
     sc.setLogLevel("WARN")
     # 2-读取数据
     dataDF =
spark.read.text("/export/data/pyspark_workspace/data/words.txt")
     # 3-查看数据
     dataDF.printSchema()
     # root
     # | -- value: string(nullable=true)
     # 4-wordcount
     from pyspark.sql import functions as F
    # 这里使用explode爆炸函数将文本数据扁平化处理
     # withColumn,如果有相同列调换掉,否则增加列
    dataExplodeDF = dataDF.withColumn("words",
F.explode(F.split(F.col("value"), " ")))
    dataExplodeDF.groupby("words").count().orderBy("count",
ascending=False).show()
 # +----+
 # | words | count |
 # +----+
 # | hello | 3 |
 # | Spark | 2 |
 # | me | 1 |
 # | Flink | 1 |
 # | you | 1 |
 # | she | 1 |
 # +----+
```

• SQL操作

```
# -*- coding: utf-8 -*-
# Program function: DSL wordcount
from pyspark.sql import SparkSession

if __name__ == '__main__':
```

```
# 1-准备环境变量
     spark =
SparkSession.builder.appName("readData").master("local[*]").getOrCreate()
     sc = spark.sparkContext
     sc.setLogLevel("WARN")
     # 2-读取数据
     dataDF =
spark.read.text("/export/data/pyspark_workspace/data/words.txt")
     # 3-查看数据
     dataDF.printSchema()
     # root
     # | -- value: string(nullable=true)
     # 4-wordcount
     dataDF.createOrReplaceTempView("t_table")
     spark.sql("select split(value,' ') from t_table").show()
     spark.sql("select explode(split(value,' ')) as words from
t_table").show()
     spark.sql("""
         select words,count(1) as count from
         (select explode(split(value,' ')) as words from t_table) w
         group by words
         order by count desc
     """).show()
     # +----+
     # | words | count |
     # +----+
     # | hello | 3 |
     # | Spark | 2 |
     # | you | 1 |
     # | me | 1 |
     # | Flink | 1 |
     # | she | 1 |
     # +----+
```

• 完毕

总结

- Spark Shuffle
- Spark的内存模型
- SparkSQL引入
- SparkSQL数据结构
- SparkSQL的RDD转化为DataFrame的方式-----需要了解, 重点掌握1种
- SparkSQL的花式查询
- SparkSQL的wordcount案例实战

作业:

- 1-练习2个代码: wordcount代码, sparksql花式查询(至少能看懂所有结构, 自己掌握一种)
- 2-原理: Spark的基础结构需要做思维导图的实现