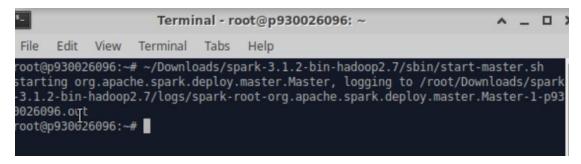
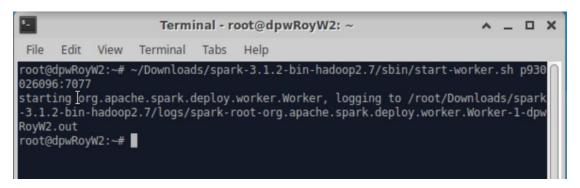
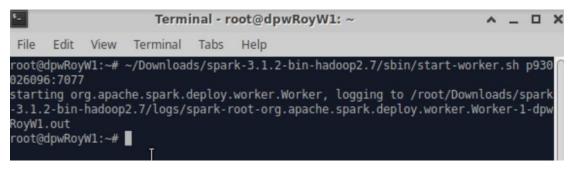
Basic



Start the master



Start the first worker



Start the second worker

```
root@p930026096:~# conda install pyspark
Solving environment: done

==> WARNING: A newer version of conda exists. <==
    current version: 4.5.4
    latest version: 4.10.3

Please update conda by running

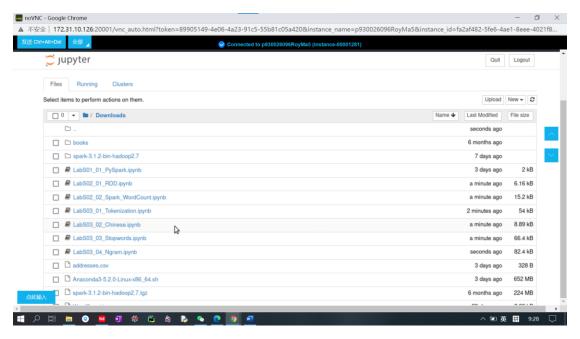
$ conda update -n base conda

## Package Plan ##

environment location: /root/anaconda3
```

Install pyspark in anaconda

Install jieba in anaconda



Open the localhost jupyter notebook

Run the LabS03_1_Tokenization file

```
Jupyter LabS03_01_Tokenization Checkpoint: 6 minutes ago (unsaved changes)
```

Create df

Create spark dataframe

Tokenize

Tokenize the words in sentences

Process the tokens with regex

```
In [7]: regex_tokenized = regex_tokenizer.transform(sen_df)
          regex tokenized.show(truncate=False)
          regex tokenized.withColumn('tokens', count tokens(col('words'))).show(truncate=False)
          |id |sentence
                                                              Iwords
                                                             |[hi, i, heard, about, thomas]
               Hi I heard about Thomas
          10
               Data Science in UIC is YYDS, period [data, science, in, uic, is, yyds, period] 
| Logistic, regression, model, are, neat | [logistic, regression, model, are, neat]
          12
          lid |sentence
                                                             lwords
                                                                                                                    Itokensl
               |Hi I heard about Thomas | [hi, i, heard, about, thomas] |5
|Data Science in UIC is YYDS, period|[data, science, in, uic, is, yyds, period]|7
          10
               |Logistic, regression, model, are, neat | [logistic, regression, model, are, neat] | 5
```

Process the tokens with regex

Process text file input

```
In [9]: df text = spark.read.text("1.txt")
    df_text.printSchema()
    df_text.show(truncate=False)

| 0001 Lorem Ipsum is simply dummy text of the printing and typesetting industry. Lorem Ipsum has been the industry'
    s standard dummy text ever since the 1500s, when an unknown printer took a galley of type and scrambled it to make
    a type specimen book. It has survived not only five centuries, but also the leap into electronic typesetting, remai
    ning essentially unchanged. It was popularised in the 1960s with the release of Letraset sheets containing Lorem Ip
    sum passages, and more recently with desktop publishing software like Aldus PageMaker including versions of Lorem I
    psum.

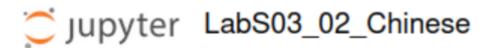
| 0002 Contrary to popular belief, Lorem Ipsum is not simply random text. It has roots in a piece of classical Latin
    literature from 45 BC, making it over 2000 years old. Richard McClintock, a Latin professor at Hampden-Sydney Colle
    ge in Virginia, looked up one of the more obscure Latin words, consectetur, from a Lorem Ipsum passage, and going t
    hrough the cites of the word in classical literature, discovered the undoubtable source. Lorem Ipsum comes from sec
    tions 1.10.32 and 1.10.33 of "de Finibus Bonorum et Malorum" (The Extremes of Good and Evil) by Cicero, written in
    45 BC. This book is a treatise on the theory of ethics, very popular during the Renaissance. The first line of Lore
    m Ipsum, "Lorem ipsum dolor sit amet..", comes from a line in section 1.10.32

| 0003 The standard chunk of Lorem Ipsum used since the 1500s is reproduced below for those interested. Sections 1.1
    0.32 and 1.10.33 from "de Finibus Bonorum et Malorum" by Cicero are also reproduced in their exact original form, a
    ccompanied by English versions from the 1914 translation by H. Rackham.
```

Read a text file

Tokenization for the text file

Run the Lab03_02_Chinese file



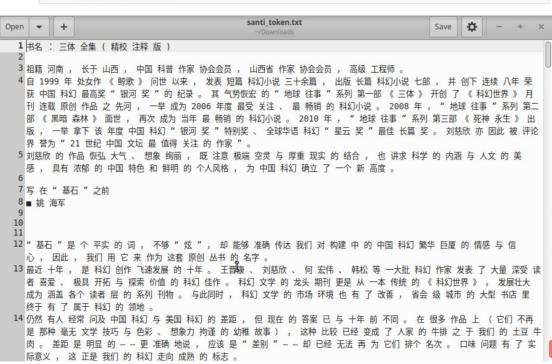
Jieba for Chinese text analysis

Define some Chinese strings as input

```
# string='宝,我今天输液了,输什么液 ? 想你的夜'
# string='宝,我今天去种地了,种的什么地?对你的死心塌地'
# string='宝,我今天去吃面了,吃的什么面? 突然想见你一面'
 # string='来到杨过曾经生活的地方,小龙女动情地说: 我也想过过过儿过过的生活
 # string=' 货拉拉拉不拉拉布拉多,取决于货拉拉拉拉有拉多时拉布拉多拉不拉耙耙
# string=' 校长说: 校服上除了校徽别别别的,让你们别别别的别别别的你非别别的
 # string='明明明明的自白白喜欢他,可她就是不说'
 # string=' 人要是行,干一行行一行,一行行行行行,行行行干哪行都行。要是不行,干一行不行一行,一行不行行行不行,行行不行干哪行都不行'
 #Precise mode
 text_cut=jieba.cut(string)
 print(" ".join(text cut))
 text_cut=jieba.cut(string,cut_all=True)
print(" ".join(text_cut))
 #Search mode
 text_cut=jieba.cut_for_search(string)
 print(" ".join(text cut))
 Building prefix dict from the default dictionary ...
Dumping model to file cache /tmp/jieba.cache
Loading model cost 0.828 seconds.
Prefix dict has been built successfully.
EDG 夺冠 , 爷青回
EDG 夺冠 , 爷 青 回
EDG 夺冠 , 爷青回
```

Tokenization of Chinese

You can also provide a text file for Jieba Tokenization



Tokenization for Chinese text file

Remove the stopwords for Chinese

Go through the stopwords dictionary word by word, and remove them

```
In [3]: string='总的来说,人说话的时候废话非常多。与此同时,废话多了有害身体健康,换句话说,不如别说废话!'

text_cut = jieba.cut(string)
print(" ".join(text_cut))

def stopwordslist(filepath):
    stopwords = [line.strip() for line in open(filepath, 'r', encoding='utf-8').readlines()]
    return stopwords

def seg_sentence(sentence):
    sentence_seged = jieba.cut(sentence.strip())
    stopwords = stopwordslist('baidu_stopwords.txt')
    outstr = ''
    for word in sentence_seged:
        if word not in stopwords:
            if word != '\t':
                outstr += word
                 outstr += "
                 return outstr

line_seg = seg_sentence(string)
```

```
print(line_seg)

总的来说 , 人 说话 的 时候 废话 非常 多 。 与此同时 , 废话 多 了 有害 身体健康 , 换句话说 , 不如 别说 废话 ! , 说话 废话 。 , 废话 有害 身体健康 , , 废话 !
```

Remove stop words in Chinese text according to baidu_stopwords.txt

You can also use the built-in function to remove the stopwords

```
In [4]: text cut=jieba.cut(string) print(" ".join(text_cut)) import jieba.analyse jieba.analyse.set_stop_words('baidu_stopwords.txt') text_cut = jieba.analyse.extract_tags(string, 20) print(" ".join(text_cut)) 总的来说 , 人 说话 的 时候 废话 非常 多 。 与此同时 , 废话 多 了 有害 身体健康 , 换句话说 , 不如 别说 废话 ! 废话 身体健康 有害 说话
```

Use a built-in function to remove the stop words rather than using baidu_stopwords.txt

You can also provide a text file for stopwords removal, go through the stopwords dictionary word by word, and remove them

```
In [5]: processedFile = 'santi_removesw.txt'
inputs = open(textFile, 'r', encoding='utf-8')
outputs = open(processedFile, 'w')
for line in inputs:
    line_seg = seg_sentence(line)
    outputs.write(line_seg + '\n')
```

Provide a self-built stop words text file, and remove stop words in the file



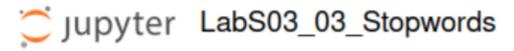
The result of a Chinese text file, removing stop words

Provide a text file for stopwords removal, and use the built-in function to remove the stopwords

```
In [6]: with open(textFile, 'r', encoding = 'utf-8') as file:
    text = file.readlines()
    keywords = jieba.analyse.extract_tags(str(text), topK = 200)
    print(keywords)

['程心', '罗輔', '三体', '太空', '汪淼', '宇宙', '地球', '智子', '飞船', '中文洁', '世界', '人类', '太阳', '舰队', '面壁', 'AA
', '文明', '太阳系', '纪元', '光速', 'u3000', '大史', '关一帆', '水滴', '史强', '二维', '北海', '迪亚兹', '感觉', '行星', '恒星', '时间', '信息', '冬眠', '东西', '天明', '两个', '很快', '维德', '看着', '计划', '成摄', '真的', '黑暗', '发现, '这是', '消失', '空间', '丁仪', '星环', 一一种', '目光', '太空城', '红岸', '恩斯', '战舰', '地说', '技术', '技术', '又身', '只能', '木星', '世纪', '蓝色', '方向', '穿梭机', '引力', '研索', '报天', '公主', '万有引力', '仿佛', '技术', '技术', '发射', '凡能', '木星', '地记', '嫉乖', '星星', '时代', '状态', '三个', '想象', '生活', '舰长', 秦勒', '肯定', '地面', '速度', '距离', "看上去', '思想', '森林', 处于', '点点头', '目标', '工作', '生命', '立刻', '感到', '观测', '掩体', '加速', '外面', '毁灭', '眼睛', '显老', '三维', '一颗', '保思', '明如', '城子', '还结', '国师', '张子', '基地', '无空', '表面', '身保', '面你', '动后', '动后', '现香', '强格', '面你', '地方', '小时', '探测器', '曹彬', '到达', '移民', '有人', '平面', '天线', '永远', '也许', '生存', '外星', '看望', '自然选择', '延绪', '画师', '星亮', '再, '一只', '常伟思', '一名', '强精', '画面', '默斯', '黑洞', '大部', '光神', '坎特', '杨卫', '东方', '形状', '告诉', '士存', '外星', '两", '别', "容相', '海师', '梁淳', '鬼新', '海神', '大昭', '动精', '动神', '双特', '场中', '东方', '形状', '告诉', '士舜', '内郎', '内郎', '防師', '不到', '李幕', '确实', '平面', '天结', '启动', '一点', '我神', '人神', '人神', '人神', '人神', '人神', '从节', '独特', '太宇', '在诉', '上神', '生存', '外星', '为星', '为理', '为理
```

Remove stop words according to your own stop words file.



Create PySpark environment and import library

Create pyspark environment and import library

Stopwords removal

Remove stop words in English sentences by built-in function

Process text file input

First tokenize, then remove stop words

```
In [3]: df_text = spark.read.text("1.txt")

df_text.show(truncate=False)

tokenizer = Tokenizer(inputCol = 'value', outputCol = 'words')
tokenized = tokenizer.transform(df_text)

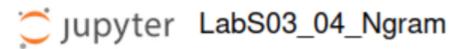
remover = StopWordsRemover(inputCol = 'words', outputCol = 'filtered')
remover.transform(tokenized).show(truncate=False)

|0001 Lorem Ipsum is simply dummy text of the printing and typesetting industry. Lorem Ipsum has been the industry'
s standard dummy text ever since the 1500s, when an unknown printer took a galley of type and scrambled it to make
a type specimen book. It has survived not only five centuries, but also the leap into electronic typesetting, remai
ning essentially unchanged. It was popularised in the 1960s with the release of Letraset sheets containing Lorem Ip
sum passages, and more recently with desktop publishing software like Aldus PageMaker including versions of Lorem I
psum.

| 0002 Contrary to popular belief, Lorem Ipsum is not simply random text. It has roots in a piece of classical Latin
literature from 45 BC, making it over 2000 years old. Richard McClintock, a Latin professor at Hampden-Sydney Colle
ge in Virginia, looked up one of the more obscure Latin words, consectetur, from a Lorem Ipsum passage, and going t
hrough the cites of the word in classical literature, discovered the undoubtable source. Lorem Ipsum comes from sec
tions 1.10.32 and 1.10.33 of "de Finibus Bonorum et Malorum" (The Extremes of Good and Evil) by Cicero, written in
```

Process text file. First tokenization and then remove stop words

Run LabS03_04_Ngram



Create PySpark environment and import library

```
In [1]:
from pyspark.sql import SparkSession

spark = SparkSession.builder.appName('MyNgram').getOrCreate()

from pyspark.ml.feature import Tokenizer, RegexTokenizer
from pyspark.sql.functions import col, udf
from pyspark.sql.types import IntegerType
from pyspark.ml.feature import NGram
```

Create pyspark environment and import library

3-gram from words df

```
In [2]: wordDataFrame = spark.createDataFrame([
              (0, ['Hi', 'I', 'heard', 'about', 'Spark']),
  (1, ['I', 'wish', 'python', 'could', 'use', 'case', 'classes']),
  (2, ['Logistic', 'regression', 'models', 'are', 'neat'])
], ['id', 'words'])
              wordDataFrame.show(truncate=False)
              ngram = NGram(inputCol = 'words', outputCol = 'grams', n = 3)
              ngram.transform(wordDataFrame).show(truncate=False)
              ngram.transform(wordDataFrame).select('grams').show(truncate=False)
              |id |words
              [0 | [Hi, I, heard, about, Spark]
              | I | [I, wish, python, could, use, case, classes] |
              |2 |[Logistic, regression, models, are, neat] |
|id |words
 |0 |[Hi, I, heard, about, Spark]
                                               |[Hi I heard, I heard about, heard about Spark]
 1 |[I, wish, python, could, use, case, classes]|[I wish python, wish python could, python could use, could use cas
e, use case classes]|
|2 |[Logistic, regression, models, are, neat] |[Logistic regression models, regression models are, models are nea
 ||Hi I heard, I heard about, heard about Spark]
|[I wish python, wish python could, python could use, could use case, use case classes]
|[Logistic regression models, regression models are, models are neat]
```

Get 3-gram from words df

Process text file input

First tokenize, then 3-gram

```
In [3]: df text = spark.read.text("1.txt")
        df text.show()
        tokenizer = Tokenizer(inputCol = 'value', outputCol = 'words')
        tokenized = tokenizer.transform(df text)
        ngram = NGram(inputCol = 'words', outputCol = 'grams', n = 3)
        ngram.transform(tokenized).show(truncate=False)
        +-----
                       valuel
        |0001 Lorem Ipsum ...|
         0002 Contrary to ...
         0003 The standard...
         0004 It is a long...
         0005 There are ma...
         0006 Lorem ipsum ...
         0007 Mauris ut da...
         0008 Lorem Ipsum ...
         0009 Contrary to ...
         0010 The standard...
```

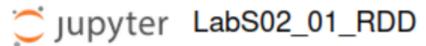
ngram = NGram(inputCol = 'words', outputCol = 'grams', n = 3)
ugram.transform(tokenized).show(truncate=False)

10001 Lorem Ipsum is simply dummy text of the printing and typesetting industry. Lorem Ipsum has been the industry's standard dummy text ever since the 1500s, when an unknown printer took a galley of type and scrambled it to make a type specimen book. It has survived not only five centuries, but also the leap into electronic typesetting, remaining essentially unchanged. It was popularised in the 1960s with the release of Letraset sheets containing Lorem Ipsum passages, and more recently with desktop publishing software like Aldus PageMaker including versions of Lorem I

psum. [1000], lorem, ipsum, is, simply, dummy, text, of, the, printing, and, typesetting, industry., lorem, ipsum, has, b een, the, industry's, standard, dummy, text, ever, since, the, 1500s, when, an, unknown, printer, took, a, galley, of, type, and, scrambled, it, to, make, a, type, specimen, book., it, has, survived, not, only, five, centuries, b ut, also, the, leap, into, electronic, typesetting, remaining, essentially, unchanged., it, was, popularised, in, the, 1960s, with, the, release, of, letraset, sheets, containing, lorem, ipsum, passages,, and, more, recently, with, desktop, publishing, software, like, aldus, pagemaker, including, versions, of, lorem, ipsum.] [1000] lorem ipsum, lorem ipsum is, ipsum is simply, is simply dummy, simply dummy text, dummy text of, text of the, of the printing, the printing and, printing and typesetting, and typesetting industry. typesetting industry lorem, industry. lorem ipsum, lorem ipsum has, ipsum has been, has been the, been the industry's, the industry's standard, industry's standard dummy, standard dummy text, dummy text ever, text ever since, ever since the, since the 1 500s. when 1500s. when an when an unknown an unknown printer. unknown printer took. printer took a.

Process text file. First tokenization and then get 3-gram

Run LabS02_01_RDD file



Simple RDD parallelize, sum of 1+2+3+4...+100

```
In [1]: from pyspark.sql import SparkSession
    spark = SparkSession.builder.master('local').getOrCreate()
    sc = spark.sparkContext
    rdd = sc.parallelize(range(100 + 1))
    rdd.sum()
Out[1]: 5050
```

Try RDD parallelize. Get the sum from 1 to 100

RDD can also parallelize array of words, and count words

```
In [2]: words = sc.parallelize (
    ["scala",
    "java",
    "hadoop",
    "spark",
    "akka",
    "spark vs hadoop",
    "pyspark",
    "pyspark",
    "pyspark and spark"]
)
counts = words.count()
print("Number of elements in RDD -> %i" % (counts))
Number of elements in RDD -> 8
```

RDD can also parallelize array of words, and count words

You can use collect operation to get elements from the RDD

```
In [3]: coll = words.collect() print("Elements in RDD -> %s" % (coll))

Elements in RDD -> { 'scala', 'java', 'hadoop', 'spark', 'akka', 'spark vs hadoop', 'pyspark', 'pyspark and spark']
```

Get elements from RDD by .collect() function

The "Map" operation of RDD

```
In [4]: words map = words.map(lambda x: (x, 1)) mapping = words_map.collect() print("Key value pair -> %s" % (mapping)

Key value pair -> [('scala', 1), ('java', 1), ('hadoop', 1), ('spark', 1), ('akka', 1), ('spark vs hadoop', 1), ('py spark', 1), ('pyspark and spark', 1)]
```

Map elements from RDD by .map() function

The "Reduce" operation of RDD

```
In [5]: from operator import add
  nums = sc.parallelize([1, 2, 3, 4, 5])
  adding = nums.reduce(add)
  print("Adding all the elements -> %i" % (adding))

Adding all the elements -> 15
```

Aggregate the elements of the dataset by .reduce() function

The "Join" operation of RDD, joining elements containing matching keys

```
In [6]: x = sc.parallelize([("spark", 1), ("hadoop", 4)])
y = sc.parallelize([("spark", 2), ("hadoop", 5)])
joined = x.join(y)
final = joined.collect()
print("Join RDD -> %s" % (final))
Join RDD -> [('hadoop', (4, 5)), ('spark', (1, 2))]
```

Join elements containing matching keys by .join function

Create DataFrame for Spark

Create dataframe for spark

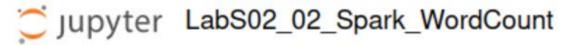
You can also submit the Spark job to the Cluster Master

```
In [9]: from pyspark.sql import SparkSession
    spark = SparkSession.builder.master('spark://p930026096:7077').appName('MyAccumulate').getOrCreate()
    sc = spark.sparkContext
    rdd = sc.parallelize(range(1000000000))
    rdd.sum()

Out[9]: 499999999950000000000
```

Use master and two workers to calculate a very large number

Run LabS02_02_Spark_WordCount file



Initialize PySpark

```
In [1]: from pyspark import SparkConf, SparkContext
sc = SparkContext.getOrCreate(SparkConf())
```

Initialize pyspark

Process CSV files as RDD

```
In [2]: lines = sc.textFile('Baby_Names_Beginning_2007.csv')
    print(lines.first())
    print(lines.take(5))

#length of first 5 elements
lines.map(lambda s: len(s)).take(5)

Year,First Name,County,Sex,Count
...
['Year,First Name,County,Sex,Count', '2013,GAVIN,ST LAWRENCE,M,9', '2013,LEVI,ST LAWRENCE,M,9', '2013,LOGAN,NEW YOR K,M,44', '2013,HUDSON,NEW YORK,M,49']
Out[2]: [32, 26, 25, 24, 25]
```

Run .csv file as RDD

```
In [3]: #returns total number of characters
  rdd = lines.map(lambda s: len(s))
  rdd = rdd.map(lambda s: 2*s)
  print(rdd.reduce(lambda a,b: a+b))
```

2424036

Apply map and reduce functions.

MapReduce on RDD

```
In [4]: rdd = sc.parallelize(['hello','world','hello','thomas'])
    rdd = rdd.map(lambda w: (w,1))
    rdd.collect()
    rdd.reduceByKey(lambda x, y: x + y).collect()

Out[4]: [('hello', 2), ('thomas', 1), ('world', 1)]
```

MapReduce on RDD

Text file can also be processed as RDD in Spark

```
In [5]: #The first line defines a base RDD from an external file.
#This dataset is not loaded in memory or otherwise acted on: lines is merely a pointer to the file.
lines = sc.textFile("l.txt")

#The second line defines lineLengths as the result of a map transformation.
#Again, lineLengths is not immediately computed, due to laziness.
lineLengths = lines.map(lambda s: len(s))

#Finally, we run reduce, which is an action.
#At this point Spark breaks the computation into tasks to run on separate machines, and each machine runs #both its part of the map and a local reduction, returning only its answer to the driver program.
totalLength = lineLengths.reduce(lambda a, b: a + b)

print(totalLength)
```

Process text file as RDD in spark

```
In [13]: #Read text file, you can also provide HDFS URI
         text file = sc.textFile('1.txt')
         #MapReduce operation from Spark
         counts = text file.flatMap(lambda line: line.split(' '))\
                              .map(lambda word: (word, 1))\
                      I
                              .reduceByKey(lambda a, b: a + b)\
                              .sortBy(lambda x: x[1], False)
         #Option 1: print output
         output = counts.collect()
         for (word, count) in output:
             print("%s: %i" % (word, count))
         #Option 2: save as text file
         #counts.saveAsTextFile("output.txt")
         ulctum: 1
         nulla: 1
         posuere .: 1
         cursus: 1
         bibendum: 1
         pellentesque: 1
         Pellentesque: 1
         malesuada: 1
         nunc: 1
         mollis: 1
```

Read a text file and count the word in the document

```
nulla: 1
posuere.: 1
cursus: 1
bibendum: 1
pellentesque: 1
pellentesque: 1
malesuada: 1
nunc: 1
mollis: 1
at.: 1
lacus.: 1
Maecenas: 1
ex: 1
condimentum: 1
suscipit:: 1
ut,: 1
lacinia: 1
varius: 1
elementum,: 1
```

Here is part of the word count result

You can also provide HDFS URI for batch processing

Assuming you have HDFS server @ ds-hdfs:9000

You can also run this command from CLI of your Spark Master node:

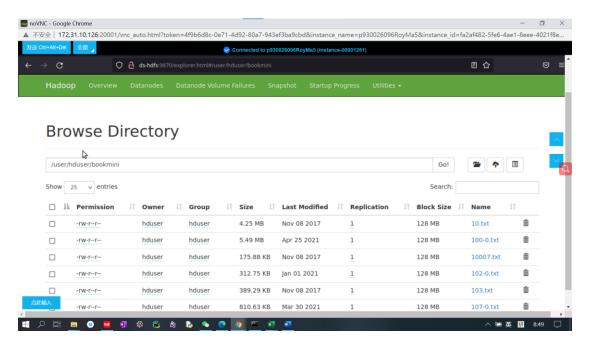
 $bin/spark-submit-master\ spark://dpw2tcxu:7077\ examples/src/main/python/wordcount.py\ "hdfs://ds-hdfs:9000/user/hduser/input/*.txt"$

```
In [6]: from pyspark.sql import SparkSession

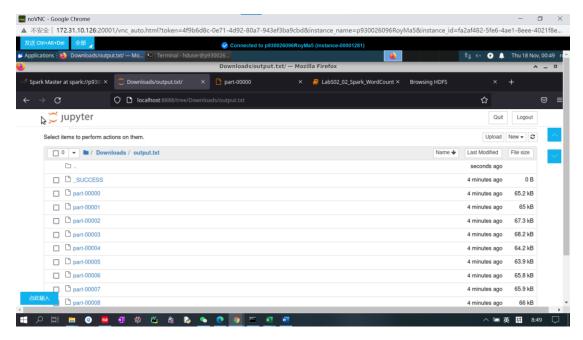
spark = SparkSession.builder.master('spark://p930026096:7077').appName('MyWordCount').getOrCreate()
    sc = spark.sparkContext

    text_file = sc.textFile('hdfs://ds-hdfs:9000/user/hduser/bookmini/*.txt')
    counts = text_file.flatMap(lambda line: line.split(" ")).map(lambda word: (word, 1)).reduceByKey(lambda a, b: a + b)
    counts.saveAsTextFile('outgut.txt')
```

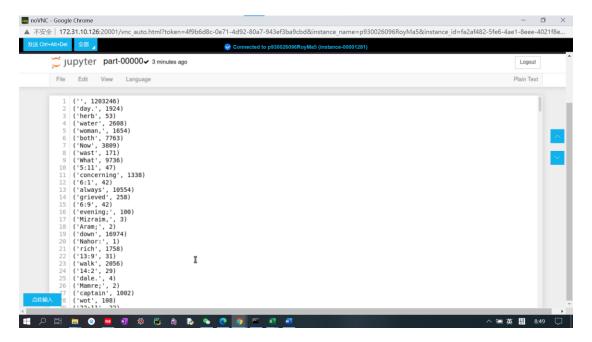
Indicating the HDFS URL. Attach files in HDFS as the input text files to apply word count to every file in bookmini directory



The books in bookmini directory



The output file. Each file contains corresponding word count result



We open the first result file as an example.