#### **BIG DATS PROGRAMING**

#### **ASSIGNMENT-2**

1 To implement the PageRank algorithm using map reduce in hadoop, given adjacency list and initial page rank values in two different text files. The primary step here is to read the two text files and split them, then following the map reduce process for page rank algorithm implementation. But this process contains of reading two text files lead to more number of mappers and its very computationally expensive. To overcome this in this assignment Distributed cache of hadoop is used so that one of the files is cached and the other is used as input in here. The Intial Page rank values file is cached and Adjacency list file is used as input file.

The overall design flow of map reduce for Page Rank is shown in below:

The Page rank algorithm is a iterative algorithm and In each iteration rank values are computes and updated with previous values until the change in values from present and previous iteration is around 10^-6, i.e. the values are very similar with minute error.

Based on the given graph the rank values are computed using the standard page rank formula. And the generalized version for computing ranks is shown below.

$$\mathbf{r} = c\mathbf{P} \top \mathbf{r} + (1 - c)/n$$

In each iteration we take the updated page rank value file and upload it into the cache and also the rank values are outputted into new file. This type of iteration is also called as power iteration

$$\mathbf{r}^t = c \cdot \mathbf{P}^\top \cdot \mathbf{r}^{t-1} + (1 - c)\mathbf{1}/n$$

 $r_i^t$ : PageRank value of node i at iteration t

$$r_1^t = c \cdot r_4^{t-1} \cdot p_{4,1} + (1-c)/5$$

$$r_2^t = c \cdot r_1^{t-1} \cdot p_{1,2} + (1-c)/5$$

$$r_3^t = c \cdot r_2^{t-1} \cdot p_{2,3} + c \cdot r_5^{t-1} \cdot p_{5,3} + (1-c)/5$$

$$r_4^t = c \cdot r_2^{t-1} \cdot p_{2,4} + c \cdot r_3^{t-1} \cdot p_{3,4} + (1-c)/5$$

$$r_5^t = c \cdot r_4^{t-1} \cdot p_{4,5} + (1-c)/5$$

**1.1** Design of Mapper, This takes the input adjacency list row and also the Page Rank values, But as mentioned above, The page rank values are stored in Distributed cache and not given as input file path like adjacency list.

Let's see how the Page rank rank values are used in Mapper from Distributed cache, The pagerank.txt file is stored in distributed cache, This file is used in mapper class in such a way the values of PageRank are stored in a Hash Map.

Distributed cache, The hdfs file system sends small text files to each datanodes while running map reduce job through distributed cache. And these files are deleted after the job is completed from data nodes. This usage will decrease the time taken by reading file each and every time from hdfs.

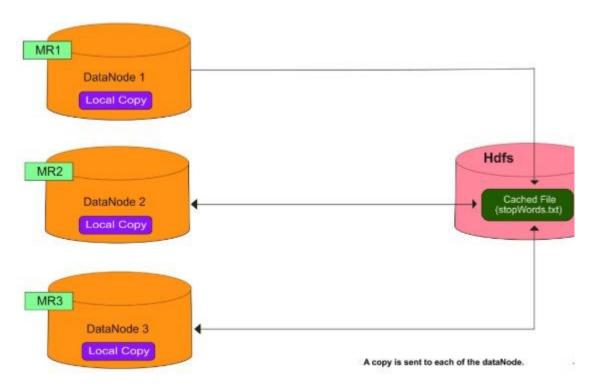


Fig: Showing the working of Distributed cache

Before Mapper design, the data from distributed cache is loaded and stored in a Hash Map, The Hashmap consists of key as nth node index and values as the rank of that node. This can be achieved by overriding the setup method, And this process follow as shown below.

As a initial step read the cached files into URI array and check whether there are any files, If there are any files create File system object and pass configuration object into it, File system is a abstract class of fairly generic file system, After this open the file using File system object and convert the byte stream into character with input stream reader and store it as buffer reader. As next step check this buffered for not empty and read line by line until its empty, Using string tokenize each line is tokenized and the first token is used as key i.e nth node index and the value as PageRank until all the buffer reader is empty. The output here is the Hash Map with key as nth node index and PageRank value of it.

The Hash table created above is used for fetching page rank values based on the adjacent list node index values. As shown below.

Hash Map:		Adjacency List:	
<u>Key</u>	<u>value</u>	1	j
1	0.2	1	[2]
2	0.2	2	[3, 4]
3	0.2	3	[4]
4	0.2	4	[1, 5]
5	0.2	5	[3]

As show above the Mapper would read each line of adjacency list file and in this line is in <Text value> and the key be object, From the Object the value is converted into string and string tokenize it. After this the first value of tokenizer is used as key to hash map for getting the page rank value (from above I is the key for hashmap). Once we got the key next all tokens are taken into loop and compute rank\*transition probability of the nodes and output it with <token, rank\*transition probability> the transition probability is calculates using len(tokens)-1

Output of mapper for line 2 of adjacency list is shown below

- <3, hashmap[2]\*1/len(tokenizers-1)>
- <4, hashmap[2]\*1/len(tokenizers-1)>

In above 3, 4 represents nodes and in a similar for all nodes its calculated.

### **1.2** Reducer:

After Shuffling and sorting the input for reducer is <node number, list of values>. For example

In the reducer For each of this input we compute the final using formula mentioned above and the output is written as <node number, rank>

And this process is continued until 30 iterations in the main/driver class of map reduce process.

**1.3** I haven't used a combiner in this process, as the data and graph is small it doesn't have that great effect on the network congestion. And if we use combiner in this problem it will be after mapper output and before shuffle and sorting so it does not have any effect. And also the combiner is nothing but the reducer and one can use same reducer as combiner in many cases but it fails if the reducer that is implemented here for a single mapper in this case doesn't act as combiner. May be one can write separate class for reducer that act as combiner and further more customized class for reducer. This Combiner system may not work for multiple mapper if the same reducer is used.

- **2.** The Experimentation results are shown below.
- 1 0.15555492363830498
- 2 0.16223821815273626
- 3 0.23119216214996707
- 4 0.29545977242068655
- 5 0.15555492363830498

# 2.1

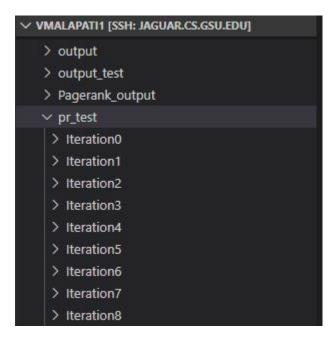


Fig: Showing output files created after 30 iterations

```
VMALAPATI1 [SSH: JAGUAR.CS.GSU.EDU]
                                              data > pr_test > Iteration29 > 

part-r-00000
   > iteration (7
                                                           0.15555492363830498
  > Iteration18
                                                      2
                                                           0.16223821815273626
  > Iteration19
                                                           0.23119216214996707
  > Iteration20
                                                      4
                                                           0.29545977242068655
                                                           0.15555492363830498
  > Iteration21
  > Iteration22
  > Iteration23
  > Iteration24
  > Iteration25
  > Iteration26
  > Iteration27
  > Iteration28
  Iteration29
   ■ SUCCESS
    ■ part-r-00000
```

Fig: showing result after 30 iterations

The results are as shown above and these results are from the  $30^{th}$  iteration. The error in results from  $29^{th}$  iteration to  $30^{th}$  iteration is nearly  $10^{(-4)}$ . Since there is very minute change in results we stopped iterations at this point.

The results are as equal to the results that are given in the class.

```
VMALAPATI1 [SSH: JAGUAR.CS.GSU.EDU]
                                       workspacejava > HadoopExamples > src > main > java > HadoopExamples > 🧶 prtest.java > 😘 prtest > 😘 PowerIterationMapper > 🕻
                                                  public void map(Object key, Text value, Context context
   HadoopExamples
                                                                  ) throws IOException, InterruptedException {
   PageRank.java
    WordCount.java
 > test
                                                      StringTokenizer itr = new StringTokenizer(value.toString());
> target
                                                      // Degree of the node is finded by using the below line
.classpath
                                                      nThisNodeOutDegree = itr.countTokens() - 1;
                                                      // getting first element in a line as index for hash map
                                                      nThisNodeIndex = Integer.parseInt(itr.nextToken());
 {} HadoopExamples
∕ 😘 prtest
                                                      dThisNodePRValue = vPRValues.get(nThisNodeIndex);

∨ S PowerIterationMapper

   map(Object Text Context) : void
   setup(Context) : void
                                                      while (itr.hasMoreTokens()) {
src/main/java
                                                          nNeighborNodeIndex.set(Integer.parseInt(itr.nextToken()));
 Double resultValue = dThisNodePRValue * 1 / nThisNodeOutDegree;
  > A PageRankiava
                                                          dThisNodePassingValue.set(resultValue);
  > 👙 WordCount.java
                                                          context.write(nNeighborNodeIndex, dThisNodePassingValue);
     prtest.java
MAVEN PROJECTS
> m HadoopExamples
```

## Fig: Showing the mapper code

```
EXPLORES
                                                      prtest.java X 🖳 Java Overview
                                  VMALAPATI1 [SSH: JAGUAR.CS.GSU.EDU]
  main / java
   > hadoop
                                                            Context context
   WordCount.iava
  > test
 .classpath
                                                  Double sum = 0.0;
OUTLINE
                                                   Double decay = 0.85;
 {} HadoopExamples
v 😘 prtest
                                                   for (DoubleWritable val : values) {
PowerIterationMapper
                                                       sum += val.get();
   map(Object, Text, Context) : void
   Setup(Context) : void
JAVA DEPENDENCIES
                                                   sum = sum * decay + (1-decay) / a;

✓ 

main/iava

                                                   dNewPRValue.set(sum);
 context.write(key, dNewPRValue);
    PageRank.iava
  > 🔬 WordCount.java
                                         public static void main(String[] args) throws Exception []
MAVEN PROJECTS
> m HadoopExamples
                                             String sInputPathForOneIteration = args[0];
                                                                                                               1: bash
```

Fig: Showing reducer code

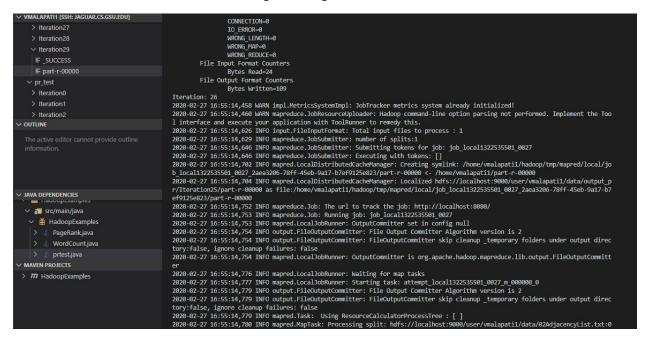


Fig: Showing the printed screen at 26th iteration during execution of the code

```
HDFS: Number of read operations=1727
HDFS: Number of large read operations=0
HDFS: Number of write operations=294
HDFS: Number of bytes read erasure-coded
Map-Reduce Framework
Map input records=5
Map output records=7
Map output bytes=84
Map output bytes=84
Input split bytes=127
Combine input records=0
Combine output records=0
Reduce input groups=5
Reduce shuffle bytes=104
Reduce input records=7
     VMALAPATI1 ISSH: JAGUAR.CS.GSU.EDUI
           > Iteration27
             > Iteration28
             ∨ Iteration29
          > Iteration0
          > Iteration2
 OUTLINE
                                                                                                                                                                                                                                                                                                                                                              Reduce input records=7
Reduce output records=5
                                                                                                                                                                                                                                                                                                                                                           Reduce Output records=18
Shuffled Maps =1
Failed Shuffles=0
Merged Map outputs=1
GC time elapsed (ms)=31
Total committed heap usage (bytes)=436953088
JAVA DEPENDENCIES
                                                                                                                                                                                                                                                                                                             Shuffle Errors
BAD_ID=0
CONNECTION=0
IO_ERROR=0

√ m src/main/java

           PageRank.java
                                                                                                                                                                                                                                                                                                                                                             WRONG_LENGTH=0
WRONG_MAP=0
                                                                                                                                                                                                                                                              WRONG_MAP=0

WRONG_REDUCE=0

File Input Format Counters

Bytes Read=24

File Output Format Counters

Bytes Written=110

vmalapati1@kvm_vmalapati1:-$ hdfs dfs -get /user/vmalapati1/data/output_pr/* /home/vmalapati1/data/pr_test/
2020-02-27 16:55:37,677 INFO sasl.SaslDataTransferClient: SASL encryption trust check: localHostTrusted = false, remoteHostTrusted = false, remo
> m HadoopExamples
                                                                                                                                                                                                                                                                 ted = false
```

Fig: showing the get usage for getting files in hdfs into local system