Hadoop ile Patent Verisi Islemek

75-99 yillari arasinda hangi patentin hangi hangi patentlere referans verdigi ve patentler hakkinda detayli verileri Hadoop ile isleyecegiz. Veriler alttaki baglantidan alinabilir, gerekli dosyalar Dosyalar cite75_99.txt ve apat63_99.txt. Bu dosyalari acip biz diyelim ki /data altina koyduk.

```
www.nber.org/patents/
```

Referans verisine bakarsak,

```
! head -10 /data/cite75_99.txt

"CITING", "CITED"

3858241,956203

3858241,1324234

3858241,33557384

3858241,3634889

3858242,1515701

3858242,3319261

3858242,3668705

3858242,3707004
```

Bu veri, hangi patentin hangi diger patenti kullandigini "tek" patent bazinda gostermekte. Detayli patent verisine bakalim

Simdi patent detay verisinden bir orneklem (sample) alalim. Daha ufak bir veri kumesiyle calismak ilk basta faydali olabilir, gelistirme test etme surecini hizlandirir.

```
! chmod a+r /data/apat63_99.txt
! head -1 /data/apat63_99.txt > /data/apat63_99_sampled.txt
! cat /data/apat63_99.txt | perl -n -e 'print if (rand() < .05)' >> /data/apat63_99_s
```

Hadoop baslatalim

```
! ssh localhost -1 hduser /home/hduser/Downloads/hadoop*/bin/stop-all.sh ! ssh localhost -1 hduser /home/hduser/Downloads/hadoop*/bin/start-all.sh
```

```
no jobtracker to stop
localhost: no tasktracker to stop
no namenode to stop
localhost: no datanode to stop
localhost: no secondarynamenode to stop
starting namenode, logging to /home/hduser/Downloads/hadoop-1.0.4/libexec/../logs/hado
localhost: starting datanode, logging to /home/hduser/Downloads/hadoop-1.0.4/libexec/
localhost: starting secondarynamenode, logging to /home/hduser/Downloads/hadoop-1.0.4
starting jobtracker, logging to /home/hduser/Downloads/hadoop-1.0.4/libexec/../logs/hadoop-1.0.4/libexec/../logs/hadoop-1.0.4/libexec/../logs/hadoop-1.0.4/libexec/../logs/hadoop-1.0.4/libexec/../logs/hadoop-1.0.4/libexec/../logs/hadoop-1.0.4/libexec/../logs/hadoop-1.0.4/libexec/../logs/hadoop-1.0.4/libexec/../logs/hadoop-1.0.4/libexec/../logs/hadoop-1.0.4/libexec/../logs/hadoop-1.0.4/libexec/../logs/hadoop-1.0.4/libexec/../logs/hadoop-1.0.4/libexec/../logs/hadoop-1.0.4/libexec/../logs/hadoop-1.0.4/libexec/../logs/hadoop-1.0.4/libexec/../logs/hadoop-1.0.4/libexec/../logs/hadoop-1.0.4/libexec/../logs/hadoop-1.0.4/libexec/../logs/hadoop-1.0.4/libexec/../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/hadoop-1.0.4/libexec/.../logs/ha
localhost: starting tasktracker, logging to /home/hduser/Downloads/hadoop-1.0.4/libex
/home/hduser/Downloads/hadoop*/bin/hadoop dfs -mkdir /user/hduser/patent
| ssh localhost -1 hduser /home/hduser/Downloads/hadoop*/bin/hadoop \
dfs -ls /user/hduser/patent
Found 2 items
-rw-r--r- 1 hduser supergroup ... /user/hduser/patent/apat63_99.txt
-rw-r--r- 1 hduser supergroup ... /user/hduser/patent/apat63_99_sampled.txt
| ssh localhost -1 hduser /home/hduser/Downloads/hadoop*/bin/hadoop \
dfs -copyFromLocal /data/apat63_99_sampled.txt \
/user/hduser/patent/apat63_99_sampled.txt
copyFromLocal: Target /user/hduser/patent/apat63_99_sampled.txt already exists
```

Amacimiz patent verisindeki ulke (country) kodunu kullanarak her ulke basina ortalama ne kadar patent uretildigini hesaplamak. Esleme-Indirgeme (Map-Reduce) dongusunde esleme kismini yapacak program asagida.

```
#!/usr/bin/python
import os,sys
os.environ['MPLCONFIGDIR']='/tmp'
import pandas as pd
data = pd.read_csv(sys.stdin,sep=",",index_col=0,usecols=[0,4,8])
df = data[pd.notnull(data.ix[:,0]) \& pd.notnull(data.ix[:,1])].ix[:,0:2]
df.to_csv(sys.stdout,sep="\t",index=False,header=False)
```

Indirgeyici yazmadan once programimizi iki sekilde test edelim. Bu sekillerden birisi hic indirgeyici olmadan, ikincisi IdentityReducer denen kendisine gecilen veriyi oldugu gibi disari atan (ama yine de ortada bir indirgeyici oldugu icin sonradan bazi islemlerin yine de yapildigi) seklinde. Bu iki kullanim Hadoop kodlarinda hata bulma / temizleme icin faydali olabiliyor.

```
! cp mapper.py /tmp/
! chmod a+r /tmp/mapper.py
! chmod a+x /tmp/mapper.py
! ssh localhost -1 hduser /home/hduser/Downloads/hadoop*/bin/hadoop \
dfs -rmr /user/hduser/output
! ssh localhost -1 hduser /home/hduser/Downloads/hadoop*/bin/hadoop \
jar \$ HOME/Downloads/hadoop*/contrib/streaming/hadoop-*streaming*.jar\
-input patent/apat63_99_sampled.txt -output output \
-mapper /tmp/mapper.py -numReduceTasks 0
```

```
Deleted hdfs://localhost:54310/user/hduser/output
packageJobJar: [/app/hadoop/tmp/hadoop-unjar2555196345671652661/] [] /tmp/streamjob50
13/02/24 16:30:26 INFO util.NativeCodeLoader: Loaded the native-hadoop library
13/02/24 16:30:26 WARN snappy.LoadSnappy: Snappy native library not loaded
13/02/24 16:30:26 INFO mapred.FileInputFormat: Total input paths to process : 1
13/02/24 16:30:27 INFO streaming.StreamJob: getLocalDirs(): [/app/hadoop/tmp/mapred/localDirs()]
13/02/24 16:30:27 INFO streaming.StreamJob: Running job: job_201302241611_0012
13/02/24 16:30:27 INFO streaming. StreamJob: To kill this job, run:
13/02/24 16:30:27 INFO streaming.StreamJob: /home/hduser/Downloads/hadoop-1.0.4/libex
13/02/24 16:30:27 INFO streaming. StreamJob: Tracking URL: http://localhost:50030/jobde
13/02/24 16:30:28 INFO streaming.StreamJob: map 0% reduce 0%
13/02/24 16:30:43 INFO streaming.StreamJob: map 100% reduce 0%
13/02/24 16:30:49 INFO streaming.StreamJob: map 100% reduce 100%
13/02/24 16:30:49 INFO streaming.StreamJob: Job complete: job_201302241611_0012
13/02/24 16:30:49 INFO streaming.StreamJob: Output: output
! ssh localhost -1 hduser /home/hduser/Downloads/hadoop*/bin/hadoop dfs -copyToLocal
! head -20 /tmp/output/part-00000
AD 14.0
AE 15.4
AG 13.25
AI 10.0
AM 18.0
AN 9.625
AR 9.188990825688073
AT 10.683988393563704
AU 12.291563832174107
AW 15.5
AZ 11.0
BB 11.0
BE 11.945544554455445
BG 4.9899497487437188
BH 6.5
BM 10.076923076923077
BN 9.0
BO 11.75
BR 9.358426966292134
BS 15.778846153846153
```

Ustteki sonucta goruyoruz ki anahtarlar uretilmis, ama ciktilar anahtara gore siralanmamislar. Hatta ustteki sira girdi sirasiyla tipatip ayni. Simdi IdentityReducer uzerinden.

```
! ssh localhost -1 hduser /home/hduser/Downloads/hadoop*/bin/hadoop \
dfs -rmr /user/hduser/output
! ssh localhost -1 hduser /home/hduser/Downloads/hadoop*/bin/hadoop \
jar /home/hduser/Downloads/hadoop*/contrib/streaming/hadoop-*streaming*.jar \
-input patent/apat63_99_sampled.txt -output output \
-mapper /tmp/mapper.py -reducer org.apache.hadoop.mapred.lib.IdentityReducer \
-numReduceTasks 1

Deleted hdfs://localhost:54310/user/hduser/output
packageJobJar: [/app/hadoop/tmp/hadoop-unjar2314287838929839696/] [] /tmp/streamjob52:13/02/24 18:03:14 INFO util.NativeCodeLoader: Loaded the native-hadoop library
```

```
13/02/24 18:03:14 WARN snappy.LoadSnappy: Snappy native library not loaded
13/02/24 18:03:14 INFO mapred. File Input Format: Total input paths to process: 1
13/02/24 18:03:14 INFO streaming.StreamJob: getLocalDirs(): [/app/hadoop/tmp/mapred/localDirs(): [/app/hadoop/tmp/mapred/localDirs()]
13/02/24 18:03:14 INFO streaming.StreamJob: Running job: job_201302241759_0004
13/02/24 18:03:14 INFO streaming.StreamJob: To kill this job, run:
13/02/24 18:03:14 INFO streaming.StreamJob: /home/hduser/Downloads/hadoop-1.0.4/libexe
13/02/24 18:03:14 INFO streaming. StreamJob: Tracking URL: http://localhost:50030/jobde
13/02/24 18:03:15 INFO streaming.StreamJob: map 0% reduce 0%
13/02/24 18:03:28 INFO streaming.StreamJob: map 50% reduce 0%
13/02/24 18:03:31 INFO streaming.StreamJob: map 100% reduce 0% 13/02/24 18:03:40 INFO streaming.StreamJob: map 100% reduce 100% 13/02/24 18:03:46 INFO streaming.StreamJob: Job complete: job_201302241759_0004
13/02/24 18:03:46 INFO streaming.StreamJob: Output: output
! ssh localhost -1 hduser rm -rf /tmp/output
! ssh localhost -l hduser /home/hduser/Downloads/hadoop*/bin/hadoop \
dfs -copyToLocal output /tmp/
! head -10 /tmp/output/part-00000
FR 12.0
US 5.0
US 1.0
US 4.0
US 4.0
US 21.0
US 4.0
US 8.0
US 7.0
US 11.0
```

Ustteki sonucta anahtarlarin siralanmis oldugunu goruyoruz.

Simdi bir indirgeyici (reducer) ekleyelim. Bu indirgeyici ulke bazindaki veriler uzerinen ortalama alacak.

```
#!/usr/bin/python
import os, sys
os.environ['MPLCONFIGDIR']='/tmp'
import pandas as pd
data = pd.read_csv(sys.stdin, sep="\t", names=['country', 'count'])
grouped = data.groupby('country').mean()
grouped.to_csv(sys.stdout, sep="\t", header=False)
```

Eger indirgeyiciyi direk isletirsek (Hadoop disindan)

```
cat /tmp/output/part-00000 | ./reducer.py | tail -10
SE 9.0021739130434781
SG 14.0
SU 6.4136125654450264
SV 6.5
TR 8.0
TW 6.2037037037037033
US 10.964136780650541
```

```
VE 9.3333333333333333
YU 5.75
ZA 11.170212765957446
```

Bu kodu hduser'in bulabilecegi bir yere koyuyoruz.

```
! cp reducer.py /tmp/
! chmod a+r /tmp/reducer.py
! chmod a+x /tmp/reducer.py
! ssh localhost -1 hduser /home/hduser/Downloads/hadoop*/bin/hadoop \
dfs -rmr /user/hduser/output
! ssh localhost -1 hduser /home/hduser/Downloads/hadoop*/bin/hadoop \
jar \ $ HOME/Downloads/hadoop*/contrib/streaming/hadoop-*streaming*.jar\
-input patent/apat63_99_sampled.txt -output output \
 -mapper /tmp/mapper.py -reducer /tmp/reducer.py -numReduceTasks 1
Deleted hdfs://localhost:54310/user/hduser/output
packageJobJar: [/app/hadoop/tmp/hadoop-unjar3358838375062006941/] [] /tmp/streamjob363
13/02/24 20:33:10 INFO util.NativeCodeLoader: Loaded the native-hadoop library
13/02/24 20:33:10 WARN snappy.LoadSnappy: Snappy native library not loaded
13/02/24 20:33:10 INFO mapred.FileInputFormat: Total input paths to process : 1
13/02/24 20:33:10 INFO streaming.StreamJob: getLocalDirs(): [/app/hadoop/tmp/mapred/lo
13/02/24 20:33:10 INFO streaming.StreamJob: Running job: job_201302241759_0005
13/02/24 20:33:10 INFO streaming. StreamJob: To kill this job, run:
13/02/24 20:33:10 INFO streaming.StreamJob: /home/hduser/Downloads/hadoop-1.0.4/libex
13/02/24 20:33:10 INFO streaming.StreamJob: Tracking URL: http://localhost:50030/jobde
13/02/24 20:33:11 INFO streaming.StreamJob: map 0% reduce 0%
13/02/24 20:33:23 INFO streaming.StreamJob: map 50% reduce 0%
13/02/24 20:33:26 INFO streaming.StreamJob: map 100% reduce 0%
13/02/24 20:33:35 INFO streaming.StreamJob: map 100% reduce 100%
13/02/24 20:33:42 INFO streaming.StreamJob: Job complete: job_201302241759_0005
13/02/24 20:33:42 INFO streaming.StreamJob: Output: output
! ssh localhost -1 hduser rm -rf /tmp/output
! ssh localhost -1 hduser /home/hduser/Downloads/hadoop*/bin/hadoop \
dfs -copyToLocal output /tmp/
```

Ve sonuc altta oldugu gibi

```
! head -10 /tmp/output/part-00000
AE 12.0
AG 24.0
AN 15.0
AR 10.35999999999999
AT 11.077306733167083
AU 12.789029535864978
BE 11.442748091603054
BG 4.5
BM 8.0
BO 25.0
```

Tabii bu sonuclar bir orneklem uzerinden alindi. Tum veriyi islemek icin

```
| ssh localhost -1 hduser /home/hduser/Downloads/hadoop*/bin/hadoop dfs \
-copyFromLocal /data/apat63_99.txt /user/hduser/patent/apat63_99.txt
| ssh localhost -1 hduser /home/hduser/Downloads/hadoop*/bin/hadoop |
dfs -rmr /user/hduser/output
| ssh localhost -1 hduser /home/hduser/Downloads/hadoop*/bin/hadoop jar \
 /home/hduser/Downloads/hadoop*/contrib/streaming/hadoop-*streaming*.jar
-input patent/apat63_99.txt -output output -mapper /tmp/mapper.py \
-reducer /tmp/reducer.py -numReduceTasks 1
Deleted hdfs://localhost:54310/user/hduser/output
packageJobJar: [/app/hadoop/tmp/hadoop-unjar938213738183646678/] [] /tmp/streamjob743
13/02/24 23:50:12 INFO util.NativeCodeLoader: Loaded the native-hadoop library
13/02/24 23:50:12 WARN snappy.LoadSnappy: Snappy native library not loaded
13/02/24 23:50:12 INFO mapred.FileInputFormat: Total input paths to process : 1
13/02/24 23:50:12 INFO streaming.StreamJob: getLocalDirs(): [/app/hadoop/tmp/mapred/lo
13/02/24 23:50:12 INFO streaming.StreamJob: Running job: job_201302241759_0006
13/02/24 23:50:12 INFO streaming.StreamJob: To kill this job, run:
13/02/24 23:50:12 INFO streaming.StreamJob: /home/hduser/Downloads/hadoop-1.0.4/libex
13/02/24 23:50:12 INFO streaming.StreamJob: Tracking URL: http://localhost:50030/jobde
13/02/24 23:50:13 INFO streaming.StreamJob: map 0% reduce 0%
13/02/24 23:50:28 INFO streaming.StreamJob: map 50% reduce 0%
13/02/24 23:50:40 INFO streaming.StreamJob: map 75% reduce 8%
13/02/24 23:50:52 INFO streaming.StreamJob: map 100% reduce 8%
13/02/24 23:50:55 INFO streaming.StreamJob: map 100% reduce 25%
13/02/24 23:51:04 INFO streaming.StreamJob: map 100% reduce 100%
13/02/24 23:51:17 INFO streaming.StreamJob: Job complete: job_201302241759_0006
13/02/24 23:51:17 INFO streaming.StreamJob: Output: output
! ssh localhost -l hduser rm -rf /tmp/output
! ssh localhost -1 hduser /home/hduser/Downloads/hadoop*/bin/hadoop dfs \
-copyToLocal output /tmp/
! head -7 /tmp/output/part-00000
AD 14.0
AE 15.4
AG 13.25
AI 10.0
AM 18.0
AN 9.625
AR 9.188990825688073
```