# FINAL PROJECT

INFO7250- Engg Of Big Data

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# **CONTENTS**

# 1. Analysis of Flight Data using MAP REDUCE on Hadoop

#### 1- Getting total count of all the data:

This is a very basic map reduce use case in which we count the whole data to get a sense of how many total records are there:

```
hadoop jar ~/Downloads/ProjectJars/count.jar
hadoop.project.total_count.MRCount /flight-data /FinalProjectMROutput/2-
Total-Data-Count
```

The final count is: 123534970

#### 2- Getting the total flights from all source destinations pairs in from 1987 to 2008:

This was a huge data and MapReduce made this analysis quite simple and fast:

```
ankit@ankit-VirtualBox:/usr/local/bin/hadoop-2.8.5
ABE-ALB 2
ABE-ATL 16541
ABE-AVP 1627
ABE-AZO 1
ABE-BDL 1
ABE-BHM 1
ABE-BWI 2559
ABE-CLE 5860
ABE-CLT
        7261
ABE-CVG 6881
ABE-DCA 395
ABE-DTW 17738
ABE-FWA 2
ABE-GRR 1
ABE-HPN 99
ABE-IAD 2075
ABE-IND 1
ABE-JFK 10
ABE-LGA 216
ABE-MCO 1868
ABE-MDT 12871
ABE-ORD 24572
ABE-PHL 553
ABE-PIT 21753
ABE-RDU 86
ABE-ROC 1
ABE-SBN
ABI-CLL
ABI-DFW 20073
ABI-IAH 1632
ABI-LAX 1
ABI-SJT 2
ABI-TYR 1
ABI-VCT 1
ABQ-AMA 15302
ABQ-ATL 14419
ABQ-AUS 1176
ABQ-BNA 54
ABQ-BWI 3124
```

#### 3: Top 30 source destination pairs

Sorting the above data to get top 30 most busy Source Destination pair:

```
ankit@ankit-VirtualBox:/usr/local/bin/hadoop-2.8.5/bin$ hadoop fs -cat /FinalProjectMROutpu
SF0-LAX 338472
LAX-SF0 336938
LAX-LAS 292125
LAS-LAX 286328
PHX-LAX 279716
LAX-PHX 279116
ORD-MSP 249960
MSP-ORD 249250
PHX-LAS 240587
LAS-PHX 239183
LGA-ORD 235531
HOU-DAL 230971
ORD-LGA 229657
DAL-HOU 216595
EWR-ORD 210999
ORD-EWR 203736
ORD-DFW 193370
OAK-LAX 191189
LAX-0AK 190549
ORD-LAX 189952
LGA-BOS 189443
LAX-ORD 189419
ATL-DFW 188006
DFW-ORD 187949
BOS-LGA 186474
DFW-ATL 186330
ATL-ORD 182555
SAN-PHX 180832
DFW-IAH 180799
IAH-DFW 179036
ankit@ankit-VirtualBox:/usr/local/bin/hadoop-2.8.5/bin$
```

#### 4: Delay in flight percentage

We considered the delay greater than or equal to 15 minutes as delay. Now we need to count those flights which had delay greater than or equal to 15 minutes.

#### **Delayed flight Count:**

Percentage of departure delayed flights: Total Flight Count/ Departure Delayed Flight count

So, this shows that the actual delay greater that 15 minutes is very less and generally flights depart on time.

Let's check the same for arrival delay

Percentage of departure delayed flights: Total Flight Count/ Delayed Flight count

So, the delay in departure and arrival is between 15 to 20 % range.

So, it shows that overall flights are mostly on time from/to all source destination

## 5- Count of unique carrier's flights

The data for unique carriers are as follows:

```
ankit@ankit-VirtualBox:/usr/local/bin/
9E
        521059
AA
        14984647
AQ.
        154381
AS
        2878021
В6
        811341
CO
        8145788
DH
        693047
DL
        16547870
EA
        919785
ΕV
        1697172
F9
        336958
FL
        1265138
HA
        274265
HP
        3636682
ML (1)
        70622
MQ
        3954895
NW
        10292627
OH
        1464176
00
        3090853
PA (1)
        316167
PΙ
        873957
PS
        83617
TW
        3757747
ΤZ
        208420
UA
        13299817
US
        14075530
WN
        15976022
ΧE
        2350309
Y۷
        854056
ankit@ankit-VirtualBox:/usr/local/bin/
```

#### 6- Inner Join to get the full name for unique carriers

We did inner join with between two files to get carrier names instead of carrier codes

```
-VirtualBox:/usr/local/bin/hadoop-2.8.5/bin$ hadoop fs -cat /FinalProjectMROu<u>tput/7-Inner-Join-Carrie</u>r
Pinnacle Airlines Inc.
                            521059
American Airlines Inc.
                            14984647
Aloha Airlines Inc.
                            154381
Alaska Airlines Inc.
                            2878021
JetBlue Airways 811341
Continental Air Lines Inc.
                                      8145788
                            693047
Independence Air
Delta Air Lines Inc.
                            16547870
Eastern Air Lines Inc.
                            919785
Atlantic Southeast Airlines
Frontier Airlines Inc. 3369
                                      1697172
                           336958
AirTran Airways Corporation
                                      1265138
Hawaiian Airlines Inc. 274265
America West Airlines Inc. (Merged with US Airways 9/05. Stopped reporting 10/07.)
                                                                                                       3636682
Midway Airlines Inc. (1)
American Eagle Airlines Inc.
                                      70622
                                      3954895
Northwest Airlines Inc. 10292627
Comair Inc. 14641
Skywest Airlines Inc.
                  1464176
                            3090853
Pan American World Airways (1)
                                     316167
Piedmont Aviation Inc. 873957
Pacific Southwest Airlines
                                      83617
Trans World Airways LLC 3757747
ATA Airlines d/b/a ATA 208420
United Air Lines Inc. 13299817
US Airways Inc. (Merged with America West 9/05. Reporting for both starting 10/07.)
Southwest Airlines Co. 15976022
                                                                                                        14075530
Expressjet Airlines Inc.
                                      2350309
Mesa Airlines Inc.
                            854056
ankit@ankit-VirtualBox:/usr/local/bin/hadoop-2.8.5/bin$
```

# 7- Getting Flight data by year

```
ankit@ankit-VirtualBox:
1987
        1311826
1988
        5202096
1989
        5041200
1990
        5270893
1991
        5076925
1992
        5092157
1993
        5070501
1994
         5180048
1995
         5327435
1996
         5351983
         5411843
1997
1998
         5384721
1999
         5527884
2000
        5683047
2001
        5967780
2002
        5271359
2003
        6488540
2004
        7129270
2005
         7140596
2006
         7141922
2007
         7453215
2008
         7009728
```

#### 8- Delayed flights per year

In this we will check delayed flights per year (we will count flights as delayed only is the delay time if greater than equal to 15 minutes)

```
Bytes Written=279
ankit@ankit-VirtualBox:/usr/local/bi
1987
        312770
1988
        977853
1989
        1119466
        1019363
1990
1991
        833978
1992
        838347
1993
        861259
1994
        881408
1995
        1039250
1996
        1220045
        1083834
1997
1998
        1070071
1999
        1152725
2000
        1356040
        1104439
2001
2002
        868225
        1057804
2003
2004
        1421391
2005
        1466065
2006
        1615537
2007
        1803320
2008
        1524735
ankit@ankit-VirtualBox:/usr/local/bi
```

## 9- Cancelled flights by year

```
ankit@ankit-VirtualBox:/usr/local/bi
1987
        19685
1988
        50163
1989
        74165
        52458
1990
1991
        43505
1992
        52836
1993
        59845
1994
        66740
1995
        91905
1996
        128536
1997
        97763
1998
        144509
1999
        154311
        187490
2000
2001
        231198
2002
        65143
2003
        101469
2004
        127757
2005
        133730
2006
        121934
2007
        160748
        137434
2008
ankit@ankit-VirtualBox:/usr/local/bi
```

#### 10- Ratio of delayed flights per year to total flights

We can get percentage of delayed flights per year also

```
ankit@ankit-VirtualBox:/usr/local/bin/hadoop-2.8.5/bin$ hadoop fs -cat /FinalProjectMROutput
1987
        flightCount=1311826, delayedFlightCount=291947, delayPercent=22.26
1988
        flightCount=5202096, delayedFlightCount=910460, delayPercent=17.50
1989
        flightCount=5041200, delayedFlightCount=1050606, delayPercent=20.84
1990
        flightCount=5270893, delayedFlightCount=954609, delayPercent=18.11
1991
        flightCount=5076925, delayedFlightCount=777309, delayPercent=15.31
        flightCount=5092157, delayedFlightCount=779598, delayPercent=15.31
1992
1993
        flightCount=5070501, delayedFlightCount=805674, delayPercent=15.89
        flightCount=5180048, delayedFlightCount=825865, delayPercent=15.94
1994
1995
        flightCount=5327435, delayedFlightCount=982790, delayPercent=18.45
        flightCount=5351983, delayedFlightCount=1161396, delayPercent=21.70
1996
1997
        flightCount=5411843, delayedFlightCount=1030159, delayPercent=19.04
1998
        flightCount=5384721, delayedFlightCount=1020934, delayPercent=18.96
1999
        flightCount=5527884, delayedFlightCount=1101355, delayPercent=19.92
2000
        flightCount=5683047, delayedFlightCount=1301615, delayPercent=22.90
2001
        flightCount=5967780, delayedFlightCount=1053819, delayPercent=17.66
2002
        flightCount=5271359, delayedFlightCount=823147, delayPercent=15.62
2003
        flightCount=6488540, delayedFlightCount=1005631, delayPercent=15.50
2004
        flightCount=7129270, delayedFlightCount=1355988, delayPercent=19.02
        flightCount=7140596, delayedFlightCount=1399557, delayPercent=19.60
2005
2006
        flightCount=7141922, delayedFlightCount=1548755, delayPercent=21.69
2007
        flightCount=7453215, delayedFlightCount=1734629, delayPercent=23.27
2008
        flightCount=7009728, delayedFlightCount=1466191, delayPercent=20.92
ankit@ankit-VirtualBox:/usr/local/bin/hadoop-2.8.5/bin$
```

It shows that the years 1991-1994, 2002,2003 were best years to fly as they had least delayed flights (less than 16%).

Years with most delays were- 1987, 2000, 2007 with more than 22% flights delayed

#### 11- Total flights by day of week and ratio to delayed

Following is the data of total flights, delayed flights and their ratio.

```
ankit@ankit-VirtualBox:/usr/local/bin/hadoop-2.8.5/bin$ hadoop fs -cat /FinalProjectMROutput
Friday flightCount=18091338, delayedFlightCount=4004214, delayPercent=22.13
Monday flightCount=18136111, delayedFlightCount=3298072, delayPercent=18.19
Saturday flightCount=15915382, delayedFlightCount=2520933, delayPercent=15.84
Sunday flightCount=17143178, delayedFlightCount=3151506, delayPercent=18.38
Thursday flightCount=18083800, delayedFlightCount=3838270, delayPercent=21.22
Tuesday flightCount=18061938, delayedFlightCount=3153109, delayPercent=17.46
Wednesday flightCount=18103222, delayedFlightCount=3415930, delayPercent=18.87
ankit@ankit-VirtualBox:/usr/local/bin/hadoop-2.8.5/bin$
```

From this data we can infer that maximum delay is on Thursday and Fridays that is when weekends are starting .

Best day to fly are when the weekends ends like Saturday, Sunday or on weekdays

#### 12- Total flights by months of year and ratio to delayed

```
ankit@ankit-VirtualBox:/usr/local/bin/hadoop-2.8.5/bin$ hadoop fs -cat /FinalProjectMROutput/13-Dela
                flightCount=10272489, delayedFlightCount=2182706, delayPercent=21.25
1-January
10-October
                flightCount=10758658, delayedFlightCount=1726732, delayPercent=16.05
11-November
                flightCount=10218176, delayedFlightCount=1783797, delayPercent=17.46
12-December
                flightCount=10572256, delayedFlightCount=2547282, delayPercent=24.09
2-February
                flightCount=9431225, delayedFlightCount=1935450, delayPercent=20.52
3-March flightCount=10448039, delayedFlightCount=2042953, delayPercent=19.55
4-April flightCount=10081982, delayedFlightCount=1679654, delayPercent=16.66
5-May flightCount=10330467, delayedFlightCount=1723594, delayPercent=16.68
       flightCount=10226946, delayedFlightCount=2178142, delayPercent=21.30
6June
7-July flightCount=10571942, delayedFlightCount=2127609, delayPercent=20.13
8-August
                flightCount=10646835, delayedFlightCount=2055026, delayPercent=19.30
                flightCount=9975954, delayedFlightCount=1399089, delayPercent=14.02
9-September
ankit@ankit-VirtualBox:/usr/local/bin/hadoop-2.8.5/binS
```

We can infer from this data that best months to fly was September with least delay- 14 %

Other good months were- April, May and October with delay – 16%

Worst month was December- 24% flights delayed. It may be due to big holidays season in December.

#### 13- Total delayed flights by flight carriers and ratio of delayed flights

```
ankit@ankit-VirtualBox:/usr/local/bin/hadoop-2.8.5/bin$ hadoop fs -cat /FinalProjectMROutput/14.1-Delay_Ratio_Carriers_Name/part-r-00000
Pinnacle Airlines Inc. flightCount=521059, delayedFlightCount=94432, delayPercent=18.12
American Airlines Inc. flightCount=14984647, delayedFlightCount=2819508, delayPercent=18.82
Aloha Airlines Inc.
                       flightCount=154381, delayedFlightCount=13195, delayPercent=8.55
Alaska Airlines Inc.
                       flightCount=2878021, delayedFlightCount=593864, delayPercent=20.63
JetBlue Airways flightCount=811341, delayedFlightCount=191762, delayPercent=23.64
Continental Air Lines Inc.
                               flightCount=8145788, delayedFlightCount=1555471, delayPercent=19.10
                       flightCount=693047, delayedFlightCount=141765, delayPercent=20.46
Independence Air
Delta Air Lines Inc.
                       flightCount=16547870, delayedFlightCount=3215538, delayPercent=19.43
Eastern Air Lines Inc. flightCount=919785, delayedFlightCount=156324, delayPercent=17.00
                              flightCount=1697172, delayedFlightCount=418887, delayPercent=24.68
Atlantic Southeast Airlines
Frontier Airlines Inc. flightCount=336958, delayedFlightCount=62934, delayPercent=18.68
AirTran Airways Corporation flightCount=1265138, delayedFlightCount=281657, delayPercent=22.26
Hawaiian Airlines Inc. flightCount=274265, delayedFlightCount=16706, delayPercent=6.09
America West Airlines Inc. (Merged with US Airways 9/05. Stopped reporting 10/07.)
                                                                                      flightCount=3636682, delayedFlightCount=670214, delayPercent=18.43
Midway Airlines Inc. (1)
                               flightCount=70622, delayedFlightCount=9288, delayPercent=13.15
American Eagle Airlines Inc.
                               flightCount=3954895, delayedFlightCount=842571, delayPercent=21.30
Northwest Airlines Inc. flightCount=10292627, delayedFlightCount=1815983, delayPercent=17.64
              flightCount=1464176, delayedFlightCount=304364, delayPercent=20.79
Skywest Airlines Inc. flightCount=3090853, delayedFlightCount=517173, delayPercent=16.73
Pan American World Airways (1) flightCount=316167, delayedFlightCount=57436, delayPercent=18.17
Piedmont Aviation Inc. flightCount=873957, delayedFlightCount=201513, delayPercent=23.06
                               flightCount=83617, delayedFlightCount=17789, delayPercent=21.27
Pacific Southwest Airlines
Trans World Airways LLC flightCount=3757747, delayedFlightCount=709233, delayPercent=18.87
ATA Airlines d/b/a ATA flightCount=208420, delayedFlightCount=39135, delayPercent=18.78
United Air Lines Inc. flightCount=13299817, delayedFlightCount=2761933, delayPercent=20.77
US Airways Inc. (Merged with America West 9/05. Reporting for both starting 10/07.) flightCount=14075530, delayedFlightCount=2615152, delayPercent=18.58
Southwest Airlines Co. flightCount=15976022, delayedFlightCount=2565525, delayPercent=16.06
Expressjet Airlines Inc.
                               flightCount=2350309, delayedFlightCount=502089, delayPercent=21.36
Mesa Airlines Inc.
                       flightCount=854056, delayedFlightCount=190593, delayPercent=22.32
ankit@ankit-VirtualBox:/usr/local/bin/hadoop-2.8.5/bin$
```

By using this analysis we can check which carriers are more prone to delays and can plan flights with those carriers who are less prone to delays.

Carriers with least delays- Hawaiian Airlines, Aloha Airlines with 6% and 8% flights delayed respectively.

Carriers with most delays- JetBlue Airways, Atlantic Southeast Airlines with around 24% flights delayed.

#### 14- Total cancelled flights by flight carriers and ratio of cancelled flights

```
ankit@ankit-VirtualBox:/usr/local/bin/hadoop-2.8.5/bin$ hadoop fs -cat /FinalProjectMROutput/15-Cancelle
          flightCount=521059, delayedFlightCount=15039, delayPercent=2.89
          flightCount=14984647, delayedFlightCount=286889, delayPercent=1.91
AQ
AS
          flightCount=154381, delayedFlightCount=2837, delayPercent=1.84
          flightCount=2878021, delayedFlightCount=57121, delayPercent=1.98
          flightCount=811341, delayedFlightCount=9281, delayPercent=1.14
Вб
со
          flightCount=8145788, delayedFlightCount=113064, delayPercent=1.39
DH
          flightCount=693047, delayedFlightCount=22176, delayPercent=3.20
          flightCount=16547870, delayedFlightCount=258382, delayPercent=1.56
DL
EΑ
          flightCount=919785, delayedFlightCount=28702, delayPercent=3.12
          flightCount=1697172, delayedFlightCount=48676, delayPercent=2.87
ΕV
F9
          flightCount=336958, delayedFlightCount=1778, delayPercent=0.53
          flightCount=1265138, delayedFlightCount=12854, delayPercent=1.02
НА
          flightCount=274265, delayedFlightCount=1329, delayPercent=0.48
   flightCount=3636682, delayedFlightCount=55431, delayPercent=1.52
(1) flightCount=70622, delayedFlightCount=1342, delayPercent=1.90
MQ
NW
         flightCount=3954895, delayedFlightCount=157478, delayPercent=3.98 flightCount=10292627, delayedFlightCount=214154, delayPercent=2.08 flightCount=1464176, delayedFlightCount=47174, delayPercent=3.22
OH
          flightCount=3090853, delayedFlightCount=65390, delayPercent=2.12
   (1) flightCount=316167, delayedFlightCount=3521, delayPercent=1.11 flightCount=873957, delayedFlightCount=8910, delayPercent=1.02 flightCount=83617, delayedFlightCount=1151, delayPercent=1.38
ΡI
PS
TW
          flightCount=3757747, delayedFlightCount=69088, delayPercent=1.84
ΤZ
          flightCount=208420, delayedFlightCount=2307, delayPercent=1.11
UA
          flightCount=13299817, delayedFlightCount=290506, delayPercent=2.18
          flightCount=14075530, delayedFlightCount=291650, delayPercent=2.07
         flightCount=15976022, delayedFlightCount=155053, delayPercent=0.97 flightCount=2350309, delayedFlightCount=51991, delayPercent=2.21
WN
XΕ
          flightCount=854056, delayedFlightCount=30050, delayPercent=3.52
ankit@ankit-VirtualBox:/usr/local/bin/hadoop-2.8.5/binS
```

```
ankit@ankit=VirtualBox:/isr/local/bin/hadoop-2.8.5/binS hadoop fs -cat /FinalProjectMROutput/15.1-Cancelled_Ratio_Carriers_Name/part-r-000000
Pinnacle Airlines Inc.
flightcount=1980647, delayedFilightCount=280830, delayPercent=1.91
Aloha Airlines Inc.
flightcount=19438047, delayedFilightCount=280830, delayPercent=1.98
Alaska Airlines Inc.
flightcount=19438021, delayedFilightCount=195140, delayPercent=1.98
JetBlue Airways flightCount=01341, delayedFilightCount=195140, delayPercent=1.98
JetBlue Airways flightCount=01341, delayedFilightCount=195140, delayPercent=1.98
JetBlue Airways flightCount=01341, delayedFilightCount=195140, delayPercent=1.99
Independence Air flightCount=030474, delayedFilightCount=195140, delayPercent=1.90
Delta Air Lines Inc.
flightCount=030474, delayedFilightCount=287820, delayPercent=3.20
Delta Air Lines Inc.
flightCount=0347870, delayedFilightCount=287820, delayPercent=3.12
Atlantic Southeast Airlines filightCount=1957830, delayedFilightCount=287820, delayPercent=3.12
Atlantic Southeast Airlines filightCount=1957272, delayedFilightCount=287820, delayPercent=3.82
Airfran Airways Corporation flightCount=1957272, delayedFilightCount=195783, delayePercent=3.83
Airfran Airways Corporation flightCount=1957838, delayedFilightCount=195783, delayedFilightCount=38780, delayedFilightCount=38780, delayedFilightCount=38780, delayedFilightCount=38780, delayedFilightCount=38800, delayedFilightC
```

The number of cancelled flights are very less for almost all the carriers less than 4%.

Among them best are **Frontier Airlines**, **Hawaiian Airlines** with **0.5%** cancelled flights and worst are **American Eagle Airlines**, **Mesa Airlines** with more than **3.5%** cancelled flights.

#### 15- Inverted index for all source and destination

This data can help to search for all the destination stations from a particular source stations.

```
BEL ADD AND SEN INCO RDD PIT PHL ORD NOT ALB MCD LCA JPK IND IAD HPM GRIR PIAN DTW DCA CVG CLT CLE BNI BHM

ARE: 373 TALL TUS THE TRA ANA ATL AUS BNA BNI CLE COS CVG DAL DEN DPN ELP ENR GJT HOU IAD IAH IDA LAS LAX LBB MAF HCI MCD HDM HKC MSP DAK DKC ONT ORD PDX PHX PIH PIT PSP SAN SAT SEA SFO SLC SMF SNA

ARX: NCN ATL VLD

ACK: LCA ENR JPK

ACV: CEC CLI TYR DPN IAH ILE

ACV: CEC CLI TYR DPN IA
```

# 16- Top 20 best source station with least departure delayed flight percent

```
Bytes Written=432
ankit@ankit-VirtualBox:/usr/local/bin/hadoop-2.8.5/bin$ hadoop fs -ca
GLH
MKK
        1.384083044982699
LNY
       1.7301038062283738
FOE
        1.7543859649122806
EAU
       3.6455929856945084
EFD
        4.211395540875309
VIS
       4.315102860010035
RDR
       4.3478260869565215
PUB
       4.500949875785474
IYK
        4.745540828015055
ITO
        5.037166347561663
LIH
       5.05663430420712
BTM
        5.388898868331237
ITH
       6.093384790998532
CCR
       6.159014557670773
PIH
       6.379106379106379
WYS
        6.4338235294117645
ROP
        6.4862104187946885
MOT
        6.588277858176555
GFK
        6.69175731006245
ankit@ankit-VirtualBox:/usr/local/bin/hadoop-2.8.5/bin$
```

## 17- Top 20 best destination station with least arrival delayed flight percent

```
ankit@ankit-VirtualBox:/usr/local/bin/hadoop-2.8.5/bin$ hadoop fs -cat /FinalProject
BFF
        0.0
MKK
        1.3888888888888888
LNY
        2.0689655172413794
ROP
        5.523710265763419
ITO
        6.492665484134358
IYK
        7.778510217534608
LIH
        8.344797820398695
EAU
        9.417889256980597
VIS
        9.63673057517659
SMX
        9.645635263612792
OXR
        9.938676252907591
PUB
        10.08503655079815
MIB
        10.112359550561797
GCN
        10.29999999999999
SPN
        10.55402656455666
PMD
        10.560859188544153
FLG
        10.744087011567013
CCR
        10.902510744175526
KOA
        11.085274322107248
CLD
        11.0986073990716
ankit@ankit-VirtualBox:/usr/local/bin/hadoop-2.8.5/bin$
```

18- Hierarchical data for all source, destination and carrier information