Domain: Transportation

Dataset: Airlines – Airport, Airlines and Route data (http://openflights.org/data.html)

Airlines OD data (http://stat-computing.org/dataexpo/2009/the-data.html)

http://stat-computing.org/dataexpo/2009/

Customer Reviews: https://github.com/quankiquanki/skytrax-reviews-dataset Airline Delays: https://www.transtats.bts.gov/OT_Delay/OT_DelayCause1.asp

About the Dataset and Data: (2003 - 2017)

The airline dataset consists of all details about the airlines, airports and the routes data from a source airport to the destination along with the airline taken on the route.

The data also consists of airline delays and takes into consideration different factors of flight delays such as Arrival Delay, Carrier Delay, Weather Delay, NAS Delay, Security Delay, and Late Aircraft Delay.

Also, customer reviews have also been taken into consideration for different carriers, so as to know the carrier/airline review.

Analysis Performed:

1) Most Preferred Airline:

Operations Performed: **Chaining and Secondary Sorting** using Comparator Class.

Analysis: The routes database has details about routes taken from a source airport to destination airport with several airlines. This analysis is done by performing chaining operations, by taking the output from the first job (getting the airline and its count) and giving it to the second job where sorting is performed in descending order using a comparator class.

2180	UA
1981	DL
1960	US
1454	CZ
1263	MU
1260	CA
1146	WN
1130	U2

Result/Output:

FR

AA

2484

2354

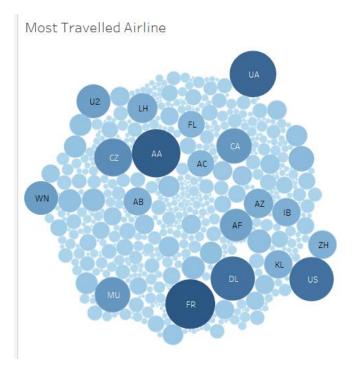
1071 AF 923 LH 877 AZ 831 IB 830 KL 815 ZH

798 AB 726 FL 705 AC 658 TK

576 DY 555 HU 549 BA 547 NH

530 AS 504 SK 488 TO 473 SU

Conclusion: It can be concluded that FR, AA, UA, DL are among the most travelled/preferred airlines.



2) Source – Destination Analysis:

Use of **Custom Writable** Objects.

The routes dataset allows to perform analysis to find out the different routes that can be taken from a particular airport (Source Airport). Also, information such as the airline taken and the number of stops from travelling Source -> Destination has also been displayed.

Two custom writable classes have been created, one to store and sort the key (source and destination) and the other (value) to store and display the airline and number of stops details.

Result/Output:

AAE	ALG	0	AH
AAE	CDG	0	AH
AAE	IST	0	AH
AAE	LYS	0	AH
AAE	MRS	0	ZI
AAE	ORN	0	AH
AAE	ORY	0	ZI
AAL	AAR	0	BA
AAL	AGP	0	DY
AAL	ALC	0	DY
AAL	AMS	0	AZ
AAL	ARN	0	SK
AAL	BCN	0	VY
AAL	BLL	0	TK
AAL	CPH	0	DY
AAL	IST	0	TK
AAL	LGW	0	DY
AAL	OSL	0	SK
AAL	PMI	0	DY
AAL	SVG	0	DX
AAN	CCJ	0	IX
AAN	PEW	0	NL
AAQ	DME	0	S7
AAQ	LED	0	SU
AAQ	SV0	0	SU
AAR	AAL	0	BA
AAR	AGP	0	FR
AAR	BMA	0	BA

Conclusion: This analysis gives a clear picture about the different destinations from a source airport.



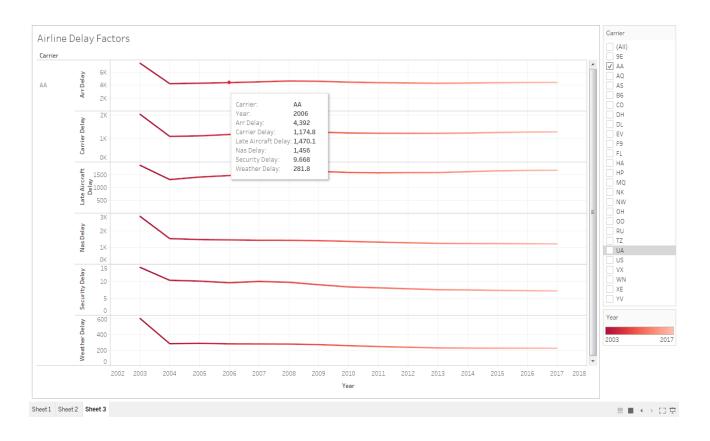
3) Airline Delay Reason: (Summarization Pattern) Use of Numerical Summarization Pattern.

The airline delays dataset is used to analyse the major factors on flight delays. The delays can be Arrival Delay, Carrier Delay, Weather Delay, NAS Delay, Security Delay, and Late Aircraft Delay. This analysis is performed by taking the average of these delays for each carrier/airline. For making use of combiner optimizations, this pattern is done by calculating the average by dividing the running sum to the running count.

Result/Output:

2003	AA	7410.879	2040.8988	602.70483	2877.3481	14.268657	1875.6583
2003	AS	5746.5005	1655.7291	410.3532	2032.7118	17.176598	1630.5298
2003	B6	5192.2925	1505.0669	364.1467	1823.3398	18.698236	1481.0409
2003	CO	4485.209	1163.3135	290.86307	1799.2452	14.472307	1217.3147
2003	DH	4149.6235	1121.0243	308.08777	1629.5819	11.576508	1079.3533
2003	DL	4145.1978	1118.6294	263.03992	1700.0676	10.000339	1053.4606
2003	EV	3804.7678	1065.2067	264.95526	1518.0345	8.813392	947.75793
2003	FL	3803.6538	1030.0128	252.78297	1511.5199	8.209612	1001.1286
2003	HA	3779.1516	1026.334	250.77028	1499.4553	8.178246	994.4138
2003	HP	3652.9727	1025.3403	234.05067	1431.4419	8.761739	953.378
2003	MQ	3666.2192	1018.4687	226.52007	1395.3483	7.963268	1017.9201
2003	NW	3543.2698	1027.3937	228.1533	1342.7717	7.6623693	937.29144
2003	00	3352.4614	1003.4031	234.58763	1241.2139	8.912444	864.3502
2003	RU	3279.0283	944.02716	226.58308	1251.6135	8.402171	848.40735
2003	TZ	3250.3105	931.0641	221.66527	1242.358	8.724194	846.5027
2003	UA	3417.1594	946.7296	220.23909	1324.3438	8.502144	917.34576
2003	US	3502.495	947.74054	219.05392	1356.6512	8.080297	970.97266
2003	WN	3715.4033	978.2293	226.9179	1354.384	9.149366	1146.7233
2004	AA	4232.6343	1092.6854	283.40222	1533.3772	10.388815	1312.7793
2004	AS	4180.479	1099.2058	271.42288	1477.4537	11.245343	1321.1547
2004	B6	4126.918	1082.6498	265.92865	1457.8413	11.942873	1308.5609
2004	CO	4076.0322	1046.2085	258.3729	1491.943	12.231789	1267.2794

Conclusion: This analysis gives a clear detail about the flight delays over the years and can be seen that over the years the delays have lessened.



4) Distinct Airline: (Filtering Pattern)

Use of **Distinct Filtering Pattern**.

This analysis gives us the distinct/unique airline names, so that we can know the different carriers/airlinesfor which we have the details of. Also, with having such large dataset, this pattern helps to get set of unique airlines and to understand better about the data that we are dealing with.

Result/Output:

```
"1-2-go"
'12 North"
"135 Airways"
"1Time Airline"
"2 Sqn No 1 Elementary Flying Training School"
"213 Flight Unit"
"223 Flight Unit State Airline"
"224th Flight Unit"
"247 Jet Ltd"
"3 Valleys Airlines"
"3D Aviation"
"40-Mile Air"
"4D Air"
"611897 Alberta Limited"
"84 Squadron Royal Air Force @ RAF Akrotiri"
"88"
"A J Services"
"A-Safar Air Services"
"A2 Jet Leasing"
"AASANA"
"ABC Aerolineas"
"ABC Air Hungary"
"ABC Bedarsflug"
"ABSA - Aerolinhas Brasileiras"
"ABX Air"
"AC Challenge Aero"
"AC Insat-Aero"
"ACA-Ancargo Air Sociedade de Transporte de Carga Lda
```

5) Top 30 Busiest Airport Details: (Filtering Pattern)

Use of Bloom Filter and Distributed Cache.

Bloom Filter helps to filter out the data by comparing to a set of hot values. In this analysis we make use of a bloom filter which consists of IATA code for 30 top most/busiest airports. The input data is compared to this bloom filter and only those records are emitted which are present in the set of hot values (bloom filter). The bloom filter is loaded into distributed cache and the mapper loads this files from distributed cache and compares the input file.

Result/Output:

Result/Output:

346, Frankfurt am Main International Airport, Frankfurt, Germany, FRA, EDDF, 50. 0333333, 8.5705556, 364, 1, E, Europe/Berlin, airport, OurAirports 507, London Heathrow Airport, London, United Kingdom, LHR, EGLL, \$1.4706, -0.461941, 83, 0, E, Europe/London, airport, OurAirports 580, Amsterdam Airport Schiphol, Amsterdam, Netherlands, AMS, EHAM, \$2.3886013794, 4.7638897896, -11, 1, E, Europe/Amsterdam, airport, OurAirports 1229, Adolfo Suárez Madrid-Barajas Airport, Madrid, Spain, MAD, LEMD, 40.471926, -3.56264, 1998, 1, E, Europe/Madrid, airport, OurAirports 1382, Charles de Gaulle International Airport, Paris, France, CDG, LFPG, 49. 0127983093, 2.549999523, 392, 1, E, Europe/Paris, airport, OurAirports 1701, Atatürk International Airport, Istanbul, Turkey, IST, LTBA, 40.9768981934, 28. 81459999988, 163, 3, E, Europe/Istanbul, airport, OurAirports 2188, Dubai International Airport, Istanbul, United Arab Emirates, DNB, Ombes, 25.2527999878, 55. 3643989563, 62, 4, U, Asia/Dubai, airport, OurAirports 2359, Tokyo Haneda International Airport, Tokyo, Japan, HND, RJTT, 35.552299, 139.779999, 35, 9, U, Asia/Tokyo, airport, OurAirports 3093, India Gandhi International Airport, Delhi, India, DEL, VIDP, 28. 5664997101, 77. 1031036377, 777, 5.5, N, Asia/Calcutta, airport, OurAirports 3275, Soekarno-Hatta International Airport, Delhi, India, DEL, VIDP, 28. 5664997101, 77. 1031036377, 777, 5.5, N, Asia/Calcutta, airport, OurAirports 3304, Kuala Lumpur International Airport, Kuala Lumpur, Malaysia, KUL, WMKK, 2.745579958, 101.7099990845, 69, 8, N, Asia/Kuala_Lumpur, airport, OurAirports 3316, Singapore Changi Airport, Singapore, Singapone, Singapone, Si 3466, Shanghai Pudong International Airport, Shanghai, China, PVG, ZSPD, 31.1434001923, 121.8050003052, 13.8, U, Asia/Shanghai, airport, OurAirports 3462, Phoenix Sky Harbor International Airport, Phoenix, United States, PHX, RPHX, 33.43429469, -112.0120010376, 1135, -7, N, America/Phoenix, airport, OurAirports 3469, San Francisco, United States, PRX, RPHX, 33.43429480, -12.0120010376, 1135, -7, N, America/Phoenix, airport, OurAirports 3469, San Francisco, United States, PRX, RPHX, 37.6189994812, -122.375, 13.-8, A, America/Los_Angeles, airport, OurAirports 3484, Los Angeles International Airport, Los Angeles, United States, LAX, KLAX, 33.94250107, -118.4079971, 125, -8, A, America/Los_Angeles, airport, OurAirports

6) Country – Airline Organization: (Organization Pattern)

Use of Structured to Hierarchical Pattern.

This organization pattern allows to have a hierarchical representation (XML format) of airlines by their country. Here the country is the parent element and airline name is the child node.

Result/Output:

7) Airline Delay Details by Year (Organization Pattern)

Use of Partitioning Pattern.

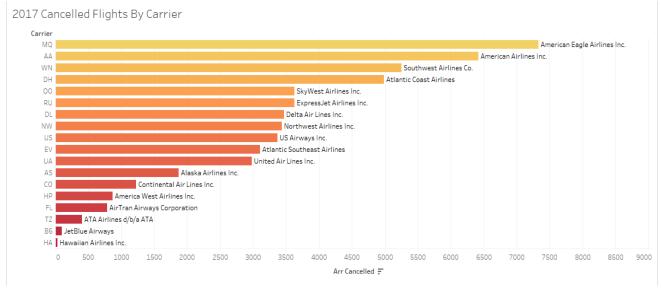
The airline delays data has data for years 2003-2017. This pattern allows us to partition the data by year so that we get a better picture about the airline delays for a particular year.

Result/Output:

```
Result/Output:

2017,1,DL,Delta Air Lines Inc.,COS,"Colorado Springs, CO: City of Colorado Springs Municipal",22,7,3.58,0,2.55,0,0.87,0,0,419,255,0,76,0,88
2017,1,DL,Delta Air Lines Inc.,CMH,"Columbus, OH: Port Columbus International",275,48,23.85,7.4,5.6,0,11.14,6,2,4743,2201,1056,337,0,1149
2017,1,DL,Delta Air Lines Inc.,CLI,"Charlotte, NC: Charlotte Douglas International",431,75,29.37,9.28,18.26,0,18.08,3,0,4654,2176,644,662,0,1172
2017,1,DL,Delta Air Lines Inc.,CLE,"Cleveland, OH: Cleveland-Hopkins International",195,28,12.68,6.81,3.12,0,5.39,3,2,2828,1237,713,244,0,634
2017,1,DL,Delta Air Lines Inc.,CCH,"Charleston AFB/International",195,28,12.68,6.81,3.12,0,5.39,3,2,2828,1237,713,244,0,634
2017,1,DL,Delta Air Lines Inc.,CHA,"Charleston, SC: Charleston AFB/International",286,53,25.75,8.71,6.07,0,12.48,3,0,4325,2033,695,380,0,1217
2017,1,DL,Delta Air Lines Inc.,CHA,"Charleston, SC: Charleston AFB/International",286,53,25.75,8.71,6.07,0,12.48,3,0,4325,2033,695,380,0,1217
2017,1,DL,Delta Air Lines Inc.,CHA,"Charleston, SC: Charleston AFB/International",386,53,25.75,8.71,6.07,0,12.48,3,0,4325,2033,695,380,0,1217
2017,1,DL,Delta Air Lines Inc.,CHA,"Charleston, SC: Charleston AFB/International",286,53,25.75,8.71,6.07,0,12.48,3,0,4325,2033,695,380,0,1217
2017,1,DL,Delta Air Lines Inc.,CAK,"Akron, OH: Akron-Canton Regional",109,11,2.3,2.31,2.23,0,4.16,21,1199,335,299,84,0,481
2017,1,DL,Delta Air Lines Inc.,CAK,"Bozeman, MT: Bozeman Yellowstone International",71,17,8.28,2.34,3.9,0,2.49,0,0,1285,417,662,115,0,91
```

Conclusion: This partitioned data for the year 2017 shows that MQ, AA are the carriers with maximum flight cancellations.



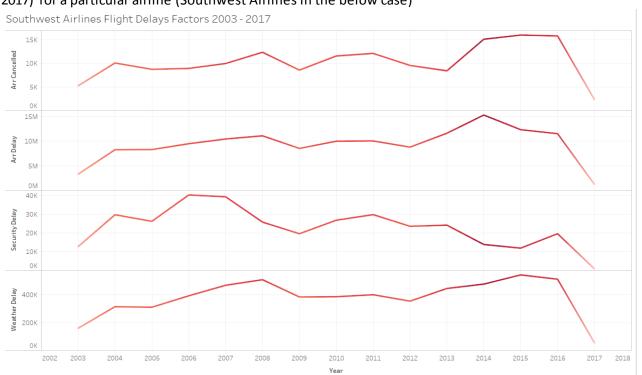
8) Categorized Airline Delay Data by Carrier: (Organization Pattern) Use of Binning Pattern.

Create bins of data by categorizing the delay data by carrier. We make use of **MultipleOutputFormat** to write the different bins into HDFS.

Result/Output:

```
2003,6, NN, Southwest Airlines Co., ABQ, "Albuquerque, NM: Albuquerque International Sunport", 1831, 246, 73. 37, 5.45, 42. 07, 0.3, 124.8, 12.0, 9681, 2798, 287, 1173, 6, 5417 2003, 6, NN, Southwest Airlines Co., ALB, "Albany, NY: Albany International", 287, 42, 17. 19, 1.57, 5.25, 0, 17.98, 1, 0, 1832, 661, 115, 228, 0, 828 2003, 6, NN, Southwest Airlines Co., ALB, "Amarillo, TX: Rick Husband Amarillo International", 305, 58, 6. 07, 0.3, 7. 39, 0, 44.25, 5, 1, 2791, 232, 22, 292, 0, 2245 2003, 6, NN, Southwest Airlines Co., AUS, "Austin, TX: Austin - Bergstrom International", 1309, 202, 57. 96, 4. 64, 44. 16, 0, 95. 24, 25, 1, 8705, 2165, 329, 1443, 0, 4768 2003, 6, NN, Southwest Airlines Co., BDL, "Hartford, CT: Bradley International", 464, 72, 16. 37, 1.71, 12. 22, 0, 41. 69, 0, 1, 3623, 682, 166, 533, 0, 2242 2003, 6, NN, Southwest Airlines Co., BBM, "Birmingham, AL: Birmingham, Shuttlesworth International", 777, 130, 37. 42, 6.87, 18. 48, 0.43, 66.81, 4, 0, 5651, 1564, 348, 731, 8, 3000 2003, 6, NN, Southwest Airlines Co., BNA, "Nashville, TN: Nashville International", 2466, 306, 90. 3, 18. 06, 53. 42, 3.51, 140.71, 1, 4, 13033, 3745, 816, 2062, 95, 6315 2003, 6, NN, Southwest Airlines Co., BNA, "Bothson, International", 281, 47, 18. 75, 2.39, 5.81, 0, 20. 65, 0, 1876, 567, 127, 315, 0, 927 2003, 6, NN, Southwest Airlines Co., BUF, "Buffalo, NY: Buffalo Niagara International", 281, 47, 18. 75, 2.39, 5.81, 0, 20. 65, 0, 1876, 567, 127, 315, 0, 927 2003, 6, NN, Southwest Airlines Co., BUF, "Buffalo, NY: Buffalo, NY: Buffal
```

Conclusion: This pattern helps to analyse each carrier, and the data helps to get data over the years (2003-2017) for a particular airline (Southwest Airlines in the below case)



9) Inner Join: (Join Patterns)

Here we use the inner join pattern to merge two tables routes database with the airport database, so as to get one view for routes and airport details.

Result/Output:

```
Result/Output:

KG,1308,GKA,1,HGU,3,0,DH8 DHT 1,"Goroka Airport","Goroka","Papua New Guinea","GKA","AYGA",-6.081689834590001,145.391998291,5282,10,"U","Pacific/Port_Moresby","airport","OurAirports"

KS,28,GKA,1,POM,5,0,DHA DHB DH3 1,"Goroka Airport","Goroka","Papua New Guinea","GKA","AYGA",-6.081689834590001,145.391998291,5282,10,"U","Pacific/Port_Moresby","airport","OurAirports"

KG,1308,GKA,1,POM,5,0,DHB 1,"Goroka Airport","Goroka","Papua New Guinea","GKA","AYGA",-6.081689834590001,145.391998291,5282,10,"U","Pacific/Port_Moresby","airport","OurAirports

KG,1308,GKA,1,MAG,2,0,DHB 1,"Goroka Airport","Goroka","Papua New Guinea","GKA","AYGA",-6.081689834590001,145.391998291,5282,10,"U","Pacific/Port_Moresby","airport","OurAirports

KG,1308,GKA,1,LAE,4,0,DHB 1,"Goroka Airport","Goroka","Papua New Guinea","GKA","AYGA",-6.081689834590001,145.391998291,5282,10,"U","Pacific/Port_Moresby","airport","OurAirports

KG,21308,GKA,1,LAE,4,0,DHB 1,"Goroka Airport","Goroka","Papua New Guinea","GKA","AYGA",-6.081689834590001,145.391998291,5282,10,"U","Pacific/Port_Moresby","airport","OurAirports

KG,221,THU,10,5VR,\N,0,BH2 1,"Goroka Airport","Goroka","Papua New Guinea","GKA","AYGA",-6.081689834590001,145.391998291,5282,10,"U","Pacific/Port_Moresby","airport","OurAirports

KG,221,THU,10,5VR,\N,0,BH2 1,"Goroka Airport","Goroka","Papua New Guinea","GKA","AYGA",-6.081689834590001,145.391998291,5282,10,"U","Pacific/Port_Moresby","airport","OurAirports

KG,221,THU,10,5VR,\N,0,BH2 1,"Goroka Airport","Goroka","Papua New Guinea","GKA","AYGA",-6.081689834590001,145.391998291,5282,10,"U","Pacific/Port_Moresby","airport","OurAirports"

KG,1308,GKA,1,LAE,4,0,0,DHB 1,"Goroka Airport","Goroka","Papua New Guinea","GKA","AYGA",-6.081689834590001,145.391998291,5282,10,"U","Pacific/Port_Moresby","airport","OurAirports"

KG,1308,GKA,1,LAE,4,0,0,DHB 1,"Goroka Airport","Goroka Airpo
```

10) Pig (Inner Join):

This pig script performs an inner join on routes data and airports data. Pig is fast and easy to code. Pig is a Hadoop extension that simplifies Hadoop programming by giving you a high-level data processing language while keeping Hadoop's simple scalability and reliability.

Result/Output:

```
routes = load 'routes.dat.csv' using PigStorage(',');
airports = load 'airports.dat.csv' using PigStorage(',');
routes_airport = JOIN routes BY $3, airports BY $0;
STORE routes_airport INTO 'RouteAirportPigJoin':
```

PX	328	GKA	1 POM 5	0	DH4 DH8	DH3	1	"Goroka Airport"	"Goroka"	"Papua New
Guinea"	"GKA"	"AYGA"	-6.081689834590001	145.391998291	5282	10	"U"	"Pacific/Port_Moresby"	"airport"	"OurAirports"
CG	1308	GKA	1 LAE 4	0	DH8	1	"Goroka	Airport" "Goroka	" Papua	New
Guinea"	"GKA"	"AYGA"	-6.081689834590001	145.391998291	5282	10	"U"	"Pacific/Port_Moresby"	"airport"	"OurAirports"
CG	1308	GKA	1 HGU 3	0	DH8 DHT	1	"Goroka	Airport" "Goroka	" "Papua	New
Guinea"	"GKA"	"AYGA"	-6.081689834590001	145.391998291	5282	10	"U"	"Pacific/Port_Moresby"	"airport"	"OurAirports"
CG	1308	GKA	1 POM 5	0	DH8	1	"Goroka	Airport" "Goroka	" "Papua	New
Guinea"	"GKA"	"AYGA"	-6.081689834590001	145.391998291	5282	10	"U"	"Pacific/Port_Moresby"	"airport"	"OurAirports"
CG	1308	GKA	1 MAG 2	0	DH8	1	"Goroka	Airport" "Goroka	" "Papua	New
Guinea"	"GKA"	"AYGA"	-6.081689834590001	145.391998291	5282	10	"U"	"Pacific/Port_Moresby"	"airport"	"OurAirports"
PX	328	MAG	2 WWK 6	0	100 DH4	2	"Madang	Airport" "Madang	" "Papua	New
Guinea"	"MAG"	"AYMD"	-5.20707988739 145.789	9001465 20	10	"U"	"Pacific	:/Port Moresby" "airpor	t" "OurAir	ports"

11) Sentiment Analysis on Customer Reviews about Airline:

The customer reviews about the airline are analysed. Here we make use of **Distributed Cache** to perform sentiment analysis. By using distributed cache, we can perform map side joins. So, here we will join the dictionary dataset containing the sentiment values of each word. In order to perform Sentiment Analysis, we will be using a dictionary called AFINN.

AFINN is a dictionary, which consists of 2500 words rated from +5 to -5, depending on their meaning.

Result/Output:

```
Result/Output:

"adria-airways" "If I have to fly a regional jet then I prefer the new generation CRJ 900 which Adria used on today's flight from Amsterdam to Ljubljana. It has much bigger windows which makes the cabin look more spacious. Despite Adria cutting back on a lot of their routes for what it is the service food and cabin is 0K." ----> -1

"adria-airways" "I was on JP650 the evening departure to Istanbul on 28th August. It was on a very clean Airbus A319 and it was a light load flight. The crew were warm and kind especially the Purser who took her time walked and talked to several passengers. They even offered me a pillow and blanket which I appreciated. A warm refreshment with selections of cold/hot beverage were offered on this 2 hours flight. We took off about 5 minutes earlier and landed more or less 20 minutes earlier. It was a relaxing flight and I do hope they will be flying to more destinations in the future since slovenia is a beautiful and lovely country to visit." ----> 14

"adria-airways" "I was very satisfied with the CRJ 900 on my flight from Zagreb to Istanbul. The aircraft's are very clean fresh new and the staff was very helpful. Besides I felt very safe and comfortable in the aircraft." ----> 8

"adria-airways" "Flights from LJU to ZRH and back all on time. In Economy class was served just coffee tea an water but it's fine for one and a half nour flight. Very friendly and helpful cabin crew members. Very clean and comfortable cabin on CRJ900 aircraft." ----> 10

"adria-airways" "The prom LJU to ZRH and back all on time. In Economy class was served just coffee tea an water but it's fine for one and a half nour flight. Very friendly and helpful cabin crew members. Very clean and comfortable cabin on CRJ900 aircraft." -----> 10

"adria-airways" "The prom LJU to FRA and back all on time. I lights were made by CRJ900 Next Generation which is a great plane. I love the very large windows which are at a proper height so that you don't have to bend your neck down in order to look out the windo
    Table of the aim out out of the series of time. Fights were made by this mextuen afficiant. Very clean Cabin and comfortable seats. Staff were always nice and friendly. New Skyshop service was excellent with nice prices and it's not too expensive." ----> 13 "adria-airways" "I had flights from Paris to Sarajevo via Ljubljana. Adria Airways provides a low cost product these days. The food and beverages secome for purchase including water. This is acceptable for short flights but it should be clearly indicated during the ticket purchase on their website. There are no hot options and quality of sandwiches is really poor. Besides the service was very friendly and efficient. Both flights arrived on time." ----> 2
```

Pig Analysis:

routes = load 'routes.dat.csv' using PigStorage(','); airports = load 'airports.dat.csv' using PigStorage(','); routes_airport = JOIN routes BY \$3, airports BY \$0; STORE routes_airport INTO 'RouteAirportPigJoin';