

# PROJECT REPORT

## Summary:

Airline on-time performance in United States of America. *Make a smart choice while booking your flight.*

Taking an airplane is one of the most important and efficient ways to travel. However, many travelers have experienced delayed flight. Which airline carriers delayed most often? Which airports have highest probability to make you wait for a long time? Also, which day of week and which month of year are better for your journey without severe delay?

The aim of this presentation is to produce a graphical summary of the airline performance data. Due to the large size of the data set, the author retrieved the recent 11 years' (1998-2008) data for analysis.

All the analyses are made from four different aspects:

- Best airlines to avoid delays.
- Top 25 Airports severely delayed.
- Best time of day/day of week/time of year to fly to minimize delays.
- And Cancellation counts on reasons, monthly basis and airlines.
- Recommendations in terms of the aspects above are made at the end.

## Dataset:

Source website: <http://stat-computing.org/dataexpo/2009/the-data.html>

The data consists of flight arrival and departure details for all commercial flights within the USA, from October 1987 to April 2008. This is a large dataset: there are nearly 120 million records in total, and takes up 1.6 gigabytes of space compressed and 12 gigabytes when uncompressed.

20 years of data in a csv format:

1987, 1988, 1989, 1990, 1991, 1992, 1993, 1994, 1995, 1996, 1997, 1998, 1999, 2000,  
2001, 2002, 2003, 2004, 2005, 2006, 2007, 2008

Other supplement data:

*carriers.csv* – Listing of carrier codes with full names.

*airports.csv* – Describes the locations of US airports.

*plane-data.csv* – Individual plane specification and

Data Screenshot:

Year	Month	DayofMonth	DayOfWeek	DepTime	CRSDepTime	ArrTime	CRSArrTime	UniqueCarrier	FlightNum	TailNum	ActualElapsedTime	CRSElapsedTime	AirTime	ArrDelay	DepDelay	Origin	Dest	Distance	TaxiIn	TaxiOut	C
2008	1	3	4	754	735	1002	1000	WN	3231	N772SW	128	145	113	2	19	IAD	TPA	810	5	10	
2008	1	3	4	628	620	804	750	WN	448	N428WN	96	90	76	14	8	IND	BWI	515	3	17	
2008	1	3	4	926	930	1054	1100	WN	1746	N612SW	88	90	78	-6	-4	IND	BWI	515	3	7	
2008	1	3	4	1829	1755	1959	1925	WN	3920	N464WN	90	90	77	34	34	IND	BWI	515	3	10	
2008	1	3	4	1940	1915	2121	2110	WN	378	N726SW	101	115	87	11	25	IND	JAX	688	4	10	
2008	1	3	4	1937	1830	2037	1940	WN	509	N763SW	240	250	230	57	67	IND	LAS	1591	3	7	
2008	1	3	4	1039	1040	1132	1150	WN	535	N428WN	233	250	219	-18	-1	IND	LAS	1591	7	7	
2008	1	3	4	617	615	652	650	WN	11	N689SW	95	95	70	2	2	IND	MCI	451	6	19	
2008	1	3	4	1620	1620	1639	1655	WN	810	N648SW	79	95	70	-16	0	IND	MCI	451	3	6	
2008	1	3	4	706	700	916	915	WN	100	N690SW	130	135	106	1	6	IND	MCO	828	5	19	
2008	1	3	4	1644	1510	1845	1725	WN	1333	N345WN	121	135	107	80	94	IND	MCO	828	6	8	
2008	1	3	4	1426	1430	1426	1425	WN	829	N476WN	60	55	39	1	-4	IND	MDW	162	9	12	
2008	1	3	4	715	715	720	710	WN	1016	N765SW	65	55	37	10	0	IND	MDW	162	7	21	
2008	1	3	4	1702	1700	1651	1655	WN	1827	N420WN	49	55	35	-4	2	IND	MDW	162	4	10	
2008	1	3	4	1029	1020	1021	1010	WN	2272	N263WN	52	50	37	11	9	IND	MDW	162	6	9	
2008	1	3	4	1452	1425	1640	1625	WN	675	N266WN	228	240	213	15	27	IND	PHX	1489	7	8	
2008	1	3	4	754	745	940	955	WN	1144	N785WN	226	250	205	-15	9	IND	PHX	1489	5	16	
2008	1	3	4	1323	1255	1526	1510	WN	4	N674AA	123	135	110	16	28	IND	TPA	838	4	9	
2008	1	3	4	1416	1325	1512	1435	WN	54	N643SW	56	70	49	37	51	ISP	BWI	220	2	5	
2008	1	3	4	706	705	807	810	WN	68	N497WN	61	65	51	-3	1	ISP	BWI	220	3	7	
2008	1	3	4	1657	1625	1754	1735	WN	623	N724SW	57	70	47	19	32	ISP	BWI	220	5	5	
2008	1	3	4	1900	1840	1956	1950	WN	717	N785SW	56	70	49	6	20	ISP	BWI	220	2	5	
2008	1	3	4	1039	1030	1133	1140	WN	1244	N714CB	54	70	47	-7	9	ISP	BWI	220	2	5	
2008	1	3	4	801	800	902	910	WN	2101	N222WN	61	70	53	-8	1	ISP	BWI	220	3	5	
2008	1	3	4	1520	1455	1619	1605	WN	2553	N394WN	59	70	50	14	25	ISP	BWI	220	2	7	
2008	1	3	4	1422	1255	1657	1610	WN	188	N215WN	155	195	143	47	87	ISP	FLL	1093	6	6	
2008	1	3	4	1954	1925	2239	2235	WN	1754	N243WN	165	190	155	4	29	ISP	FLL	1093	3	7	
2008	1	3	4	636	635	921	945	WN	2275	N454WN	165	190	147	-24	1	ISP	FLL	1093	5	13	
2008	1	3	4	734	730	958	1020	WN	550	N712SW	324	350	314	-22	4	ISP	LAS	2283	2	8	
2008	1	3	4	2107	1945	2334	2230	WN	362	N798SW	147	165	134	64	82	ISP	MCO	972	6	7	
2008	1	3	4	1008	1005	1234	1255	WN	543	N736SA	146	170	135	-21	3	ISP	MCO	972	5	6	
2008	1	3	4	712	710	953	1000	WN	1112	N795SW	161	170	142	-7	2	ISP	MCO	972	5	14	
2008	1	3	4	1312	1300	1546	1550	WN	1397	N247WN	154	170	140	-4	12	ISP	MCO	972	7	7	
2008	1	3	4	1449	1430	1715	1720	WN	3398	N707SA	146	170	134	-5	19	ISP	MCO	972	6	6	
2008	1	3	4	1634	1555	1859	1845	WN	3480	N443WN	145	170	134	14	39	ISP	MCO	972	5	6	
2008	1	3	4	831	830	935	955	WN	300	N735SW	124	145	112	-20	1	ISP	MDW	765	5	7	
2008	1	3	4	1812	1650	1927	1815	WN	422	N779SW	135	145	118	72	82	ISP	MDW	765	6	11	
2008	1	3	4	1127	1105	1235	1230	WN	1837	N704SW	128	145	114	5	22	ISP	MDW	765	9	5	

Variable descriptions – Yearly File Columns

Name	Description
1	Year 1987-2008
2	Month 1-12
3	DayofMonth 1-31
4	DayOfWeek 1 (Monday) - 7 (Sunday)
5	DepTime actual departure time (local, hhmm)
6	CRSDepTime scheduled departure time (local, hhmm)
7	ArrTime actual arrival time (local, hhmm)
8	CRSArrTime scheduled arrival time (local, hhmm)
9	UniqueCarrier unique carrier code
10	FlightNum flight number
11	TailNum plane tail number
12	ActualElapsedTime in minutes
13	CRSElapsedTime in minutes
14	AirTime in minutes
15	ArrDelay arrival delay, in minutes
16	DepDelay departure delay, in minutes
17	Origin origin IATA airport code
18	Dest destination IATA airport code
19	Distance in miles
20	TaxiIn taxi in time, in minutes
21	TaxiOut taxi out time in minutes

22 Cancelled was the flight cancelled?  
 23 CancellationCode reason for cancellation (A = carrier, B = weather, C = NAS, D = security)  
 24 Diverted 1 = yes, 0 = no  
 25 CarrierDelay in minutes  
 26 WeatherDelay in minutes  
 27 NASDelay in minutes  
 28 SecurityDelay in minutes  
 29 LateAircraftDelay in minutes

## Airports

Airports.csv describes the locations of US airports, with the fields:

- iata: the international airport abbreviation code
- name of the airport
- city and country in which airport is located.
- lat and long: the latitude and longitude of the airport

## Carrier codes

Listing of carrier codes with full names

### SCREENSHOTS and Summary of the Analysis performed:

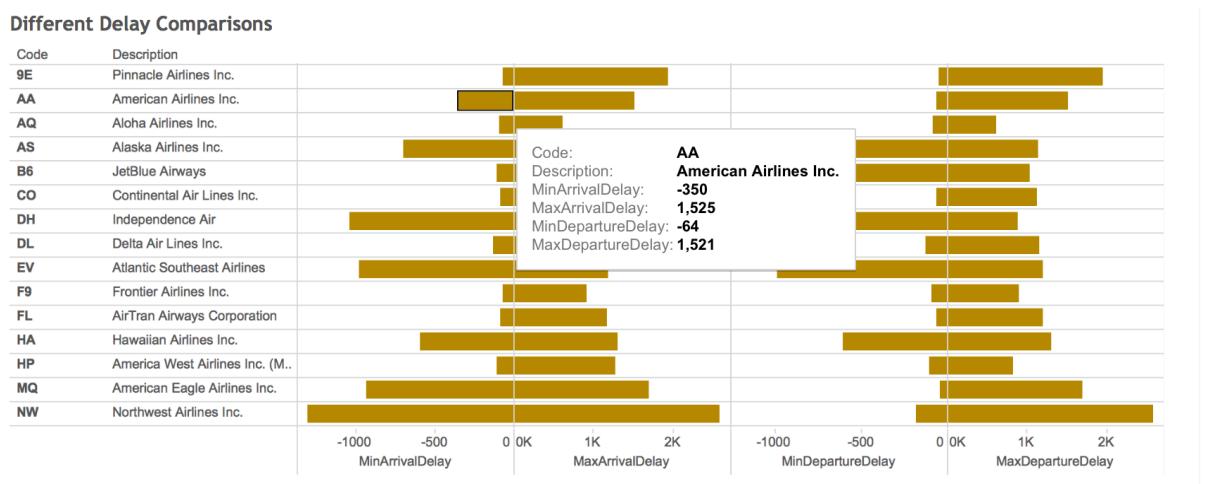
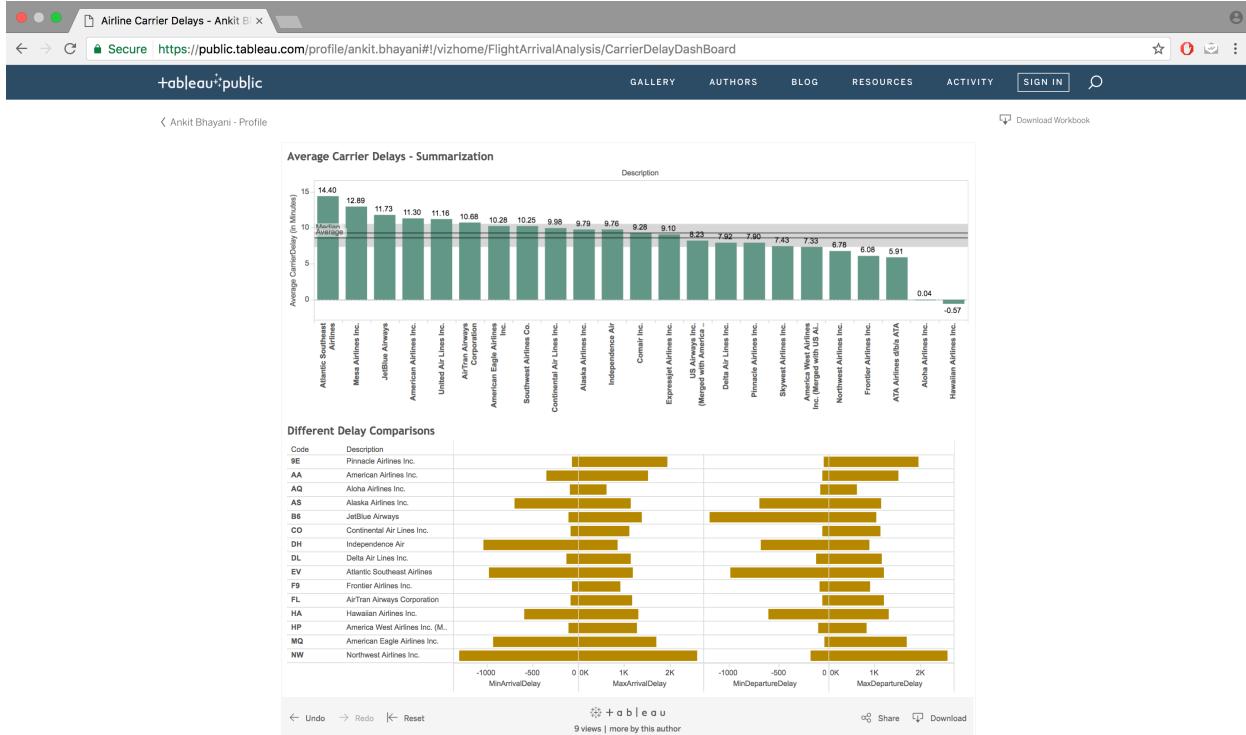
Index.html – Main page of the website

The screenshot shows the main index.html page of the ADMS Final Project. At the top, there's a navigation bar with tabs like Home, About, Services, Contact, and Help. Below the navigation, there's a large banner with the text "Flight Arrival Data Analysis - INFO7275 Advanced Database Mgt Sys Final Project" and a subtext "Airline on-time performance in United States of America. Make a smart choice while booking your flight." Below the banner, there are four main analysis sections:

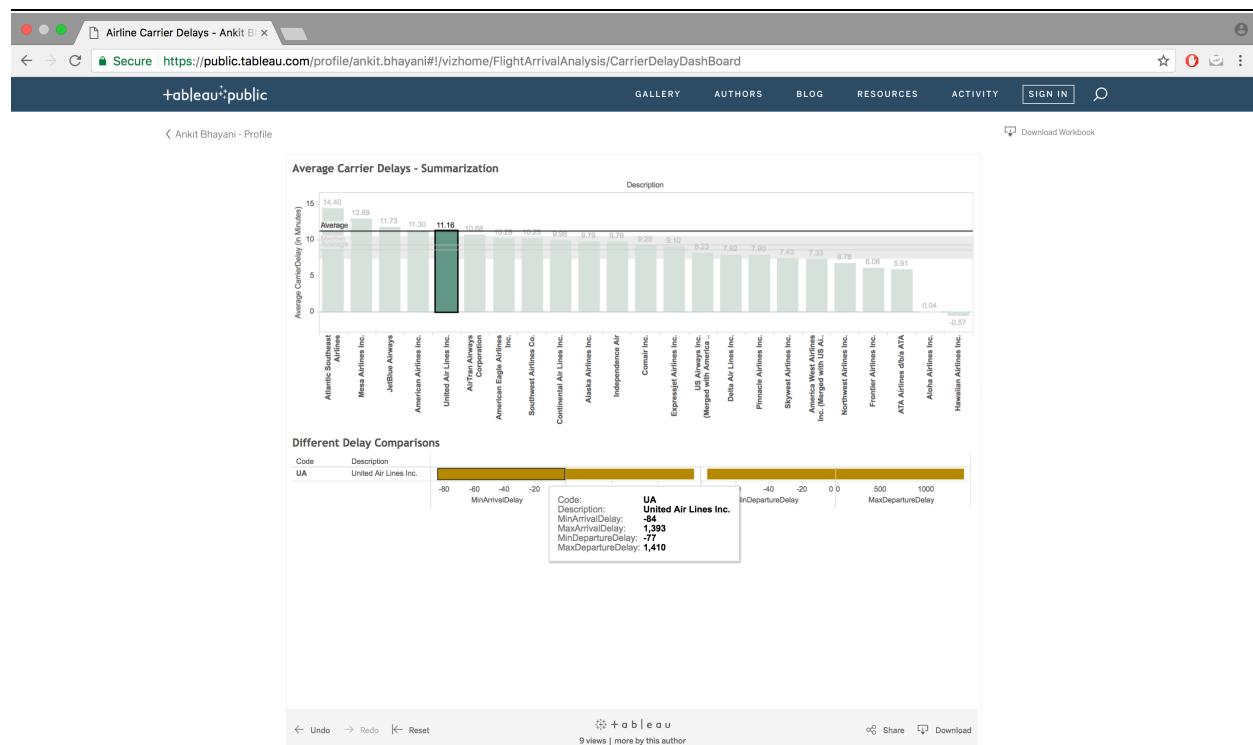
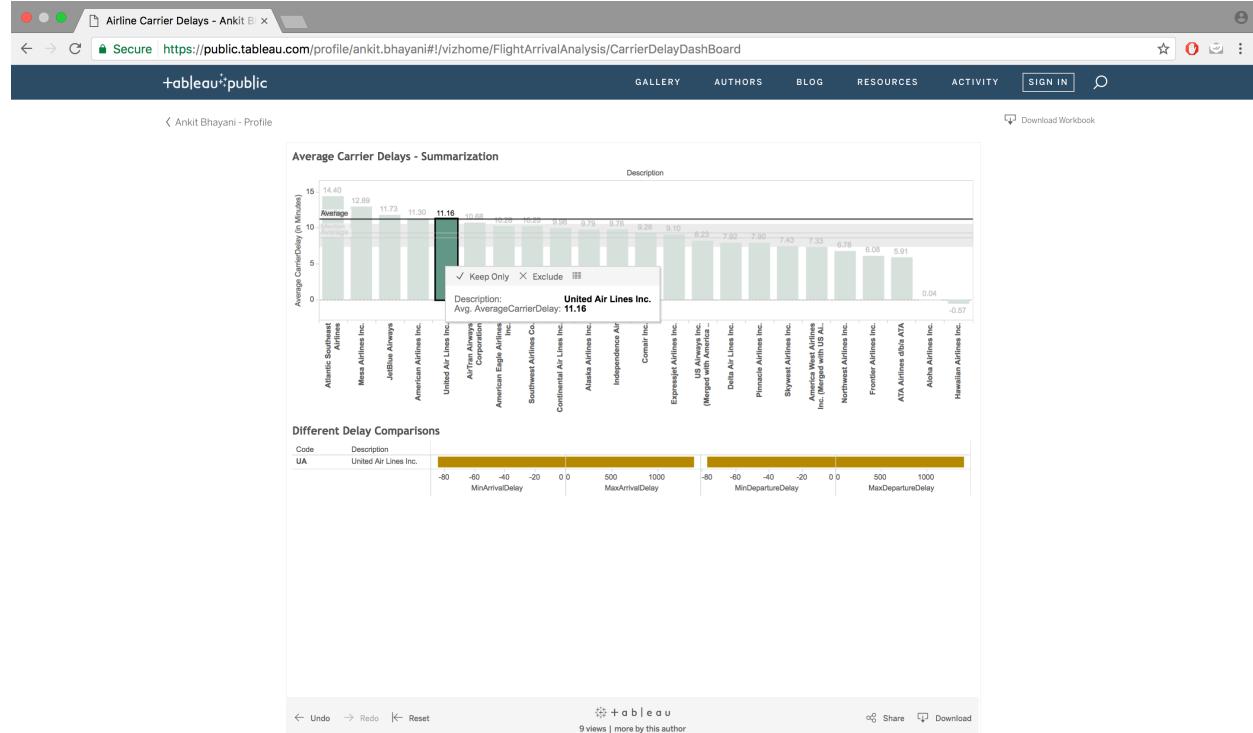
- Airline Carrier Delays:** Shows an image of an airplane in flight. Below it, a table lists airline codes and their cancellation counts: Delta (536), United (5281), United (5277), American (1571), United (2371), and American (1407). All entries show "Cancelled" as the reason.
- Top 25 Busiest Airports:** Shows a photo of a busy airport terminal with many people walking. Below it, a table lists the top 25 busiest airports with their names and codes: Atlanta (ATL), Chicago O'Hare (ORD), Dallas/Ft. Worth (DFW), Los Angeles (LAX), Houston (IAH), Philadelphia (PHL), San Francisco (SFO), New York (JFK), Detroit (DTW), Boston (BOS), Seattle (SEA), Newark (EWR), Charlotte (CLT), Miami (MIA), Minneapolis (MSP), Las Vegas (LAS), Portland (PDX), San Jose (SJC), Honolulu (HNL), and Washington (IAD).
- Time Analysis:** Shows a hand holding an orange alarm clock. Below it, a table provides the best time of day/day of week/time of year to fly to minimize delays.
- Flight Cancellation Trends:** Shows a table of flight cancellations by reason, month, and airline. The table includes columns for Date, Reason, Month, and Time. It lists several entries for American Airlines (AA) and United Airlines (UA) with reasons like "Cancelled" and times like "8:17A", "3:45P", "5:20P", and "6:40P".

At the bottom of the page, there's a "Real time Cancellation Status:" form with fields for Airline Carrier (AA), Flight Number (351), Origin (Boston), Destination (San Francisco), and a Check Status button. Below the form, a status message box is empty. At the very bottom, there's a footer with the text "Ankit Bhayani | NUID : 001632340 | Graduate Student, Information Systems | Northeastern University".

Best airlines to avoid delays: In this analysis, summarization pattern is used to calculate Average Carrier Delays and Min Arrival Delay, Min Arrival Delay, Min Departure Delay and Min Departure Delay (Aggregation Functions grouped on Unique Airline Carrier Code).  
<https://public.tableau.com/profile/ankit.bhayani#!/vizhome/FlightArrivalAnalysis/CarrierDelayDashBoard>



## Interactive Graphs on Tableau Public:

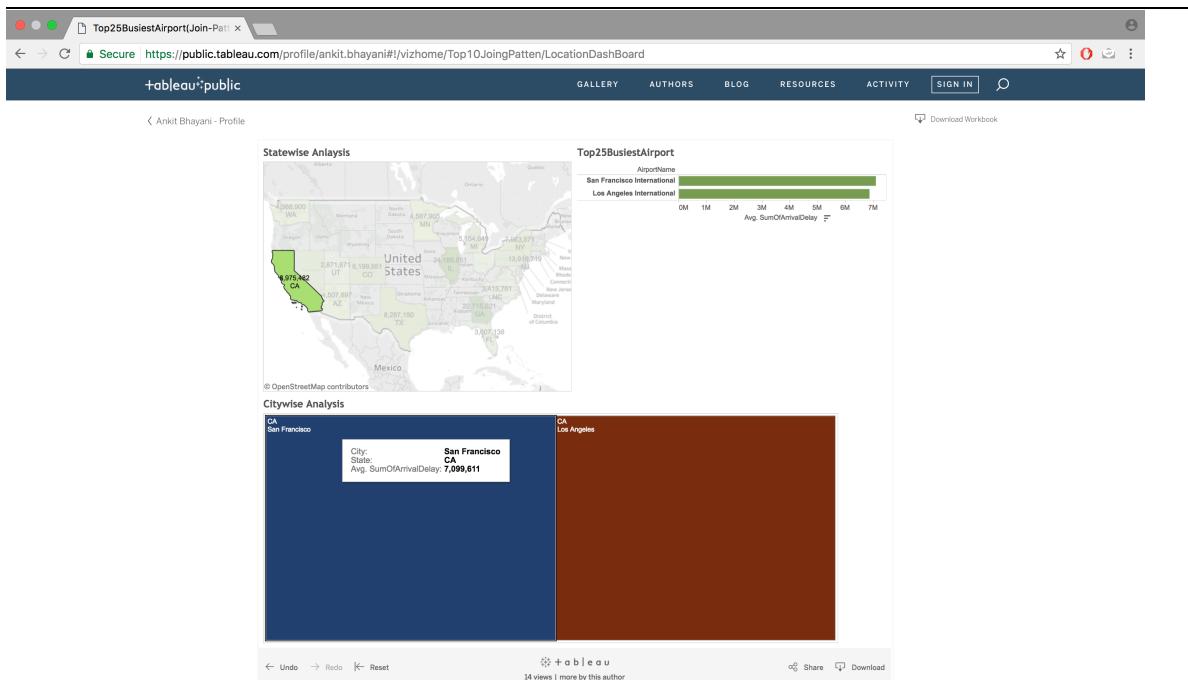
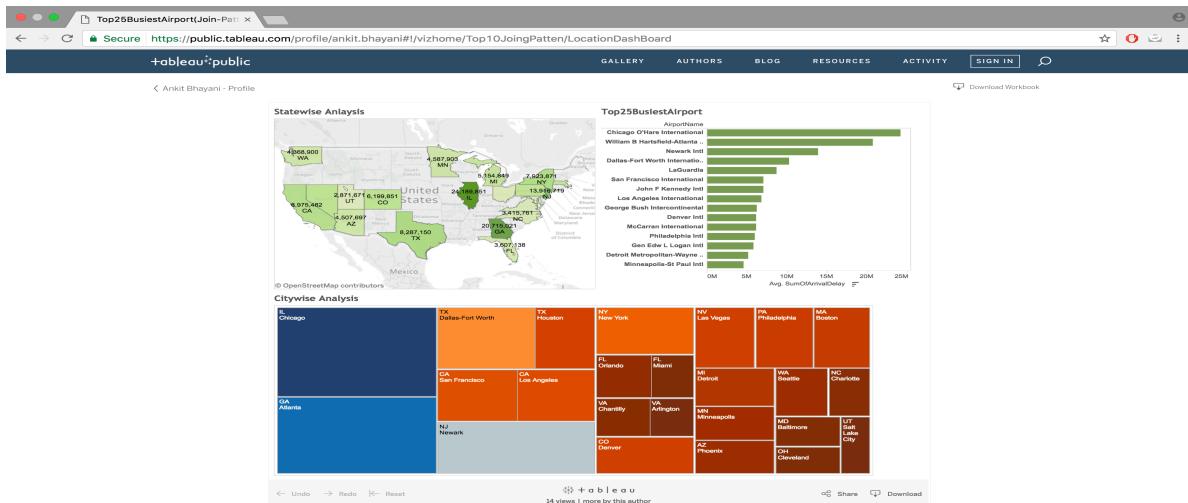


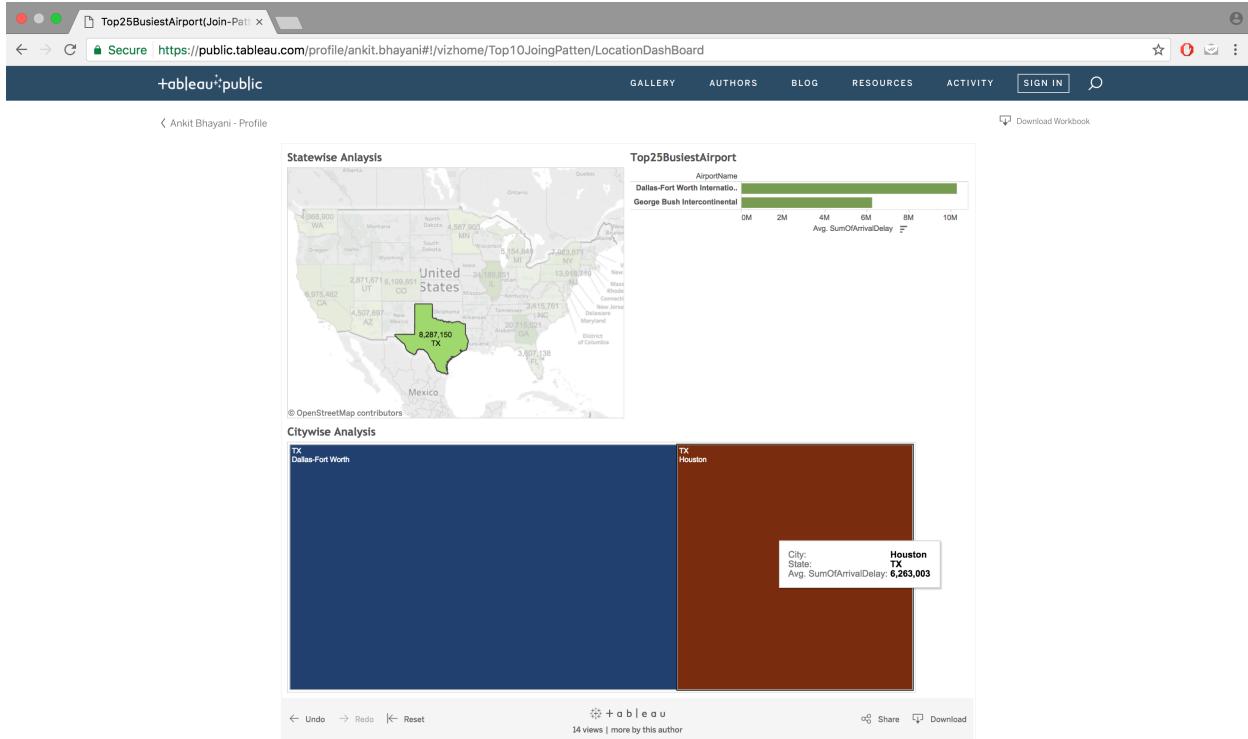
[Top 25 Busiest Airport or severely Delayed](#): In this analysis, Top 10 and Join pattern is used to calculate analysis on State-wise, city wise and to find out the busiest airport.

Tableau link:

<https://public.tableau.com/profile/ankit.bhayani#/vizhome/Top10JoiningPatten/LocationDashboard>

Please see next page for screenshots



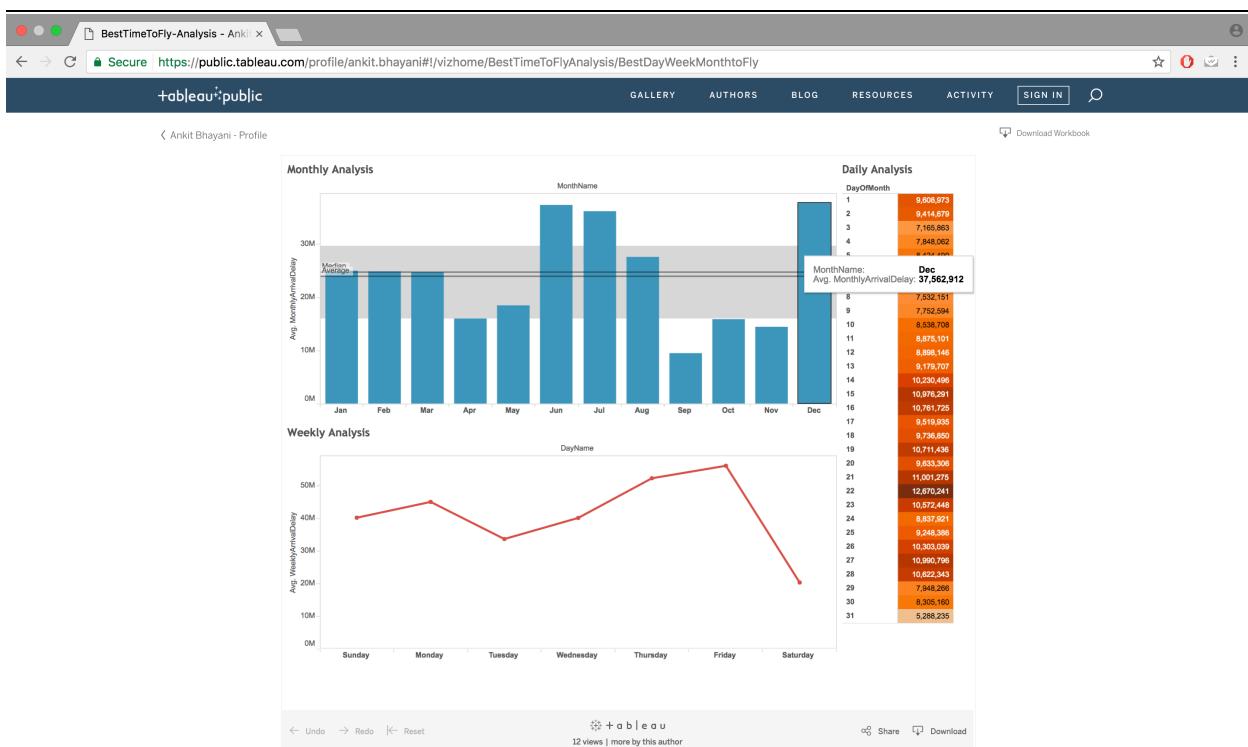
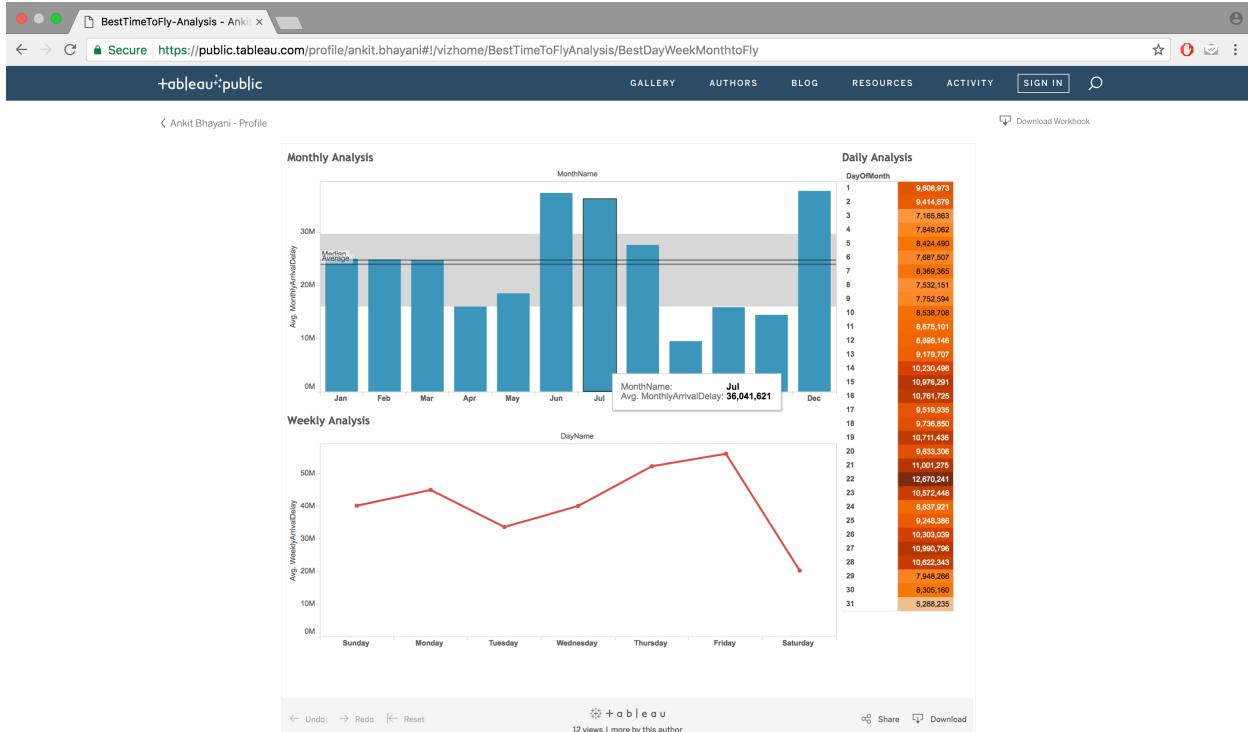


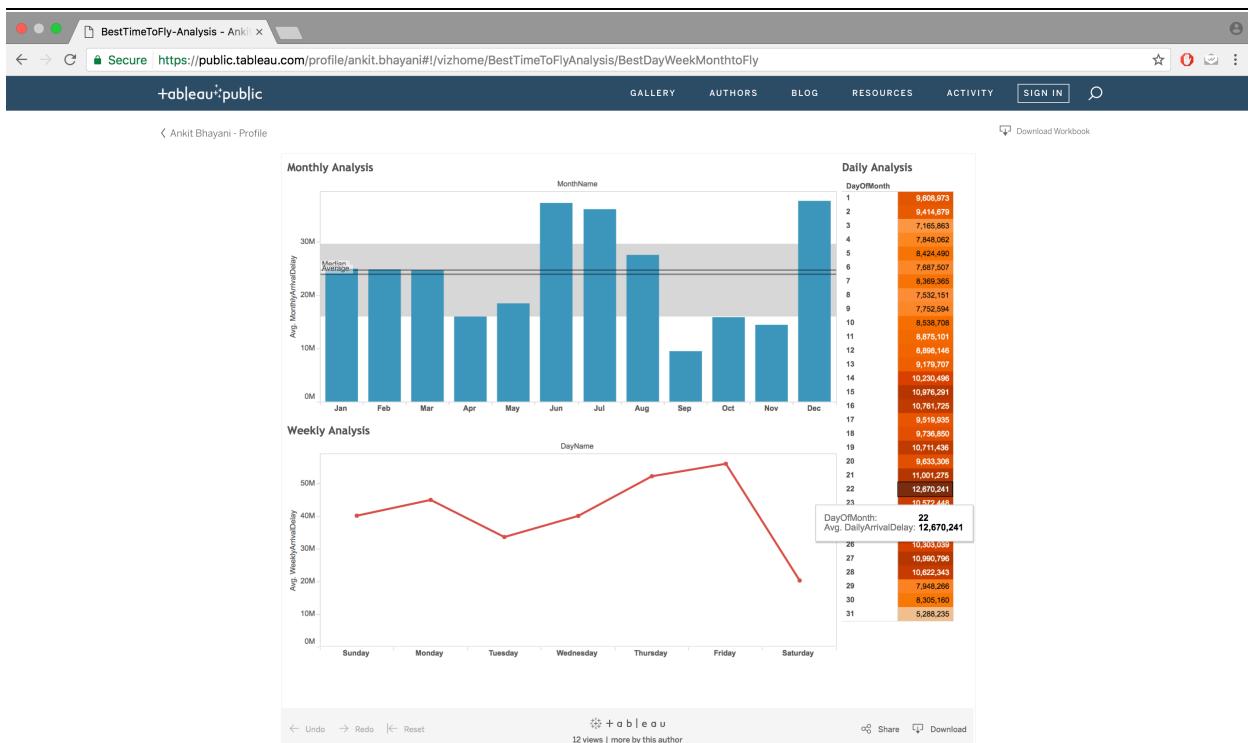
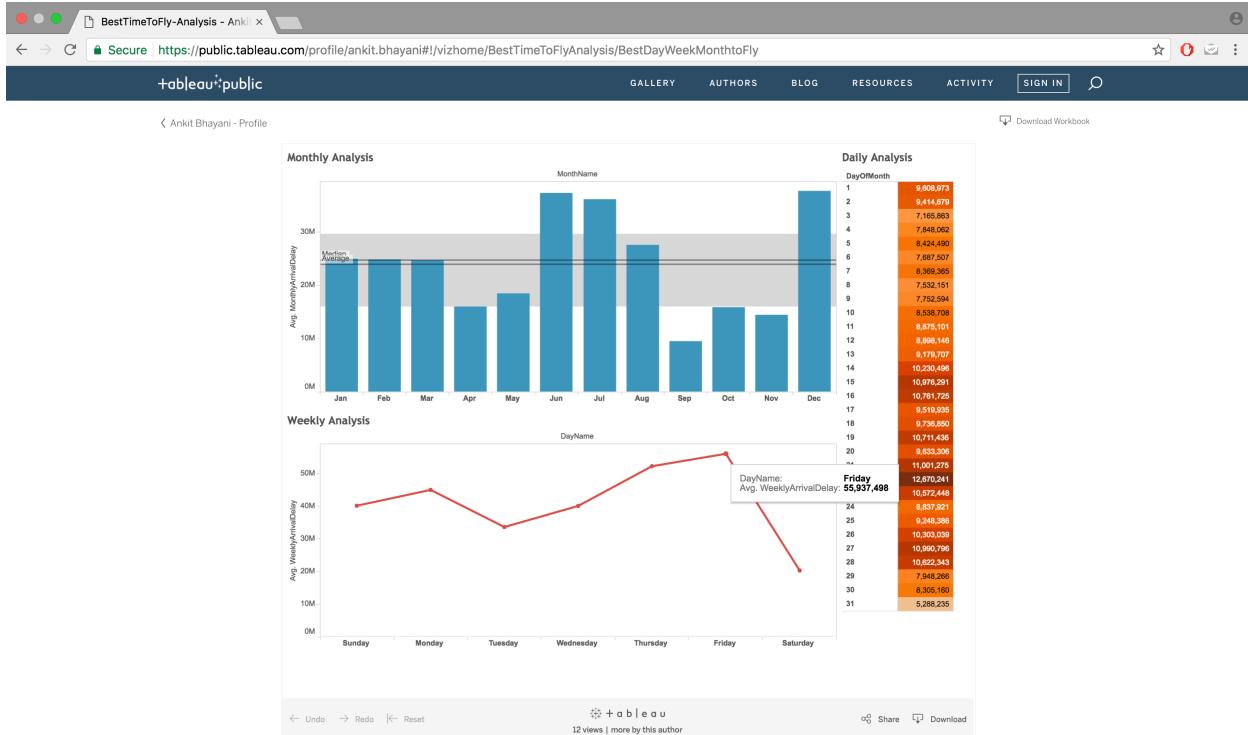
Best time of day/day of week/time of year to fly to minimize delays.: In this analysis, Partitioning pattern is used to calculate monthly, weekly and daily analysis.

Tableau link:

<https://public.tableau.com/profile/ankit.bhayani#/vizhome/BestTimeToFlyAnalysis/BestDayWeekMonthtoFly>

Please see next page for screenshots



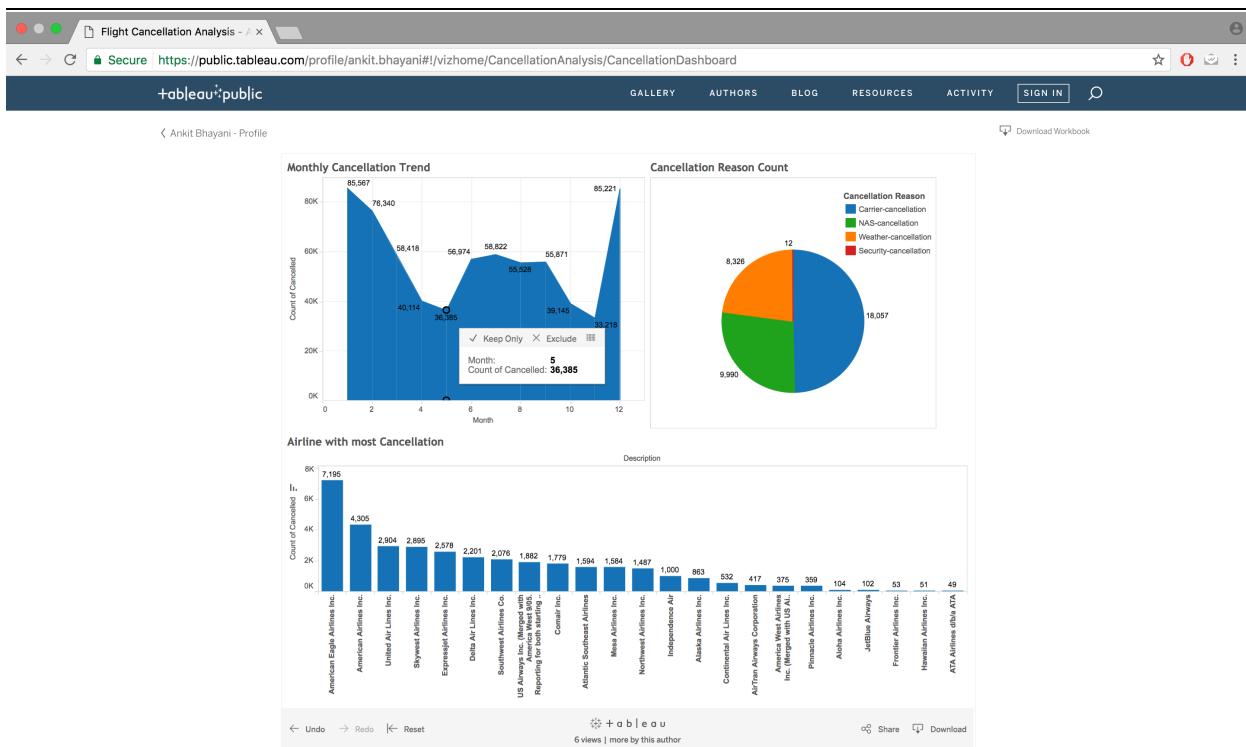
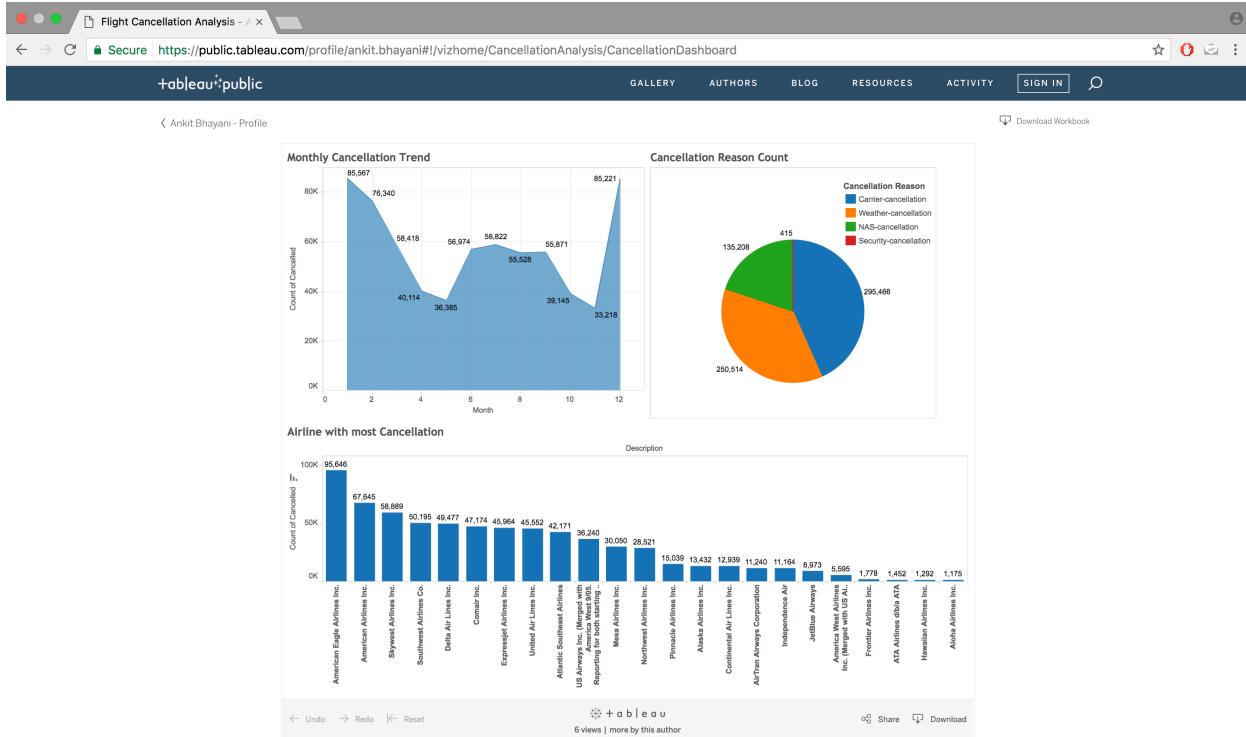


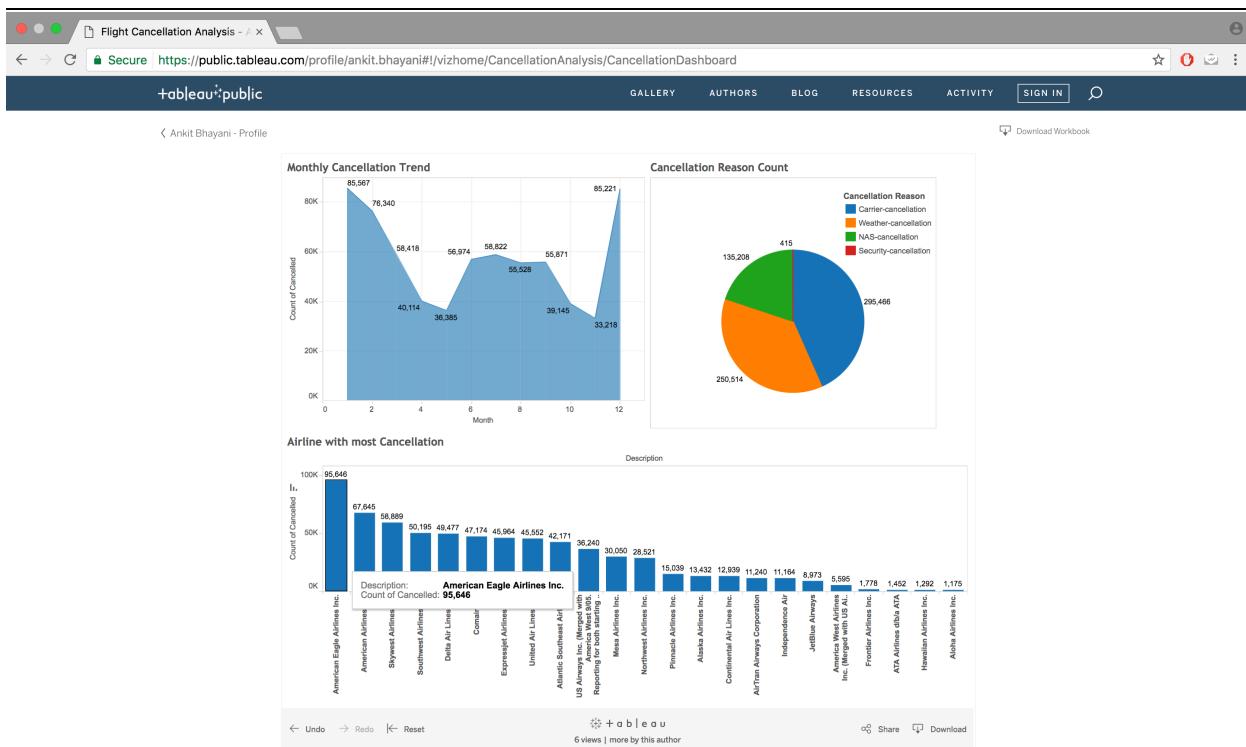
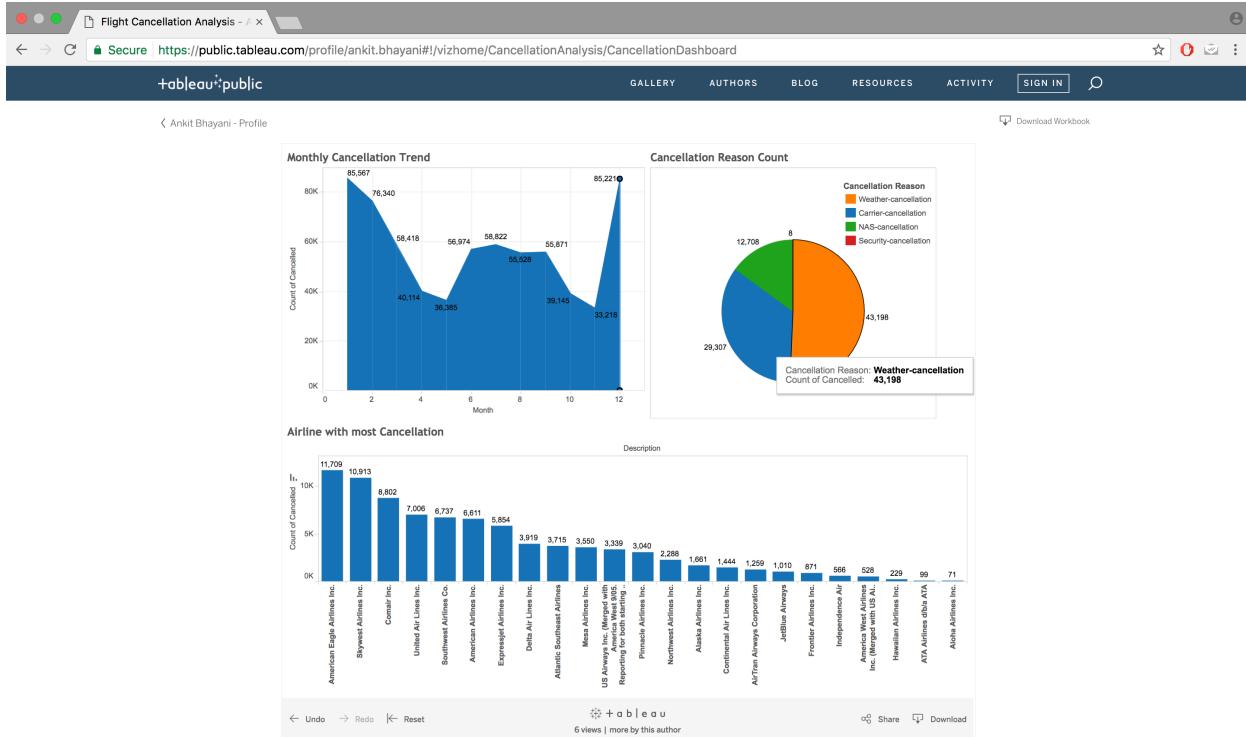
Flight Cancellation Trends.: In this analysis, Binning pattern is used to find out Cancellation counts on reasons, monthly basis and airlines.

Tableau link:

[https://public.tableau.com/profile/ankit.bhayani#/vizhome/CancellationAnalysis/Cancellation Dashboard](https://public.tableau.com/profile/ankit.bhayani#/vizhome/CancellationAnalysis/CancellationDashboard)

Please see next page for screenshots





## Real Time Flight Cancelled Status Check:

Binary Classification (Machine learning) through Amazon Machine learning and displaying the real-time status on webpage.

The screenshot shows the Amazon Machine Learning Evaluation Summary page. The evaluation has been completed successfully. Key details include:

- ID:** ev-rCsER9oSEHT
- Name:** Evaluation: ML model: FlightData\_2008
- Datasource ID:** ds-kKpvHG6m05A
- Output location:** Not available
- Creation time:** Apr 26, 2017 6:07:50 AM
- Completion time:** 5 mins.
- Compute Time (Approximate):** 4 mins.
- Status:** Completed
- Log:** Download log

In the ML model performance metric section, it states: "On your most recent evaluation, ev-rCsER9oSEHT, the ML model's quality score is considered suspiciously good (too good to be true?) for most machine learning applications." It shows an AUC of 1.00, which is highlighted in orange. The baseline AUC is 0.500, and the difference is 0.500.

Next step: If you want to use this ML model to generate predictions, explore trade-offs to optimize the performance of your ML model first.

Tags: Add or edit tags  
No tags

The screenshot shows the Amazon Machine Learning ML model performance page. The chart displays the distribution of predicted answers for actual "1" and "0" records. The x-axis represents the score, and the y-axis represents the number of records. The chart highlights the overlap area where the model guesses wrong. The legend indicates:

- Predicted most likely to be "0": Red shaded area
- Predicted most likely to be "1": Black shaded area

Key statistics from the chart:

- True negative (98.4%)
- True positive (0.0%)
- False negative (1.6%)

Trade-off based on score threshold: 0.5

Advanced metrics:

- False positive rate: 0
- Precision: 1
- Recall: 0.0003
- Accuracy: 0.984

The screenshot displays two identical pages from the Amazon Machine Learning console, one above the other. Both pages show the details of an ML model named "ML model: FlightData\_2008".

**ML model summary (Top Page):**

- ID:** ml-CrQUcPYyrtF
- Name:** ML model: FlightData\_2008
- Type:** Binary classification
- Creation time:** Apr 26, 2017 6:07:49 AM
- Completion time:** 30 mins. (30 mins. ago)
- Compute Time (Approximate):** 25 mins. (25 mins. ago)
- Status:** Completed
- Log:** Download log

**Evaluations (Top Page):**

- Evaluations created:** 1
- Latest evaluation result:** 1 (AUC)
- Buttons:** Perform another Evaluation, Try real-time predictions

**Predictions (Top Page):**

- CloudWatch metrics:** View in CloudWatch
- Score threshold:** 0.5
- A single dataset:** Generate one-time predictions for a single dataset.
- Buttons:** Generate batch predictions, Try real-time predictions

**ML model summary (Bottom Page):**

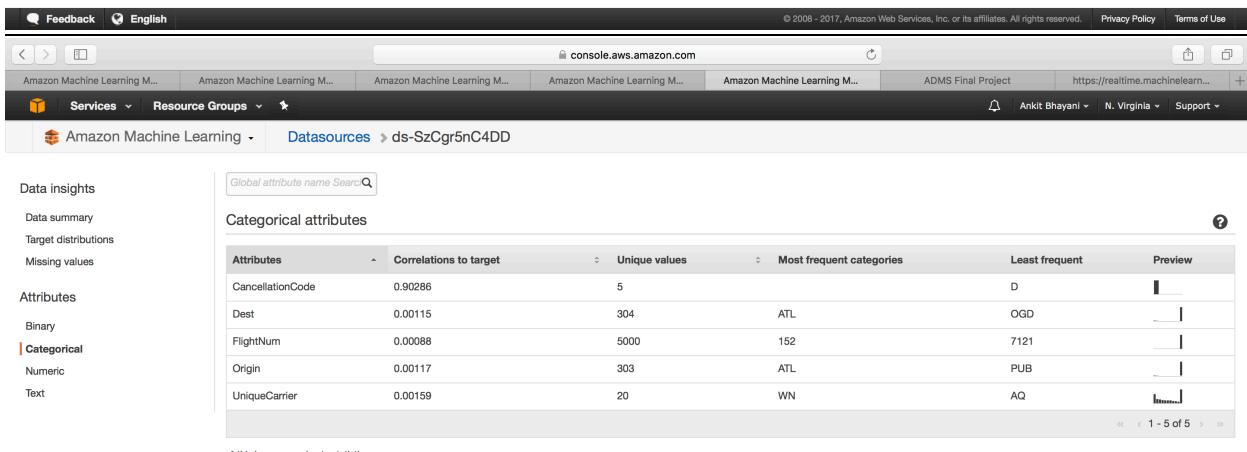
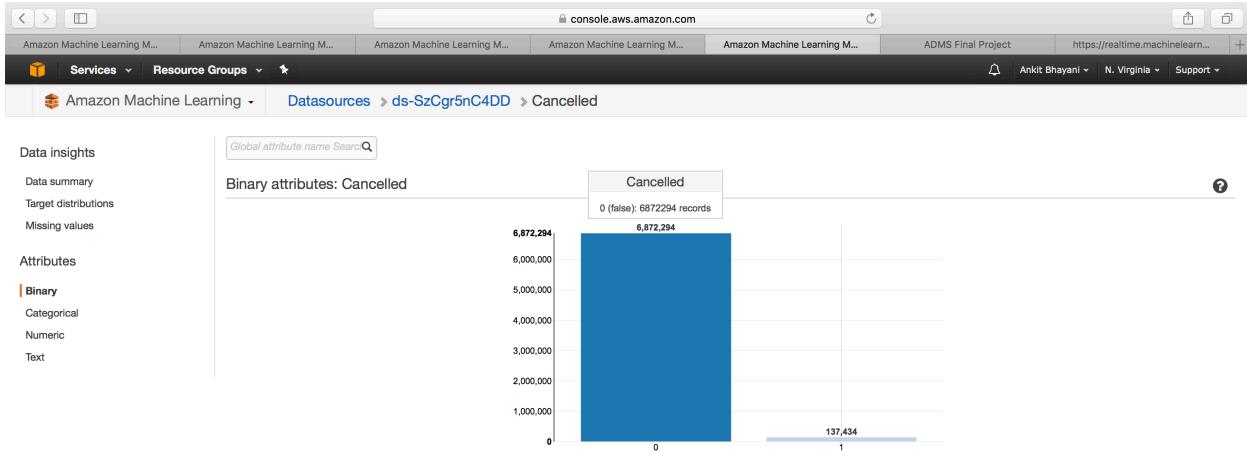
- Data source (training):**
- DataSource ID:** ds-odTj0ZA8D0D
- Target:** Cancelled
- Input schema:** View input schema

**Evaluations (Bottom Page):**

- Evaluations created:** 1
- Latest evaluation result:** 1 (AUC)
- Buttons:** Perform another Evaluation

**Predictions (Bottom Page):**

- CloudWatch metrics:** View in CloudWatch
- Score threshold:** 0.5
- A single dataset:** Generate one-time predictions for a single dataset.
- Buttons:** Generate batch predictions, Try real-time predictions
- Real-time endpoint:** Ready
- Endpoint URL:** https://realtime.machinelearning.us-east-1.amazonaws.com
- Peak Requests Per Second:** 200



**CONCLUSION:**

1. Southwest airline is more likely to have a departure delay.
2. Friday has largest probability of delayed flights.
3. December, June and July have largest percentage of delayed flights.
4. Among 50 busiest airports of US, Atlanta, Philadelphia and Chicago-ORD, these three airports have over 85% delayed flights. Ten airports' percentages of delay are over 80%.
5. The travelers should avoid taking Southwest airline's flights, avoid taking off on Friday or in December and avoid choosing larger airports such as Atlanta, Philadelphia and Chicago-ORD in order to reduce the probability to experience delayed flights.

**CODE:**

Summarization.java

```
package finalproject.summarization;

import java.io.IOException;

import org.apache.hadoop.conf.Configuration;
import org.apache.hadoop.fs.Path;
import org.apache.hadoop.io.Text;
import org.apache.hadoop.mapreduce.Job;
import org.apache.hadoop.mapreduce.Mapper;
import org.apache.hadoop.mapreduce.Reducer;
import org.apache.hadoop.mapreduce.lib.input.FileInputFormat;
import org.apache.hadoop.mapreduce.lib.output.FileOutputFormat;

public class Summarization {

    public static class Summarization_Mapper extends Mapper<Object,
    Text, Text, CompositeKeyWritable>{

        private Text UniqueCarrier = new Text();

        @Override
        protected void map(Object key, Text value, Mapper<Object,
    Text, Text, CompositeKeyWritable>.Context context)
            throws IOException, InterruptedException {

            if (!value.toString().contains("UniqueCarrier")) {
                String[] input = value.toString().split(",");
                UniqueCarrier.set(input[0] + ":" + input[1]);
                context.write(UniqueCarrier, value);
            }
        }
    }
}
```

```

        if(!input[14].equalsIgnoreCase("NA") &&
!input[15].equalsIgnoreCase("NA")){

            double carrierDelay = 0;
            if(input[15].equalsIgnoreCase("NA")) carrierDelay=0.0;
            else carrierDelay=Double.parseDouble(input[15]);

            CompositeKeyWritable outTuple= new
CompositeKeyWritable(Integer.parseInt(input[14]),Integer.parseInt(inpu
t[14]),

            Integer.parseInt(input[15]),Integer.parseInt(input[15]),carrierDe
lay,1);
            UniqueCarrier.set(input[8]);
            context.write(UniqueCarrier, outTuple);
        }
    }
}
}

```

```

public static class SummarizationReducer extends Reducer<Text,
CompositeKeyWritable, Text, CompositeKeyWritable> {

```

```

    @Override
    protected void reduce(Text key,
Iterable<CompositeKeyWritable> values,Reducer<Text,
CompositeKeyWritable, Text, CompositeKeyWritable>.Context context)
                        throws IOException,
InterruptedException {

```

```

        int minArrDel = Integer.MAX_VALUE;
        int maxArrDel = Integer.MIN_VALUE;
        int minDepDel = Integer.MAX_VALUE;
        int maxDepDel = Integer.MIN_VALUE;
        int count = 0;
        double sum = 0;

```

```

        for (CompositeKeyWritable val : values) {

            if (val.getArrMinDelay() < minArrDel)
                minArrDel = val.getArrMinDelay();

```

```

        if (val.getArrMaxDelay() > maxArrDel)
            maxArrDel = val.getArrMaxDelay();

        if (val.getDepMinDelay() < minDepDel)
            minDepDel = val.getDepMinDelay();

        if (val.getDepMaxDelay() > maxDepDel)
            maxDepDel = val.getDepMaxDelay();

        sum += val.getAverage()*val.getCount();
        count +=val.getCount();

    }

    context.write(key,new
CompositeKeyWritable(minArrDel, maxArrDel, minDepDel,
maxDepDel,(sum/count),count));
}

}

public static void main( String[] args ){
    System.out.println( "Hello World!" );

    Configuration conf = new Configuration();

    try {
        Job job = Job.getInstance(conf, "stock price high");
        job.setJarByClass(Summarization.class);
        job.setMapperClass(Summarization_Mapper.class);
        job.setCombinerClass(Summarization_Reducer.class);
        job.setReducerClass(Summarization_Reducer.class);
        job.setOutputKeyClass(Text.class);
        job.setOutputValueClass(CompositeKeyWritable.class);

        FileInputFormat.addInputPath(job, new Path(args[0]));
        FileOutputFormat.setOutputPath(job, new
Path(args[1]));

        System.exit(job.waitForCompletion(true) ? 0 : 1);
    } catch (Exception e) {
        e.printStackTrace();
    }
}

```

```
    }
}
```

CompositeKeyWritable.java

```
package finalproject.summarization;

import java.io.DataInput;
import java.io.DataOutput;
import java.io.IOException;

import org.apache.hadoop.io.Writable;

public class CompositeKeyWritable implements Writable{

    private int arrMinDelay;
    private int arrMaxDelay;
    private int depMinDelay;
    private int depMaxDelay;
    private double average;
    private long count;

    public CompositeKeyWritable(){}
    public CompositeKeyWritable(int arrMinDelay, int arrMaxDelay, int
depMinDelay,
        int depMaxDelay, double average, int count) {
        this.arrMinDelay = arrMinDelay;
        this.arrMaxDelay = arrMaxDelay;
        this.depMinDelay = depMinDelay;
        this.depMaxDelay = depMaxDelay;
        this.average = average;
        this.count = count;
    }

    public int getArrMinDelay() {
        return arrMinDelay;
    }

    public void setArrMinDelay(int arrMinDelay) {
        this.arrMinDelay = arrMinDelay;
    }
}
```

```
public int getArrMaxDelay() {
    return arrMaxDelay;
}

public void setArrMaxDelay(int arrMaxDelay) {
    this.arrMaxDelay = arrMaxDelay;
}

public int getDepMinDelay() {
    return depMinDelay;
}

public void setDepMinDelay(int depMinDelay) {
    this.depMinDelay = depMinDelay;
}

public int getDepMaxDelay() {
    return depMaxDelay;
}

public void setDepMaxDelay(int depMaxDelay) {
    this.depMaxDelay = depMaxDelay;
}

public double getAverage() {
    return average;
}

public void setAverage(double average) {
    this.average = average;
}

public long getCount() {
    return count;
}

public void setCount(long count) {
    this.count = count;
}

public void readFields(DataInput in) throws IOException {
    arrMinDelay = in.readInt();
    arrMaxDelay = in.readInt();
```

```
    depMinDelay = in.readInt();
    depMaxDelay = in.readInt();
    average = in.readDouble();
    count = in.readLong();

}

public void write(DataOutput out) throws IOException {
    out.writeInt(arrMinDelay);
    out.writeInt(arrMaxDelay);
    out.writeInt(depMinDelay);
    out.writeInt(depMaxDelay);
    out.writeDouble(average);
    out.writeLong(count);
}

@Override
public String toString() {
    return (arrMinDelay + " " + arrMaxDelay + " " + depMinDelay +
" " + depMaxDelay + " " + average + " " + count );
}

}
```

### Top10BusiestAirport.java

```
/*
 * To change this license header, choose License Headers in Project
Properties.
 * To change this template file, choose Tools | Templates
 * and open the template in the editor.
 */
package finalproject.top10;

import java.io.IOException;
import java.util.ArrayList;

import org.apache.hadoop.conf.Configuration;
import org.apache.hadoop.fs.Path;
import org.apache.hadoop.io.IntWritable;
import org.apache.hadoop.io.LongWritable;
import org.apache.hadoop.io.Text;
```

```
import org.apache.hadoop.mapreduce.Job;
import org.apache.hadoop.mapreduce.Mapper;
import org.apache.hadoop.mapreduce.Reducer;
import org.apache.hadoop.mapreduce.lib.input.FileInputFormat;
import org.apache.hadoop.mapreduce.lib.input.MultipleInputs;
import org.apache.hadoop.mapreduce.lib.input.TextInputFormat;
import org.apache.hadoop.mapreduce.lib.output.FileOutputFormat;

/**
 *
 * @author ankitbhayani
 */
public class Top10BusiestAirport {

    public static class Map1 extends Mapper<LongWritable, Text, Text,
    IntWritable>{

        @Override
        protected void map(LongWritable key, Text value, Context
        context) throws IOException, InterruptedException {

            if (!value.toString().contains("UniqueCarrier")) {

                String row[] = value.toString().split(",");
                if(!row[14].equalsIgnoreCase("NA")){
                    String destAirport = row[17];
                    //String arrDelay = row[14].trim();

                    try {
                        IntWritable busyRating = new
                        IntWritable(Integer.parseInt(row[14]));
                        context.write(new Text(destAirport),
                        busyRating);

                    } catch (Exception e) {
                        e.printStackTrace();
                    }
                }
            }
        }
    }
}
```

```

    }

}

public static class Reduce1 extends Reducer<Text, IntWritable,
Text, IntWritable>{

    private IntWritable result = new IntWritable();

    @Override
    protected void reduce(Text key, Iterable<IntWritable> values,
Context context)
        throws IOException, InterruptedException {
        //super.reduce(key, values, context); //To change body of
generated methods, choose Tools | Templates.
        //int count=0;
        int sum=0;
        //double avg=0;

        for(IntWritable val : values){
            sum += val.get();
            //++count;
        }

        //avg=sum/count;
        result.set(sum);
        context.write(key, result);
    }

}

public static class Map2 extends Mapper<LongWritable, Text,
IntWritable, Text>{

    //private final static IntWritable sales = new IntWritable();
    //private Text employee = new Text();

    @Override
    protected void map(LongWritable key, Text value, Context
context) throws IOException, InterruptedException {

```

```

    //super.map(key, value, context); //To change body of
generated methods, choose Tools | Templates.

    String row[] = value.toString().split("\t");
    //IntWritable movieId = new
IntWritable(Integer.parseInt(row[0]));
    //Text airport = new Text(row[0]);

    String rating = row[1].trim();

    try {
        IntWritable ratingg = new
IntWritable(Integer.parseInt(rating));
        context.write(ratingg, new Text(row[0]));

    } catch (Exception e) {
        e.printStackTrace();
    }

}

}

public static class Reduce2 extends Reducer<IntWritable, Text,
Text, IntWritable>{

    private static int count= 25;
    @Override
    protected void reduce(IntWritable key, Iterable<Text> values,
Context context) throws IOException, InterruptedException {

        for(Text val : values){
            if(count>0){
                context.write(val, key);
                --count;
            }
            else
                break;
        }

    }
}

```

```

}

public static class BusyRatingMapper extends Mapper<Object, Text,
Text, Text>{

    private Text outkey= new Text();
    private Text outValue= new Text();

    @Override
    public void map(Object key, Text value, Context context)
        throws IOException, InterruptedException {

        String airportList[] = value.toString().split("\t");
        String airport = airportList[0].replace("\\"", "");

        if(airport!=null){
            outkey.set(airport);
            outValue.set("A"+ value.toString().replace("\\"", ""));
            context.write(outkey, outValue);
        }
    }
}

public static class AiportMapper extends Mapper<Object, Text,
Text, Text>{

    private Text outkey= new Text();
    private Text outValue= new Text();

    @Override
    public void map(Object key, Text value, Context context)
        throws IOException, InterruptedException {

        String aiportList[] = value.toString().split(",");
        if (!value.toString().replace("\\"", "").contains("iata"))
        {
            String iata = aiportList[0].replace("\\"", "");
            //System.out.println("Airport nm ->" + iata);
            if(iata!=null){
                outkey.set(iata);
                outValue.set("B"+ value.toString().replace("\\"", "",

```

```

        """).replace(", ", " "));
            context.write(outkey, outValue);
        }
    }
}

public static class JoinReducer extends
Reducer<Text,Text,Text,Text> {

    public static final Text EMPTY_TEXT = new Text("");
    private Text tmp = new Text();
    private ArrayList<Text> listA = new ArrayList<Text>();
    private ArrayList<Text> listB= new ArrayList<Text>();
    private String joinType = null;

    @Override
    protected void setup(Context context) throws IOException,
InterruptedException {
        joinType= context.getConfiguration().get("join.type");
    }

    @Override
    public void reduce(Text key, Iterable<Text> values,Context
context)
        throws IOException, InterruptedException {

        listA.clear();
        listB.clear();

        for(Text val: values){
            tmp = val;

            if(tmp.charAt(0) == 'A'){
                listA.add(new
Text(tmp.toString().substring(1)));
            }
            else if(tmp.charAt(0) == 'B'){
                listB.add(new
Text(tmp.toString().substring(1)));
            }
        }
    }
}

```

```

        executeJoin(context);

    }

    private void executeJoin(Context context)
        throws IOException, InterruptedException{
        if(joinType.equalsIgnoreCase("inner")){
            if(!listA.isEmpty() && !listB.isEmpty()){
                for(Text A: listA){
                    for(Text B: listB){
                        //System.out.println("ListAB contains
: "+ A + " " + B);
                        context.write(A, B);
                    }
                }
            }
        }
    }

}

/**
 * @param args the command line arguments
 */
public static void main(String[] args) throws IOException,
InterruptedException, ClassNotFoundException {

    Configuration conf1 = new Configuration();
    Job job1 = Job.getInstance(conf1, "Chaining");
    job1.setJarByClass(Top10BusiestAirport.class);

    job1.setMapperClass(Map1.class);
    job1.setMapOutputKeyClass(Text.class);
    job1.setMapOutputValueClass(IntWritable.class);

    job1.setReducerClass(Reduce1.class);
    job1.setOutputKeyClass(Text.class);
    job1.setOutputValueClass(IntWritable.class);
}

```

```
job1.setCombinerClass(Reduce1.class);

FileInputFormat.addInputPath(job1, new Path(args[0]));
FileOutputFormat.setOutputPath(job1, new Path(args[1]));

boolean firstComplete = job1.waitForCompletion(true);
boolean secondComplete=false;

Configuration conf2 = new Configuration();
Job job2 = Job.getInstance(conf2, "Chaining");

if(firstComplete) {

    job2.setJarByClass(Top10BusiestAirport.class);
    job2.setMapperClass(Map2.class);
    job2.setMapOutputKeyClass(IntWritable.class);
    job2.setMapOutputValueClass(Text.class);

    job2.setReducerClass(Reduce2.class);
    job2.setOutputKeyClass(Text.class);
    job2.setOutputValueClass(IntWritable.class);

    job2.setSortComparatorClass(SortKeyComparator.class);

    job2.setNumReduceTasks(1);

    FileInputFormat.addInputPath(job2, new Path(args[1]));
    FileOutputFormat.setOutputPath(job2, new
Path(args[2]));

    secondComplete=job2.waitForCompletion(true);

}

Configuration conf3 = new Configuration();
Job job3 = Job.getInstance(conf3, "Join");

if(secondComplete){

    job3.setJarByClass(Top10BusiestAirport.class);
```

```

        job3.setMapperClass(BusyRatingMapper.class);
        job3.setMapperClass(AiportMapper.class);
        //job3.setMapOutputKeyClass(Text.class);
        //job3.setMapOutputValueClass(Text.class);
        job3.setReducerClass(JoinReducer.class);

        MultipleInputs.addInputPath(job3, new Path(args[2]),
TextInputFormat.class, BusyRatingMapper.class);
        MultipleInputs.addInputPath(job3, new Path(args[3]),
TextInputFormat.class, AiportMapper.class);
        job3.getConfiguration().set("join.type", "inner");

        job3.setOutputKeyClass(Text.class);
        job3.setOutputValueClass(Text.class);

        FileInputFormat.addInputPath(job3, new
Path(args[2]));
        FileOutputFormat.setOutputPath(job3, new
Path(args[4]));

        System.exit(job3.waitForCompletion(true)? 0 :1);
    }

}

}

```

## SortKeyComparator.java

```

/*
 * To change this license header, choose License Headers in Project Properties.
 * To change this template file, choose Tools | Templates
 * and open the template in the editor.
 */
package finalproject.top10;

import org.apache.hadoop.io.IntWritable;
import org.apache.hadoop.io.WritableComparable;
import org.apache.hadoop.io.WritableComparator;

```

```
/*
*
* @author ankitbhayani
*/
public class SortKeyComparator extends WritableComparator{

    protected SortKeyComparator() {
        super(IntWritable.class, true);
    }

    @Override
    public int compare(WritableComparable a, WritableComparable b) {
        IntWritable key1 = (IntWritable) a;
        IntWritable key2 = (IntWritable) b;

        int result = key1.get() < key2.get() ? 1 : key1.get() == key2.get() ? 0 : -1;
        return result;
    }

}

package finalproject.dailyanalysis;

import java.io.IOException;
//import static java.lang.System.exit;
import org.apache.hadoop.conf.Configuration;
import org.apache.hadoop.fs.Path;
import org.apache.hadoop.io.IntWritable;
import org.apache.hadoop.io.Text;
import org.apache.hadoop.mapreduce.Job;
import org.apache.hadoop.mapreduce.Mapper;
import org.apache.hadoop.mapreduce.Partitioner;
import org.apache.hadoop.mapreduce.Reducer;
import org.apache.hadoop.mapreduce.lib.input.FileInputFormat;
import org.apache.hadoop.mapreduce.lib.output.FileOutputFormat;

/*
*
* @author ankitbhayani

```

```

*/
public class DailyTraffic {

    public static class TMapper extends Mapper<Object, Text, Text,
IntWritable>{
        //private final static IntWritable one = new IntWritable(1);
        private Text dayOfTheMonth= new Text();

        public void map(Object key, Text value, Context context)
            throws IOException, InterruptedException {

            String row[] = value.toString().split(",");
            if (!value.toString().contains("UniqueCarrier")) {
                if(!row[14].equalsIgnoreCase("NA")){
                    dayOfTheMonth.set(row[2]);
                    context.write(dayOfTheMonth, new
IntWritable(Integer.parseInt(row[14])));
                }
            }
        }
    }

    public static class IReducer extends
Reducer<Text,IntWritable,Text,IntWritable> {
        private IntWritable result = new IntWritable();

        public void reduce(Text key, Iterable<IntWritable> values,Context
context)
            throws IOException, InterruptedException {
            int sum=0;

            for (IntWritable val : values){
                sum +=val.get();
            }
            result.set(sum);
            context.write(key, result);
        }
    }

    private static class LPartitioner extends Partitioner<Text,
IntWritable>{

        @Override

```

```
public int getPartition(Text key, IntWritable value, int numOfPartitions) {
    //int mon = 0;
    int mon = Integer.parseInt(key.toString());

    /*switch(key.toString()){
        case "Jan" :
            mon=1;break;
        case "Feb" :
            mon=2; break;
        case "Mar" :
            mon=3; break;
        case "Apr" :
            mon=4; break;
        case "May" :
            mon=5;break;
        case "Jun" :
            mon=6; break;
        case "Jul" :
            mon=7; break;
        case "Aug" :
            mon=8; break;
        case "Sep" :
            mon=9; break;
        case "Oct" :
            mon=10; break;
        case "Nov" :
            mon=11; break;
        case "Dec" :
            mon=12; break;

        default :
            System.out.println("Erroneous Month");
            exit(0);
    }*/

    return (mon % numOfPartitions);
}

public static void main(String[] args) throws IOException,
InterruptedException, ClassNotFoundException {
```

```

        Configuration conf = new Configuration();
        Job job = Job.getInstance(conf, "Daily Partitioning
count");
        job.setJarByClass(DailyTraffic.class);

        job.setMapperClass(TMapper.class);
        job.setMapOutputKeyClass(Text.class);
        job.setMapOutputValueClass(IntWritable.class);

        job.setPartitionerClass(LPartitioner.class);
        job.setNumReduceTasks(31);

        job.setCombinerClass(IReducer.class);
        job.setReducerClass(IReducer.class);
        job.setOutputKeyClass(Text.class);
        job.setOutputValueClass(IntWritable.class);
        FileInputFormat.addInputPath(job, new Path(args[0]));
        FileOutputFormat.setOutputPath(job, new Path(args[1]));
        System.exit(job.waitForCompletion(true) ? 0 : 1);
    }

}

package finalproject.partitioning;

import java.io.IOException;
//import static java.lang.System.exit;
import org.apache.hadoop.conf.Configuration;
import org.apache.hadoop.fs.Path;
import org.apache.hadoop.io.IntWritable;
import org.apache.hadoop.io.Text;
import org.apache.hadoop.mapreduce.Job;
import org.apache.hadoop.mapreduce.Mapper;
import org.apache.hadoop.mapreduce.Partitioner;
import org.apache.hadoop.mapreduce.Reducer;
import org.apache.hadoop.mapreduce.lib.input.FileInputFormat;
import org.apache.hadoop.mapreduce.lib.output.FileOutputFormat;

/**
 *
 * @author ankitbhayani
 */
public class MonthlyTraffic {

```

```

public static class TMapper extends Mapper<Object, Text, Text,
IntWritable>{
    //private final static IntWritable one = new IntWritable(1);
    private Text month= new Text();

    public void map(Object key, Text value, Context context)
        throws IOException, InterruptedException {

        String row[] = value.toString().split(",");
        if (!value.toString().contains("UniqueCarrier")) {
            if (!row[14].equalsIgnoreCase("NA")){
                month.set(row[1]);
                context.write(month, new
IntWritable(Integer.parseInt(row[14])));
            }
        }
    }

    public static class IReducer extends
Reducer<Text,IntWritable,Text,IntWritable> {
    private IntWritable result = new IntWritable();

    public void reduce(Text key, Iterable<IntWritable> values,Context
context)
        throws IOException, InterruptedException {
        int sum=0;

        for (IntWritable val : values){
            sum +=val.get();
        }
        result.set(sum);
        context.write(key, result);
    }
}

private static class LPartitioner extends Partitioner<Text,
IntWritable>{

    @Override
    public int getPartition(Text key, IntWritable value, int
numOfPartitions) {

```

```

//int mon = 0;
int mon = Integer.parseInt(key.toString());

/*switch(key.toString()){
    case "Jan" :
        mon=1;break;
    case "Feb" :
        mon=2; break;
    case "Mar" :
        mon=3; break;
    case "Apr" :
        mon=4; break;
    case "May" :
        mon=5; break;
    case "Jun" :
        mon=6; break;
    case "Jul" :
        mon=7; break;
    case "Aug" :
        mon=8; break;
    case "Sep" :
        mon=9; break;
    case "Oct" :
        mon=10; break;
    case "Nov" :
        mon=11; break;
    case "Dec" :
        mon=12; break;

    default :
        System.out.println("Erroneous Month");
        exit(0);
}

return (mon % num0fPartitions);
}

}

public static void main(String[] args) throws IOException,
InterruptedException, ClassNotFoundException {
    Configuration conf = new Configuration();
    Job job = Job.getInstance(conf, "Monthly Partitioning"

```

```
count");
    job.setJarByClass(MonthlyTraffic.class);

    job.setMapperClass(TMapper.class);
    job.setMapOutputKeyClass(Text.class);
    job.setMapOutputValueClass(IntWritable.class);

    job.setPartitionerClass(LPartitioner.class);
    job.setNumReduceTasks(12);

    job.setCombinerClass(IReducer.class);
    job.setReducerClass(IReducer.class);
    job.setOutputKeyClass(Text.class);
    job.setOutputValueClass(IntWritable.class);
    FileInputFormat.addInputPath(job, new Path(args[0]));
    FileOutputFormat.setOutputPath(job, new Path(args[1]));
    System.exit(job.waitForCompletion(true) ? 0 : 1);
}

package finalproject.weeklyanalysis;

import java.io.IOException;
//import static java.lang.System.exit;
import org.apache.hadoop.conf.Configuration;
import org.apache.hadoop.fs.Path;
import org.apache.hadoop.io.IntWritable;
import org.apache.hadoop.io.Text;
import org.apache.hadoop.mapreduce.Job;
import org.apache.hadoop.mapreduce.Mapper;
import org.apache.hadoop.mapreduce.Partitioner;
import org.apache.hadoop.mapreduce.Reducer;
import org.apache.hadoop.mapreduce.lib.input.FileInputFormat;
import org.apache.hadoop.mapreduce.lib.output.FileOutputFormat;

/**
 *
 * @author ankitbhayani
 */
public class WeeklyTraffic {

    public static class TMapper extends Mapper<Object, Text, Text,
```

```

IntWritable>{
    //private final static IntWritable one = new IntWritable(1);
    private Text dayOfTheWeek= new Text();

    public void map(Object key, Text value, Context context)
        throws IOException, InterruptedException {

        String row[] = value.toString().split(",");
        if (!value.toString().contains("UniqueCarrier")) {
            if(!row[14].equalsIgnoreCase("NA")){
                dayOfTheWeek.set(row[3]);
                context.write(dayOfTheWeek, new
IntWritable(Integer.parseInt(row[14])));
            }
        }
    }

    public static class IReducer extends
Reducer<Text,IntWritable,Text,IntWritable> {
        private IntWritable result = new IntWritable();

        public void reduce(Text key, Iterable<IntWritable> values,Context
context)
            throws IOException, InterruptedException {
            int sum=0;

            for (IntWritable val : values){
                sum +=val.get();
            }
            result.set(sum);
            context.write(key, result);
        }
    }

    private static class LPartitioner extends Partitioner<Text,
IntWritable>{

        @Override
        public int getPartition(Text key, IntWritable value, int
numOfPartitions) {
            //int mon = 0;
            int mon = Integer.parseInt(key.toString());
    }
}

```

```

/*switch(key.toString()){
    case "Jan" :
        mon=1;break;
    case "Feb" :
        mon=2; break;
    case "Mar" :
        mon=3; break;
    case "Apr" :
        mon=4; break;
    case "May" :
        mon=5;break;
    case "Jun" :
        mon=6; break;
    case "Jul" :
        mon=7; break;
    case "Aug" :
        mon=8; break;
    case "Sep" :
        mon=9; break;
    case "Oct" :
        mon=10; break;
    case "Nov" :
        mon=11; break;
    case "Dec" :
        mon=12; break;

    default :
        System.out.println("Erroneous Month");
        exit(0);
}

*/
return (mon % numofPartitions);
}

}

public static void main(String[] args) throws IOException,
InterruptedException, ClassNotFoundException {
    Configuration conf = new Configuration();
    Job job = Job.getInstance(conf, "Daily Partitioning
count");
    job.setJarByClass(WeeklyTraffic.class);
}

```

```
        job.setMapperClass(TMapper.class);
        job.setMapOutputKeyClass(Text.class);
        job.setMapOutputValueClass(IntWritable.class);

        job.setPartitionerClass(LPartitioner.class);
        job.setNumReduceTasks(7);

        job.setCombinerClass(IReducer.class);
        job.setReducerClass(IReducer.class);
        job.setOutputKeyClass(Text.class);
        job.setOutputValueClass(IntWritable.class);
        FileInputFormat.addInputPath(job, new Path(args[0]));
        FileOutputFormat.setOutputPath(job, new Path(args[1]));
        System.exit(job.waitForCompletion(true) ? 0 : 1);
    }

}

package finalproject.binning;

/*
 * To change this license header, choose License Headers in Project
Properties.
 * To change this template file, choose Tools | Templates
 * and open the template in the editor.
 */

import java.io.IOException;
import org.apache.hadoop.conf.Configuration;
import org.apache.hadoop.fs.Path;
import org.apache.hadoop.io.IntWritable;
import org.apache.hadoop.io.NullWritable;
import org.apache.hadoop.io.Text;
import org.apache.hadoop.mapreduce.Job;
import org.apache.hadoop.mapreduce.Mapper;
import org.apache.hadoop.mapreduce.lib.input.FileInputFormat;
import org.apache.hadoop.mapreduce.lib.output.FileOutputFormat;
import org.apache.hadoop.mapreduce.lib.output.MultipleOutputs;
import org.apache.hadoop.mapreduce.lib.output.TextOutputFormat;

/**
 *
 * @author ankitbhayani

```

```
/*
public class FlightCancellationReasonBinning {

    public static class TMapper extends Mapper<Object, Text, Text,
    NullWritable>{

        private MultipleOutputs<Text, NullWritable> mos=null;
        //private final static IntWritable one = new IntWritable(1);
        //private Text hour= new Text();

        @Override
        protected void setup(Context context) throws IOException,
        InterruptedException {
            mos = new MultipleOutputs(context);
        }

        @Override
        public void map(Object key, Text value, Context context)
            throws IOException, InterruptedException {

            String row[] = value.toString().split(",");
            if (!value.toString().contains("UniqueCarrier")) {
                if(!row[21].equalsIgnoreCase("0")){
                    String cancellationCode = row[22];

                    if(cancellationCode.equalsIgnoreCase("A"))
                        mos.write("bins", value, NullWritable.get(), "Carrier-
cancellation");
                    if(cancellationCode.equalsIgnoreCase("B"))
                        mos.write("bins", value, NullWritable.get(), "Weather-
cancellation");
                    if(cancellationCode.equalsIgnoreCase("C"))
                        mos.write("bins", value, NullWritable.get(), "NAS-
cancellation");
                    if(cancellationCode.equalsIgnoreCase("D"))
                        mos.write("bins", value,
NullWritable.get(), "Security-cancellation");
                }
            }
        }

        @Override
        protected void cleanup(Context context) throws IOException,
        InterruptedException {
```

```
        mos.close();
    }

}

public static void main(String[] args) throws IOException,
InterruptedException, ClassNotFoundException {
    Configuration conf = new Configuration();
    Job job = Job.getInstance(conf, "Cancellation Binning ");
    job.setJarByClass(FlightCancellationReasonBinning.class);

    job.setMapperClass(TMapper.class);

    MultipleOutputs.addNamedOutput(job, "bins",
TextOutputFormat.class, Text.class, IntWritable.class);
    MultipleOutputs.setCountersEnabled(job, true);
    job.setNumReduceTasks(0);

    job.setOutputKeyClass(Text.class);
    job.setOutputValueClass(NullWritable.class);
    FileInputFormat.addInputPath(job, new Path(args[0]));
    FileOutputFormat.setOutputPath(job, new Path(args[1]));
    System.exit(job.waitForCompletion(true) ? 0 : 1);
}

}
```