BAN 130 - ZBB

Programming for Analytics

Flight Delay Prediction

Group 9:

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Submitted To:

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INTRODUCTION

The goal of the project is to use a statistical model to determine if a domestic aircraft be delayed or rescheduled for more than 15 minutes in Jan. We have considered various factors, for example, the take-off time, day of the month, and the transporter the traveler is flying with. The travel information of all domestic planes which flew in Jan 2004 was included in the dataset we used to develop the statistical method. Our forecast model would permit a traveler to know his/her possibility of being postponed over 15 minutes, as well as assist airline businesses in measuring their performance and addressing problems that cause flight delays.

Because the airline business is so dynamic, airlines tend to keep their unpleasant performance outcomes hidden. Even though the United States Department of Transportation maintains actual flight information and makes it publicly available, most don't have the analytical background to evaluate the data in depth. Our team would want to use this chance to predict the results aimed at forecasting whether a flight will arrive on time or late, as well as providing consumer recommendations and interrelated parameters for airports and airlines.

DATASET

The database includes information such as day of the month, day of the week, origin, departure time, Flight number, Carrier, Weather, Tail number, Flight Status, Flight Date, Distance, Destination, and CRS Elapsed Time of Flight (estimated elapse time) operated by major airlines.

Goal: Accurately predict whether a flight, will be delayed (e.g., 15 min or more) (outcome 1 = delayed and 0 = on time).

• Data: 2001 record with 5 predictors (variables). All flights from the Washington, DC area into the New Your City area during January 2004.

• Filename: FlightDelays.csv

Day of week: Coded as 1 = Monday, 2 = Tuesday, ..., 7 = Sunday

Sch. Dep. Time: Broken down into 18 intervals between 6:00 AM and 10:00 PM Origin: The

airport codes: DCA (Reagan National), IAD (Dulles), BWI (BaltimoreWashington Int'l)

Destination: Three airport codes: JFK (Kennedy), LGA (LaGuardia), EWR (Newark)

Carrier: Eight airline codes: CO (Continental), DH (Atlantic Coast), DL (Delta), MQ (American Eagle), OH (Comair), RU (Continental Express), UA (United), and US (USAirways)
FlightDelays.csv is a database that offers details on all passenger airlines that left Washington, D.C., and landed in New York in January 2004. There contains data on the entry and exit airports, the route mileage, the expected timestamp of the trip, and so on for every flight. The variable we're seeking to analyze is whether or not a flight will be delayed. A delay can be defined as a time difference of at least 15 minutes from the anticipated arrival time.

IMPORTING THE DATASET

PROC IMPORT DATAFILE="/home/u60687931/BAN130ZBB/FlightDelays.csv"

OUT=Flight DBMS=csv;

run;

proc print data=Flight(obs=5);

run;

Obs	CRS_DEP_TME	GARRIER	DEP_TIME	DEST	DISTANCE	FL_DATE	PL_NUM	ORGN	Weather	BAY_WEEK	DAY_OF_MONTH	TAIL_NUM	Flight Status	new_DEP_TIME	new_GRS_TIME	CRS_TIME
1	1040	DH	1640	JFK.	213	2004-01- 01	8155	DGA		4	1	N409FJ	orême	15:40	0.90	
2	1455	OL.	1458	JFK.	213	2004-01- 01	346	DOA		4	1	N9180C	orême	14:58	0.90	
9	900	OL.	950	LGA	214	2004-01- 01	1746	DOA		4	1	N9430L	ontime	9.32	0.90	
4	1298	OL.	1229	LGA	214	200H-01- 01	1752	DCA		4	1	N9410L	ontime	12:26	0:90	
5	1400	DL.	1429	LGA	214	200H-01- 01	1758	DCA		4	1	NOVIOL	ordine	14:29	0:90	

1. HANDLING MISSING DATA

```
/* Check missing values in Dataset */

TITLE "Checking for missing values";

PROC MEANS DATA=Flight mean median max min n nmiss maxdec=3;

RUN;
```

DATA Flight;

SET Flight;

IF FL_DATE=. then

delete;

RUN;

/* Check missing values in Dataset after modification*/ TITLE "Check missing values in Dataset after modification"; PROC MEANS

Checking for missing values

The MEANS Procedure

Variable	Mean	Median	Maximum	Minimum	N	N Miss
CRS_DEP_TIME	1371.939	1455.000	2130.000	600.000	2201	0
DEP TIME	1369.299	1450.000	2330.000	10.000	2201	0
DISTANCE	211.871	214.000	229.000	169.000	2201	0
FL_DATE	16086.032	16086.000	16101.000	16071.000	2200	1
FL_NUM	3815.086	2385.000	7924.000	746.000	2201	0
Weather	0.015	0.000	1.000	0.000	2201	0
DAY_WEEK	3.905	4.000	7.000	1.000	2201	0
DAY_OF_MONTH	16.025	16.000	31.000	1.000	2201	0

Check missing values in Dataset after modification

The MEANS Procedure

Variable	Mean	Median	Maximum	Minimum	N	N Miss
CRS_DEP_TIME	1371.901	1455.000	2130.000	600.000	2200	0
DEP TIME	1369.260	1450.000	2330.000	10.000	2200	0
DISTANCE	211.884	214.000	229.000	169.000	2200	0
FL_DATE	16086.032	16086.000	16101.000	16071.000	2200	0
FL_NUM	3814.123	2385.000	7924.000	746.000	2200	0
Weather	0.015	0.000	1.000	0.000	2200	0
DAY_WEEK	3.905	4.000	7.000	1.000	2200	0
DAY_OF_MONTH	16.032	16.000	31.000	1.000	2200	0

2. NEW DATASET 'FLIGHT DELAYS'

/* Create a new SAS dataset "FlightDelays" containing only one Origin plus a new variable called DelayedFlight with values of 1 for delayed flight and 0 for none */

```
DATA Flight;
```

```
SET Flight;
```

WHERE ORIGIN='DCA';

NewDepTime=input(cats(DEP_TIME, "00"), hhmmss.);

format NewDepTime time5.;

NewCRSTime=input(cats(CRS_TIME, "00"), hhmmss.);

format NewCRSTime time5.;

MinDiff=intck("minutes", new_CRS_DEP_TIME, NewDepTime);

```
IF MinDiff ge 15 THEN

DelayedFlight="1";

ELSE

DelayedFlight="0";

RUN;

proc print data=Flight(obs=5);

run;
```



3. AVERAGE DELAY PER DAY

```
/* Generate a table for the average delay per day for each airport and plot the vertical bar chart for the 7 days. */

proc sql;

create table AvgDelayPerDay as select DEST, DAY_WEEK, avg(MinDiff)

as AvgDelay from Flight where DelayedFlight='1' group by DEST, DAY_WEEK order by DEST asc;

quit;

TITLE "FIRST 10 OBSERVATIONS";

PROC PRINT DATA=Flight(OBS=10) NOOBS;

RUN;
```

```
TITLE "FIRST 10 OBSERVATIONS FOR DELAYED FLIGHTS";

PROC PRINT DATA=Flight(OBS=10) NOOBS;

WHERE DelayedFlight='1';
```

RUN;

							FIR	IST 10 O	BSERWATIC	IMS						
CRS_DEP_TME	CARRIER	DEP_TIME	DEST	DISTRACE	FL_DATE	FL_NUM	ORIGIN	Weather	DAY_WEEK	DAY_OF_MONTH	TAL_NUM	Flight Status	new_DEP_TIME	new_CRS_TIME	CRS_TME	#UU
1640	DH	1640	JPK	213	2904-01- 01	6155	DGA	0	4	1	NADSEJ	ontime	16.40	8:08		
1455	DL.	1458	JEK	213	2964-01- 01	746	DGA	0	4	1	NOTECE	ontime	14:58	8:00		
930	DL.	902	LGA	214	2004-01- 01	1746	DCA	0	4	1	NOVIDL.	ontime	9.32	808		
1230	DL.	1208	LOA	214	2004-01- 01	1752	DCA	0	4	1	N2H10L	ontime	12.28	000		
1430	DL.	1429	LGA	214	2904-01- 01	1758	DCA	0	4	1	N2430L	onlime	14:29	808		
1750	DL.	1726	LGA	214	2904-01- 01	1762	DGA	0	4	1	NOVIOL	ontime	17:26	8:00		
2010	DL.	2029	LGA	214	2984-01- 01	1768	DCA	0	4	1	NEKEOL	ontime	20:29	808		
1830	MO	1525	"FK	213	3004-01- 01	4752	DCA	0	4	1	NTSIMIC	ontime	15.25	000		
600	MQ	586	,PK	213	2904-01- 01	4760	DCA	0	4	1	NTITHO	onlime	5.96	0.00		
1650	MO	1822	JFK	213	2904-01- 01	4784	DGA	0	4	1	NTSTMO	ontime	19:22	8:00		

4. REPORT SHOWING MEAN NUMBER OF FLIGHTS /*

Produce a report showing the mean number of flights per day for each Carrier. Give a sample of a scatter plot for one of the Carrier. */

```
* Calculating the number of flights per day of month for each Carrier
```

; PROC MEANS DATA=Flight;

CLASS carrier;

OUTPUT OUT=flight1 MEAN=A;

RUN;

*Deleting the 1st Row with data for all combined;

PROC SQL;

DELETE FROM flight1 WHERE carrier="";

RUN;

*Getting the average flights per day for each carrier in Average variable;

```
SET flight1;
                Average_Flights_Per_Day=Freq / 30;
                DROP A Type Freq;
         RUN;
         TITLE "Report for Mean number of flights per day for each airport";
         PROC PRINT DATA=flight1 Averaged noobs;
         RUN;
         proc means data=Flight;
                where carrier="DH";
                class FL_Date;
                output out=Flight2 mean=A;
         run;
         *Deleting extra row;
         PROC SQL;
                DELETE FROM Flight2 WHERE FL_Date=.;
         run;
         *Plotting our Scatterplot;
         Title "Plot for Mean number of flights per day each airport for 'DH' Carrier";
         proc sgplot data=Flight2;
                scatter x=fl_date y=freq ;
         run;
4/14/22, 1:27 AM Results: Project.sas
```

The MEANS Procedure

CARRIE R	N Obs	Variable	N	Mean	Std Dev	Minimum	Maximum	

			1	1			
СО	94	CRS_DEP_TIME DEP_TIME DISTANCE FL_DATE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTIME MinDiff	9 4 9 4 9 4 9 4 9 4 9 4 0 0 0 9 4 9 4 0	1419.50 1413.23 199.0000 000 16086 .16 841.2659 574 0.0212 766 3.7446809 16.1595745 51857.87 0 51857.87 0	414.8253 098 422.9878 726 0 8.5387204 169.0298 806 0.1450 787 1.8776339 8.5387204 15236.27 0 15236.27	735.0000 000 727.0000 000 199.0000 000 16071.00 806.0000 1.0000000 1.0000000 26820.00 0 26820.00 0	1900.00 1959.00 199.0000 000 16101 .00 1767.00 1.0000000 7.0000000 31.0000 000 71940 .00 0 71940.00 0
DH	27	CRS_DEP_TIME DEP_TIME DISTANCE FL_DATE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTIME MinDiff	2 7 2 7 2 7 2 7 2 7 2 7 2 7 2 7 2 7 2 7	1640.00 1650.44 213.0000 000 16086 .30 6155.00 0 4.2592593 16.2962963 60360.00 0 60360.00	0 58.4329 5 5 2 0 8.9520724 0 1.93333628 8.9520724 2134.59 0 	1640.00 1630.00 213.0000 000 16071 .00 6155.00 0 1.0000000 59400.00 0 59400.00 0	1640.00 1941.00 213.0000 000 16101 .00 6155.00 0 7.0000000 31.0000 000 70860 .00 0 70860.00 0
DL	388	CRS_DEP_TIME DEP_TIME DISTANCE FL_DATE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTime MinDiff	38 8 38 8 38 8 38 8 38 8 38 8 38 8 38	1369.37 1373.59 213.9201 031 16086 .34 1674.05 0.0077320 3.8608247 16.3402062 50163.71 0	411.6614 735 413.0830 326 0.271483 6 8.4549410 273.9521 402 0.0877 040 1.8955166 8.4549410 14866.64 0	630.0000 000 627.0000 000 213.0000 16071.00 746.0000 1.0000000 1.0000000 23220.00 0 23220.00	2030.00 2033.00 214.0000 000 16101 .00 1768.00 1.0000000 7.0000000 31.0000 000 73980 .00 0

			38 8 0				
MQ	295	CRS_DEP_TIME DEP_TIME DISTANCE FL_DATE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTime MinDiff	29 5 29 5 29 5 29 5 29 5 29 5 29 5 29 5	1312.97 1305.77 213.6915 254 16085 .74 4902.87 0.0338983 3.7898305 15.7389831 47951.59 0	421.8907 057 445.2284 223 0.462648 4 8.4986797 92.3125 025 0.1812 749 1.8561989 8.4986797 15865.51 0 15865.51	600.0000 000 548.0000 000 213.0000 000 16071.00 4752.00 0 1.0000000 20880.00 0 20880.00 0	1900.00 2023.00 214.0000 000 16101 .00 4976.00 1.0000000 7.0000000 31.0000 000 73380 .00 0 73380.00 0

CARRIE R	N Obs	Variable	N	Mean	Std Dev	Minimum	Maximum
RU	162	CRS_DEP_TIME DEP_TIME DISTANCE FL_DATE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTIME MinDiff	16 2 16 2 16 2 16 2 16 2 16 2 16 2 0 0 0 16 2 16 2	1368.43 1372.07 199.0000 000 16085 .58 2454.48 0.0061728 3.9753086 15.5802469 50353.70 0 50353.70	463.4422 489 471.5012 646 0 8.8596569 270.6426 491 0.0785 674 1.8548262 8.8596569 16925.79 0 16925.79	645.0000 000 638.0000 199.0000 000 16071.00 2097.00 0 1.0000000 23880.00 0 23880.00 0	2130.00 2244.00 199.0000 000 16101 .00 2879.00 1.0000000 7.0000000 31.0000 000 81840 .00 0 81840.00 0

US	404	CRS_DEP_TIME	40	1363.37	448.0889	630.0000	2100.00
		DEP_TIME	4	1328.25	163	000	2139.00
		DISTANCE	40	214.0000	446.0715	625.0000	214.0000
		FL_DATE	4	000	547 0	000	000
		FL_NUM	40	16086	8.5436468	214.0000	16101
		Weather	4	.34	151.1816	000	.00
		DAY_WEEK	40	2139.62	387	16071.00	2188.00
		DAY_OF_MONTH	4	0.0024752	0.0497	1479.00	1.0000000
		new_DEP_TIME	40	3.8143564	519	0	7.0000000
		new_CRS_TIME	4	16.3391089	1.9273896	1.0000000	31.0000
		CRS_TIME	40	49011.98	8.5436468	1.0000000	000
		diff_in_minutes	4	0	16064.86	23100.00	77940
		new_CRS_DEP_TI	40		0	0	.00
		ME NewDepTime	4				0
		NewCRSTime	40				
		MinDiff	4	49011.98			
			40	0	16064.86	23100.00	
			4		0	0	77940.00
			40				0
			4				
			0				
			0				
1			0				
			40				
			4				
			40				
			4				
			0				

Report for Mean number of flights per day for each airport

CARRIE R	_TYPE	_FREQ	Average_Flights_Per_Da y
СО	1	94	
DH	1	27	
DL	1	388	·
MQ	1	295	
RU	1	162	
US	1	404	

Report for Mean number of flights per day for each airport

The MEANS Procedure

FL_DAT E	N Obs	Variable	N	Mean	Std Dev	Minimum	Maximum
04-01-0	1	CRS_DEP_TIME DEP_TIME DISTANCE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTIME	1 1 1 1 1 1 1 1 0 0 0 1 1 1 0	1640.00 1640.00 213.0000 000 6155 .00 0 4.0000000 1.0000000 0 60000.00 0		1640.00 1640.00 213.0000 000 6155 .00 0 4.0000000 1.0000000 60000.00 0	1640.00 1640.00 213.0000 000 6155 .00 0 4.0000000 1.0000000 0

FL_DAT E	N Obs	Variable	N	Mean	Std Dev	Minimum	Maximum
04-01-0 2	1	CRS_DEP_TIME DEP_TIME DISTANCE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTime MinDiff	1 1 1 1 1 1 1 1 0 0 0 1 1	1640.00 1641.00 213.0000 000 6155 .00 0 5.0000000 2.0000000 60060.00 0		1640.00 1641.00 213.0000 000 6155 .00 0 5.0000000 2.0000000 60060.00 0	1640.00 1641.00 213.0000 000 6155 .00 0 5.0000000 2.0000000 60060.00 0
04-01-0	1	CRS_DEP_TIME DEP_TIME DEP_TIME DISTANCE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTime MinDiff	1 1 1 1 1 1 1 1 0 0 0 1 1 1 0	1640.00 1644.00 213.0000 000 6155 .00 0 7.0000000 4.0000000 60240.00 0		1640.00 1644.00 213.0000 000 6155 .00 0 7.0000000 4.0000000 60240.00 0	1640.00 1644.00 213.0000 000 6155 .00 0 7.0000000 4.0000000 60240.00 0
04-01-0 5	1	CRS_DEP_TIME DEP_TIME DEP_TIME DISTANCE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTIME	1 1 1 1 1 1 1 1 0 0 0 1 1	1640.00 1638.00 213.0000 000 6155 .00 0 1.0000000 5.0000000 59880.00 0		1640.00 1638.00 213.0000 000 6155 .00 0 1.0000000 5.0000000 59880.00 0 59880.00	1640.00 1638.00 213.0000 000 6155 .00 0 1.0000000 5.0000000 59880.00 0
04-01-0 7	1	CRS_DEP_TIME DEP_TIME DISTANCE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTIME	1 1 1 1 1 1 1 1 0 0 0 1 1	1640.00 1639.00 213.0000 000 6155 .00 0 3.0000000 7.0000000 59940.00 0		1640.00 1639.00 213.0000 000 6155 .00 0 3.0000000 7.0000000 59940.00 0	1640.00 1639.00 213.0000 000 6155 .00 0 3.0000000 7.0000000 59940.00 0

04-01-0 8 CRS_DEP_TIME DEP_TIME DISTANCE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTime MinDiff	1 1 1 1 1 1 1 0 0 0 1 1 0	1640.00 1640.00 213.0000 000 6155 .00 0 4.0000000 8.0000000 60000.00 0		1640.00 1640.00 213.0000 000 6155 .00 0 4.0000000 8.0000000 60000.00 0	1640.00 1640.00 213.0000 000 6155 .00 0 4.0000000 8.0000000 60000.00 0
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https://odamid-usw2.oda.sas.com/SASStudio/sasexec/submissions/7cf2a868-453f-46a0-b27d-f8ed5017c317/results 3/8 4/14/22, 1:27 AM Results: Project.sas

FL DAT	N	Variable	N	Mean	Std	Minimum	Maximum
E	Obs	- 4114010		moun	Dev		maxillulli
04-01-0 9	1	CRS_DEP_TIME DEP_TIME DISTANCE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTIME MinDiff	1 1 1 1 1 1 1 0 0 0 1 1 0	1640.00 1634.00 213.0000 000 6155 .00 0 5.0000000 9.0000000 59640.00 0 59640.00		1640.00 1634.00 213.0000 000 6155 .00 0 5.0000000 9.0000000 59640.00 0 59640.00	1640.00 1634.00 213.0000 000 6155 .00 0 5.0000000 9.0000000 59640.00 0
04-01-1	1	CRS_DEP_TIME DEP_TIME DISTANCE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTIME	1 1 1 1 1 1 1 0 0 0 1 1 0	1640.00 1638.00 213.0000 000 6155 .00 0 6.0000000 10.0000000 59880.00 0		1640.00 1638.00 213.0000 000 6155 .00 0 6.0000000 10.0000000 59880.00 0	1640.00 1638.00 213.0000 000 6155 .00 0 6.0000000 10.0000000 59880.00 0
04-01-11	1	CRS_DEP_TIME DEP_TIME DISTANCE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTime MinDiff	1 1 1 1 1 1 1 0 0 0 1 1 0	1640.00 1634.00 213.0000 000 6155 .00 0 7.0000000 11.0000000 59640.00 0		1640.00 1634.00 213.0000 000 6155 .00 0 7.0000000 11.0000000 59640.00 0	1640.00 1634.00 213.0000 000 6155 .00 0 7.0000000 11.0000000 59640.00 0

04-01-1	1	CRS_DEP_TIME DEP_TIME DISTANCE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTime MinDiff	1 1 1 1 1 1 1 0 0 0 0 1 1 0	1640.00 1640.00 213.0000 000 6155 .00 0 1.0000000 12.0000000 60000.00 0	1640.00 1640.00 213.0000 000 6155 .00 0 1.0000000 12.0000000 60000.00 0	1640.00 1640.00 213.0000 000 6155 .00 0 1.0000000 12.0000000 60000.00 0
04-01-1	1	CRS_DEP_TIME DEP_TIME DISTANCE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTime MinDiff	1 1 1 1 1 1 1 1 0 0 0 0 1 1 0	1640.00 1639.00 213.0000 000 6155 .00 0 2.0000000 13.0000000 59940.00 0	1640.00 1639.00 213.0000 000 6155 .00 0 2.0000000 13.0000000 59940.00 0	1640.00 1639.00 213.0000 000 6155 .00 0 2.0000000 13.0000000 59940.00 0

https://odamid-usw2.oda.sas.com/SASStudio/sasexec/submissions/7cf2a868-453f-46a0-b27d-f8ed5017c317/results 4/8

: Project.sas							
FL_DAT E	N Obs	Variable	N	Mean	Std Dev	Minimum	Maximum
04-01-1 4	1	CRS_DEP_TIME DEP_TIME DISTANCE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTIME MinDiff	1 1 1 1 1 1 1 0 0 0 1 1 0	1640.00 1630.00 213.0000 000 6155 .00 0 3.0000000 14.0000000 59400.00 0		1640.00 1630.00 213.0000 000 6155 .00 0 3.0000000 14.000000 59400.00 0	1640.00 1630.00 213.0000 000 6155 .00 0 3.0000000 14.0000000 59400.00 0
04-01-1 5	1	CRS_DEP_TIME DEP_TIME DISTANCE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTIME	1 1 1 1 1 1 1 1 0 0 0 1 1 0	1640.00 1637.00 213.0000 000 6155 .00 0 4.0000000 15.0000000 59820.00 0		1640.00 1637.00 213.0000 000 6155 .00 0 4.0000000 15.0000000 59820.00 0	1640.00 1637.00 213.0000 000 6155 .00 0 4.0000000 15.0000000 59820.00 0

04-01-1 6	1	CRS_DEP_TIME DEP_TIME DISTANCE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTIME	1 1 1 1 1 1 1 1 0 0 0 1 1 0	1640.00 1648.00 213.0000 000 6155 .00 0 5.0000000 16.0000000 60480.00 0	1640.00 1648.00 213.0000 000 6155 .00 0 5.0000000 16.0000000 60480.00 0 	1640.00 1648.00 213.0000 000 6155 .00 0 5.0000000 16.0000000 60480.00 0
04-01-1 7	1	CRS_DEP_TIME DEP_TIME DISTANCE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTIME	1 1 1 1 1 1 1 1 0 0 0 1 1 1 0	1640.00 1637.00 213.0000 000 6155 .00 0 6.0000000 17.0000000 59820.00 0	1640.00 1637.00 213.0000 000 6155 .00 0 6.0000000 17.000000 59820.00 0	1640.00 1637.00 213.0000 000 6155 .00 0 6.0000000 17.0000000 59820.00 0
04-01-1	1	CRS_DEP_TIME DEP_TIME DISTANCE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTime MinDiff	1 1 1 1 1 1 1 0 0 0 0 1 1 0 0	1640.00 1659.00 213.0000 000 6155 .00 7.0000000 18.0000000 61140.00 0	 1640.00 1659.00 213.0000 000 6155 .00 7.0000000 18.0000000 61140.00 0	1640.00 1659.00 213.0000 000 6155 .00 0 7.0000000 18.0000000 61140.00 0

https://odamid-usw2.oda.sas.com/SASStudio/sasexec/submissions/7cf2a868-453f-46a0-b27d-f8ed5017c317/results 5/8

. Froject.sas			_				
FL_DAT E	N Obs	Variable	N	Mean	Std Dev	Minimum	Maximum
04-01-1 9	1	CRS_DEP_TIME DEP_TIME DEP_TIME DISTANCE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTIME	1 1 1 1 1 1 1 1 0 0 0 1 1	1640.00 1636.00 213.0000 000 6155 .00 0 1.0000000 19.0000000 59760.00 0		1640.00 1636.00 213.0000 000 6155 .00 0 1.0000000 19.0000000 59760.00 0	1640.00 1636.00 213.0000 000 6155 .00 0 1.0000000 19.0000000 59760.00 0

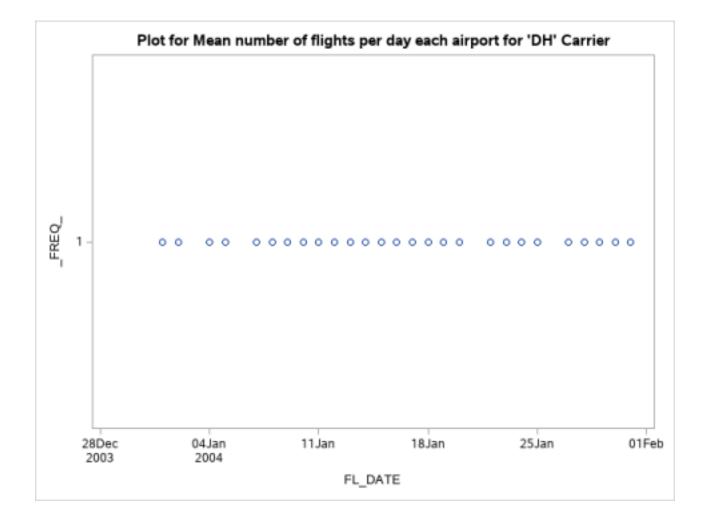
0 DEP_TIME 1 1637.00 . 1637.00 1637.00 213.0000 213.0000 213.0000 213.0000 213.000 213.000 000	00 155 00 0 0000 000 0 0 0 820 0 0
2 DEP_TIME	00 155 00 0 0000 0000 000 0 0060 0
3 DEP_TIME	00 155 00 0 0000 0000 0 0 0 0 0 0 0 0 0
4 DEP_TIME	00 155 00 0 0000 0000
new_CRS_TIME	0

: Project.sas							
FL_DAT E	N Obs	Variable	N	Mean	Std Dev	Minimum	Maximum
04-01-2 5	1	CRS_DEP_TIME DEP_TIME DISTANCE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTIME	1 1 1 1 1 1 1 1 1 0 0 0 0 1 1 0 0	1640.00 1656.00 213.0000 000 6155 .00 7.0000000 25.0000 000 60960 .00 0		1640.00 1656.00 213.0000 000 6155 .00 0 7.0000000 25.0000 000 60960 .00 0	1640.00 1656.00 213.0000 000 6155 .00 0 7.0000000 25.0000 000 60960 .00 0
04-01-2 7	1	CRS_DEP_TIME DEP_TIME DISTANCE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTIME	1 1 1 1 1 1 1 1 0 0 0 0 1 1 0	1640.00 1941.00 213.0000 000 6155 .00 2.0000000 27.0000 000 70860 .00 0		1640.00 1941.00 213.0000 000 6155 .00 0 2.0000000 27.0000 000 70860 .00 0 70860.00 0	1640.00 1941.00 213.0000 000 6155 .00 2.0000000 27.0000 000 70860 .00 0
04-01-2 8	1	CRS_DEP_TIME DEP_TIME DISTANCE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTIME MinDiff	1 1 1 1 1 1 1 0 0 0 1 1 0 0	1640.00 1631.00 213.0000 000 6155 .00 0 3.0000000 28.0000 000 59460 .00 0		1640.00 1631.00 213.0000 000 6155 .00 0 3.0000000 28.0000 000 59460 .00 0	1640.00 1631.00 213.0000 000 6155 .00 0 3.0000000 28.0000 000 59460 .00 0

04-01-2	1	CRS_DEP_TIME DEP_TIME DISTANCE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTIME	1 1 1 1 1 1 1 1 0 0 0 1 1	1640.00 1636.00 213.0000 000 6155 .00 0 4.0000000 29.0000 000 59760 .00	1640.00 1636.00 213.0000 000 6155 .00 0 4.0000000 29.0000 000 59760 .00 0	1640.00 1636.00 213.0000 000 6155 .00 0 4.0000000 29.0000 000 59760 .00
04-01-3	1	CRS_DEP_TIME DEP_TIME DISTANCE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTime MinDiff	1 1 1 1 1 1 1 0 0 0 1 1 0	0 	0 	0 1640.00 1640.00 213.0000 000 6155 .00 0 5.0000000 30.0000 000 60000 .00 60000.00 0

https://odamid-usw2.oda.sas.com/SASStudio/sasexec/submissions/7cf2a868-453f-46a0-b27d-f8ed5017c317/results 7/8 4/14/22, 1:27 AM Results: Project_sas

FL_DAT E	N Obs	Variable	N	Mean	Std Dev	Minimum	Maximum
04-01-3	1	CRS_DEP_TIME DEP_TIME DISTANCE FL_NUM Weather DAY_WEEK DAY_OF_MONTH new_DEP_TIME new_CRS_TIME CRS_TIME diff_in_minutes new_CRS_DEP_TI ME NewDepTime NewCRSTIME	1 1 1 1 1 1 1 0 0 0 1 1 0	1640.00 1633.00 213.0000 000 6155 .00 0 6.0000000 31.0000 000 59580 .00 0		1640.00 1633.00 213.0000 000 6155 .00 0 6.0000000 31.0000 000 59580 .00 0	1640.00 1633.00 213.0000 000 6155 .00 0 6.0000000 31.0000 000 59580 .00 0



5. GRAPHS FOR QUANTITATIVE VARIABLES

```
/* Plot a histogram for each of the quantitative variables. */

TITLE "Histogram representing the quantitative variables";

PROC UNIVARIATE DATA=Flight;

VAR DISTANCE FL_DATE FL_NUM Weather DAY_WEEK DAY_OF_MONTH;

HISTOGRAM;

RUN;
```

Histogram representing the quantitative variables

The UNIVARIATE Procedure Variable: DISTANCE

Moments								
N	1370	Sum Weights	1370					
Mean	211.088321	Sum Observations	289191					
Std Deviation	5.80510802	Variance	33.6992791					
Skewness	-1.5980104	Kurtosis	0.57103678					
Uncorrected SS	61090977	Corrected SS	46134.3131					
Coeff Variation	2.75008489	Std Error Mean	0.15683754					

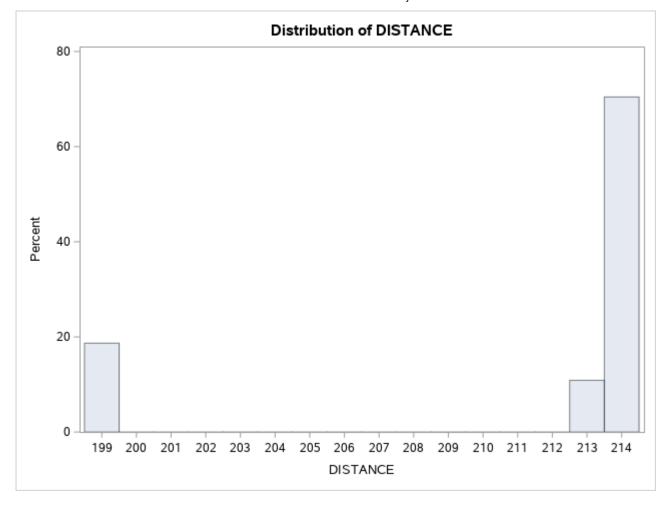
	Basic Statistical Measures								
Location Variability									
Mean	211.0883	Std Deviation	5.80511						
Median	214.0000	Variance	33.69928						
Mode	214.0000	Range	15.00000						
		Interquartile Range	1.00000						

Tests for Location: Mu0=0					
Test Statistic p Value					
Student's t	t 1345.904		Pr > t	<.0001	
Sign	М	685	Pr >= M	<.0001	
Signed Rank	S	469567.5	Pr >= S	<.0001	

Quantiles (Definition 5)				
Level	Quantile			
100% Max	214			
99%	214			
95%	214			
90%	214			
75% Q3	214			
50% Median	214			
25% Q1	213			
10%	199			
5%	199			
1%	199			
0% Min	199			

Extreme Observations				
Low	Lowest		est	
Value	Value Obs		Obs	
199	1370	214	1360	
199	1369	214	1361	
199	1368	214	1362	
199	1367	214	1363	
199	1366	214	1364	

Histogram representing the quantitative variables



Histogram representing the quantitative variables

The UNIVARIATE Procedure Variable: FL_DATE

Moments					
N 1370 Sum Weights					
Mean	16086.1073	Sum Observations	22037967		
Std Deviation	8.54444091	Variance	73.0074704		
Skewness	0.04353289	Kurtosis	-1.1460507		
Uncorrected SS	3.54505E11	Corrected SS	99947.227		
Coeff Variation	0.0531169	Std Error Mean	0.23084654		

Basic Statistical Measures					
Location Variability					
Mean	Mean 16086.11 Std Deviation 8.5444				
Median	16086.00	Variance	73.00747		
Mode	Mode 16083.00 Range		30.00000		
		Interquartile Range	14.00000		

Note: The mode displayed is the smallest of 2 modes with a count of 56.

Tests for Location: Mu0=0					
Test	Statistic p Value				
Student's t	t	69683.12	Pr > t	<.0001	
Sign M 685 Pr >= M <.0001					

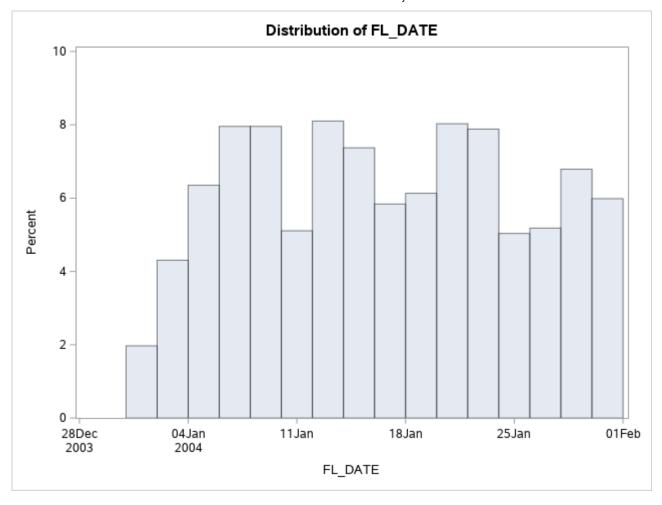
Tests for Location: Mu0=0				
Test	5	Statistic	p Val	ue
Signed Rank	S 469567.5		Pr >= S	<.0001

Quantiles (Definition 5)				
Level	Quantile			
100% Max	16101			
99%	16101			
95%	16100			
90%	16098			
75% Q3	16093			
50% Median	16086			
25% Q1	16079			
10%	16075			
5%	16073			
1%	16071			
0% Min	16071			

Extreme Observations				
Low	est	Highest		
Value	Value Obs		Obs	
16071	27	16101	1366	
16071	26	16101	1367	
16071	25	16101	1368	
16071	24	16101	1369	
16071	23	16101	1370	

Histogram representing the quantitative variables

The UNIVARIATE Procedure



Histogram representing the quantitative variables

The UNIVARIATE Procedure Variable: FL_NUM

Moments					
N	1370				
Mean	2630.05474	Sum Observations	3603175		
Std Deviation	1397.09603	Variance	1951877.32		
Skewness	0.9638961	Kurtosis	-0.3548852		
Uncorrected SS	1.21487E10	Corrected SS	2672120045		
Coeff Variation	53.1204163	Std Error Mean	37.7455688		

Basic Statistical Measures					
Location Variability					
Mean	2630.055	Std Deviation 139			
Median	2172.000	Variance	1951877		
Mode	746.000 Range		5409		
		Interquartile Range	1123		

Note: The mode displayed is the smallest of 4 modes with a count of 31.

Tests for Location: Mu0=0					
Test	Statistic p Value				
Student's t	t	69.6785	Pr > t	<.0001	
Sign M 685 Pr >= M <.0001					

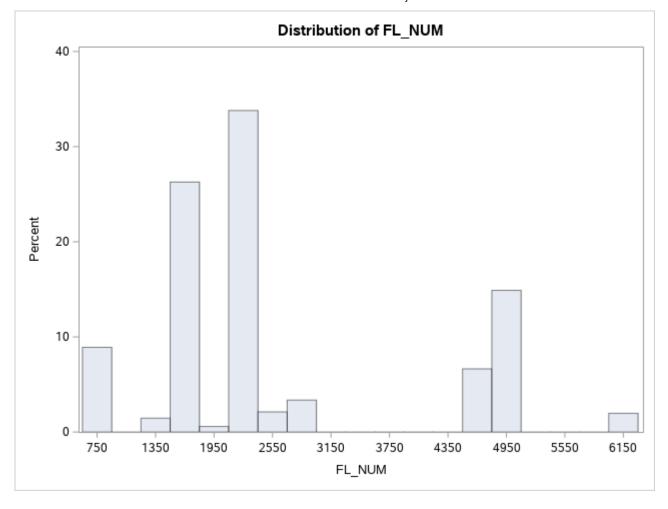
Tests for Location: Mu0=0				
Test	Statistic		p Val	lue
Signed Rank	s	469567.5	Pr >= S	<.0001

Quantiles (Definition 5)		
Level	Quantile	
100% Max	6155	
99%	6155	
95%	4972	
90%	4964	
75% Q3	2879	
50% Median	2172	
25% Q1	1756	
10%	1479	
5%	808	
1%	746	
0% Min	746	

Ext	Extreme Observations			
Low	Lowest		est	
Value	Obs	Value	Obs	
746	1344	6155	1164	
746	1290	6155	1196	
746	1237	6155	1236	
746	1197	6155	1289	
746	1165	6155	1343	

Histogram representing the quantitative variables

The UNIVARIATE Procedure



Histogram representing the quantitative variables

The UNIVARIATE Procedure Variable: Weather

Moments			
N	1370	1370 Sum Weights 13	
Mean	0.01240876	Sum Observations	17
Std Deviation	0.11074174	Variance	0.01226373
Skewness	8.81879017	Kurtosis	75.8818345
Uncorrected SS	17	Corrected SS	16.7890511
Coeff Variation	892.448157	Std Error Mean	0.00299193

Basic Statistical Measures				
Location Variability				
Mean	0.012409	Std Deviation	0.11074	
Median	0.000000	Variance	0.01226	
Mode 0.000000		Range	1.00000	
		Interquartile Range	0	

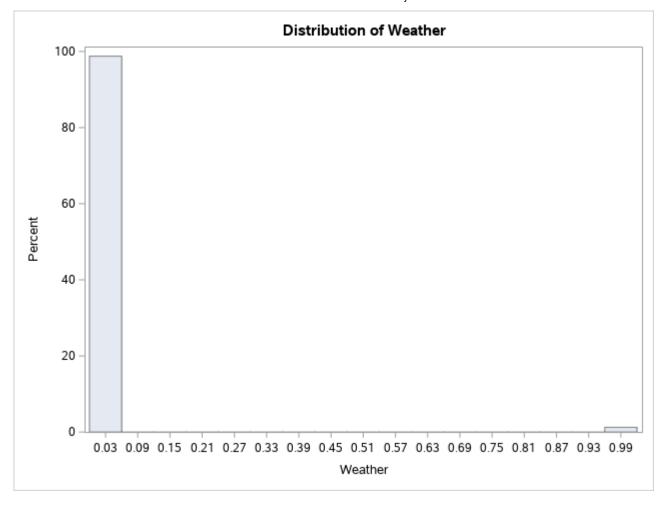
Tests for Location: Mu0=0				
Test	Statistic p Value			ue
Student's t	t 4.147413		Pr > t	<.0001
Sign	М	8.5	Pr >= M	<.0001
Signed Rank	S	76.5	Pr >= S	<.0001

Quantiles (Definition 5)		
Quantile		
1		
1		
0		
0		
0		
0		
0		
0		
0		
0		
0		

Extreme Observations			
Low	Lowest		est
Value	Obs	Value	Obs
0	1370	1	1175
0	1369	1	1178
0	1368	1	1180
0	1367	1	1193
0	1366	1	1309

Histogram representing the quantitative variables

The UNIVARIATE Procedure



Histogram representing the quantitative variables

The UNIVARIATE Procedure Variable: DAY_WEEK

Moments			
N	1370	Sum Weights	1370
Mean	3.84525547	Sum Observations	5268
Std Deviation	1.88980467	Variance	3.5713617
Skewness	0.06945538	Kurtosis	-1.068596
Uncorrected SS	25146	Corrected SS	4889.19416
Coeff Variation	49.1464009	Std Error Mean	0.05105716

Basic Statistical Measures				
Location Variability				
Mean	3.845255	Std Deviation	1.88980	
Median	4.000000	Variance	3.57136	
Mode	5.000000	Range	6.00000	
		Interquartile Range	3.00000	

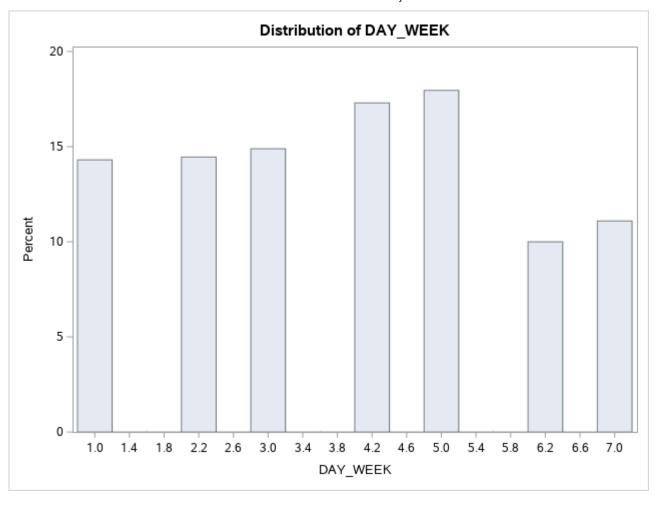
Tests for Location: Mu0=0				
Test	Statistic p Value			ue
Student's t	t	75.31276	Pr > t	<.0001
Sign	M	685	Pr >= M	<.0001
Signed Rank	S	469567.5	Pr >= S	<.0001

Quantiles (Definition 5)		
Level	Quantile	
100% Max	7	
99%	7	
95%	7	
90%	7	
75% Q3	5	
50% Median	4	
25% Q1	2	
10%	1	
5%	1	
1%	1	
0% Min	1	

Extreme Observations				
Lowest		Highest		
Value	Obs	Value	Obs	
1	1163	7	1120	
1	1162	7	1121	
1	1161	7	1122	
1	1160	7	1123	
1	1159	7	1124	

Histogram representing the quantitative variables

The UNIVARIATE Procedure



Histogram representing the quantitative variables

The UNIVARIATE Procedure Variable: DAY_OF_MONTH

Moments					
N	1370	Sum Weights	1370		
Mean	16.1072993	Sum Observations	22067		
Std Deviation	8.54444091	Variance	73.0074704		
Skewness	0.04353289	Kurtosis	-1.1460507		
Uncorrected SS	455387	Corrected SS	99947.227		
Coeff Variation	53.0470116	Std Error Mean	0.23084654		

Basic Statistical Measures				
Location Variability				
Mean	16.10730	Std Deviation	8.54444	
Median	16.00000	Variance	73.00747	
Mode	13.00000	Range	30.00000	
		Interquartile Range	14.00000	

Note: The mode displayed is the smallest of 2 modes with a count of 56.

Tests for Location: Mu0=0				
Test		Statistic	p Value	
Student's t	t	69.77492	Pr > t	<.0001
Sign	М	685	Pr >= M	<.0001

Tests for Location: Mu0=0				
Test	Statistic		p Value	
Signed Rank	s	469567.5	Pr >= S	<.0001

Quantiles (Definition 5)		
Level	Quantile	
100% Max	31	
99%	31	
95%	30	
90%	28	
75% Q3	23	
50% Median	16	
25% Q1	9	
10%	5	
5%	3	
1%	1	
0% Min	1	

Extreme Observations			
Lowest		Highest	
Value	Obs	Value	Obs
1	27	31	1366
1	26	31	1367
1	25	31	1368
1	24	31	1369
1	23	31	1370

Histogram representing the quantitative variables

The UNIVARIATE Procedure

