

## CSC423 Data Analysis and Regression

### SAS Procedures for Exploratory Data Analysis (EDA)

#### PROC MEANS

The **PROC Means** provides data summarization tools to compute descriptive statistics for variables across all observations and within groups of observations. For example, it calculates the descriptive statistics based on moments, estimates the percentiles and the median value, calculates the confidence limits for the mean and performs a **t** test on the population average.

```
PROC MEANS DATA=dataset-name <statistic-keyword(s)>;  
VAR variables;           ← one or more measurement variables in the dataset  
RUN;
```

The **statistics keywords** specify which statistics to compute and the order to display them in the output.

The available keywords in the PROC statement include: MEAN (average), STD (standard deviation), STDERR (standard error), P50 (median), Q1 (first quartile), Q3 (third quartile). Keywords for confidence intervals: CLM, ALPHA=*value* specifies the confidence level (1-*value*)%

Keywords for t-tests: T (t-statistic), PRT (p-value). Notice that SAS provides a test only for a zero population average, i.e.  $H_0: \mu=0$ .

#### PROC UNIVARIATE

You can use the PROC UNIVARIATE to compute the following:

- Descriptive statistics based on moments (including skewness and kurtosis), quantiles or percentiles (such as the median), frequency tables, and extreme values
- Histograms. Optionally, these can be fitted with probability density curves for various distributions and with kernel density estimates. (HISTOGRAM statement)
- Probability plots. These plots facilitate the comparison of a data distribution with various theoretical distributions. (QQPLOT statement or PROBPLOT)

#### Syntax:

```
PROC UNIVARIATE < options >;  
  BY variables ;  
  VAR variables ;  
  CLASS variable-1;  
  HISTOGRAM < variables > /normal;  
  OUTPUT OUT=new-SAS-data-set;  
  PROBPLOT < variables > / normal (mu=est sigma=est);  
RUN;
```

**<OPTIONS>** Options for the PROC UNIVARIATE are *normal* and *plot*. The *normal* option is used to compute tests on normality to determine if variables defined in VAR come from a normal distribution (Shapiro-Wilk test, Kolmogorov – Smirnov test...). The *plot* option creates low-level boxplot and normal probability plot.

**BY** variables ; Calculate separate statistics for each BY group

**VAR** variables ; Select the analysis variables and determine their order in the report. Variables are one or more measurement variables in the dataset. If you do not use the VAR statement, all numeric variables in the data set are analyzed.

**CLASS** variable-1; specify one or two variables that group the data into classification levels. The analysis is carried out for each combination of level.

**HISTOGRAM** < variables > / **NORMAL** **CFILL** = white **PFILL** = solid **MIDPOINTS** = <list >; Creates a histogram, the NORMAL option displays a fitted normal curve on the histogram, the MIDPOINTS= option specifies midpoints for the histogram, cfill & pfill control the appearance of the histogram. If no variables are specified, histograms are created for each variable defined in the VAR statement.

**OUTPUT** **OUT**=new-SAS-data-set; The OUTPUT statement saves statistics and BY variables in an output data set.

**PROBPLOT** < variables > / **NORMAL** (**MU=EST** **SIGMA=EST**); Creates a normal probability plot

**RUN**;

## EXAMPLE

Consider the following data set on the time between machine failures. Data were collected during a study on machine performance that involved 39 similar machines. The producing company states that on average the time between failures is 20 hours. The researchers believe that on average the time between failures is longer than 20 hours, so they want to estimate the average time between failures and test the claim of the producing company.

DATA: 21.6 21.7 22.7 21.2 21.9 21.6 24.8 22.5 21.9 23.6 23.0 22.3 23.3 24.2 25.5 22.5 23.1 24.7 26.2 24.7 23.6 21.5 23.7 24.3 26.2 22.5 22.7 21.5 24.3 24.7 25.7 27.3 22.4 20.1 26.3 23.9 21.7 23.3 22.2

STEP 1 – Read the data into SAS and create the SAS data set “failure”

```
Title 'Time between failures';

data failure;
infile "c:/.../faildata.dat";
input time;
timecent=time-20;
label time = 'time between failures' timecent = time-20 hours;
```

STEP 2 – Compute some descriptive statistics about the data and a 95% confidence interval for the average time between failures.

```
proc means mean std stderr clm p25 p50 p75;
var time;
run;
```

Time between failures				
The MEANS Procedure				
Analysis Variable : time time between failures				
Mean	Std Dev	Std Error	Lower 95% CL for Mean	Upper 95% CL for Mean
23.3564103	1.6676165	0.2670323	22.8158315	23.8969890
Analysis Variable : time time between failures				
25th Pctl	50th Pctl	75th Pctl		
21.9000000	23.1000000	24.7000000		

The estimated average time between failures is 23.356 hours, with standard error equal to 0.267 hours. The average time is between 22.81 hours and 23.9 hours.

---

STEP 3 – Test the company’s claim that the average time between failures is 20 hours.  
Null hypothesis: **Ho:  $\mu=20$**  hours against the alternative hypothesis that **Ha:  $\mu > 20$  hours**.  
To use SAS, we need to compute the variable `timecent=time-20` and express the test as:  
**Ho:  $\mu=0$  vs Ha:  $\mu>0$**  where  $\mu$  is now the population average for the new variable `timecent`.  
Note: Examine the data histogram and the normal probability plot to check the normality assumptions, before carrying out the statistical test.

```
proc univariate normal;
var timecent;
histogram /cfill=WHITE pfill=SOLID name='HIST' normal;
probplot/normal(mu=est sigma=est color=BLUE l=1 w=1);
run;
```

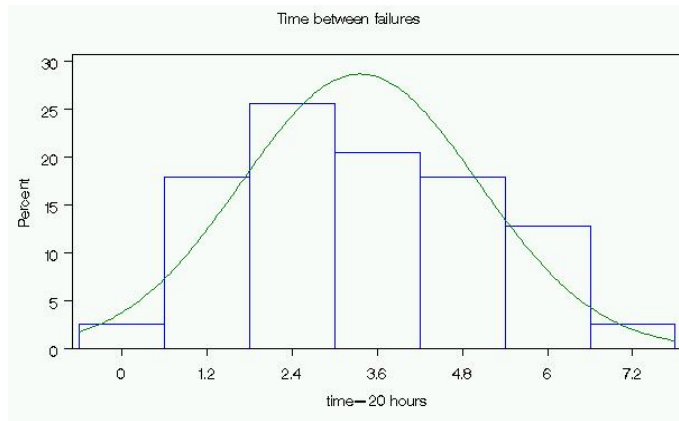
The UNIVARIATE Procedure			
Variable: timecent (time-20 hours)			
Moments			
N	39	Sum Weights	39
Mean	3.35641026	Sum Observations	130.9
Std Deviation	1.66761646	Variance	2.78094467
Skewness	0.47112614	Kurtosis	-0.3745406
Uncorrected SS	545.03	Corrected SS	105.675897
Coeff Variation	49.6845241	Std Error Mean	0.26703235
Basic Statistical Measures			
Location		Variability	
Mean	3.356410	Std Deviation	1.66762
Median	3.100000	Variance	2.78094
Mode	2.500000	Range	7.20000
		Interquartile Range	2.80000
NOTE: The mode displayed is the smallest of 2 modes with a count of 3.			
Tests for Location: Mu0=0			
Test	-Statistic-	-----p Value-----	
<b>Student's t</b>	<b>t 12.5693</b>	<b>Pr &gt;  t </b>	<b>&lt;.0001</b>
<b>Sign</b>	<b>M 19.5</b>	<b>Pr &gt;=  M </b>	<b>&lt;.0001</b>
Signed Rank	S 390	Pr >=  S	<.0001

RESULT: The t test is highly significant, since the p-value is very small ( $<.0001/2=.00005$ ). Thus the data do not support the company’s claim and are consistent with the researchers’ hypothesis. Note that the t-statistic is positive and very large, indicating that the actual time between failures is sensibly larger than 20 hours.

Tests for Normality				
Test	--Statistic---		-----p Value-----	
Shapiro-Wilk	W	0.965106	Pr < W	0.2628
Kolmogorov-Smirnov	D	0.114608	Pr > D	>0.1500
Cramer-von Mises	W-Sq	0.078669	Pr > W-Sq	0.2166
Anderson-Darling	A-Sq	0.512045	Pr > A-Sq	0.1921
Quantiles (Definition 5)				
	Quantile	Estimate		
	100% Max	7.3		
	99%	7.3		
	95%	6.3		
	90%	6.2		
	75% Q3	4.7		
	50% Median	3.1		
	25% Q1	1.9		
	10%	1.5		
	5%	1.2		
	1%	0.1		
	0% Min	0.1		
Extreme Observations				
	----Lowest----		----Highest---	
Value	Obs	Value	Obs	
0.1	34	5.7	31	
1.2	4	6.2	19	
1.5	28	6.2	25	
1.5	22	6.3	35	
1.6	6	7.3	32	
Parameters for Normal Distribution				
	Parameter	Symbol	Estimate	
	Mean	Mu	3.35641	
	Std Dev	Sigma	1.667616	
Goodness-of-Fit Tests for Normal Distribution				
Test	---Statistic---		-----p Value-----	
Kolmogorov-Smirnov	D	0.11460833	Pr > D	>0.150
Cramer-von Mises	W-Sq	0.07866879	Pr > W-Sq	0.217
Anderson-Darling	A-Sq	0.51204470	Pr > A-Sq	0.192

The Shapiro-Wilk test supports the assumption that the data arise from a normal population. The normal probability plot confirms this result, because the points lie close to a line. The histogram, however, is skewed. We assume that data come from a normally distributed population and we use the t-test. Notice that both the sign test and the t test produce the same result.

Histogram of the data



Normal probability plot

