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## MASTECTOMY VERSUS LUMPECTOMY IN BREAST CANCER TREATMENT

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### ABSTRACT

**Objective**: To extract information and analyze the cost of mastectomy and lumpectomy as breast cancer treatments using SAS. **Methods**: The data used are from the National Inpatient Sample (NIS). It contains a stratified sample of all hospital patient visits from 37 participating states. First, we extract breast cancer cases among all the data and then focus on those treated by mastectomy and lumpectomy. Then, data analysis techniques are used to examine and compare these two major surgical treatments. We used linear models in SAS/STAT to examine the data, and also PROC GPLOT methods. **Results**: For the data used, the study shows that the cost of mastectomy treatment is lower than the cost of lumpectomy treatment. Moreover, the analysis shows that mastectomy is more used than lumpectomy. **Conclusion**: SAS is a good tool for statistical data analysis, data mining and data visualization. Further study will include claims data to investigate longitudinal patient outcomes.

#### INTRODUCTION

Surgery is the most used and trusted treatment to control and cure breast cancer. There are two types of surgical treatments for breast cancer: the mastectomy and the lumpectomy. Lumpectomy is surgery that targets the cancer cells. Mastectomy is a more general surgery that removes the whole infected breast. Both of these surgeries are used to treat breast cancer and to try to cure the patient when possible. In this paper, we analyze these two treatments individually and then compare them. We study their use: which one is the most used, the most chosen and we analyze the cost, the total charges of the whole treatment sequence and finally, we look at the length of stay at the hospital for each of those treatments. The data used are the NIS (National Inpatient Survey) for the year 2005. We use SAS as a statistical tool for the analysis and SAS Enterprise Guide 4 as our interface. The data are analyzed by summary statistics, graphs, kernel density estimation and linear models.

#### METHOD

The data used are from the NIS (National Inpatient Sample) records of 2005. The data contain millions of records on patients from 37 participating states and a stratified sample of hospitals. The identities of the patients are respected in these records; for this reason, it is impossible to perform a longitudinal analysis. However, the data contain detailed diagnosis and procedure codes.

First, the breast cancer cases are extracted from other records. In the NIS data, diagnoses are recorded in the diagnosis columns DX1 thru DX15. The method we use is the ICD9-CM diagnosis coding. ICD9-CM stands for International Classification of Disease, 9<sup>th</sup> Division- Clinical Modification classification system. We consider the codes 199.0 (Disseminated cancer unspecified site (primary)), 199.1 (Disseminated cancer unspecified site (secondary)) and 174 (Malignant neoplasm of female breast). These codes define cases with general cancer and general breast problems. The next thing to do is to make sure that we consider only breast cancer. We extract two tables from this one: one containing the patient treated by lumpectomy and the other containing the patients treated by mastectomy. In the NIS, the procedures are recorded through the variables, PR1 thru PR15 and the coding method used is the ICD9-CM procedure codes. We consider the codes, 85.41, 85.43, 85.44, 85.45, 85.46, 85.47, 85.48, 85.33, 85.34, 85.36, 85.23, which represent the different types of mastectomies and the code, 85.21, which is the code for lumpectomy. We are now sure that these results reflect the breast cancer cases and we proceed to the analysis of each one of them. For each table of data (Mastectomy data and Lumpectomy data), we produce:

- Summary statistics giving the number of patients, the average age of patients, average length of stay, the average number of diagnoses per patient, average number of procedures per patient and the average total charges.
- A chart representing the frequency of the total charges to see how many people are charged how much money
- A chart representing the frequency of the length of stay to have an idea of how many people stay at the hospital during treatment and for how long.
- A scatter plot of the total charges versus the length of stay to analyze whether the length of stay affects in any way the total charges.
- Finally, we use the built-in Regression linear models analysis in Enterprise Guide 4 to study deeply the relation between total charges and length of stay.

After analyzing each one of the Mastectomy and Lumpectomy procedures, we compare them. In order to perform the

comparison, we first apply kernel density estimation to each one of the tables on the variables, total charges (totchg) and length of stay (los) individually. Then, we plot the compared graphs for mastectomy versus lumpectomy for total charges and length of stay.

#### RESULTS

```
To extract cancer cases and breast problem cases among others, we use the following code: libname NIS2005 'E:\NIS2005';
```

```
data core1;
set NIS2005.NIS_2005_CORE;
if (dx1='1740' or dx2='1740' or ... dx15='1740' or
dx1='1741' or ... or dx15='1741' or dx1='1742' or ... or dx15='1742' or
dx1='1743' or ... or dx15='1743' or dx1='1744' or ... or dx15='1744' or dx1='1745' or ...
or dx15='1745' or dx1='1746' or ... or dx15='1746' or
dx1='1747' or ... or dx15='1747' or dx1='1748' or ... or dx15='1748' or
dx1='1749' or ... or dx15='1749' or dx1='1990' or ... or dx15='1990' or
dx1='1991' or ... or dx15='1991')
then code=1;
else code=0;
data NIS2005.BREAST_CANCER;
set core1;
where code=1;
run;
```

As a result, we obtain a table of 55,950 patients. These cases contain breast cancer cases as well as other unspecified cancers and other breast diseases. To extract cases treated by lumpectomy and mastectomy, we use the codes below:

```
data LUMP1;
set NIS2005.BREAST CANCER;
if (pr1='8521' or ... or pr15='8521' )
then code2=2;
else code2=0;
data NIS2005.LUMPECTOMY;
set LUMP1;
where code2=2;
run;
data MAST1;
set NIS2005.BREAST CANCER;
if (pr1='8541' or ... or pr15='8541' or
pr1='8543' or ... or pr15='8543' or pr1='8544' or ... or pr15='8544' or
pr1='8534' or ... or pr15='8534' or
pr1='8533' or ... or pr15='8533' or pr1='8536' or ... or pr15='8536' or
prl='8547' or ... or prl5='8547' or prl='8548' or ... or prl5='8548' or
pr1='8545'
or ... or pr15='8545' or pr1='8546' or ... or pr15='8546' or
pr1='8523' or ... or pr15='8523')
then code1=1;
else code1=0;
data NIS2005.MASTECTOMY;
set MAST1;
where code1=1;
run;
```

These codes produce a table of 1,413 patients treated by lumpectomy and a table of 12,139 patients treated by mastectomy.

ANALYSIS OF MASTECTOMY AND LUMPECTOMY INDIVIDUALLY MASTECTOMY

| Table1: Summary statistics of Mastectomy |       |  |  |  |  |
|--|-------|--|--|--|--|
| Number of patients                       | 12115 |  |  |  |  |
| Average age of patients                  | 62    |  |  |  |  |

| Average length of stay per patient (in days) | 2     |
|--|-------|
| Average number of diagnoses per patient      | 4     |
| Average number of procedures per patient     | 2     |
| Average total charges                        | 19475 |

This table was summarized from the result of the following code: libname NIS2005 'E:\NIS2005';

The summary statistics table gives the averages of the considered variables. We are interested in the variables, total charges and length of stay. To view more clearly how they are in the mastectomy data, we produce charts.

#### Chart1: Chart representing frequencies of the total charges in Mastectomy

| Total charges (cleaned) |                               |      | Cum.  |         | Cum.    |  |
|-------------------------|-------------------------------|------|-------|---------|---------|--|
| Midpoint                |                               | Freq | Freq  | Percent | Percent |  |
|                         |                               |      |       |         |         |  |
| 0                       | ***                           | 576  | 576   | 4.82    | 4.82    |  |
| 12000                   | *****                         | 6760 | 7336  | 56.62   | 61.44   |  |
| 24000                   | *****                         | 2855 | 10191 | 23.91   | 85.35   |  |
| 36000                   | ****                          | 959  | 11150 | 8.03    | 93.38   |  |
| 48000                   | **                            | 405  | 11555 | 3.39    | 96.78   |  |
| 60000                   | *                             | 147  | 11702 | 1.23    | 98.01   |  |
| 72000                   |                               | 90   | 11792 | 0.75    | 98.76   |  |
| 84000                   |                               | 50   | 11842 | 0.42    | 99.18   |  |
| 96000                   |                               | 32   | 11874 | 0.27    | 99.45   |  |
| 108000                  |                               | 24   | 11898 | 0.20    | 99.65   |  |
| 120000                  |                               | 14   | 11912 | 0.12    | 99.77   |  |
| 132000                  |                               | 5    | 11917 | 0.04    | 99.81   |  |
| 144000                  |                               | 6    | 11923 | 0.05    | 99.86   |  |
| 156000                  |                               | 4    | 11927 | 0.03    | 99.89   |  |
| 168000                  |                               | 3    | 11930 | 0.03    | 99.92   |  |
| 180000                  |                               | 2    | 11932 | 0.02    | 99.93   |  |
| 192000                  |                               | 3    | 11935 | 0.03    | 99.96   |  |
| 204000                  |                               | 0    | 11935 | 0.00    | 99.96   |  |
| 216000                  |                               | 0    | 11935 | 0.00    | 99.96   |  |
| 228000                  |                               | 0    | 11935 | 0.00    | 99.96   |  |
| 240000                  |                               | 0    | 11935 | 0.00    | 99.96   |  |
| 252000                  |                               | 1    | 11936 | 0.01    | 99.97   |  |
| 264000                  |                               | 0    | 11936 | 0.00    | 99.97   |  |
| 276000                  |                               | 1    | 11937 | 0.01    | 99.97   |  |
| 288000                  |                               | 0    | 11937 | 0.00    | 99.97   |  |
| 300000                  |                               | 1    | 11938 | 0.01    | 99.98   |  |
| 312000                  |                               | 0    | 11938 | 0.00    | 99.98   |  |
| 324000                  |                               | 0    | 11938 | 0.00    | 99.98   |  |
| 336000                  |                               | 0    | 11938 | 0.00    | 99.98   |  |
| 348000                  |                               | 1    | 11939 | 0.01    | 99.99   |  |
| 360000                  |                               | 1    | 11940 | 0.01    | 100.00  |  |
|                         |                               |      |       |         |         |  |
|                         | +++++++                       |      |       |         |         |  |
|                         | 1000 2000 3000 4000 5000 6000 |      |       |         |         |  |
|                         |                               |      |       |         |         |  |
|                         | Frequency                     |      |       |         |         |  |

Code to obtain the chart above:

```
data mast2;
set NIS2005.mastectomy;
keep totchg;
run;
proc chart data=mast2;
title1'Chart representing the frequency of'
title2 ' the total charges in mastectomy';
hbar totchg;
run;
```

From the table of summary statistics for Mastectomy, the average cost is \$19,475, but looking at the chart, we see that the charges for most people (56.62%) are \$12,000. Moreover, about 80.53% are charged between \$12,000 and \$24,000. From this, we conclude that the charges for Mastectomy are about \$18,000.

#### Chart2: Chart with frequencies for the Length Of Stay in Mastectomy

| Midpoint       Freq       Freq       Freq       Percent       Percent         1       ************************************  | Length   | of stay (cleaned)                                |      | Cum.  |         | Cum.    |
|---|----------|--|------|-------|---------|---------|
| 1       5359       5359       44.15       44.15         1       5173       10532       42.61       86.76         1       1012       11544       8.34       95.10         1       1       281       11825       2.31       97.41         9       1       1       65       11986       0.54       98.29         11       1       65       11986       0.54       98.29         13       38       12034       0.31       99.14         15       12079       0.12       99.58         21       12       12100       0.10       99.68         23       10       12110       0.08       99.78         24       12       12100       0.02       99.84         29       6       12126       0.05       99.81         21       2       12120       0.02       99.84         29       112128       0.00       99.91         33       2       12128       0.02       99.84         29       12128       0.02       99.96         31       2       12128       0.02       99.97         34  | Midpoint |  | Freq | Freq  | Percent | Percent |
| 1   |          |  |      |       |         |         |
| 3        ************************************   | 1        | *****  | 5359 | 5359  | 44.15   | 44.15   |
| 5       ****       1012       11544       8.34       95.10         7       ***       281       11825       2.31       97.41         9       *       106       11931       0.87       98.29         11       *       65       11996       0.54       98.32         13       38       12034       0.31       99.14         15       1       30       12064       0.25       99.38         17       1       12       12100       0.10       99.58         23       1       12       12100       0.10       99.83         27       2       12120       0.02       99.84         28       10       12110       0.08       99.76         25       8       12118       0.07       99.83         27       2       12120       0.02       99.84         29       6       12126       0.02       99.91         33       1       2       12128       0.02       99.91         35       1       12135       0.01       99.97         41       1       21235       0.01       99.97         43   | 3        | ***************************************          | 5173 | 10532 | 42.61   | 86.76   |
| 7        ***       281       11825       2.31       97.41         9        *       106       11931       0.87       98.29         11        *       65       11996       0.54       99.29         13       38       12034       0.31       99.14         15       1       30       12064       0.25       99.38         17       1       15       12079       0.12       99.51         19       9       12088       0.07       99.68         23       10       12110       0.10       99.89         25       8       12118       0.07       99.89         31       2       12120       0.02       99.84         29       6       12126       0.02       99.91         33       2       12128       0.02       99.91         35       4       12132       0.03       99.94         37       2       12124       0.02       99.97         33       0       12135       0.00       99.97         41       12135       0.01       99.97         45       0       12135       0.00       99.   | 5        | *******  | 1012 | 11544 | 8.34    | 95.10   |
| 9        *       106       11831       0.87       98.29         11        *       65       11996       0.54       98.82         13               38       12034       0.31       99.14         15               30       12064       0.25       99.38         17               15       12079       0.12       99.51         19               9       12088       0.07       99.58         21               12       12100       0.10       99.68         23               10       12110       0.08       99.76         25               8       12118       0.07       99.83         27               2       12120       0.02       99.84         29               6       12126       0.05       99.99         33               2       12128       0.00       99.91         35               1       12135       0.01       199.97         41               12135       0.01       99.97         33               12135       0.01       99.97         41               12135 <td>7</td> <td>***</td> <td>281</td> <td>11825</td> <td>2.31</td> <td>97.41</td> | 7        | ***  | 281  | 11825 | 2.31    | 97.41   |
| 11        *       65       11996       0.54       98.82         13               38       12034       0.31       99.14         15               30       12064       0.25       99.38         17               15       12079       0.12       99.51         19               9       12088       0.07       99.58         21               12       12100       0.10       99.68         23               10       12110       0.08       99.76         25               8       1218       0.07       99.83         27               2       12120       0.02       99.84         28               2       12128       0.02       99.91         33               12128       0.02       99.91         34               12132       0.03       99.96         39                       12132       0.01       99.97         41               12135       0.01       99.97         43                       12135       0.01       99.91         44               12135       0.01   | 9        | *  | 106  | 11931 | 0.87    | 98.29   |
| 13       38       12034       0.31       99.14         15       30       12064       0.25       99.38         17       15       12079       0.12       99.51         19       9       12088       0.07       99.58         21       12       12100       0.10       99.76         23       10       12110       0.08       99.76         25       8       12118       0.79.983         27       2       12120       0.02       99.84         29       6       12126       0.05       99.89         31       2       12120       0.02       99.81         35       2       12128       0.02       99.91         35       4       12132       0.03       99.94         37       2       12134       0.02       99.99         38       1       12135       0.00       99.97         41       12132       0.03       99.94       99.97         43       0       12135       0.00       99.97         43       0       12135       0.00       99.97         45       0       12136   | 11       | *  | 65   | 11996 | 0.54    | 98.82   |
| 15       30       12064       0.25       99.38         17       1       15       12079       0.12       99.51         19       9       12088       0.07       99.58         21       12       12100       0.10       99.68         23       10       12110       0.08       99.76         25       2       12       12000       0.02       99.84         29       2       12120       0.02       99.84         29       2       12128       0.02       99.84         29       2       12128       0.02       99.91         33       0       12128       0.02       99.91         35       4       12132       0.03       99.94         37       2       12134       0.02       99.96         39       4       12135       0.00       99.97         41       0       12135       0.00       99.97         43       0       12135       0.00       99.97         45       0       12135       0.00       99.98         51       0       12136       0.00       99.98         53 </td <td>13</td> <td></td> <td>38</td> <td>12034</td> <td>0.31</td> <td>99.14</td>    | 13       |  | 38   | 12034 | 0.31    | 99.14   |
| 17       15       12079       0.12       99.51         19       12       12008       0.07       99.58         21       12       12100       0.10       99.68         23       10       12110       0.08       99.76         25       8       12118       0.07       99.83         27       2       12120       0.02       99.84         29       6       12126       0.02       99.84         29       6       12128       0.02       99.91         33       0       12128       0.02       99.91         35       1       2       12128       0.02       99.91         35       1       12132       0.03       99.94         37       2       12134       0.02       99.96         39       1       12135       0.01       99.97         43       0       12135       0.00       99.97         43       0       12135       0.00       99.97         43       0       12135       0.00       99.97         43       0       12136       0.01       99.98         51       0 <td>15</td> <td></td> <td>30</td> <td>12064</td> <td>0.25</td> <td>99.38</td>          | 15       |  | 30   | 12064 | 0.25    | 99.38   |
| 19       9       12088       0.07       99.58         21       12       12100       0.10       99.68         23       10       12110       0.08       99.76         25       8       12118       0.07       99.83         27       2       12120       0.02       99.84         29       2       12120       0.02       99.84         29       2       12128       0.00       99.91         33       0       12128       0.02       99.91         35       1       12128       0.02       99.91         35       4       12132       0.03       99.94         37       2       12134       0.02       99.96         39       1       12135       0.00       99.97         41       0       12135       0.00       99.97         43       0       12135       0.00       99.97         43       0       12135       0.00       99.98         51       0       12136       0.00       99.98         53       0       12137       0.00       99.99         55       0       12138<   | 17       |  | 15   | 12079 | 0.12    | 99.51   |
| 21       12       12100       0.10       99.68         23       10       12110       0.08       99.76         25       2       12110       0.02       99.84         29       2       12120       0.02       99.84         29       6       12126       0.05       99.93         31       0       12128       0.02       99.91         33       0       12128       0.02       99.94         37       1       12132       0.03       99.94         37       2       1213       0.02       99.96         39       1       12135       0.01       99.97         43       0       12135       0.00       99.97         44       12132       0.03       99.94         47       0       12135       0.00       99.97         43       0       12135       0.00       99.97         45       0       12135       0.00       99.97         47       1       12136       0.00       99.98         51       0       12136       0.00       99.98         55       0       12138       0.0   | 19       |  | 9    | 12088 | 0.07    | 99.58   |
| 23       10       12110       0.08       99.76         25       8       12118       0.07       99.83         27       2       12120       0.02       99.84         29       6       12126       0.05       99.89         31       2       12128       0.02       99.91         33       0       12128       0.02       99.91         35       1       12135       0.01       99.97         41       12135       0.01       99.97         43       1       12135       0.01       99.97         43       0       12135       0.00       99.97         43       0       12135       0.00       99.97         43       0       12135       0.00       99.97         44       12135       0.00       99.97         45       0       12135       0.00       99.97         45       0       12136       0.01       19.98         49       0       12136       0.00       99.98         51       0       12136       0.00       99.99         53       0       12138       0.00  | 21       |  | 12   | 12100 | 0.10    | 99.68   |
| 25       8       12118       0.07       99.83         27       2       12120       0.02       99.84         29       6       12126       0.05       99.89         31       2       12128       0.02       99.91         33       0       12128       0.02       99.91         35       1       2       12128       0.02       99.91         35       1       12128       0.02       99.94         37       1       2       12134       0.02       99.96         39       1       12135       0.01       99.97         41       0       12135       0.00       99.97         43       0       12135       0.00       99.97         44       12135       0.00       99.97         45       0       12135       0.00       99.98         51       0       12136       0.01       99.98         53       0       12136       0.00       99.98         55       0       12137       0.01       99.99         55       0       12138       0.01       99.99         55       0  | 23       |  | 10   | 12110 | 0.08    | 99.76   |
| 27       2       12120       0.02       99.84         29       6       12126       0.05       99.89         31       2       12128       0.02       99.91         33       0       12128       0.02       99.91         33       1       12128       0.02       99.91         35       1       12128       0.02       99.91         36       12128       0.00       99.91         37       1       2       1213       0.02       99.96         39       1       12135       0.01       99.97         41       12135       0.01       99.97         43       0       12135       0.00       99.97         44       12135       0.01       99.97         45       0       12135       0.00       99.97         47       1       12135       0.00       99.98         51       0       12135       0.00       99.98         53       0       12136       0.00       99.98         55       0       12138       0.01       99.99         53       0       12138       0.00       99   | 25       |  | 8    | 12118 | 0.07    | 99.83   |
| 29       6       12126       0.05       99.89         31       2       12128       0.02       99.91         35       0       12128       0.00       99.91         35       4       12132       0.03       99.94         37       2       12134       0.02       99.96         39       1       12135       0.01       99.97         41       0       12135       0.00       99.97         43       0       12135       0.00       99.97         44       12135       0.00       99.97         45       0       12135       0.00       99.97         45       0       12135       0.00       99.97         45       0       12135       0.00       99.97         45       0       12136       0.00       99.98         51       0       12136       0.00       99.98         53       1       12137       0.01       99.98         55       0       12138       0.00       99.99         55       0       12138       0.00       99.99         63       0       12138       0.00   | 27       |  | 2    | 12120 | 0.02    | 99.84   |
| 31       2       12128       0.02       99.91         33       0       12128       0.00       99.91         35       4       12132       0.03       99.94         37       2       12134       0.02       99.96         39       1       12135       0.01       99.97         41       0       12135       0.00       99.97         43       0       12135       0.00       99.97         43       0       12135       0.00       99.97         45       0       12135       0.00       99.97         45       0       12135       0.00       99.97         45       0       12136       0.00       99.98         51       0       12136       0.00       99.98         53       0       12136       0.00       99.98         55       0       12137       0.01       99.99         55       0       12138       0.00       99.99         56       0       12138       0.00       99.99         67       0       12138       0.00       99.99         67       0       12138 <td>29</td> <td></td> <td>6</td> <td>12126</td> <td>0.05</td> <td>99.89</td>           | 29       |  | 6    | 12126 | 0.05    | 99.89   |
| 33       0       12128       0.00       99.91         35       4       12132       0.03       99.94         37       2       12134       0.02       99.96         39       1       12135       0.01       99.97         41       0       12135       0.00       99.97         43       0       12135       0.00       99.97         43       0       12135       0.00       99.97         45       0       12135       0.00       99.97         45       0       12135       0.00       99.97         47       1       12135       0.00       99.97         47       1       12135       0.00       99.97         47       1       12136       0.01       99.98         51       0       12136       0.00       99.98         53       1       12137       0.01       99.98         55       0       12138       0.01       99.99         57       0       12138       0.00       99.99         63       0       12138       0.00       99.99         65       0       12138 <td>31</td> <td></td> <td>2</td> <td>12128</td> <td>0.02</td> <td>99.91</td>           | 31       |  | 2    | 12128 | 0.02    | 99.91   |
| 35       4       12132       0.03       99.94         37       2       12134       0.02       99.96         39       1       12135       0.01       99.97         41       0       12135       0.00       99.97         43       0       12135       0.00       99.97         45       0       12135       0.00       99.97         47       0       12135       0.00       99.97         47       1       12135       0.00       99.98         51       0       12136       0.01       99.98         53       0       12136       0.00       99.98         54       0       12136       0.00       99.98         55       0       12137       0.01       99.98         56       0       12138       0.01       99.99         63       0       12138       0.00       99.99         63       0       12138       0.00       99.99         67       0       12138       0.00       99.99         67       0       12138       0.00       99.99         67       0       12138 <td>33</td> <td></td> <td>0</td> <td>12128</td> <td>0.00</td> <td>99.91</td>           | 33       |  | 0    | 12128 | 0.00    | 99.91   |
| 37       2       12134       0.02       99.96         39       1       12135       0.01       99.97         41       0       12135       0.00       99.97         43       0       12135       0.00       99.97         43       0       12135       0.00       99.97         45       0       12135       0.00       99.97         47       1       12136       0.01       99.98         49       0       12136       0.00       99.98         51       0       12136       0.00       99.98         53       0       12137       0.01       99.98         55       0       12137       0.00       99.99         55       0       12138       0.01       99.99         57       1       12138       0.00       99.99         63       0       12138       0.00       99.99         65       0       12138       0.00       99.99         67       1       12139       0.01       100.00         Frequency  | 35       |  | 4    | 12132 | 0.03    | 99.94   |
| 39       1       12135       0.01       99.97         41       0       12135       0.00       99.97         43       0       12135       0.00       99.97         45       0       12135       0.00       99.97         45       0       12135       0.00       99.97         47       1       12136       0.01       99.98         51       0       12136       0.00       99.98         51       0       12136       0.00       99.98         53       0       12136       0.00       99.98         55       1       12137       0.01       99.98         57       1       12138       0.01       99.99         57       1       12138       0.01       99.99         59       0       12138       0.00       99.99         63       0       12138       0.00       99.99         65       0       12138       0.00       99.99         67       1       12139       0.01       100.00         Frequency  | 37       |  | 2    | 12134 | 0.02    | 99.96   |
| 41       0       12135       0.00       99.97         43       0       12135       0.00       99.97         45       0       12135       0.00       99.97         47       0       12135       0.00       99.97         47       1       12136       0.01       99.98         51       0       12136       0.00       99.98         53       0       12136       0.00       99.98         55       0       12137       0.01       99.98         55       0       12137       0.00       99.98         57       1       12138       0.01       99.99         57       0       12138       0.00       99.99         61       0       12138       0.00       99.99         63       0       12138       0.00       99.99         65       0       12138       0.00       99.99         67       1       12139       0.01       100.00         Frequency  | 39       |  | 1    | 12135 | 0.01    | 99.97   |
| 43       0       12135       0.00       99.97         45       0       12135       0.00       99.97         47       1       12136       0.01       99.98         49       0       12136       0.00       99.98         51       0       12136       0.00       99.98         53       0       12136       0.00       99.98         53       0       12137       0.01       99.98         55       0       12137       0.00       99.98         57       0       12137       0.00       99.99         57       0       12138       0.01       99.99         59       0       12138       0.00       99.99         61       0       12138       0.00       99.99         63       0       12138       0.00       99.99         65       0       12138       0.00       99.99         67       1       12139       0.01       100.00         Frequency  | 41       |  | 0    | 12135 | 0.00    | 99.97   |
| 45       0       12135       0.00       99.97         47       1       12136       0.01       99.98         49       0       12136       0.00       99.98         51       0       12136       0.00       99.98         53       0       12136       0.00       99.98         53       1       12137       0.01       99.98         55       0       12137       0.00       99.98         57       1       12138       0.01       99.99         59       0       12138       0.00       99.99         61       0       12138       0.00       99.99         63       0       12138       0.00       99.99         65       0       12138       0.00       99.99         67       1       12139       0.01       100.00         Frequency  | 43       |  | 0    | 12135 | 0.00    | 99.97   |
| 47       1       12136       0.01       99.98         49       0       12136       0.00       99.98         51       0       12136       0.00       99.98         53       1       12137       0.01       99.98         55       1       12137       0.01       99.98         57       1       12137       0.00       99.98         57       1       12137       0.00       99.98         57       1       12138       0.01       99.99         59       0       12138       0.00       99.99         61       0       12138       0.00       99.99         63       0       12138       0.00       99.99         65       0       12138       0.00       99.99         67       1       12139       0.01       100.00         Frequency  | 45       |  | 0    | 12135 | 0.00    | 99.97   |
| 49       0       12136       0.00       99.98         51       0       12136       0.00       99.98         53       1       12137       0.01       99.98         55       0       12137       0.00       99.98         57       1       12137       0.00       99.98         57       1       12137       0.00       99.99         59       0       12138       0.01       99.99         61       0       12138       0.00       99.99         63       0       12138       0.00       99.99         65       0       12138       0.00       99.99         67       1       12138       0.00       99.99         67       1       12138       0.00       99.99         67       1       12138       0.00       99.99         67       1       12139       0.01       100.00         Frequency  | 47       |  | 1    | 12136 | 0.01    | 99.98   |
| 51       0       12136       0.00       99.98         53       1       12137       0.01       99.98         55       0       12137       0.00       99.98         57       1       12138       0.01       99.99         59       1       12138       0.01       99.99         61       0       12138       0.00       99.99         63       0       12138       0.00       99.99         65       0       12138       0.00       99.99         65       0       12138       0.00       99.99         67       1       12138       0.00       99.99         67       1       12138       0.00       99.99         67       1       12139       0.01       100.00         Frequency  | 49       |  | 0    | 12136 | 0.00    | 99.98   |
| 53       1       12137       0.01       99.98         55       0       12137       0.00       99.98         57       1       12138       0.01       99.99         59       0       12138       0.00       99.99         61       0       12138       0.00       99.99         63       0       12138       0.00       99.99         65       0       12138       0.00       99.99         67       1       12138       0.00       99.99         67       1       12138       0.00       99.99         67       1       12138       0.00       99.99         67       1       12138       0.00       99.99         67       1       12139       0.01       100.00         Frequency  | 51       |  | 0    | 12136 | 0.00    | 99.98   |
| 55       0       12137       0.00       99.98         57       1       12138       0.01       99.99         59       0       12138       0.00       99.99         61       0       12138       0.00       99.99         63       0       12138       0.00       99.99         65       0       12138       0.00       99.99         67       1       12138       0.00       99.99         67       1       12138       0.00       99.99         67       1       12138       0.00       99.99         67       1       12139       0.01       100.00         Frequency  | 53       |  | 1    | 12137 | 0.01    | 99.98   |
| 57       1       12138       0.01       99.99         59       0       12138       0.00       99.99         61       0       12138       0.00       99.99         63       0       12138       0.00       99.99         65       0       12138       0.00       99.99         67       1       12138       0.00       99.99         67       1       12138       0.00       99.99         67       1       12138       0.00       99.99         67       1       12139       0.01       100.00         Frequency  | 55       |  | 0    | 12137 | 0.00    | 99.98   |
| 59       0       12138       0.00       99.99         61       0       12138       0.00       99.99         63       0       12138       0.00       99.99         65       0       12138       0.00       99.99         67       1       12138       0.00       99.99         67       1       12138       0.00       99.99         67       1       12138       0.00       99.99         67       1       12139       0.01       100.00         Frequency  | 57       |  | 1    | 12138 | 0.01    | 99.99   |
| 61       0       12138       0.00       99.99         63       0       12138       0.00       99.99         65       0       12138       0.00       99.99         67       1       12138       0.00       99.99         67       1       12139       0.01       100.00         1       12139       0.01       100.00         1       500       1000       1500       2000       2500       3000       4000       4500       5000  | 59       |  | 0    | 12138 | 0.00    | 99.99   |
| 63   0 12138 0.00 99.99<br>65   0 12138 0.00 99.99<br>67   1 12139 0.01 100.00<br> <br>+  | 61       |  | 0    | 12138 | 0.00    | 99.99   |
| 65   0 12138 0.00 99.99<br>67   1 12139 0.01 100.00<br> <br>+++++++<br>500 1000 1500 2000 2500 3000 3500 4000 4500 5000<br>Frequency  | 63       |  | 0    | 12138 | 0.00    | 99.99   |
| 67   1 12139 0.01 100.00<br> <br>+  | 65       |  | 0    | 12138 | 0.00    | 99.99   |
| I<br>500 1000 1500 2000 2500 3000 3500 4000 4500 5000<br>Frequency  | 67       |  | 1    | 12139 | 0.01    | 100.00  |
| 500 1000 1500 2000 2500 3000 3500 4000 4500 5000  |          |  |      |       |         |         |
| Frequency   |          |  |      |       |         |         |
| Frequency   |          | 300 1000 1900 2000 2900 3000 3900 4000 4500 5000 |      |       |         |         |
|   |          | Frequency  |      |       |         |         |

Code to obtain the chart above:

data mast2; set NIS2005.mastectomy; keep los; run; proc chart data=mast2; title'Chart representing the frequency'; title2 'of the length of stay in mastectomy'; hbar los; run;

For the length of stay, the summary statistics table and these charts say the same thing. The average number of nights spent at the hospital during treatment is 2 to 3, and is at least 1.

Now, we look at the scatter plot of total charges versus length of stay. This scatter plot will tell us whether or not the

two variables are related in mastectomy.



# Graph1: Scatter plot of total charges versus length of stay in Mastectomy

The scatter plot was obtained with the use of the following code:

```
proc plot data=mast2;
title1'Scatter plot of the total charges';
title2 'vs the length of stay in mastectomies';
plot totchg*los;
label totchg='Total Charges' los='length of stay';
run;
proc plot data=lump2;
title1'Scatter plot of the total charges';
title2 'vs the length of stay in lumpectomies';
plot totchg*los;
label totchg='Total Charges' los='length of stay';
run;
```

From the scatter plot, we can conclude that in the mastectomy cases, the length of stay affects the total charges. The more the patient stays at the hospital, the higher the charges.

We next analyze the total charges as a function of the length of stay. According to the scatter plot, there is a linear relation between total charges and length of stay. We use the built-in linear regression functions in SAS Enterprise Guide 4 (EG4) to analyze this relationship.

#### LINEAR MODELS APPLIED ON THE MASTECTOMY DATA

The following results are obtained

| Analysis of Variance |       |                   |                |         |        |  |  |  |  |
|----------------------|-------|-------------------|----------------|---------|--------|--|--|--|--|
| Source               | DF    | Sum of<br>Squares | Mean<br>Square | F Value | Pr > F |  |  |  |  |
| Model                | 1     | 1.190639E12       | 1.190639E12    | 6792.50 | <.0001 |  |  |  |  |
| Error                | 11938 | 2.092579E12       | 175287214      |         |        |  |  |  |  |
| Corrected Total      | 11939 | 3.283218E12       |                |         |        |  |  |  |  |

| Root MSE       | 13240    | R-Square | 0.3626 |
|----------------|----------|----------|--------|
| Dependent Mean | 19473    | Adj R-Sq | 0.3626 |
| Coeff Var      | 67.99029 |          |        |

| Parameter Estimates |                          |    |                       |                   |         |         |  |
|---------------------|--------------------------|----|-----------------------|-------------------|---------|---------|--|
| Variable            | Label                    | DF | Parameter<br>Estimate | Standard<br>Error | t Value | Pr >  t |  |
| Intercept           | Intercept                | 1  | 10415                 | 163.58024         | 63.67   | <.0001  |  |
| LOS                 | Length of stay (cleaned) | 1  | 3980.52145            | 48.29754          | 82.42   | <.0001  |  |

From the first table (ANOVA table), we have the p.value<.0001, which means that Length of stay affects total charges. The second table confirms this fact: the large value of the R-square means that the model found is good. The third table (Parameter estimates table) gives the estimated equation of the model relation, which is:

#### Total charges= 3980.52145\*Length of stay + 10,415.

The positive slope, 3980.52145, of the linear regression line suggests that the longer the patient stays at the hospital, the higher the total charges (same conclusion as from the scatter plot). In addition, one additional night at the hospital during mastectomy treatment should increase the charges by almost \$4,000.

### LUMPECTOMY

| Tabez: Summary statistics of Lumpectomy      |      |  |  |  |  |
|--|------|--|--|--|--|
| Number of patients                           | 1412 |  |  |  |  |
| Average age of patients                      | 64   |  |  |  |  |
| Average length of stay per patient (in days) | 3    |  |  |  |  |
| Average number of diagnoses per patient      | 5    |  |  |  |  |

| Average number of procedures per patient | 3        |
|--|----------|
| Average total charges                    | 21584.77 |

This table was summarized from the result of the following code:

```
libname NIS2005 'E:\NIS2005';
data lump1;
set NIS2005.lumpectomy;
keep age los ndx npr totchg;
run;
proc univariate data=lump1;
var age los ndx npr totchg;
output out=NIS2005.SummaryStat_lumpectomy
    N=lumpectomies
    mean=meanage meanlos meanndx meannpr meantotchg;
run;
```

This summary statistics table gives the averages of the considered variables. Since we are interested in the variables, total charges and length of stay, we produce charts to view more clearly how they are in the lumpectomy data.

Chart3: Chart representing the frequencies of the total charges in Lumpectomy

| Total charges (cleaned) |   |      | Cum. | Descent | Cum.    |  |
|-------------------------|---|------|------|---------|---------|--|
| Midpoint                | L   | Freq | Freq | Percent | Percent |  |
| 0                       | ************************************      | 674  | 674  | 48.98   | 48.98   |  |
| 30000                   | <br>  * * * * * * * * * * * * * * * * * * | 605  | 1279 | 43.97   | 92.95   |  |
| 60000                   | <br> ***                                  | 57   | 1336 | 4.14    | 97.09   |  |
| 90000                   | <br> *                                    | 19   | 1355 | 1.38    | 98.47   |  |
| 120000                  |   | 7    | 1362 | 0.51    | 98.98   |  |
| 150000                  |   | 4    | 1366 | 0.29    | 99.27   |  |
| 180000                  |   | 5    | 1371 | 0.36    | 99.64   |  |
| 210000                  |   | 2    | 1373 | 0.15    | 99.78   |  |
| 240000                  |   | 0    | 1373 | 0.00    | 99.78   |  |
| 270000                  |   | 1    | 1374 | 0.07    | 99.85   |  |
| 300000                  |   | 0    | 1374 | 0.00    | 99.85   |  |
| 330000                  |   | 0    | 1374 | 0.00    | 99.85   |  |
| 360000                  |   | 1    | 1375 | 0.07    | 99.93   |  |
| 390000                  |   | 0    | 1375 | 0.00    | 99.93   |  |
| 420000                  |   | 0    | 1375 | 0.00    | 99.93   |  |
| 450000                  |   | 0    | 1375 | 0.00    | 99.93   |  |
| 480000                  |   | 0    | 1375 | 0.00    | 99.93   |  |
| 510000                  |   | 1    | 1376 | 0.07    | 100.00  |  |
|                         |   |      |      |         |         |  |
|                         | 100 200 300 400 500 600                   |      |      |         |         |  |
|                         | Frequency                                 |      |      |         |         |  |

Code to obtain the chart above:

```
data lump2;
set NIS2005.lumpectomy;
keep totchg;
run;
proc chart data=lump2;
title1'Chart representing the frequency of'
title2 ' the total charges in lumpectomies';
hbar totchg;
run;
```

The table of summary statistics for Lumpectomy gives an average amount of \$21,584.77 for the total charges and the chart shows that about 43.97% of the patients are charged \$30,000. If we choose not to take into consideration those with an average cost of \$0.0, we can conclude that the charges for Lumpectomy are about \$30,000.

| Length<br>Midpoint | of stay (cl | eaned)  |          |        |         |           | Freq | Cum.<br>Freq | Percent | Cum.<br>Percent |  |
|--------------------|-------------|---------|----------|--------|---------|-----------|------|--------------|---------|-----------------|--|
| 2.5                | *******     | ******* | *******  | ****** | ******* | ****      | 1195 | 1195         | 84.57   | 84.57           |  |
| 7.5                | ****        |         |          |        |         |           | 129  | 1324         | 9.13    | 93.70           |  |
| 12.5               | **          |         |          |        |         |           | 55   | 1379         | 3.89    | 97.59           |  |
| 17.5               | *           |         |          |        |         |           | 17   | 1396         | 1.20    | 98.80           |  |
| 22.5               |             |         |          |        |         |           | 2    | 1398         | 0.14    | 98.94           |  |
| 27.5               |             |         |          |        |         |           | 6    | 1404         | 0.42    | 99.36           |  |
| 32.5               |             |         |          |        |         |           | 3    | 1407         | 0.21    | 99.58           |  |
| 37.5               |             |         |          |        |         |           | 2    | 1409         | 0.14    | 99.72           |  |
| 42.5               |             |         |          |        |         |           | 0    | 1409         | 0.00    | 99.72           |  |
| 47.5               |             |         |          |        |         |           | 2    | 1411         | 0.14    | 99.86           |  |
| 52.5               |             |         |          |        |         |           | 0    | 1411         | 0.00    | 99.86           |  |
| 57.5               |             |         |          |        |         |           | 1    | 1412         | 0.07    | 99.93           |  |
| 62.5               |             |         |          |        |         |           | 0    | 1412         | 0.00    | 99.93           |  |
| 67.5               |             |         |          |        |         |           | 0    | 1412         | 0.00    | 99.93           |  |
| 72.5               |             |         |          |        |         |           | 0    | 1412         | 0.00    | 99.93           |  |
| 77.5               |             |         |          |        |         |           | 0    | 1412         | 0.00    | 99.93           |  |
| 82.5               |             |         |          |        |         |           | 0    | 1412         | 0.00    | 99.93           |  |
| 87.5               |             |         |          |        |         |           | 1    | 1413         | 0.07    | 100.00          |  |
|                    | 200         | 400     | 600      | 800    | 1000    | +<br>1200 |      |              |         |                 |  |
|                    | 200         |         |          |        |         |           |      |              |         |                 |  |
|                    |             | F       | requency |        |         |           |      |              |         |                 |  |

#### Chart4: Chart with frequencies for the Length Of Stay in Lumpectomy

Code to obtain the chart above:

```
data lump2;
set NIS2005.lumpectomy;
keep los;
run;
```

```
proc chart data=mast2;
title'Chart representing the frequency of';
title2 'the length of stay in lumpectomies';
hbar los;
run;
```

For the length of stay, the summary statistics table and these charts say the same thing. The average number of nights spent at the hospital during treatment is 2 to 3, and is at least 1.

Next, we look at the scatter plot of total charges versus length of stay. It will show us whether or not the two variables are related in lumpectomy and what kind of relation they have if there is any.



(Plot of TOTCHG\*LOS. Legend: A = 1 obs, B = 2 obs, etc.)



The scatter plot was obtained with the use of the following code:

```
proc plot data=lump2;
title1'Scatter plot of the total charges';
title2 'vs the length of stay in lumpectomies';
```

```
plot totchg*los;
label totchg='Total Charges' los='length of stay';
run;
```

From the scatter plot, we can conclude that in the lumpectomy treatment, the length of stay affects the total charges. The more time the patient spends at the hospital, the more the charges.

This inspires us to analyze the total charges as a function of the length of stay. Looking at the scatter plots, the relation between total charges and length of stay is linear. Just like in the mastectomy case, we use the built-in linear regression functions in SAS Enterprise Guide 4 (EG4) to study this relationship.

#### LINEAR MODELS APPLIED ON THE LUMPECTOMY DATA

| Analysis of Variance |      |                   |                |         |        |  |  |  |  |
|----------------------|------|-------------------|----------------|---------|--------|--|--|--|--|
| Source               | DF   | Sum of<br>Squares | Mean<br>Square | F Value | Pr > F |  |  |  |  |
| Model                | 1    | 5.802538E11       | 5.802538E11    | 1758.49 | <.0001 |  |  |  |  |
| Error                | 1374 | 4.53383E11        | 329973099      |         |        |  |  |  |  |
| Corrected Total      | 1375 | 1.033637E12       |                |         |        |  |  |  |  |

From EG, we get the following results:

| Root MSE       | 18165    | R-Square | 0.5614 |
|----------------|----------|----------|--------|
| Dependent Mean | 21585    | Adj R-Sq | 0.5611 |
| Coeff Var      | 84.15729 |          |        |

| Parameter Estimates |                          |    |                       |                   |         |         |  |
|---------------------|--------------------------|----|-----------------------|-------------------|---------|---------|--|
| Variable            | Label                    | DF | Parameter<br>Estimate | Standard<br>Error | t Value | Pr >  t |  |
| Intercept           | Intercept                | 1  | 9814.30932            | 564.43938         | 17.39   | <.0001  |  |
| LOS                 | Length of stay (cleaned) | 1  | 3982.33597            | 94.96601          | 41.93   | <.0001  |  |

Like in the mastectomy case, for the first table (ANOVA table), we get the p.value<.0001, which means that, here also, Length of stay affects total charges. The R-square value from the second table is a little higher than the one found in the Mastectomy data, so it also confirms the conclusion drawn from the ANOVA table. The third table (Parameter estimates table) gives the estimated equation of the model relation:

#### Total charges= 3982.33597\*Length of stay + 9814.30932.

The positive slope, 3982.33597, of the linear regression line suggests that the longer the patient stays at the hospital, the higher the total charges, and one additional night at the hospital during lumpectomy treatment will increase the charges by almost \$4,000 (same amount as in the mastectomy case).

#### COMPARISON OF MASTECTOMY AND LUMPECTOMY DATA

We first look at the compared summary statistics.

|                                      | Mastectomy | Lumpectomy |
|--------------------------------------|------------|------------|
| Number of patients                   | 12115      | 1412       |
| Average age of patients              | 62         | 64         |
| Average length of stay per treatment | 2          | 3          |
| Average amount of total charges      | 19475      | 21584.77   |

#### Table3: Summary statistics comparing the mastectomy and the lumpectomy

The mastectomy is the most used compared to lumpectomy. The length of stay for both surgeries is almost the same. There is a major difference in the total charges for these two surgeries: the lumpectomy is the most expensive. This last observation given by the means of the two total charges is also confirmed by the frequencies (see chart1 and chart2); while most people are charged \$18,000 for mastectomy, many people are charged \$30,000 for lumpectomy.

We then look at the densities of the total charges in both the mastectomy and the lumpectomy. For this, we use kernel density estimation. Kernel density estimation is a way to estimate the density probability function. We use PROC KDE to compute the estimated probabilities and PROC GPLOT to plot the functions. The code used is the following:

```
/*compute densities in mastectomy and in lumpectomy*/
libname NIS2005 'E:\NIS2005';
data mast1 totchg density;
set NIS2005.mastectomy;
keep totchq;
run;
proc kde data=mast1 totchq density out=mast2 totchq density;
var totchq;
run:
data lump1 totchg density;
set NIS2005.lumpectomy;
keep totchg;
run:
proc kde data=lump1 totchq density out=lump2 totchq density;
var totchq;
run;
/*Combine tables*/
data NIS2005.mast3 totchg density (rename=(totchg=mast totchg
density=mast density count=mast count));
set mast2 totchg density;
run;
data NIS2005.lump3 totchg density (rename=(totchg=lump totchg
density=lump density count=lump count));
set lump2 totchg density;
run:
Data NIS2005.mast lump totchg density;
merge NIS2005.mast3 totchg density NIS2005.lump3 totchg density;
run:
/*Graph the two densities in the same coordinate system* (red=mastectomy,
blue=lumpectomy*/
title'Comparison of the total charges of mastectomy and lumpectomy';
proc gplot data=NIS2005.Mast lump totchg density;
```

This code produces the compared densities for total charges above.

#### Graph3: Comparison of the total charges densities in Mastectomy and Lumpectomy

## Comparison of the length of stay of mastectomy and lumpectomy



Blue:Lumpectomy

Red: Mastectomy

From this graph, we show that the estimates of charges for mastectomy and lumpectomy are the same. The probability of paying a certain amount of money is the same when treated by mastectomy or lumpectomy

Finally, we look at the densities of the length of stay in the mastectomy and the lumpectomy. Again, we use the kernel density estimation. The code below is used:

```
/*compute densities in mastectomy and in lumpectomy*/
   data mast1_los_density;
   set NIS2005.mastectomy;
   keep los;
   run;
   proc kde data=mast1_los_density out=mast2_los_density;
   var los;
   run;
```

```
data lump1 los density;
set NIS2005.lumpectomy;
keep los;
run;
proc kde data=lump1 los density out=lump2 los density;
var los;
run;
/*Combine tables*/
data NIS2005.mast3 los density (rename=(los=mast los density=mast density
count=mast count));
set mast2 los density;
run;
data NIS2005.lump3 los density (rename=(los=lump los density=lump density
count=lump count));
set lump2 los density;
run;
Data NIS2005.mast lump los density;
merge NIS2005.mast3 los density NIS2005.lump3 los density;
run;
/*Graph the two densities in the same coordinate system* (red=mastectomy,
blue=lumpectomy*/
title'Comparison of the length of stay of mastectomy and lumpectomy';
proc gplot data=NIS2005.Mast lump los density;
symbol1 color=red i=spline w=3 v=none;
symbol2 color=blue i=spline w=3 v=none;
plot mast density*mast los lump density*lump los/overlay
                                                   haxis=0 to
                                                                  14 by 2;
label mast los='Length Of Stay'
     lump los='Length Of Stay'
     mast density='Density'
     lump density='Density';
run;
```

As a result, we have the graph below:

## Graph4: Comparison of the length of stay densities in Mastectomy and Lumpectomy Comparison of the length of stay of mastectomy and lumpectomy



This graph tells us that the patient is more likely to spend nights at the hospital when treated by mastectomy than when treated by lumpectomy.

#### CONCLUSION

Lumpectomy and mastectomy are important surgical treatments used for breast cancer. It is important for a patient to know the similarities and the differences, especially in total charges and length of stay at the hospital. Our study shows that lumpectomy is more expensive than mastectomy and the difference can be more than \$10,000. The length of stay is almost the same, on average, 2 to 3 days, but one is more likely to spend nights at the treatment center when treated by mastectomy then when treated by lumpectomy. From our study, we can conclude that SAS is a powerful tool for data analysis, data visualization and data description.

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#### **CONTACT INFORMATION**

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