

Questions:

1. Read the data into SAS. Report what you observe about the datasets (10 pts)

Ans) The dataset salesdata.csv is composed of 300 observations, the variables used here are as follows: internetadvt, price, printadvt, radioadvt , sales, week. In total we have 6 variables. The variable type used here is Num and Len 8.

| Engine/Host Dependent Information | |
|-----------------------------------|--|
| Data Set Page Size | 65536 |
| Number of Data Set Pages | 1 |
| First Data Page | 1 |
| Max Obs per Page | 1361 |
| Obs in First Data Page | 300 |
| Number of Data Set Repairs | 0 |
| ExtendObsCounter | YES |
| Filename | C:\Users\SMUKHE~1\AppData\Local\Temp\SAS Temporary Files_TD3564_SSB401H11_\salesdata.sas7bdat |
| Release Created | 9.0401M6 |
| Host Created | X64_10PRO |
| Owner Name | ILTECH\smukherjee3 |
| File Size | 128KB |
| File Size (bytes) | 131072 |

| Alphabetic List of Variables and Attributes | | | | | |
|---|--------------|------|-----|---------|----------|
| # | Variable | Type | Len | Format | Informat |
| 5 | internetadvt | Num | 8 | BEST12. | BEST32. |
| 2 | price | Num | 8 | BEST12. | BEST32. |
| 3 | printadvt | Num | 8 | BEST12. | BEST32. |
| 4 | radioadvt | Num | 8 | BEST12. | BEST32. |
| 1 | sales | Num | 8 | BEST12. | BEST32. |
| 6 | week | Num | 8 | BEST12. | BEST32. |

DATASET STRUCTURE

The SAS System

| Obs | sales | price | printadvt | radioadvt | internetadvt | week |
|-----|-------|-------|-----------|-----------|--------------|------|
| 1 | 59 | 3.08 | 12 | 9 | 6 | 1 |
| 2 | 99 | 6.18 | 11 | 12 | 16 | 2 |
| 3 | 67 | 5.87 | 12 | 11 | 8 | 3 |
| 4 | 99 | 6.4 | 14 | 12 | 15 | 4 |
| 5 | 85 | 6.04 | 11 | 13 | 12 | 5 |
| 6 | 67 | 4.74 | 13 | 10 | 7 | 6 |
| 7 | 83 | 2.85 | 14 | 10 | 10 | 7 |
| 8 | 45 | 6.44 | 11 | 6 | 6 | 8 |
| 9 | 72 | 3.14 | 11 | 7 | 11 | 9 |
| 10 | 115 | 5.93 | 14 | 9 | 20 | 10 |
| 11 | 94 | 3.76 | 11 | 8 | 16 | 11 |
| 12 | 80 | 3.62 | 13 | 8 | 11 | 12 |
| 13 | 106 | 4.56 | 12 | 12 | 16 | 13 |
| 14 | 107 | 3.69 | 13 | 6 | 20 | 14 |
| 15 | 80 | 5.76 | 11 | 11 | 11 | 15 |
| 16 | 99 | 4.59 | 12 | 7 | 18 | 16 |
| 17 | 96 | 3.99 | 15 | 12 | 13 | 17 |
| 18 | 72 | 5.95 | 10 | 10 | 11 | 18 |
| 19 | 92 | 2.75 | 12 | 10 | 13 | 19 |
| 20 | 64 | 3.63 | 14 | 10 | 6 | 20 |

1ST 20 OBSERVATIONS SHOWN ABOVE

2. Study the raw data and report what you see from the data. (10 pts)

The SAS System

The MEANS Procedure

| Variable | N | Mean | Std Dev | Minimum | Maximum |
|--------------|-----|---------|---------|---------|---------|
| sales | 300 | 83.803 | 18.592 | 45.000 | 125.000 |
| price | 300 | 4.537 | 1.415 | 2.000 | 6.970 |
| printadvt | 300 | 12.350 | 1.400 | 10.000 | 15.000 |
| radioadvt | 300 | 9.053 | 2.360 | 5.000 | 13.000 |
| internetadvt | 300 | 12.437 | 4.244 | 5.000 | 20.000 |
| week | 300 | 150.500 | 86.747 | 1.000 | 300.000 |

Summary statistics of the dataset.

Explanation:

The dataset comprises of 300 observations and revealing a certain degree of variability across the listed marketing metrics. On an average sales hover around an average of 83 UNITS, with a wide range between 45 UNITS to 125 UNITS. Average pricing is about 4.5 dollars with a variability of 2 to 7 dollars approx. which is significant. Average cost involved for printadvt is 12.350, in a range of 10 to 15 dollars of variability. Average cost of radioadvyt is 9.05 approx lying in a range of 5 to 13 dollars and internetadvt of average of 124.437 dollars with a wide variability of 5 dollars to 20 dollars.

Note weeks for which we are assessing the model are between 1 – 300 too.

3. Propose a suitable model to analyze this data. Specify the model specification. Setup the data for analysis and run the analysis using SAS. Describe and justify all your modeling decisions. (10 pts)

| The SAS System | | | | | |
|-----------------------------|-----|--------------------|----------------|---------|---------|
| The REG Procedure | | | | | |
| Model: MODEL1 | | | | | |
| Dependent Variable: sales | | | | | |
| Number of Observations Read | | | | | 300 |
| Number of Observations Used | | | | | 300 |
| Analysis of Variance | | | | | |
| Source | DF | Sum of Squares | Mean Square | F Value | Pr > F |
| Model | 1 | 1556.90400 | 1556.90400 | 4.56 | 0.0336 |
| Error | 298 | 101800 | 341.61239 | | |
| Corrected Total | 299 | 103357 | | | |
| Root MSE | | 18.48276 | R-Square | 0.0151 | |
| Dependent Mean | | 83.80333 | Adj R-Sq | 0.0118 | |
| Coeff Var | | 22.05492 | | | |
| Parameter Estimates | | | | | |
| Variable | DF | Parameter Estimate | Standard Error | t Value | Pr > t |
| Intercept | 1 | 91.11777 | 3.58856 | 25.39 | <.0001 |
| price | 1 | -1.61219 | 0.75518 | -2.13 | 0.0336 |

The SAS System

| Obs | _MODEL_ | _TYPE_ | _DEPVAR_ | _RMSE_ | Intercept | price | sales |
|-----|---------|--------|----------|---------|-----------|----------|-------|
| 1 | MODEL1 | PARMS | sales | 18.4828 | 91.1178 | -1.61219 | -1 |

The regression denotes that the coefficient of price is negative (-1.61), suggesting higher prices reduce sales. P value pf 0.0336. , and the model explains almost none of the variation in sales (adjusted r square of = 0.03, which indicates that the price of the product is not strongly driven by price alone and other facrs such as advertising play a bigger role.

Key variables :

Intercept:91.117

Priceperunit = -1.162

Sales = 91.117 – 1.162 * PRICE

NOW I AM RUNNING REGRESSION ON PRICE + PRINTADVT+RADIOADVT+INTERNETADVT + WEEK(NOT A PREDICTOR)

| The SAS System | | | | | |
|---|-----|--------------------|-----------------------------|---------|---------|
| The REG Procedure Model: MODEL1 Dependent Variable: sales | | | | | |
| Number of Observations Read | | 300 | Number of Observations Used | | 300 |
| Analysis of Variance | | | | | |
| Source | DF | Sum of Squares | Mean Square | F Value | Pr > F |
| Model | 2 | 2783.54883 | 1391.77442 | 4.11 | 0.0174 |
| Error | 297 | 100574 | 338.63248 | | |
| Corrected Total | 299 | 103357 | | | |
| Root MSE | | 18.40197 | R-Square | 0.0269 | |
| Dependent Mean | | 83.80333 | Adj R-Sq | 0.0204 | |
| Coeff Var | | 21.95852 | | | |
| Parameter Estimates | | | | | |
| Variable | DF | Parameter Estimate | Standard Error | t Value | Pr > t |
| Intercept | 1 | 72.93088 | 10.20183 | 7.15 | <.0001 |
| price | 1 | -1.54537 | 0.75270 | -2.05 | 0.0409 |
| printadvt | 1 | 1.44807 | 0.76084 | 1.90 | 0.0580 |

The SAS System

The REG Procedure

Model: MODEL4

Dependent Variable: sales

| | |
|-----------------------------|-----|
| Number of Observations Read | 300 |
| Number of Observations Used | 300 |

| Analysis of Variance | | | | | |
|----------------------|-----|----------------|-------------|---------|--------|
| Source | DF | Sum of Squares | Mean Square | F Value | Pr > F |
| Model | 2 | 14361 | 7180.74282 | 23.96 | <.0001 |
| Error | 297 | 88996 | 299.64953 | | |
| Corrected Total | 299 | 103357 | | | |

| | | | |
|----------------|----------|----------|--------|
| Root MSE | 17.31039 | R-Square | 0.1389 |
| Dependent Mean | 83.80333 | Adj R-Sq | 0.1332 |
| Coeff Var | 20.65597 | | |

| Parameter Estimates | | | | | |
|---------------------|----|--------------------|----------------|---------|---------|
| Variable | DF | Parameter Estimate | Standard Error | t Value | Pr > t |
| Intercept | 1 | 67.04294 | 4.98593 | 13.45 | <.0001 |
| price | 1 | -1.84640 | 0.70819 | -2.61 | 0.0096 |
| radioadvt | 1 | 2.77660 | 0.42475 | 6.54 | <.0001 |

When I regressed the price variable against advertising factors such as printadvt and advt (the effects were statistically significant) as the p values of printadvt and radioadvt clearly tells us both are lesser than 0.5, with an adjusted r square of 0.0204 and 0.1332, which means printadvt doesn't impact the price as much as radioadvt does.

p.t.o

| The SAS System | | | | | |
|-----------------------------|-----|--------------------|----------------|---------|---------|
| The REG Procedure | | | | | |
| Model: MODEL2 | | | | | |
| Dependent Variable: sales | | | | | |
| Number of Observations Read | | | | | 300 |
| Number of Observations Used | | | | | 300 |
| Analysis of Variance | | | | | |
| Source | DF | Sum of Squares | Mean Square | F Value | Pr > F |
| Model | 2 | 89815 | 44907 | 984.84 | <.0001 |
| Error | 297 | 13543 | 45.59861 | | |
| Corrected Total | 299 | 103357 | | | |
| Root MSE | | 6.75267 | R-Square | 0.8690 | |
| Dependent Mean | | 83.80333 | Adj R-Sq | 0.8681 | |
| Coeff Var | | 8.05776 | | | |
| Parameter Estimates | | | | | |
| Variable | DF | Parameter Estimate | Standard Error | t Value | Pr > t |
| Intercept | 1 | 41.94858 | 1.72279 | 24.35 | <.0001 |
| price | 1 | -1.87390 | 0.27597 | -6.79 | <.0001 |
| internetadvt | 1 | 4.04904 | 0.09203 | 43.99 | <.0001 |

when I incorporated the internetadvt variable , we see a result of adjusted r square of 0.8681,that explains massive variation in sales, and impacts the price the most.

4. Based on your model estimates, what can you tell Mr. Bond about advertising channels used for his product? (10 pts)

| The SAS System | | | | | | | |
|---|----------|---------------------|----------|-----------|-----------|--------------|------------|
| The REG Procedure Model: MODEL1 Dependent Variable: sales | | | | | | | |
| R-Square Selection Method | | | | | | | |
| Number of Observations Read 300 | | | | | | | |
| Number of Observations Used 300 | | | | | | | |
| Number in Model | R-Square | Parameter Estimates | | | | | |
| | | Intercept | price | printadvt | radioadvt | internetadvt | week |
| 1 | 0.8486 | 33.61429 | . | . | . | 4.03557 | . |
| 2 | 0.9483 | 11.64639 | . | . | 2.48805 | 3.99075 | . |
| 3 | 0.9734 | 20.37301 | -2.08618 | . | 2.55056 | 4.00463 | . |
| 4 | 0.9867 | 1.45048 | -2.00994 | 1.54037 | 2.47459 | 4.02399 | . |
| 5 | 0.9867 | 1.43619 | -2.00971 | 1.54030 | 2.47441 | 4.02403 | 0.00010190 |

| The SAS System | | | | | | | | | | | | | | | | |
|----------------|---------|--------|----------|---------|-----------|----------|-----------|-----------|--------------|------------|-------|------|-----|-------|---------|--|
| Obs | _MODEL_ | _TYPE_ | _DEPVAR_ | _RMSE_ | Intercept | price | printadvt | radioadvt | internetadvt | week | sales | _IN_ | _P_ | _EDF_ | _RSQ_ | |
| 1 | MODEL1 | PARMS | sales | 7.24574 | 33.6143 | . | . | . | 4.03557 | . | -1 | 1 | 2 | 298 | 0.84863 | |
| 2 | MODEL1 | PARMS | sales | 4.24344 | 11.6464 | . | . | 2.48806 | 3.99075 | . | -1 | 2 | 3 | 297 | 0.94826 | |
| 3 | MODEL1 | PARMS | sales | 3.04735 | 20.3730 | -2.08618 | . | 2.55056 | 4.00463 | . | -1 | 3 | 4 | 296 | 0.97341 | |
| 4 | MODEL1 | PARMS | sales | 2.15667 | 1.4505 | -2.00994 | 1.54037 | 2.47459 | 4.02399 | . | -1 | 4 | 5 | 295 | 0.98672 | |
| 5 | MODEL1 | PARMS | sales | 2.16031 | 1.4362 | -2.00971 | 1.54030 | 2.47441 | 4.02403 | .000101905 | -1 | 5 | 6 | 294 | 0.98672 | |

A stepwise modeling approach was used to identify the optimal specification, starting with the simpler models including single advertising variables and additional variables which were incrementally added based on their contribution to explaining sales variation. **I witnessed that when regressed price against just internetadvt (advertising variable) is the variable having the highest adjusted rsquare value 0.8681 and r square of 0.8691 hence this could have an effect on the price of the product.**

The SAS System

The MEANS Procedure

| Variable | Mean |
|--------------|-------------|
| sales | 83.8033333 |
| price | 4.5369667 |
| printadvt | 12.3500000 |
| radioadvt | 9.0533333 |
| internetadvt | 12.4366667 |
| week | 150.5000000 |

The SAS System

| Obs | _TYPE_ | _FREQ_ | sales_Mean | price_Mean | printadvt_Mean | radioadvt_Mean | internetadvt_Mean | week_Mean |
|-----|--------|--------|--------------|-------------|----------------|----------------|-------------------|-----------|
| 1 | 0 | 300 | 83.803333333 | 4.536966667 | 12.35 | 9.053333333 | 12.436666667 | 150.5 |

5. What would happen to sales if Mr. Bond increased the advertising in each of the channels? (10 pts)

The SAS System

| Obs | _MODEL_ | _DEPVAR_ | _RMSE_ | Intercept | price | sales | _FREQ_ | sales_Mean | price_Mean | printadvt_Mean | radioadvt_Mean | internetadvt_Mean | week_Mean | E_P_price |
|-----|---------|----------|---------|-----------|----------|-------|--------|--------------|-------------|----------------|----------------|-------------------|-----------|-----------|
| 1 | MODEL1 | sales | 18.4828 | 91.1178 | -1.61219 | -1 | 300 | 83.803333333 | 4.536966667 | 12.35 | 9.053333333 | 12.436666667 | 150.5 | -0.087281 |

FROM A MARKETING ANALYST'S POINT OF VIEW, THE DATA SHOWS THAT PRODUCT DEMAND IS QUITE INELASTIC WHICH MEANS MOST CUSTOMERS AREN'T TOO SENSITIVE TO PRICE CHANGES, WHILE THE REGRESSION CONFIRMS THAT SALES DO DIP SLIGHTLY WHEN PRICES GO UP (WITH A COEFFICIENT OF - 1.61), THE REAL TAKEAWAY COMES FROM THE PRICE ELASTICITY OF DEMAND , WHICH IS JUST -0.08.IN SIMPLE TERMS IF THE PRICES FOR THE ADVERTISING CHANNELS WERE TO GO UP/ PRICE OF THE PRODUCT WOULD GO UP BY 1 %, SALES WOULD DROP BY ONLY 0.087.THIS EXPLAINS THE CONSUMERS ARE MUCH LIKELY TO KEEP BUYING THE PRODUCTS EVEN IF THE PRICES RISE A BIT. WHICH MEANS ,THE COMPANY COULD CONSIDER MODESTLY INCREASING THE PRICES OF THE PRODUCT BY INCREASING ADVERTISING WITHOUT HURTING SALES.THIS COULD IMPROVE OVERALL REVENUE.

APPENDIX:

```
libname exam "C:\Users\smukherjee3\Downloads\final";  
proc import out = salesdata  
datafile = "C:\Users\smukherjee3\Downloads\final\salesdata.csv"  
dbms = csv replace;  
getnames = yes;  
datarow = 2;  
run;  
*printing 1st 10 observations;  
proc print data= salesdata (obs=20);  
run;  
*viewing the dataset structure and initial observations;  
proc contents data= salesdata;  
run;  
*creating summarys statistics;  
proc means data= salesdata maxdec=3;  
run;  
*print regression results results to review impact of price on sales and omarketing variables;  
proc reg data= salesdata plots=none outest =linreg_adv;  
model sales = price;  
run;quit;  
proc print data = linreg_adv;  
run;  
  
proc reg data= salesdata plots=none;  
model sales = price;  
model sales = price internetadvt;
```

```

model sales = price printadvt;
model sales = price radioadvt;
*model sales = price printadvt radioadvt;
*model sales = price printadvt radioadv internetadvt;
*model sales = price printadvt radioadv internetadvt week;
run;quit;
*automated model selection;

proc reg data = salesdata plots=none outest=linreg_advert;
model sales = price printadvt radioadvt internetadvt week / selection=rsquare b best=1;
run;

proc print data=linreg_advert;
run;
*Calculating mean values for elasticity analysis;

proc means data = salesdata mean;
var sales price printadvt radioadvt internetadvt week;
output out=means_all_v mean= /autoname;
run;

proc print data = means_all_v;
run;
*merge regression estimates and mean values for elasticity calculations;

data elasticity;
merge linreg_adv(drop=_TYPE_) 
      means_all_v(drop=_TYPE_);
E_P_price = price * (price_Mean / sales_Mean);
run;

```

```
proc print data=elasticity;  
run;
```