Abstract

GreenMarketplace.com (GMP) is the premier Internet retailer of socially and environmentally friendly products. In order to increase its sales and revenue, GMP has instituted a bi-weekly promotional sale, advertised through e-mail flyers. Although the company has informally investigated how changing elements of the promotions affects sales and revenue, it has not discovered a formula for the best promotion for its current and changing needs. This report explores elements of GMP's promotions in an attempt to find an optimal recipe. While informal data analysis does indicate weak associations between various elements of a promotion and the level of daily sales and revenue, the best model based on these elements can not reliably predict sales and revenue for a promotion two weeks in the future. Further work and more data could unveil models that better account for the overall increasing trend in sales and revenue, and would be accurate predictors.

I. Introduction

GreenMarketplace.com (GMP) is the premier Internet retailer of socially and environmentally friendly products. As part of the company's sales strategy, it implemented a free membership program that allows those who share demographic and contact information with GMP to receive a discount on all orders. In September of 2000, GreenMarketplace.com (GMP) began to experiment with promotional sales, advertised with e-mail fliers sent to all members. Since that time, GMP has varied some of the many factors that could influence the success of the promotion in terms of increased and sustained revenues and sales.

The company has informally analyzed the effects of these variations, but has not successfully created a "formula" to predict sales and revenues for a particular combination of promotion components. This report presents analysis intended to discover a recipe to maximize the number of sales and revenue during promotions; it includes informal and formal conclusions about the most relevant factors in determining a successful promotion so that GMP can consistently increase sales and revenues.

The specific factors addressed are:

- number of products put on sale
- type of products promoted
- cost of products promoted
- size of the discounts
- length of the promotional sales
- day of the week on which the promotion begins
- days of the week that the promotion covers
- number of flyers e-mailed.

The following section (Data) contains information about the data used to analyze the importance of these factors. The Analysis and Discussion section contains the formal analysis and model building. Conclusions are found in the last report section, followed by technical appendices that include extensive plots, model selection detail, and a glossary.

II. Data

The data consist of two distinct parts¹:

- 1. The historical total of number of daily sales and daily revenue and historical number of daily sales and daily revenues for 26 of the promoted products between March 8, 1999 and October 20, 2001. GMP computers automatically collect sales and revenue information, which was then compiled by GMP staff.
- 2. Promotion information, including which products were discounted, product category, original sale price, percent discount, starting day of the promotion, length of the promotion and the number of flyers e-mailed. GMP staff record promotion information at the time of each promotion.

Focus will be placed on finding predictors for:

- 1. total company sales by day
- 2. total company revenue by day
- 3. individual promotion items sales by day
- 4. individual promotion items revenue by day

Possible predictors (determinants) available for study include:

- 1. category of products included in the sale
- 2. number of flyers e-mailed
- 3. length of the promotion
- 4. number of products promoted
- 5. price (or price categories) of products promoted
- 6. percent discount (for total information, average percent discount and highest percent discount)
- 7. the month of the promotion
- 8. the day on which the promotion began
- 9. days of the week included in the promotion

Figure ?? shows GMP's overall sales and revenues, with the start days for the promotions marked. Similar plots for each of the individual products, grouped by product type, are shown in Figures ?? through ??. These plots evidence a distinct change in GMP's business near the end of the first quarter of 2000. Because this analysis is focused on the time during which promotions took place, the data used for the formal analysis will only include days after September 1, 2000. September first was chosen because it is far enough away from the point of the fundamental company change to ensure the company has stabilized in its new pattern, yet is several weeks before the first promotion and so provides an adequate baseline.

Before exploring which elements of a promotion are best, the overall sales/revenue advantage of promotions must be established. Figure ?? shows histograms and boxplots that clearly indicate that sales and revenue increases during promotion days.

¹descriptions of the data codes are found in Appendix A, the Glossary

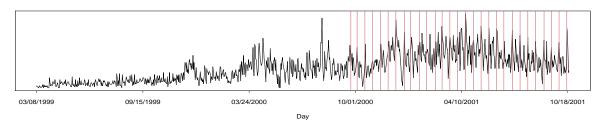
The behavior of each of the individual determinants for the overall sales and revenue models, as well as its correlation with sales and revenue, are portrayed in plots in Appendix B. Most notable among these is the lack of any strong trends. Weak correlations include:

- The first two days of a promotion are best in sales and revenue. The third day could also be better for revenue.
- More products in a promotion generate more sales and revenue.
- Sales may increase with an increase in the average percent discount offered.
- Including Tuesday in a promotion may generate more sales.
- A promotion that lasts two or three days generates more sales and revenue than those that last longer.

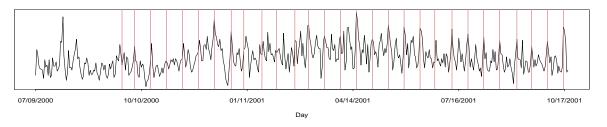
Similar plots for pooled product sales and revenues are in Appendix C. Again, there were no outstanding relationships. The strongest are:

- Home category products performed better in revenue and sales.
- The first and second days of a promotion generated the most revenue and sales.
- An increase in the number of flyers e-mailed increases the number of sales and revenue generated by a promotion.
- Including Wednesday in a promotion increases sales.

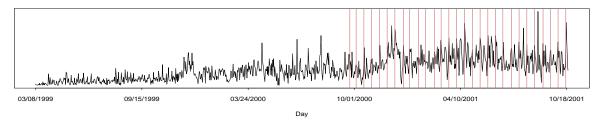
Daily Number of Sales with Promotion Start Dates Marked



Closeup of Daily Number of Sales with Promotion Start Dates Marked



Daily Revenue with Promotion Start Dates Marked



Closeup of Daily Revenue with Promotion Start Dates Marked

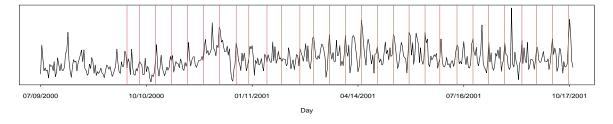


Figure 1: Overall Sales and Revenue, with Promotion Start Days Marked

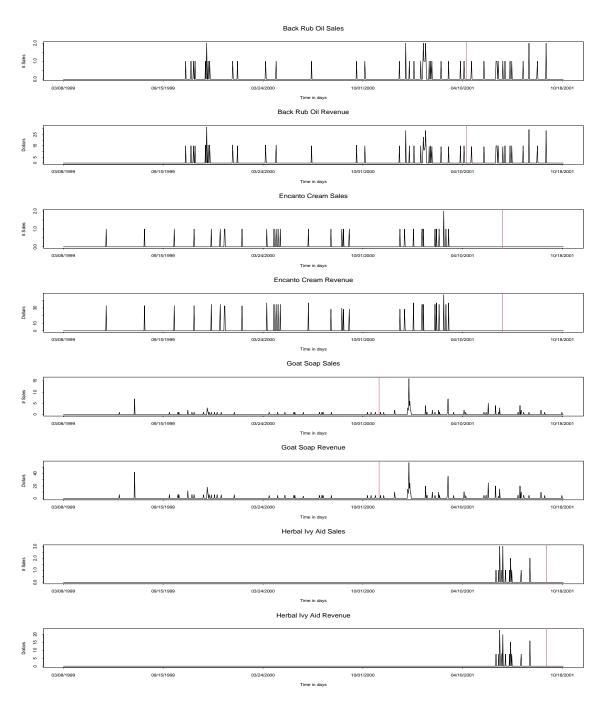


Figure 2: Body Product Sales and Revenue, with Promotion Start Days Marked (Part 1)

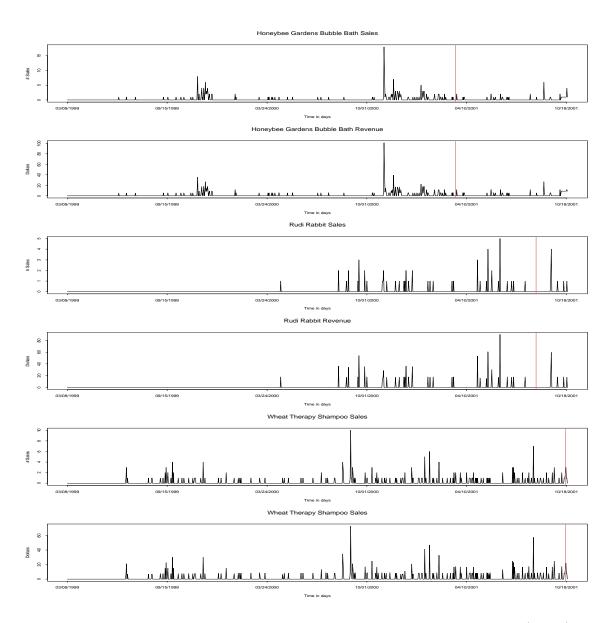


Figure 3: Body Product Sales and Revenue, with Promotion Start Days Marked (Part 2)

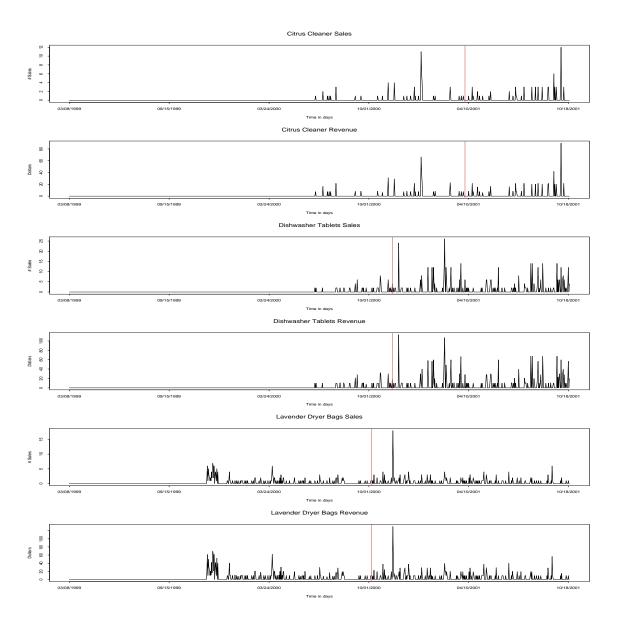


Figure 4: Cleaning Product Sales and Revenue, with Promotion Start Days Marked

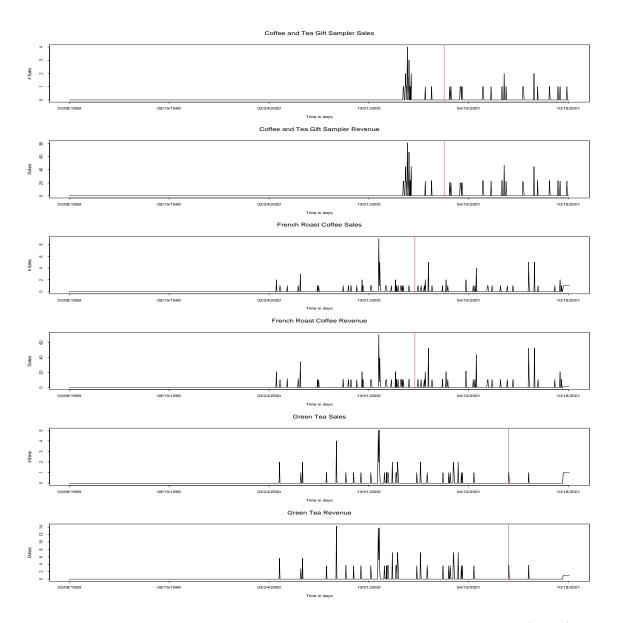


Figure 5: Food Product Sales and Revenue, with Promotion Start Days Marked (Part 1)

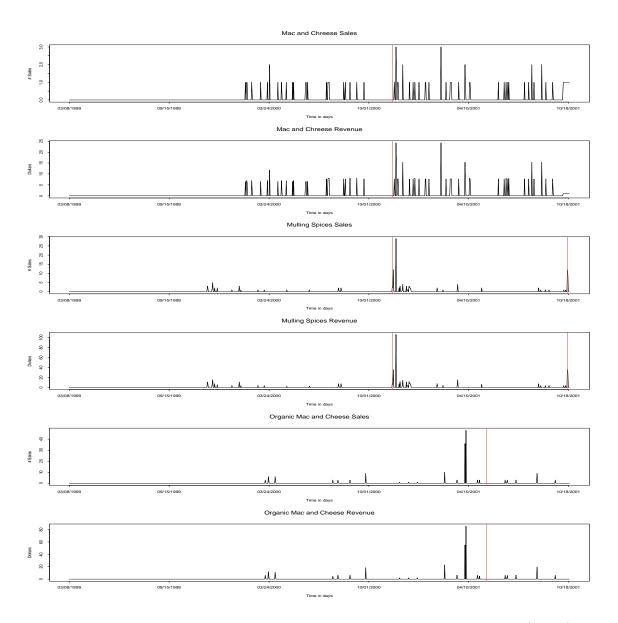


Figure 6: Food Product Sales and Revenue, with Promotion Start Days Marked (Part 2)

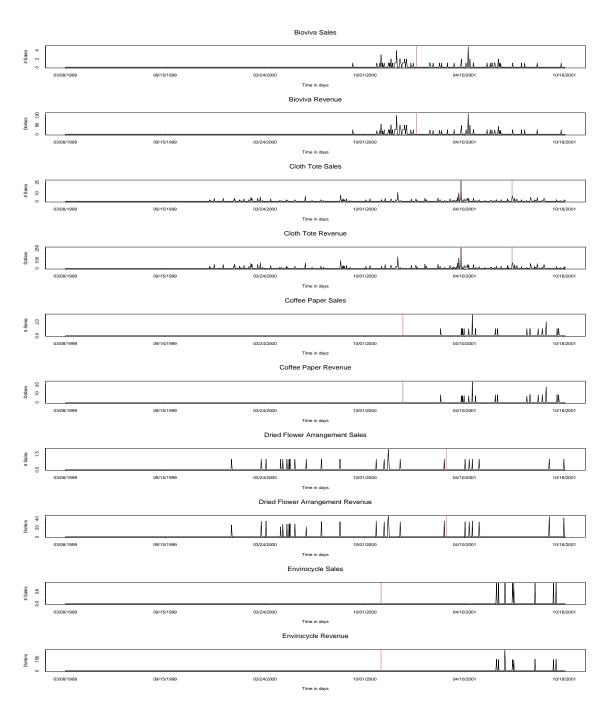


Figure 7: Home Product Sales and Revenue, with Promotion Start Days Marked (Part 1)

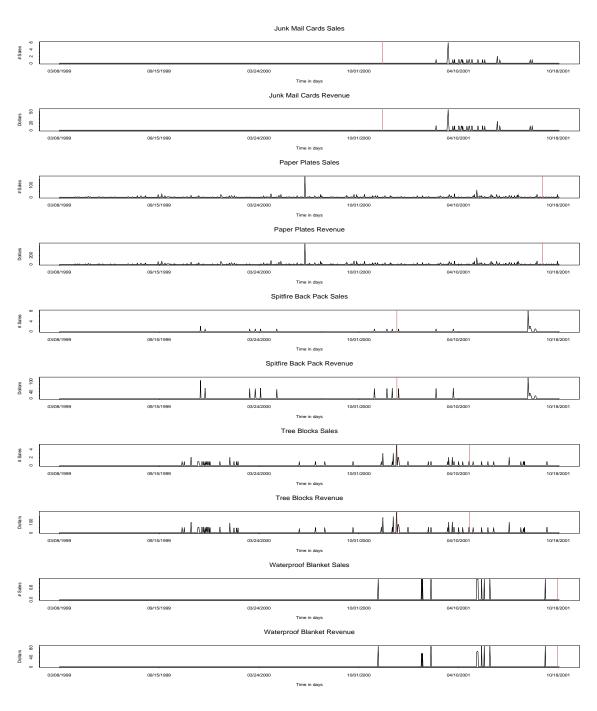


Figure 8: Home Product Sales and Revenue, with Promotion Start Days Marked (Part 2)

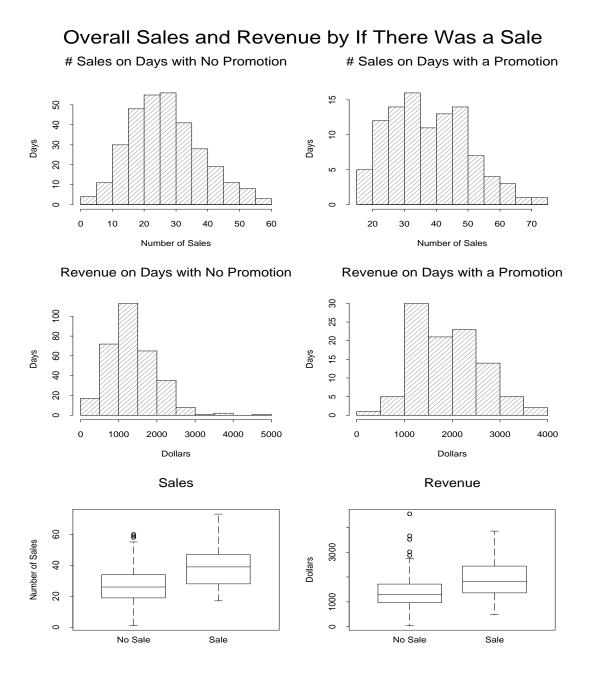


Figure 9: Overall Sales and Revenue by Whether or Not there Was a Sale

Correlation between the determinants and Sales and Revenue are used as a proxy for the strength of a relationship. If the correlation is one, the relationship is very strong and positive (i.e., the higher the determinant value, the higher the sales/revenue); if the correlation is negative one, the relationship is very strong and negative (i.e., the higher the determinant value, the lower the sales/revenue); if the correlation is close to zero, there is no relationship (i.e., an increase or decrease in the determinant value has no effect on sales/revenue). For the overall company sales and revenue, the correlations are²:

```
sales revenue
  flyers
          0.422
                   0.390
          0.402
numprods
    body
          0.222
                   0.213
    home
          0.416
                   0.412
 cleaning
           0.125
                   0.055
          0.221
    food
                   0.228
  clothes
          0.117
                   0.149
 aveperc 0.379
                   0.310
highperc
          0.399
                   0.336
  price1
           0.242
                   0.230
  price2
          0.218
                   0.202
                   0.298
          0.323
  price3
          0.192
  price4
                   0.130
  price5
          0.210
                   0.180
  is.sale
          0.387
                   0.343
start.sat -0.032
                  -0.046
start.mon 0.084
                   0.082
                   0.369
start.tue
          0.396
           0.084
                   0.076
start.wed
start.thu
          0.067
                   0.024
          0.023
                   0.006
  sat.sun
          0.096
                   0.072
          0.381
                   0.351
      tue
      wed
           0.377
                   0.347
          0.404
      thu
                   0.357
      fri
          0.108
                   0.080
  length 0.315
                   0.275
      jan
          0.037
                  -0.033
      feb
           0.059
                  -0.017
          0.174
                   0.094
      mar
          0.196
                   0.150
      apr
      may
          0.171
                   0.124
          0.058
                   0.080
      iun
      jul
          0.005
                   0.007
      aug -0.106
                   0.008
      sep -0.244
                  -0.203
      oct -0.229
                  -0.172
      nov -0.079
                  -0.093
      dec 0.102
                   0.167
    d.mon 0.126
                   0.110
    d.tue
          0.280
    d.wed
          0.164
                   0.137
    d.thu
          0.095
                   0.098
    d.fri -0.039
                  -0.043
    d.sat -0.349
                  -0.294
    d.sun -0.274
                  -0.223
    dos.1 0.351
                   0.289
           0.250
                   0.240
    dos.3 0.069
                   0.068
    dos.4 -0.039
                  -0.045
    dos.5 - 0.014
                   0.002
    dos.6 0.044
                   0.012
```

²explanations of the codes are in Appendix A, the Glossary.

It is obvious here that there are no very strong relationships between the determinants and overall sales and revenue, since the largest correlation was about 0.4. For the formal analysis, I will focus on the variables that had a correlation of greater than 0.1:

1. For Sales:

- Number of Flyers
- Number of Products in the Promotion
- Category of Product Represented in the Promotion (all categories)
- Promotion Discount (Average and Highest Percents)
- Price Category Represented in the Promotion (all categories)
- If There is a Promotion Occurring
- If the Promotion Starts on Tuesday
- If the Promotion includes Tuesday, Wednesday, Thursday or Friday
- The length of the Promotion
- The Month (specifically, March, April, May, August, September, October and December, but all will be included for technical reasons³)
- The Day of the Week (specifically, Monday, Tuesday, Wednesday, Saturday and Sunday, but all will be included for technical reasons⁴)
- The Day of the Promotion (first or second day)

2. For Revenue:

- Number of Flyers
- Number of Products in the Promotion
- Category of Product Represented in the Promotion (all categories except Cleaning)
- Promotion Discount (Average and Highest Percents)
- Price Category Represented in the Promotion (all categories)
- If There is a Promotion Occurring
- If the Promotion Starts on Tuesday
- If the Promotion includes Tuesday, Wednesday, or Thursday
- The length of the Promotion
- The Month (specifically, April, May, September, October and December, but all will be included for technical reasons⁵)
- The Day of the Week (specifically, Monday, Tuesday, Wednesday, Saturday and Sunday, but all will be included for technical reasons⁶)
- The Day of the Promotion (first or second day)

Similarly, the product sales and revenue correlation with their possible predictors is:

³By including the months, seasonal autocorrelation is minimized, and model interpretation is improved.

⁴By including the days, weekly autocorrelation is minimized, and model interpretation is improved.

⁵By including the months, seasonal autocorrelation is minimized, and model interpretation is improved.

⁶By including the days, weekly autocorrelation is minimized, and model interpretation is improved.

```
sales
                         revenue
  price -0.067632627 0.017605877
   dos1 0.208449638 0.195174179
   dos2 0.112499726 0.181236002
   dos3 0.100640748 0.091978409
   dos4 0.013562981 0.010533146
        0.027917322 0.016218032
   dos5
discount 0.182564101 0.221380804
   dmon 0.003276687 -0.004641586
   dtue 0.035562141 0.043454662
   dwed 0.005993779 0.021523538
   dthu 0.015423689 0.014674644
   dfri 0.006784569 -0.002045986
   dsat -0.034481214 -0.038739166
    feb -0.006479398 -0.008302152
    mar 0.005014489 0.002086366
    apr 0.013874669 0.013154940
    may 0.006712928 -0.001050926
    jun -0.002936974 0.013655904
    jul -0.005813063 -0.005875425
    aug -0.006479398 -0.008302152
    sep 0.005014489 0.002086366
    oct 0.013874669 0.013154940
    nov 0.006712928 -0.001050926
    dec -0.002936974 0.013655904
 flyers 0.246865002 0.272295061
 length 0.225393471 0.231743510
 sat.sun 0.121230068 0.091807149
    mon 0.133908903 0.164761779
    tue 0.211519546 0.236517951
    wed 0.132136715 0.080991995
    thu 0.004477537 0.115588260
    fri 0.205718068 0.233324517
```

Although this report does not formally explore these relationships, the strongest possible determinants are:

1. For Sales:

- The Day of a Promotion (the first three days)
- The Discount Offered
- The Number of Flyers
- The Length of the Promotion
- The Days of the Week Included in the Promotion (all except Thursday)

2. For Revenue:

- The Day of a Promotion (the first two days)
- The Discount Offered
- The Number of Flyers
- The Length of the Promotion
- The Days of the Week Included in the Promotion (Monday, Tuesday, Thursday and Friday)

III. Analysis and Discussion

Further investigation of whether or not a promotion increases sales and revenue can easily be done with a general least squares regression, which tests if the average number of sales/dollars of revenue during a promotion are greater than the corresponding value when there is no promotion⁷.

The results of the regression show that for:

- 1. sales: nine more sales occur during a promotion than when there is no promotion, with almost 100% confidence.
- 2. revenue: \$496 more are spent during a promotion than when there is no promotion, with almost 100% confidence.

Unfortunately, these results are not entirely dependable because of the reliance of one day's sales/revenue on previous days' sales/revenue (i.e., autocorrelation) is not entirely taken into account. However, because these results are so strong, there is evidence that a predictive model based promotion characteristics may be possible.

Fitting a larger model alleviates autocorrelation through the inclusion of month and day of week data. For the linear model to be reliable, the sales and revenue variables must be distributed in a bell-shaped curve (a normal distribution); the square root of both sales and revenue meets this requirement (see Figure ??

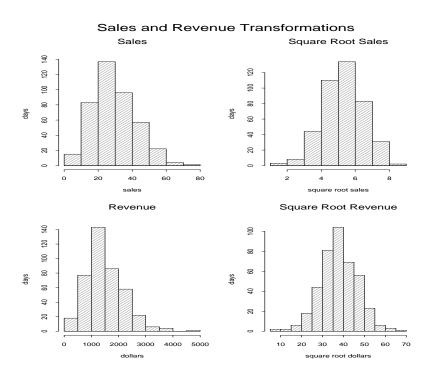


Figure 10: Overall Sales and Revenue Transformations

⁷The diagnostic plots (Figures ?? and ??) and summaries for these regressions can be found in Appendix D

Beginning with the variables enumerated at the end of the Data section (those with correlation greater than 0.1), a standard method of model selection found the best linear model to predict sales/revenue during future promotions.⁸

The best models included the variables:

- Sales aveperc, highperc, price5, jan, feb, mar, apr, may, jun, jul, aug, sep, oct, nov, d.mon, d.tue, d.wed, d.thu, d.fri, dos.1, dos.2, xmas, thu.
 - (Although the model selection only chose some of the months as significant, I include them all here, since they are needed to eliminate autocorrelation and interpretation would be difficult if I did not.)
- Revenue numprods, body, home, food, clothes, aveperc, highperc, price1, price2, price3, price4, price5, is.sale, start.tue, tue, wed, thu, length, feb, mar, apr, may, jun, jul, aug, sep, oct, nov, dec, d.mon, d.tue, d.wed, d.thu, d.fri, d.sat dos.1, and dos.2.
 - (Although the model selection only chose some of the months and days of the week as significant, I include them all here, since they are needed to eliminate autocorrelation and interpretation would be difficult if I did not.)

The specific linear models are⁹:

• Sales

```
 \sqrt{sales} = 4.66 - 0.411 (average\%) + 1.33 (highest\%) - 0.63 (includes a product over \$50) \\ + 0.10 (inFeb) + 0.62 (inMar) + 0.60 (inApr) + 0.52 (inMay) \\ + 0.23 (inJun) - 0.12 (inJul) - 0.61 (inAug) - 0.76 (inSep) \\ - 0.94 (inOct) - 0.52 (inNov) + 0.22 (inDec) \\ + 1.15 (Monday) + 1.28 (Tuesday) + 0.93 (Wednesday) + 0.71 (Friday) \\ - 0.23 (Saturday) + 0.83 (First Day of Sale) + 0.69 (Second Day of Sale)
```

Thus, sales increase with a high percent discount and on the first two days of the sale; sales decrease with a high average percent discount (as a penalty for already including the highest percent discount in the model) and inclusion of products priced over \$50; and sales are not affected by the other promotion characteristics. The remaining variables included in the model account for seasonal and weekly sales cycles.

• Revenue

```
 \sqrt{revenue} = 32.35 - 0.60(\#products) - 2.66(bodyproduct) + 5.11(homeproduct) \\ + 0.05(foodproduct) - 0.84(clothesproduct) - 13.46(average\%) \\ - 6.94(highest\%) - 1.71(under\$10included) - 3.26(\$10to\$20included) \\ + 1.05(\$20to\$30included) - 6.27(\$30to\%50included) - 6.55(over\$50included) \\ + 10.98(if there is a promotion) + 4.25(starts on Tuesday) \\ - 2.71(Tuesday included) + 1.38(Wednesday included) + 0.59(Thursday included) \\ - 0.31(length of promotion) + 0.23(in Feb) + 4.46(in Mar) \\ + 3.45(in Apr) + 4.19(in May) + 3.85(in Jun) \\ + 0.38(in Jul) + 0.65(in Aug) - 3.48(in Sep)
```

⁸The model selection process is fully described in Appendix E.

⁹Complete model summaries and diagnostic plots (Figures ?? and ??) are in Appendix D

```
\begin{split} -4.96(\text{in}Oct) - 2.65(\text{in}Nov) + 5.04(\text{in}Dec) \\ +7.20(\text{Monday}) + 7.12(\text{Tuesday}) + 4.74(\text{Wednesday}) \\ +5.15(\text{Thursday}) + 3.92(\text{Friday}) - 1.83(\text{Saturday}) \\ +4.97(\text{FirstDayof}Promotion) + 5.03(\text{SecondDayof}Promotion) \end{split}
```

Thus, revenue increases with the inclusion of home products and food products and products between \$20 and \$30, by having Wednesday and Thursday part of the promotion, and on the first two days of the promotion; revenue decreases with more products included in the sale, by including body and clothes products, by including products less than \$20 or greater than \$30, and by including Tuesday in the sale; and revenue is not affected by any of the other promotion variables considered. The months and days included in the model account for seasonal and weekly revenue variations.

If valid, the above models would be very useful in determining the types of promotions to hold in the future. To examine their validity, the models were tested against the last four promotions in the data. For the models to be useful, they must be able to predict sales/revenue at least two weeks in advance (so that products can be stocked and the flyer can be prepared); thus, the models were recalculated using only data up to two weeks before the promotion in question. The recalculated models were used to predict the sales/revenue during each day of the four sales and calculate an interval of error (a 95% Confidence Interval). These are reported along with the true values in the tables below.

SALES PREDICTIONS										
Date	Prediction	Lowest Error	Highest Error	True Value	Correct Prediction	Difference				
9/5/01	5.664074	4.232036	7.096113	6.855655	T	-1.19158037				
9/6/01	5.625319	4.193280	7.057357	5.385165	T	0.24015372				
9/7/01	4.786004	3.353965	6.218042	5.196152	T	-0.41014890				
9/18/01	6.055709	4.633672	7.477745	6.324555	T	-0.26884681				
9/19/01	5.618100	4.196063	7.040136	5.567764	T	0.05033519				
9/20/01	4.990823	3.568786	6.412859	4.472136	T	0.51868676				
10/2/01	5.699420	4.266663	7.132177	6.708204	T	-1.00878378				
10/3/01	5.231639	3.798882	6.664396	5.830952	T	-0.59931328				
10/4/01	4.608620	3.175863	6.041377	4.898979	T	-0.29035970				
10/16/01	5.791928	4.360649	7.223207	7.681146	F	-1.88921744				
10/17/01	5.297564	3.866285	6.728843	7.416198	F	-2.11863477				
10/18/01	4.644360	3.213081	6.075639	6.557439	F	-1.91307843				

average difference: -0.7400657

t-statistic for testing if this is different than zero: -0.9470364

p-value: 0.3639605

REVENUE PREDICTIONS									
Date	Prediction	Lowest Error	Highest Error	True Value	Correct Prediction	Difference			
9/5/01	38.79481	25.91398	51.67563	50.62934	${ m T}$	-11.834531			
9/6/01	40.19173	27.31091	53.07256	33.93184	${ m T}$	6.259889			
9/7/01	32.62985	19.74902	45.51067	46.04563	F	-13.415781			
9/18/01	33.16555	20.06569	46.26540	46.41077	F	-13.245228			
9/19/01	30.83001	17.73015	43.92986	46.07114	F	-15.241135			
9/20/01	26.34864	13.24879	39.44850	36.48767	${ m T}$	-10.139025			
10/2/01	36.57404	23.27285	49.87522	51.69042	F	-15.116388			
10/3/01	33.55965	20.25846	46.86083	41.25458	T	-7.694930			
10/4/01	29.36353	16.06234	42.66471	45.89989	F	-16.536362			
10/16/01	39.39807	25.98965	52.80649	50.57994	T	-11.181863			
10/17/01	36.60860	23.20018	50.01702	62.04982	F	-25.441218			
10/18/01	32.07028	18.66186	45.47869	52.28642	F	-20.216147			
average difference: -12.81689									
t-statistic for testing if this is different than zero: -0.2200733									

t-statistic for testing if this is different than zero: -0.2200733

p-value: 0.829845

The predicted values for both models were usually lower than the true values, indicating that there is a non-linear increasing trend during the month of the test promotions that is not accounted for in the model. Because the predicted values are consistently wrong, the models are not reliable.

Diagnostics for the revenue model (presented in Appendix D) indicates that there are two days that may be somehow inherently different from the other days in the study. The removal of these days from the prediction model calculations is one strategy to improve the prediction value of the revenue model. Unfortunately, in this case the model without these points actually performed more poorly than the model that included them, as explored in Appendix F.

IV. Conclusion

Although overall company sales and revenue significantly increase on days in which there is an advertised promotion, analysis of the relationship between sales and revenue and specific promotion characteristics was inconclusive. Informal analysis indicated that there is only weak reliance of overall and product sales and revenue on on any of the variables included in this study, at best; formal analysis confirmed these results.

The best models selected from the available possible predictors indicated general trends in sales and revenue dependent upon promotion variables; from these, good promotions:

- offer a high percent discount (increased sales)
- are at least two days long (increased sales and revenue)
- include home or food products (increased revenue)
- include products priced between \$20 and \$30 (increased revenue)
- include Wednesday and Thursday (increased revenue)

and bad promotions:

• include products priced over \$50 (decreased sales)

- include products priced below \$20 or greater than \$30 (decreased revenue)
- include body or clothes products (decreased revenue)
- include Tuesday (decreased revenue)

Although most of these items make sense, the decreased revenue due to including Tuesday in the sale may somehow be an artifact of having the majority of the promotions include (and in fact start on) Tuesday.

Unfortunately, these trends can not be validated through a predictive model. For both sales and revenue, predictions were for the most part lower than actual sales and revenue on promotion days; the models somehow do not account for a nonlinear trend in sales and revenue.

The models may be improved by the inclusion of nationwide consumer trend data such as the consumer price index. However, this would not be valuable for real-time predictions since this information is only available until a month or so after it would be needed. More realistic improvements may come with time as seasonal data becomes available and these trends can be accounted for.

While more information may improve the models, it is still apparent that beyond small trends, GMP consumers are largely moved to buy by the existence of a promotion, but are either not affected by the studied promotion components or are a variable enough group to be affected oppositely by the elements, thus washing out their effects. If demographic information on purchasers is available, further study may find practical predictive models based on type of shopper.

V. Credits and References

Many thanks to Brian Junker for his patient assistance in the data analysis for and writing of this report.

Also thanks to Michael for his persistent data collection and Anthony Brockwell for his time series advice.

Rawlings, John L., Sastry G. Bantula and David A. Dickey, *Applied Regression Analysis: A Research Tool*, second edition. Springer: New York, 1989.

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Appendix A Glossary

autocorrelation—the dependence of one day's values on previous days' values aveperc—average percent discount given during a promotion body—indicator that a product in the "body" category was promoted on this day cleaning—indicator that a product in the "cleaning" category was promoted on this day clothes—indicator that a product in the "clothes" category was promoted on this day d.mon-d.sun—an indicator that a particular day falls on the code day of the week date—calendar day on which the sale/revenue was make dos.1-dos.6—an indicator that a day is the code day of the promotion (e.g., dos.1=1 means this day is the first day of a promotion) dosale—day of the promotion (e.g., the first day of a three-day promotion) doweek—day of the week, where Sunday=0, Monday=1, etc. flyers—number of fliers sent to advertise a particular promotion food—indicator that a product in the "food" category was promoted on this day fri—an indicator that the promotion a particular day is part of includes a Friday highperc—highest percent discount given during a promotion home—indicator that a product in the "home" category was promoted on this day is.sale—an indicator for a promotion taking place on a particular day jan-dec—an indicator that a particular day falls in the code month length—the length of the promotion in days mon—an indicator that the promotion a particular day is part of includes a Monday month—month of the promotion numprods—number of products on sale during a promotion p-value—the probability of getting the data if what you are trying to prove is false price1—indicator that a product that ordinarily costs \$10 or less is promoted price2—indicator that a product that ordinarily costs \$10-\$20 is promoted price3—indicator that a product that ordinarily costs \$20-\$30 is promoted price4—indicator that a product that ordinarily costs \$30-\$50 is promoted price5—indicator that a product that ordinarily costs over \$50 is promoted revenue—value of orders placed on a particular day sales—number of orders placed on a particular day

sat.sun—an indicator that the promotion a particular day is part of includes a Saturday and Sunday

sqrtrevenue—square root of revenue

sqrtsales—square root of sales

start.mon—an indicator that the promotion a particular day is part of began on a Monday start.sat—an indicator that the promotion a particular day is part of began on a Saturday start.thu—an indicator that the promotion a particular day is part of began on a Thursday start.tue—an indicator that the promotion a particular day is part of began on a Tuesday start.wed—an indicator that the promotion a particular day is part of began on a Wednesday thu—an indicator that the promotion a particular day is part of includes a Thursday tue—an indicator that the promotion a particular day is part of includes a Tuesday wed—an indicator that the promotion a particular day is part of includes a Wednesday wed—an indicator that the promotion a particular day is part of includes a Wednesday xmas—an indicator for Christmas day

Appendix B Plots of Determinants for Overall Sales and Revenue

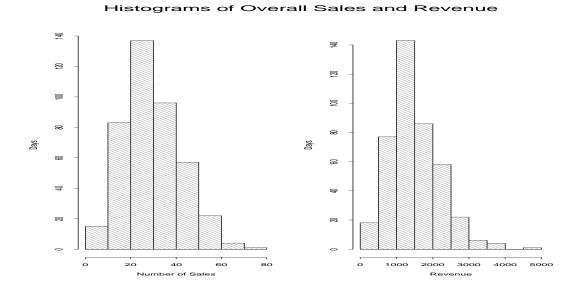


Figure 11: Histograms of Overall Sales and Revenue

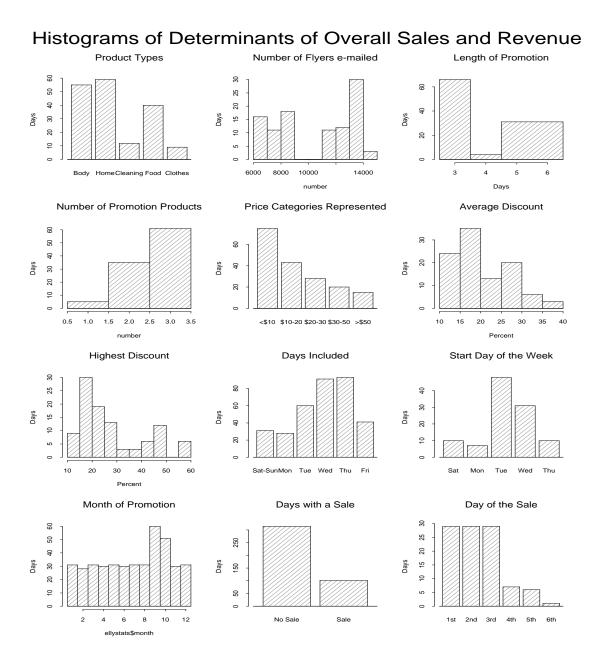


Figure 12: Histograms of Studied Determinants of Overall Sales and Revenue

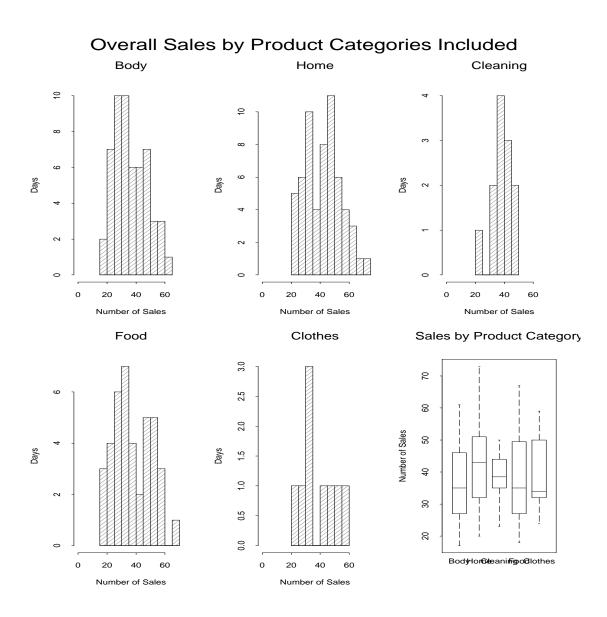


Figure 13: Overall Sales by Product Category Represented in the Promotion

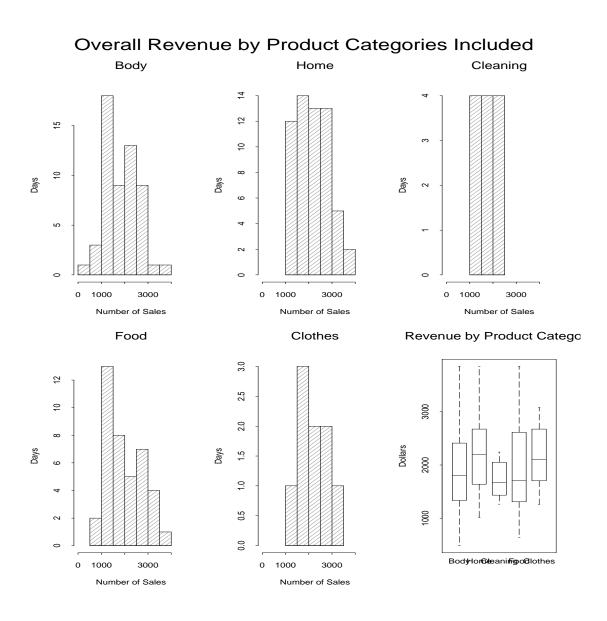


Figure 14: Overall Revenue by Product Category Represented in the Promotion

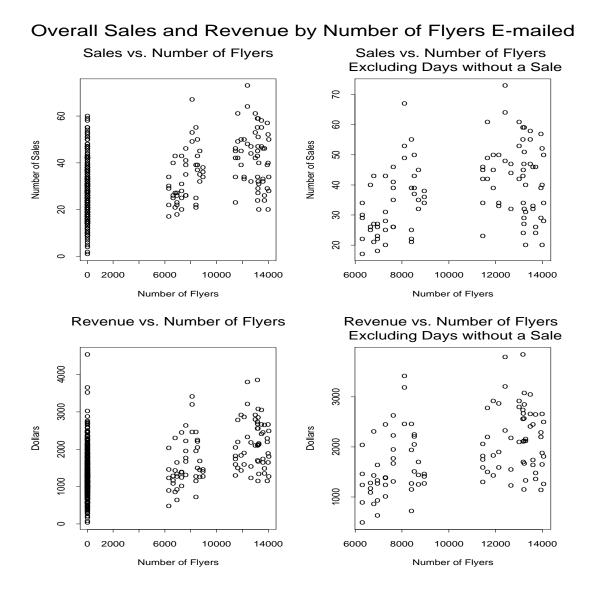


Figure 15: Overall Sales and Revenue by Number of Flyers E-mailed

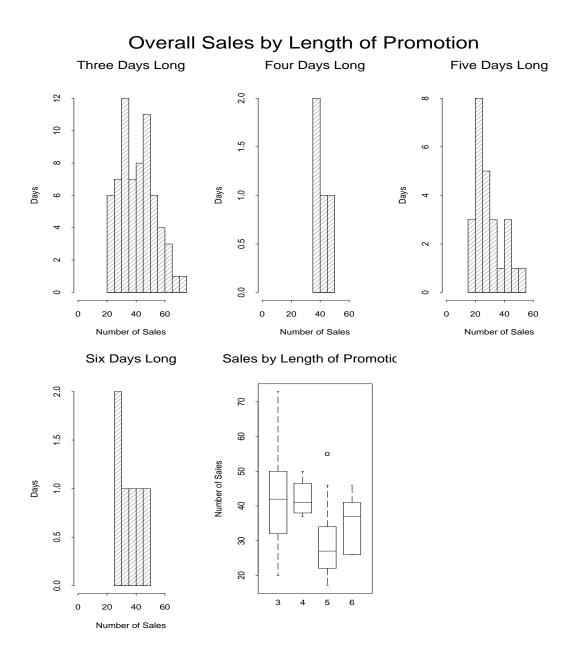


Figure 16: Overall Sales by Length of the Promotion

Overall Revenue by Length of Promotion Three Days Long Four Days Long Five Days Long 3.0 15 2.5 2.0 Days 1.5 1:0 0.5 0.0 0 1000 3000 0 1000 0 1000 3000 3000 Dollars Dollars Dollars Six Days Long Revenue by Length of Promo 3.0 2.5 3000 2.0 Dollars Days 1.5 2000 1:0 0.5 1000 0.0 0 1000 3000 Dollars Days

Figure 17: Overall Revenue by Length of the Promotion

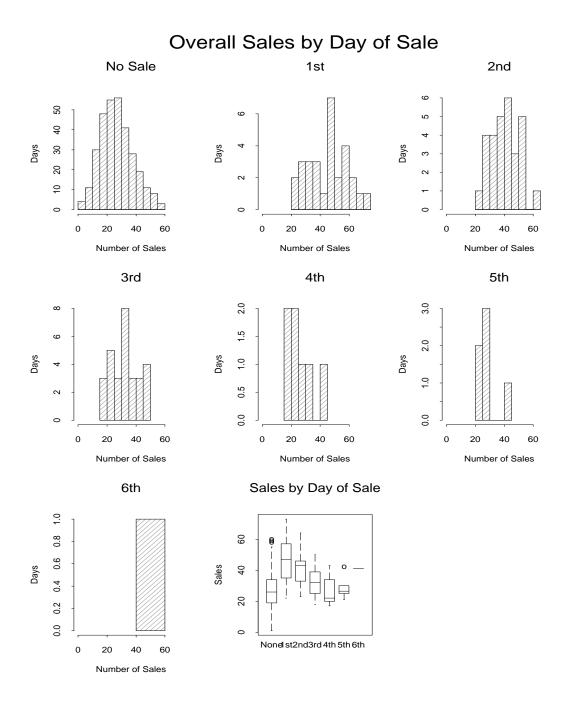


Figure 18: Overall Sales by Day of the Promotion

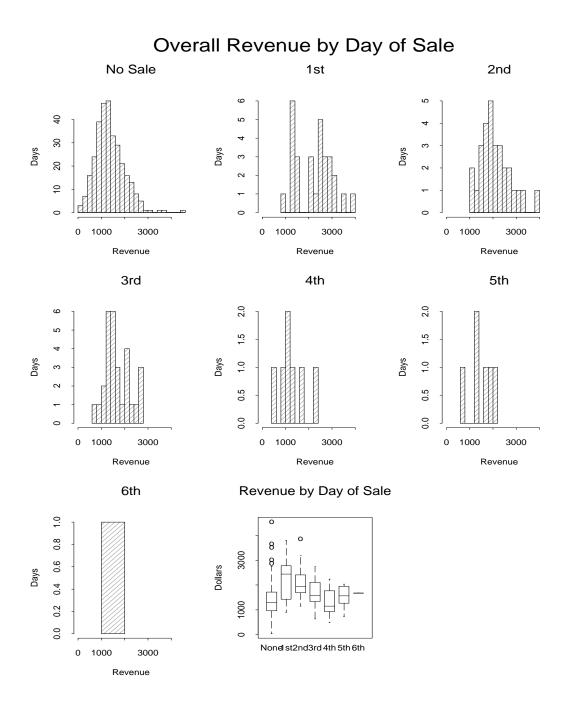


Figure 19: Overall Revenue by Day of the Promotion

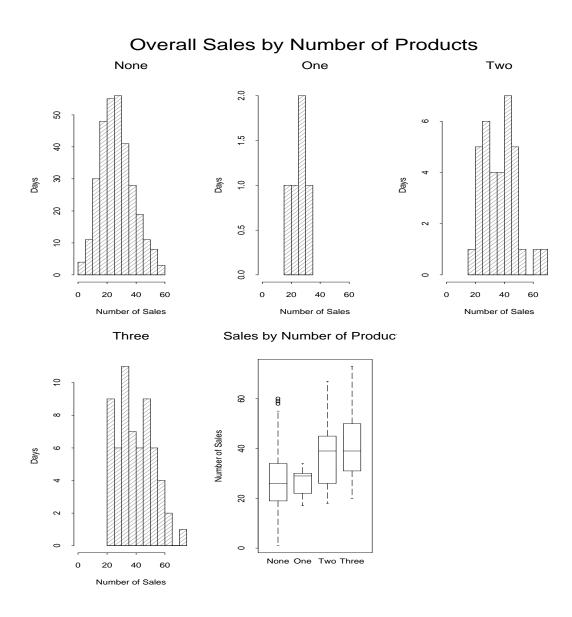


Figure 20: Overall Sales by Number of Products In the Promotion

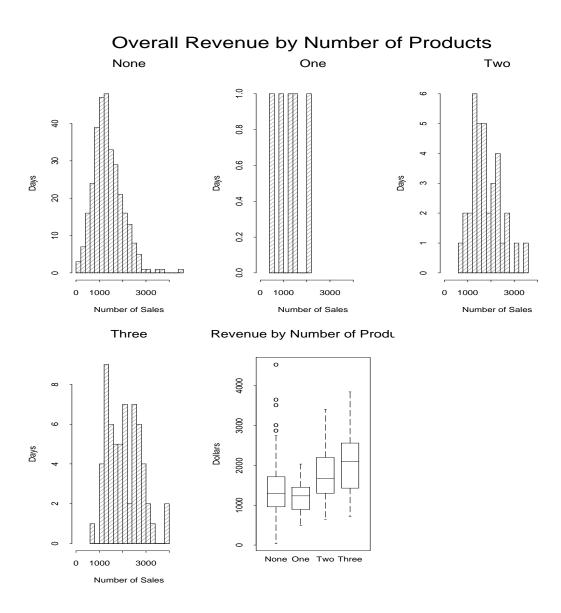


Figure 21: Overall Revenue by Number of Products In the Promotion

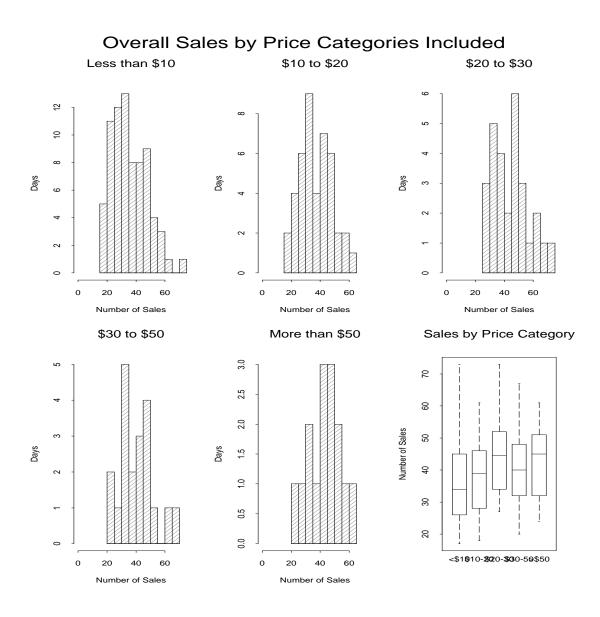


Figure 22: Overall Sales by Price Categories Represented In the Promotion

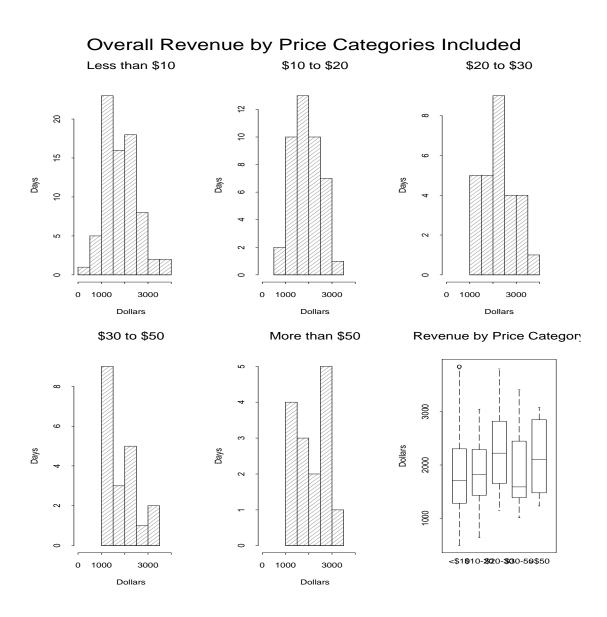


Figure 23: Overall Revenue by Price Categories Represented in the Promotion

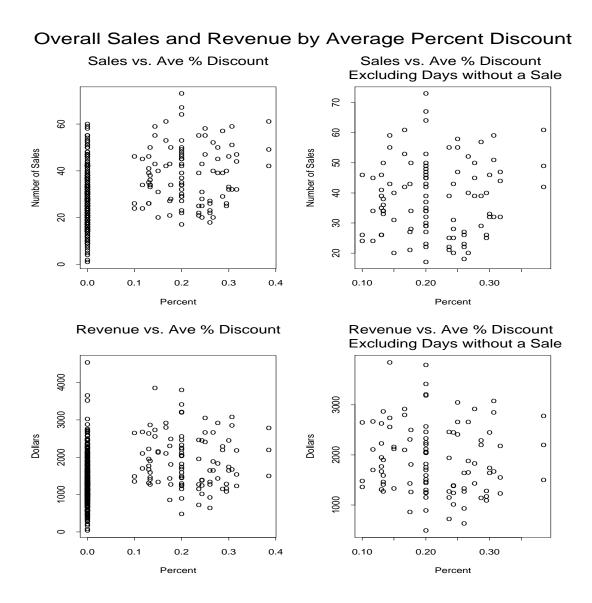


Figure 24: Overall Sales and Revenue by Average Percent Discount During the Promotion

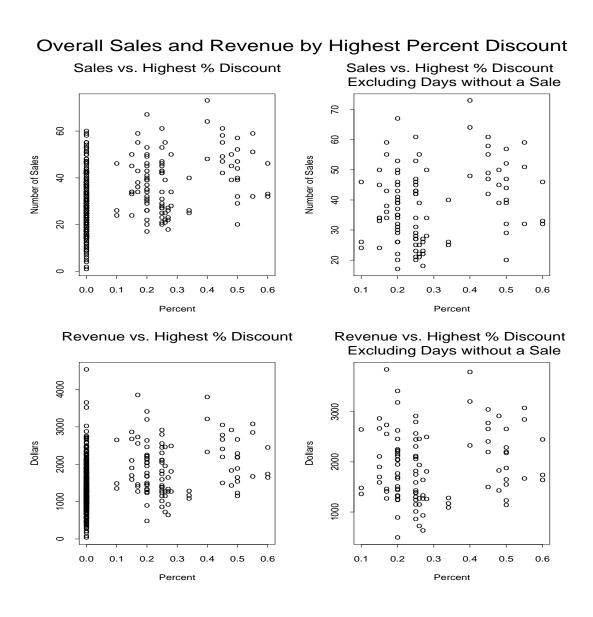


Figure 25: Overall Sales and Revenue by Highest Percent Discount During the Promotion

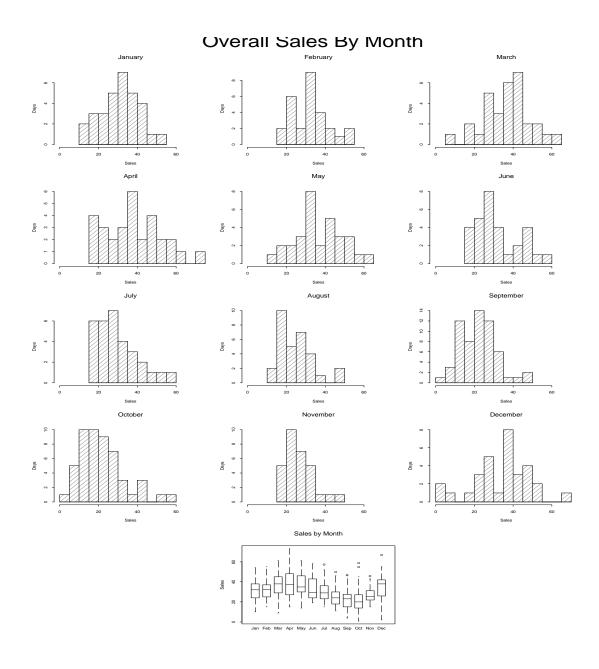


Figure 26: Overall Sales by Month

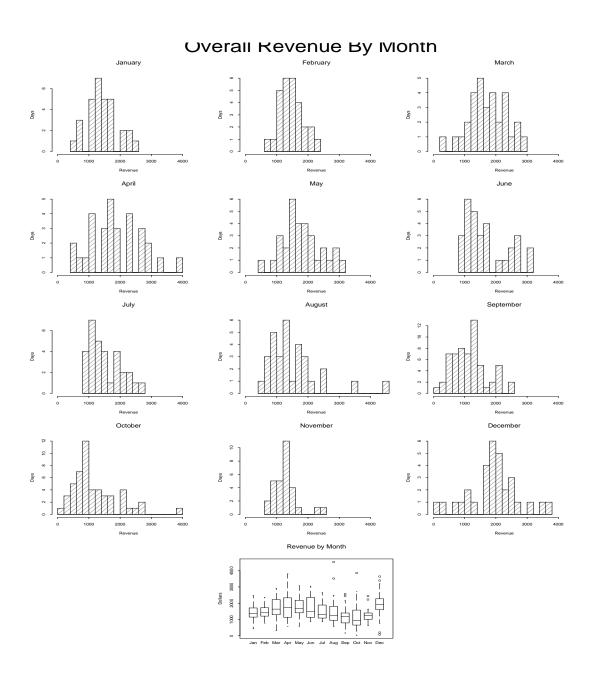


Figure 27: Overall Revenue by Month

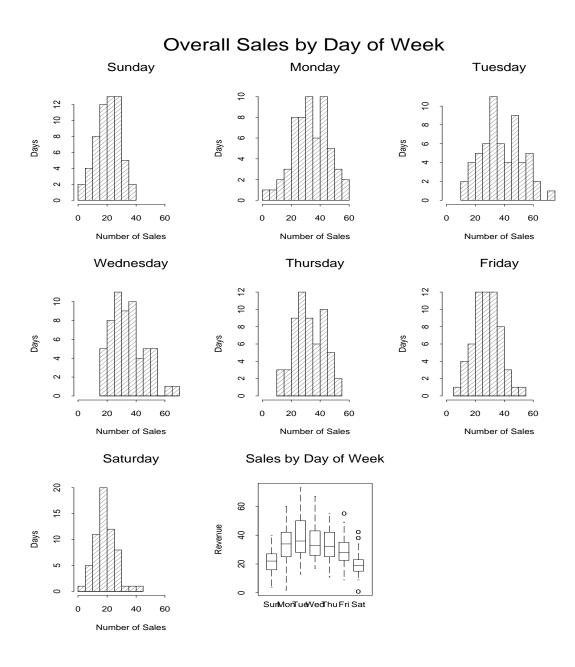


Figure 28: Overall Sales by Day of the Week

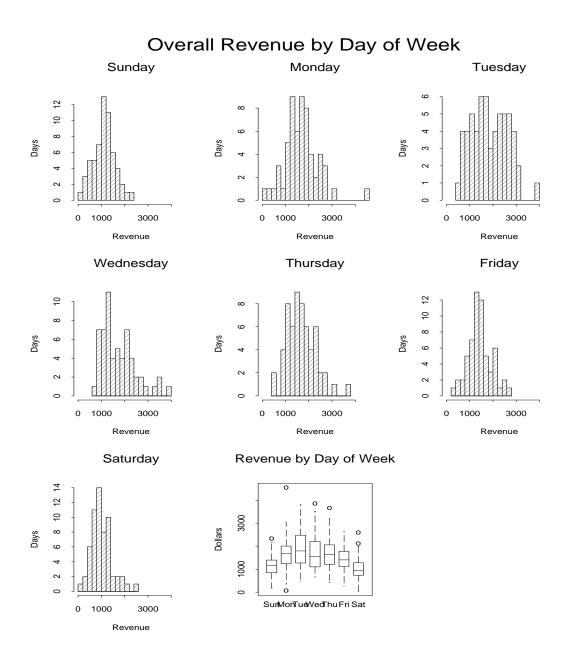


Figure 29: Overall Revenue by Day of the Week

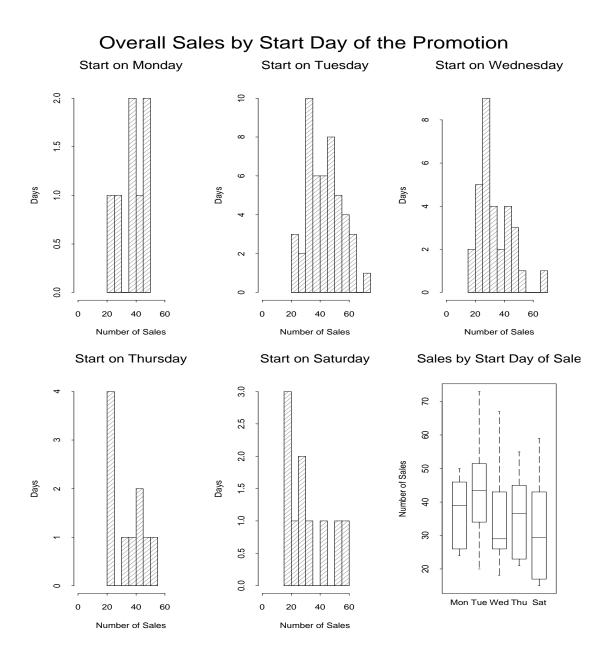


Figure 30: Overall Sales by Starting Day of the Promotion

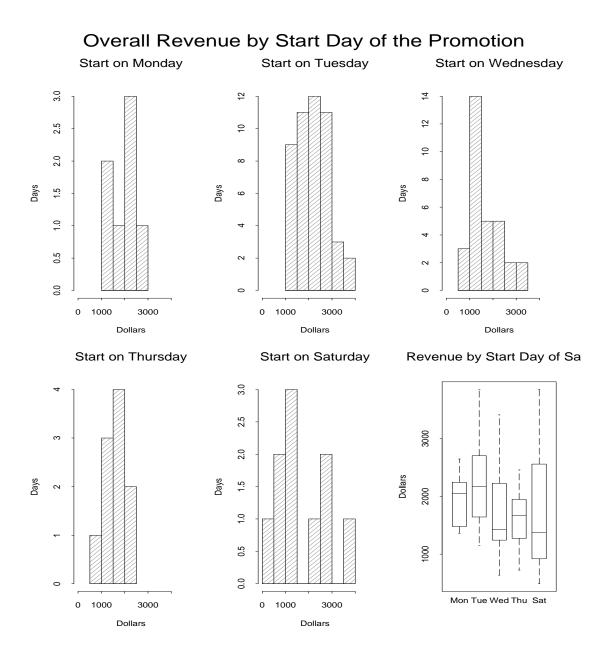


Figure 31: Overall Revenue by Starting Day of the Promotion

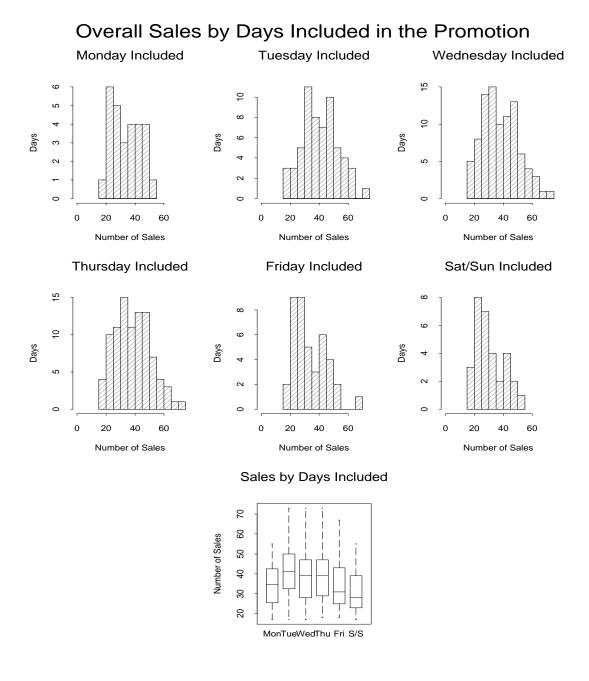


Figure 32: Overall Sales by Days Included in the Promotion

Overall Revenue by Days Included in the Promotion Monday Included Tuesday Included Wednesday Included 15 25 20 9 9 Days Days Days 15 10 2 2 0 0 1000 0 1000 0 1000 3000 Dollars Dollars Dollars Thursday Included Friday Included Sat/Sun Included 12 25 15 10 20 9 Days Days Days 9 9 2 2 3000 0 1000 3000 0 1000 3000 0 1000 Dollars Dollars Dollars Sales by Days Included 3000 Dollars 2000 1000 MonTueWedThu Fri S/S

Figure 33: Overall Revenue by Days Included in the Promotion

${\bf Appendix}~{\bf C}$ Plots of Determinants for Product Sales and Revenue

Histograms of Product Sales and Revenue

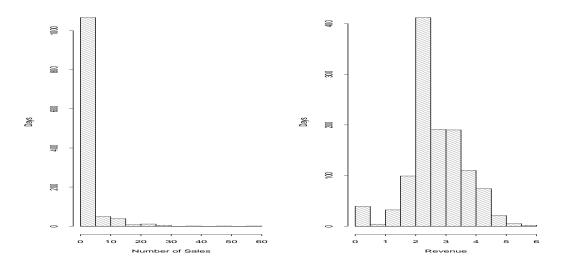


Figure 34: Histograms of Product Sales and Revenue

Histograms of Determinants of Product Sales and Revenue **Product Types** Number of Flyers e-mailed Length of Promotion 12 ∞ 20 10 9 15 Promotions ω Promotions Days 9 4 10 2 0 0 bodylothinganingoodhome 6000 3 Promotions number **Original Prices** Percent Discount Sale Prices 20 15 15 15 Promotions Promotions Days 9 10 10 2 0 50 100 150 10 20 30 40 50 0 40 80 120 master\$sale.price master\$org.price Promotions Days Included Start Day of a Promotion onth of the First Day of a Pron 15 15 9 Promotions Promotions Days 10 2

Figure 35: Histograms of Determinants of Product Sales and Revenue

MonTueWedThuFriSatSun

Sat-SMonTueWedThu Fri

6 8

master\$month

duct Sales by Product Category Not Including Days With No S Body Home Cleaning Days Days Days 0 10 Number of Sales Number of Sales Number of Sales Food Sales by Product Category О Number of Sales Days

Figure 36: Product Revenue by Category Not Including Days with No Sales

10 20 30 40 Number of Sales Body Hom@leanin@ood

: Revenue by Product Category Not Including Days With No R Body Home Cleaning Days Days Days 0 20 40 60 80 0 50 Dollars Dollars Dollars Food Revenue by Product Catego Dollars Days Body Hom@leanin@ood 0 20 40 60 80

Figure 37: Product Revenue by Category Not Including Days with No Revenue

Dollars

Product Sales and Revenue by Number of Flyers E-mailed

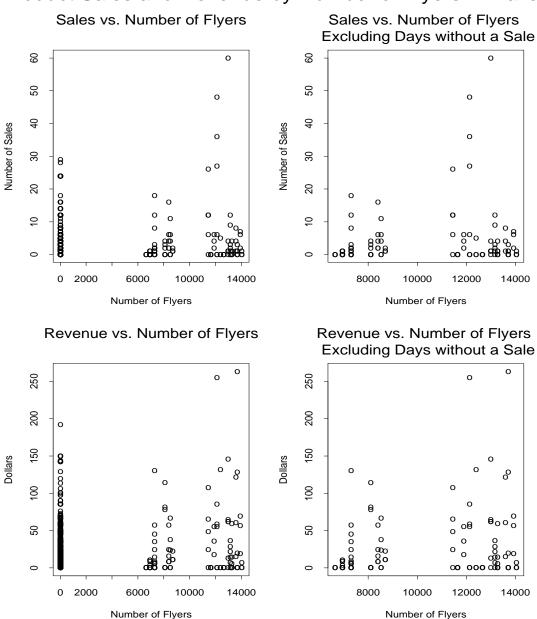


Figure 38: Product Sales and Revenue by Number of Flyers E-mailed

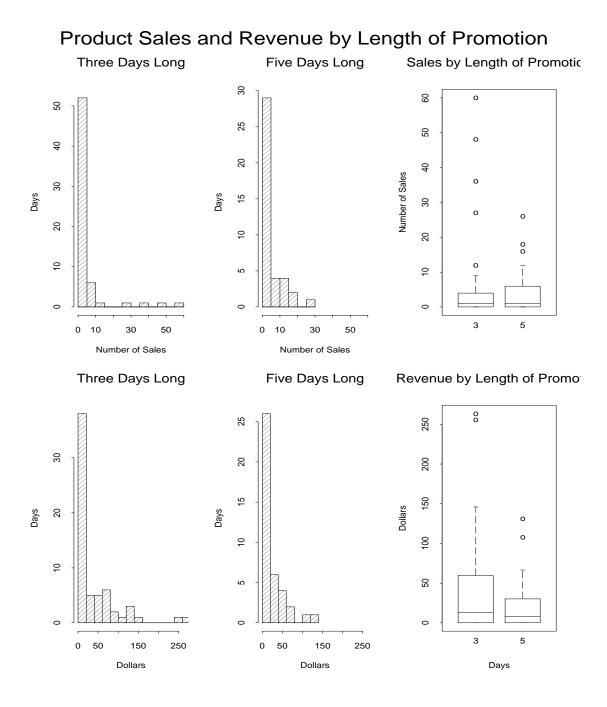


Figure 39: Product Sales and Revenue by Length of Promotion

Product Sales by Day of Sale No Sale 1st 2nd 10000 20 15 15 0009 10 Days Days Days 10 2 2000 2 0 0 0 10 0 5 10 30 15 Number of Sales Number of Sales Number of Sales 3rd 4th 5th 3.0 20 2.0 15 Days Days Days 9 1:0 7 2 0.0 6 8 30 40 0 4 0 10 20 2 Number of Sales Number of Sales Number of Sales Sales by Day of Sale 9 20 9 30 20 9 None1st 2nd 3rd 4th 5th

Figure 40: Product Sales by Day of Promotion

Product Revenue by Day of Sale No Sale 1st 2nd 10000 4 15 12 10 0009 9 Days ∞ Days Days 9 2 4 2000 0 0 0 50 150 250 0 50 250 100 Dollars Dollars Dollars 3rd 4th 5th 12 14 3.0 9 2.0 Days Days Days က 9 1.0 7 0.0 40 50 0 20 60 100 10 15 20 30 0 5 0 10 20 Dollars Dollars Dollars Revenue by Day of Sale 250 О 200 150 Dollars 100 20 None1st 2nd 3rd 4th 5th

Figure 41: Product Revenue by Day of Promotion

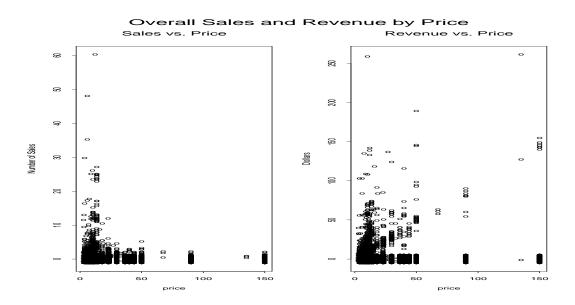


Figure 42: Product Sales and Revenue by Price

Product Sales and Revenue by Percent Discount Sales vs. % Discount Sales vs. % Discount Excluding Days without a Sale - 0 О Number of Sales Number of Sales o o Percent Percent Revenue vs. % Discount Revenue vs. % Discount Excluding Days without a Sale ° ° Dollars o o o o

Figure 43: Product Sales and Revenue by Percent Discount

Percent

Percent

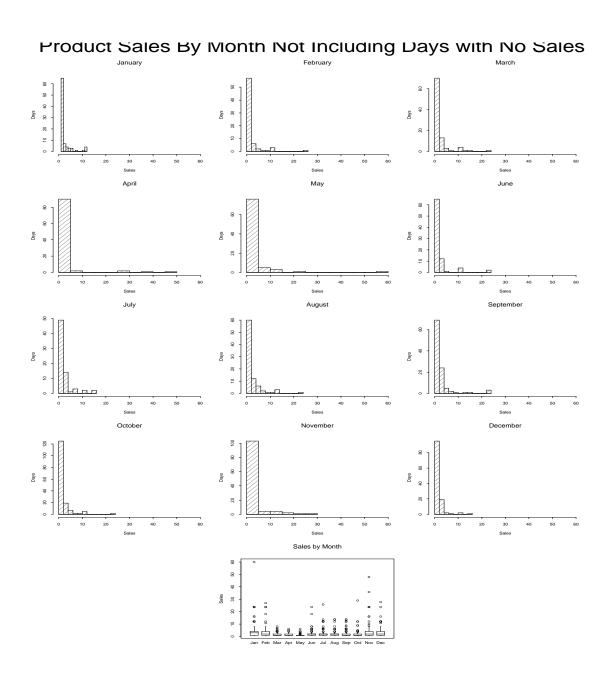


Figure 44: Product Sales By Month Not Including Days with No Sales $\,$

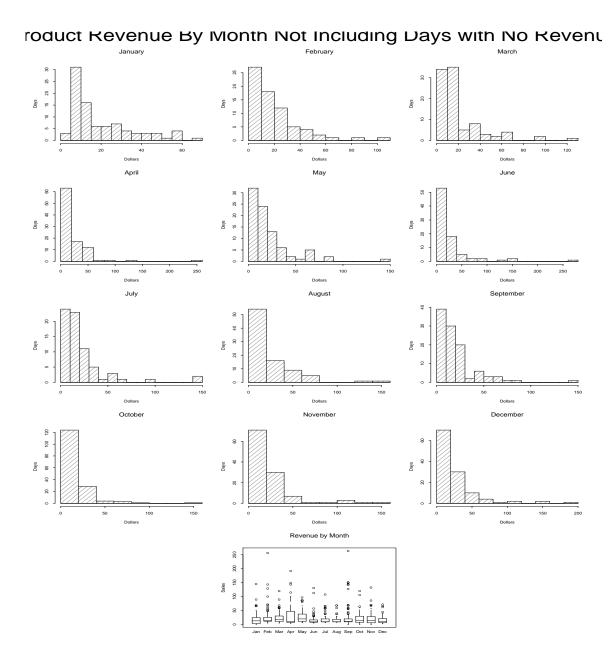


Figure 45: Product Revenue By Month Not Including Days with No Revenue

roduct Sales by Day of Week Not Including Days With No Sale

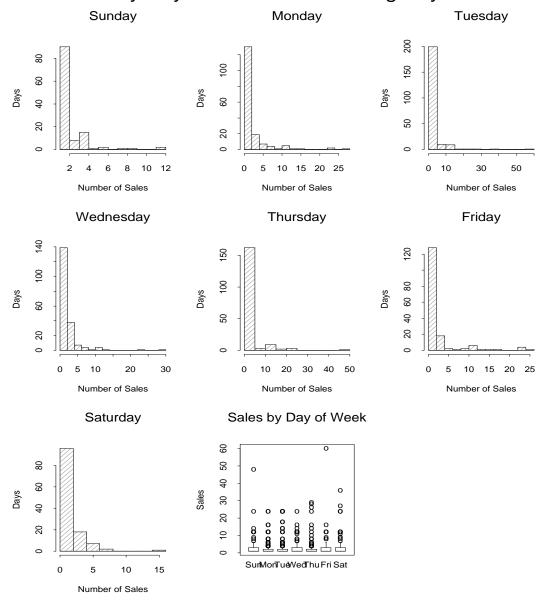


Figure 46: Product Sales by Day of the Week Not Including Days with No Sales

uct Revenue by Day of Week Not Including Days with No Rev

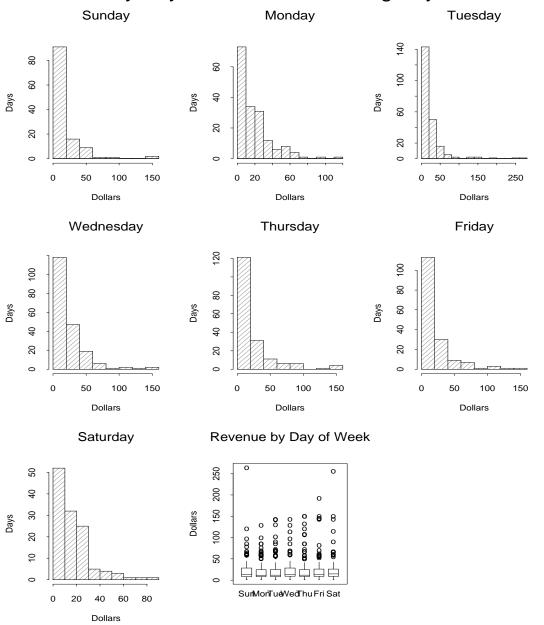


Figure 47: Product Revenue by Day of the Week Not Including Days with No Revenue

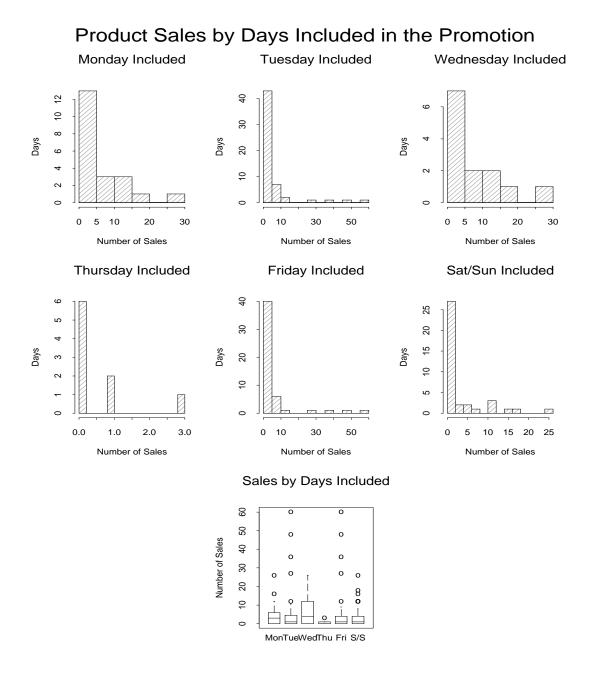


Figure 48: Product Sales by Days Included in the Promotion

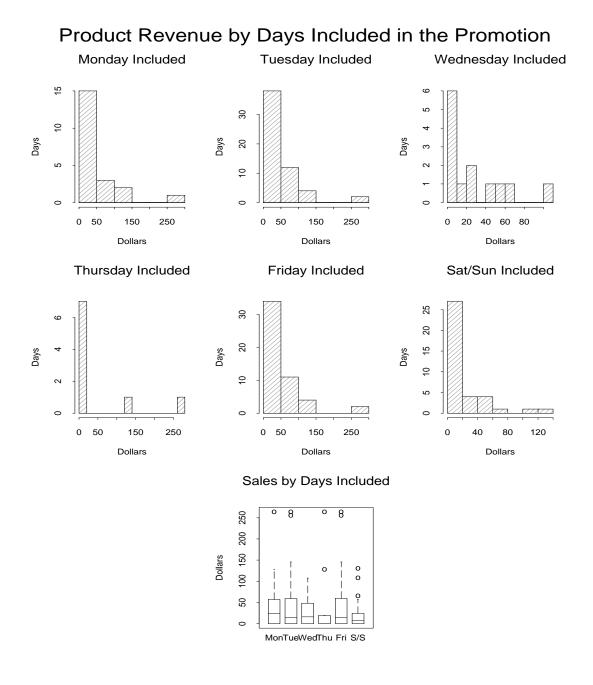


Figure 49: Product Revenue by Days Included in the Promotion

Appendix D

Regression Summaries and Diagnostic Plots

Summary and Diagnostics for The GLS Regression of Sales and Revenue on If There Is a Promotion

• Sales

```
Generalized least squares fit by REML
    Model: sales ~ is.sale
    Data: ellystats
      AIC BIC logLik
    3090.332 3106.426 -1541.166
  Correlation Structure: AR(1)
   Parameter estimate(s):
       Phi
   0.496631
  Coefficients:
                Value Std.Error t-value p-value
  (Intercept) 27.69682 1.032970 26.81281 <.0001
     is.sale 9.03717 1.439609 6.27752 <.0001
   Correlation:
         (Intr)
  is.sale -0.338
  Standardized residuals:
                             Med Q3
        Min Q1
   -2.318486 -0.7552754 -0.06051503 0.6342453 3.149524
  Residual standard error: 11.51476
  Degrees of freedom: 415 total; 413 residual
• Revenue
  Generalized least squares fit by REML Model: revenue ~ is.sale
    Data: ellystats
        AIC BIC
                       logLik
    6452.851 6468.945 -3222.426
  Correlation Structure: AR(1)
  Parameter estimate(s):
        Phi
   0.4078293
  Coefficients:
                Value Std.Error t-value p-value
  (Intercept) 1379.748 52.42007 26.32098 <.0001
     is.sale 496.387 82.41372 6.02311 <.0001
   Correlation:
         (Intr)
  is.sale -0.381
  Standardized residuals:
                    Q1
                              Med
                                       QЗ
   -2.168256 -0.6787649 -0.1410533 0.6025913 4.927752
```

Residual standard error: 641.301 Degrees of freedom: 415 total; 413 residual

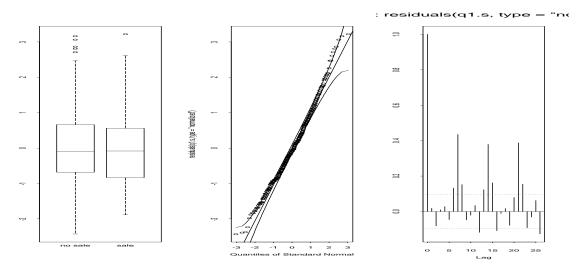


Figure 50: Diagnostic Plots for GLS Regression of Sales on Promotion

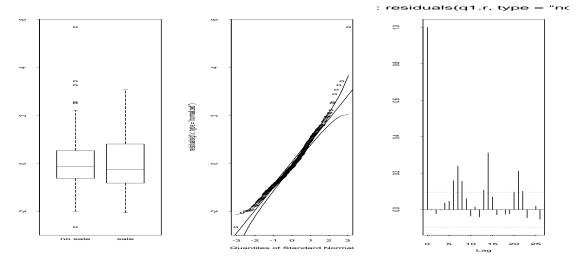


Figure 51: Diagnostic Plots for GLS Regression of Revenue on Promotion

Summary and Diagnostic Plots for the Final GLS Regression Models for Overall Sales and Revenue

• Sales

```
Generalized least squares fit by REML
 Model: finsalesform
 Data: sellystats[, ]
     AIC
           BIC
                   logLik
 947.4032 1054.489 -446.7016
Correlation Structure: AR(1)
Parameter estimate(s):
      Phi
0.3325988
Coefficients:
              Value Std.Error t-value p-value
(Intercept) 4.642625 0.205634 22.57715 <.0001
   aveperc -2.159697 2.048642 -1.05421 0.2924
  highperc 1.298493 1.258318
                              1.03193 0.3027
    price5 -0.553861 0.276145
                             -2.00569 0.0456
                              0.33320 0.7392
       feb 0.087964 0.263994
       mar 0.656252 0.263684
                               2.48878 0.0132
       apr 0.598615 0.264850
                               2.26020 0.0244
       may 0.530824 0.274874
                              1.93116 0.0542
       jun 0.266250 0.266289
                             0.99985 0.3180
       jul -0.083294 0.266248 -0.31285 0.7546
       aug -0.588233 0.265671 -2.21414
       sep -0.725913 0.228847 -3.17204 0.0016
       oct -0.944963 0.233816 -4.04149 0.0001
       nov -0.513273 0.263209 -1.95006 0.0519
       dec 0.313449 0.258701
                              1.21163 0.2264
     d.mon 1.210507 0.112406 10.76909
     d.tue 1.278938 0.136383 9.37754 <.0001
     d.wed 0.910690 0.142822 6.37641 <.0001
     d.thu 0.870134 0.140666 6.18580 <.0001
     d.fri 0.691449 0.128689
                              5.37304 <.0001
     d.sat -0.229880 0.111346 -2.06456 0.0396
     dos.1 0.775743 0.178639
                             4.34251 <.0001
     dos.2 0.658222 0.159133 4.13631 <.0001
      xmas -3.305352 0.673255 -4.90951 <.0001
       thu 0.476080 0.283043 1.68201 0.0934
Correlation:
        (Intr) aveprc hghprc price5
                                           mar
                                                  apr
                                                        may
aveperc -0.113
highperc 0.140 -0.809
 price5 0.023 0.029 -0.229
    feb -0.620 0.068 -0.059 0.003
    mar -0.646 0.022 -0.086 -0.053 0.489
    apr -0.655 0.127 -0.132 0.023 0.481 0.506
    may -0.634 0.100 -0.127 -0.246 0.463 0.509 0.492
    jun -0.648 0.062 -0.102 -0.058 0.474 0.508 0.495 0.516
    jul -0.660 0.125 -0.200 0.054 0.479 0.507 0.506 0.491
    aug -0.651 0.138 -0.194 0.045 0.481 0.506 0.507 0.491
    sep -0.746 0.016 -0.072 0.015 0.548 0.580 0.569 0.554
    oct -0.722 0.076 -0.076 0.006 0.540 0.555
                                                0.558
                                                     0.538
    nov -0.617 -0.063 0.043 0.020 0.471 0.485 0.477 0.459
    dec -0.632 0.034 -0.025 0.003 0.475 0.483 0.485 0.467
  d.mon -0.301 0.010 -0.003 -0.040 0.019 0.024 0.021 0.031
  d.tue -0.342 0.117 -0.132 -0.059 0.027 0.039 0.050 0.053
  d.wed -0.327 0.061 -0.068 -0.044 0.023 0.026 0.037 0.036
```

```
d.thu -0.294  0.063 -0.060 -0.029  0.006 -0.019  0.014  0.007
  d.fri -0.299 -0.005 0.028 0.007 -0.001 -0.027 0.012 -0.010
  d.sat -0.273 0.010 -0.008 0.007 0.000 -0.019 0.021 -0.001
  dos.1 0.061 -0.097 0.063 -0.053 -0.014 -0.027 -0.034 -0.016
  dos.2 0.037 -0.066 0.036 -0.045 -0.012 -0.019 -0.029 -0.011
   xmas 0.004 0.014 -0.021 0.000 0.001 0.003 0.005 0.004
    thu -0.056 -0.455 -0.068 0.166 -0.026 0.106 -0.003 0.040
                                                    dec d.mon
           jun
                jul
                      aug
                               sep
                                      oct
                                             nov
aveperc
highperc
 price5
    feb
    mar
    apr
    may
    jun
     jul
         0.515
    aug 0.505 0.532
    sep 0.576 0.578 0.584
    oct 0.554 0.558 0.560 0.648
    nov 0.476 0.476 0.476 0.559 0.552
    \mathtt{dec} \quad 0.477 \quad 0.482 \quad 0.483 \quad 0.555 \quad 0.548 \quad 0.497
  d.mon 0.027 0.020 0.022 0.037 0.013 0.018 0.046
  d.tue 0.042 0.044 0.044 0.038 0.024 0.022 0.037 0.554
  d.wed 0.022 0.043 0.009 0.021 0.028 0.015 0.038 0.427
  d.thu -0.016 0.017 -0.017 -0.015 0.002 -0.005 0.032 0.384
  d.fri -0.030 0.006 -0.027 -0.012 0.000 0.003 0.005 0.383
  d.sat -0.019 0.020 0.002 -0.011 0.005 0.000 0.001 0.335
  dos.1 -0.062 -0.032 -0.041 -0.047 -0.031 -0.015 0.022 -0.049
  dos.2 -0.046 -0.026 -0.023 -0.031 -0.031 -0.020 0.022 -0.010
   xmas 0.004 0.006 0.004 0.002 0.003 -0.003 -0.082 -0.104
    thu 0.091 0.086 0.065 0.111 -0.002 0.022 -0.045 0.013
         d.tue d.wed d.thu d.fri d.sat dos.1 dos.2
 aveperc
highperc
 price5
    feb
    mar
    apr
    may
     jun
    jul
    aug
     sep
    oct
    nov
    dec
  d.mon
  d.tue
  d.wed 0.646
  d.thu 0.496 0.655
  d.fri 0.431 0.494 0.625
  d.sat 0.375 0.392 0.437 0.578
  dos.1 -0.245 -0.129 0.096 0.040 -0.013
  dos.2 -0.121 -0.233 -0.003 0.016 0.010 0.539
   xmas 0.004 0.002 -0.003 -0.002 0.000 -0.018 -0.014
    thu 0.008 -0.049 -0.149 -0.069 -0.005 -0.211 -0.147 0.012
Standardized residuals:
      Min
                 Q1
                           {\tt Med}
                                      QЗ
                                              Max
 -3.670203 -0.5573744 0.06434007 0.6329508 2.378011
Residual standard error: 0.7411051
Degrees of freedom: 415 total; 390 residual
```

• Revenue

```
Generalized least squares fit by REML
 Model: newform
 Data: rellystats
     AIC
            BIC
                    logLik
  2658.567 2815.857 -1289.284
Correlation Structure: AR(1)
Parameter estimate(s):
     Phi
 0.3389055
Coefficients:
               Value Std.Error t-value p-value
(Intercept) 32.34691 2.01255 16.07257 <.0001
  numprods -0.60158 3.14092 -0.19153 0.8482
                     2.73509 -0.97348 0.3309
      body -2.66255
      home
            5.11529
                      2.79032
                               1.83323 0.0676
      food 0.05312 2.56973
                              0.02067 0.9835
   clothes -0.84019 3.52523 -0.23834 0.8118
   aveperc -13.45730 36.35451 -0.37017 0.7115
  highperc -6.94000 19.14501 -0.36250 0.7172
price1 -1.70783 3.33486 -0.51211 0.6089
    price2 -3.25725 2.65408 -1.22726 0.2205
    price3 1.04834 3.40361 0.30801 0.7582
    price4 -6.27395 3.20991 -1.95456 0.0514
                      4.56241 -1.43609 0.1518
    price5 -6.55204
   is.sale 10.97840 13.78134
                               0.79661 0.4262
  start.tue 4.25213 7.58507
                               0.56059 0.5754
       tue -2.70994
                     6.27507 -0.43186 0.6661
       wed 1.38287
                              0.26444 0.7916
                     5.22936
    thu 0.59420
length -0.31531
                      7.31869
                               0.08119 0.9353
                      1.47952 -0.21311 0.8314
       apr 3.45413 2.61217
                               1.32232 0.1869
       may 4.19365 2.70215 1.55196 0.1215
                               1.95938 0.0508
       dec 5.04442 2.57450
            7.20139
     d.mon
                      1.05529
                                6.82406 <.0001
                      1.31714
            7.12332
                               5.40817 <.0001
     d.tue
     d.wed 4.74027 1.36962
                               3.46102 0.0006
                               3.84199 0.0001
     d.thu 5.15088 1.34068
     dos.1 4.96910
dos.2 5.02506
                      1.70024
1.50444
                               2.92259 0.0037
                                3.34016 0.0009
     d.fri 3.91827 1.22026 3.21101 0.0014
     d.sat -1.83239 1.04277 -1.75723 0.0797
       feb 0.22900 2.68411 0.08532 0.9321
                               1.70704 0.0886
       mar 4.46127
                      2.61346
       iun
            3.85917
                      2.61435
                                1.47615 0.1407
       jul 0.37869
                      2.59444
                               0.14596 0.8840
       aug 0.65399
                      2.59437
                               0.25208 0.8011
       sep -3.47638
                      2.26717 -1.53335 0.1260
       oct -4.96175
                      2.32585 -2.13331 0.0335
       nov -2.64602 2.77865 -0.95227 0.3416
 Correlation:
         (Intr) nmprds body home food cloths aveprc hghprc
 numprods 0.025
    body -0.047 -0.348
    home 0.019 -0.252 0.159
    food 0.005 -0.457 0.432 0.095
  clothes 0.011 0.082 -0.151 -0.256 -0.023
aveperc -0.031 0.191 0.012 0.254 -0.129 -0.240 highperc 0.023 -0.043 0.137 -0.267 0.107 0.238 -0.870
  price1 -0.065 -0.487 0.241 0.112 0.314 -0.178 0.204 -0.250
```

```
price2 -0.051 0.104 0.094 -0.022 0.242 -0.070 0.112 0.057
  price3 -0.036 -0.229  0.282  0.228  0.098 -0.409  0.480 -0.414
  price4 -0.028 -0.095 0.128 -0.300 0.147 0.271 -0.424 0.410
  price5 -0.038 -0.599 0.529 -0.017 0.490 -0.123 -0.004 -0.072
 is.sale 0.061 -0.550 -0.212 0.139 0.090 0.019 -0.349 0.128
start.tue 0.155 -0.178 -0.238 -0.096 -0.194 -0.207 0.331 -0.481
     tue -0.149 0.047 0.234 0.036 0.289 0.150 -0.277 0.356
     wed 0.044 0.578 -0.322 -0.353 -0.507 0.117 0.069 -0.003
     thu -0.164 -0.335  0.420  0.097  0.300  0.080 -0.295  0.246
  length 0.036 0.260 -0.004 -0.237 -0.099 -0.021 0.155 -0.131
     apr -0.671 -0.020 0.089 -0.076 0.007 0.063 -0.010 0.045
     may -0.641 0.074 0.004 0.012 -0.049 -0.045 -0.008 0.015
     dec -0.629 0.043 -0.056 -0.120 -0.027 0.034 0.019 0.003
   d.mon -0.270 0.021 -0.041 -0.029 0.002 0.016 0.037 -0.033
   d.tue -0.325 0.006 -0.013 -0.017 0.004 0.009 0.012 -0.014
   d.wed -0.315 0.012 -0.011 -0.017 0.005 0.007 0.012 -0.010
   d.thu -0.281 0.026 -0.016 -0.016 0.003 0.007 0.019 -0.014
   dos.1 0.054 0.021 -0.016 -0.009 0.000 0.003 0.014 -0.008
   dos.2 0.034 0.017 -0.017 -0.008 0.000 0.004 0.012 -0.009
   d.fri -0.282  0.018 -0.008 -0.008  0.002  0.003  0.014 -0.007
   d.sat -0.261 0.002 0.006 -0.003 0.000 0.000 0.002 0.001
     feb -0.615 -0.006 0.087 0.091 -0.031 -0.041 0.144 -0.098
     mar -0.659 -0.047 0.038 -0.035 0.063 0.007 -0.038 0.011
     jun -0.653 -0.056 -0.014 -0.064 -0.064 0.037 0.041 -0.054
     jul -0.675 -0.082 0.072 -0.033 0.020 0.007 0.035 -0.070
     sep -0.756 -0.071 0.053 0.067 0.025 -0.009 0.013 -0.016
     oct -0.732  0.025  0.066 -0.012 -0.003 -0.079  0.067 -0.015
     nov -0.598 -0.141 0.140 0.032 -0.025 -0.033 -0.091 0.089
        price1 price2 price3 price4 price5 is.sal strt.t
numprods
    body
    home
    food
 clothes
 aveperc
highperc
  price1
  price2 0.164
  price3 0.587 0.237
  price4 0.126 0.415 -0.163
  price5 0.581 -0.002 0.308 0.154
 is.sale 0.163 -0.075 -0.015 0.102 0.036
start.tue 0.281 -0.306 0.389 -0.325 0.100 0.260
     tue -0.245 0.223 -0.389 0.284 -0.019 -0.302 -0.888
     wed -0.491 -0.198 -0.299 -0.205 -0.405 -0.502 0.071 -0.152
     thu 0.018 -0.123 -0.269 0.164 0.378 -0.236 -0.599 0.695
  apr 0.024 0.058 -0.029 0.108 0.080 -0.078 -0.197 0.173
     may -0.038 0.077 -0.044 0.004 -0.200 -0.028 -0.198 0.163
     dec -0.006 0.066 -0.053 0.009 -0.031 -0.050 -0.132 0.168
   d.mon 0.003 0.007 -0.004 0.000 -0.020 -0.024 0.066 -0.072
   d.tue 0.002 0.005 -0.002 0.009 -0.006 -0.001 0.002 -0.065
   d.wed 0.003 0.017 0.005 0.016 -0.004 -0.022 0.004 -0.016
   d.thu -0.003 0.020 -0.002 0.013 -0.008 -0.048 0.005 -0.014
   dos.1 -0.004 0.012 -0.005 0.001 -0.007 -0.104 0.005 0.017
   dos.2 -0.003 0.006 -0.008 -0.002 -0.007 -0.081 0.005 0.001
   d.fri -0.002 0.018 0.001 0.011 -0.003 -0.051 0.014 0.033
   d.sat -0.005 0.005 -0.002 0.006 0.003 -0.003 -0.005 0.004
     feb 0.158 -0.003 0.097 -0.096 0.068 -0.141 -0.100
                                                      0.075
     mar 0.161 0.050 0.089 0.036 0.056 0.001 -0.116 0.095
     jun 0.035 -0.049 0.043 -0.008 0.023 -0.050 -0.034 0.052
     jul 0.095 0.035 0.083 0.063 0.121 -0.021 -0.095 0.097
     aug -0.034 -0.042 -0.072 -0.051 0.042 -0.052 -0.135 0.139
```

```
sep 0.104 0.050 0.033 0.045 0.086 -0.041 -0.173 0.166
     oct 0.047 0.147 0.114 0.056
                                    0.037 -0.125 -0.160 0.163
     nov 0.027 -0.028 0.032 0.000
                                    0.056 0.133 -0.159 0.193
            wed
                  thu length
                                            dec d.mon d.tue
                              apr
                                      mav
numprods
    body
    home
    food
 clothes
 aveperc
highperc
  price1
  price2
  price3
  price4
  price5
 is.sale
start.tue
     tue
     wed
     thu -0.198
  length 0.429 -0.084
     apr -0.020 0.183 -0.040
     may 0.007 0.088 -0.097 0.498
     dec 0.054 0.088 -0.105 0.490
                                    0.475
   d.mon 0.045 -0.042 0.055 0.007
                                    0.008 0.021
   d.tue -0.004 -0.016 0.065 0.058 0.047 -0.004 0.550
   d.wed -0.052 -0.023 0.089 0.043 0.030 0.006 0.425 0.655
   d.thu -0.001 -0.068 0.108 0.017 0.002 0.004 0.385 0.507
   dos.1 0.024 -0.027 0.087 -0.024 -0.030 0.021 -0.038 -0.227
   dos.2 0.038 -0.018 0.063 -0.021 -0.022
                                           0.020
                                                 0.000 -0.108
   d.fri -0.009 -0.030 0.088 0.004 -0.015 0.001 0.376 0.408
   d.sat 0.002 -0.001 0.001 0.021 0.000 0.000 0.331 0.362
     feb 0.057 0.122 -0.052 0.474 0.458 0.472 0.005 0.007
     mar -0.085 0.121 -0.066 0.518 0.512 0.480
                                                 0.007 0.046
     jun 0.013 0.152 0.025
                             0.509
                                    0.491
                                          0.479
                                                 0.021
                                                        0.044
     jul -0.068 0.154 -0.033 0.527 0.487 0.481 0.006 0.045
     aug 0.018 0.183 -0.029 0.517 0.503 0.490 0.007 0.044
     sep -0.104 0.235 -0.101 0.586 0.552 0.551 0.019 0.036
     oct -0.046 0.111 0.010 0.571 0.544 0.541 -0.003 0.026
     nov -0.185 0.191 -0.257
                             0.468
                                    0.458 0.498 -0.033 -0.029
          d.wed d.thu dos.1 dos.2 d.fri d.sat
                                                   feb
                                                          mar
numprods
    body
    home
    food
 clothes
 aveperc
highperc
  price1
  price2
  price3
  price4
  price5
  is.sale
start.tue
     tue
     wed
     thu
  length
     apr
     may
     dec
   d.mon
```

```
d.tue
   d.wed
   d.thu 0.666
   dos.1 -0.110 0.105
   dos.2 -0.217 0.006 0.550
   d.fri 0.489 0.622 0.048 0.018
   d.sat 0.382 0.431 -0.013 0.009 0.574
     feb -0.005 -0.012 -0.010 -0.005 -0.013 -0.001
     mar 0.029 -0.016 -0.037 -0.027 -0.032 -0.019 0.496
     jun 0.027 -0.014 -0.041 -0.030 -0.032 -0.020 0.465 0.504
     jul 0.045 0.016 -0.029 -0.024 0.002 0.020
                                                 0.476 0.526
     aug 0.009 -0.019 -0.034 -0.018 -0.033 0.002
                                                 0.476 0.499
     sep 0.022 -0.018 -0.031 -0.020 -0.018 -0.011 0.556 0.587
     oct 0.039 0.011 -0.016 -0.023 0.007 0.006 0.525 0.560
     nov -0.017 -0.048 -0.044 -0.048 -0.011 0.000 0.438 0.467
            jun jul aug sep
                                     oct
numprods
    body
    home
    food
 clothes
 aveperc
highperc
  price1
  price2
  price3
  price4
  price5
 is.sale
start.tue
     tue
     wed
     thu
  length
     apr
     may
     dec
   d.mon
   d.tue
   d.wed
   d.thu
   dos.1
   dos.2
   d.fri
   d.sat
     feb
     mar
     jun
     jul 0.532
     aug 0.509 0.531
     sep 0.582 0.592 0.588
     oct 0.553 0.573 0.554 0.653
     nov 0.457 0.474 0.469 0.547 0.523
Standardized residuals:
                                       Q3
      Min
           Q1
                             Med
                                               Max
-5.115016 -0.5409164 0.0005121614 0.5758953 3.897419
Residual standard error: 6.972982
Degrees of freedom: 415 total; 377 residual
```

Diagnostic Plots for Final Sales Model

Figure 52: Diagnostic Plots for Regression of Sales on Selected Variables

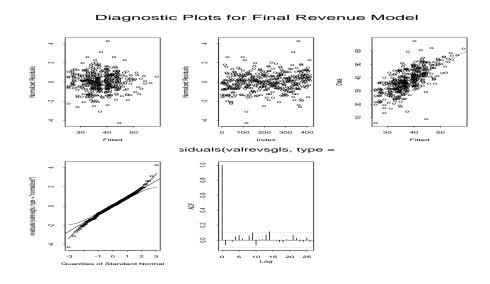


Figure 53: Diagnostic Plots for Regression of Revenue on Selected Variables

Appendix E The Model Selection Process

The process used to select the final modes was a forwards/backwards step method using the Akaike information criterion (AIC) as a measure of model fit. Particularly, the AIC presented in the tables below were calculated using:

 $-2(\log - likelihood) + 2(number of parameters)$

Thus, the model with the largest likelihood (as penalized by the number of parameters included in the model) has the smallest AIC.

The initial determinants were chosen on the basis of having at least 0.1 correlation with overall sales and revenue. For the sales prediction model, both forwards and backwards steps were used to find the best model. However, the backwards method for revenue removed only one determinant, so in the interest of keeping a simple model, the forwards process was not used (although it is presented in the table below, and its validation data is presented at the end of this Appendix).

	SALES						
AIC	Model						
1076.755	flyers + numprods + body + home + cleaning + food + clothes + aveperc + highperc +						
	price1 + price2 + price3 + price4 + price5 + is.sale + start.tue + tue + wed + thu +						
	length + mar + apr + may + d.mon + d.tue + d.wed + d.thu + dos.1 + dos.2						
	BACKWARD SELECTION						
1058.186	numprods + body + home + cleaning + food + clothes + aveperc + highperc + price1 +						
	price2 + price3 + price4 + price5 + is.sale + start.tue + tue + wed + thu + length + m						
	+ apr + may + d.mon + d.tue + d.wed + d.thu + dos.1 + dos.2						
1055.812	numprods + body + home + cleaning + clothes + aveperc + highperc + price1 + price2						
	+ price3 + price4 + price5 + is.sale + start.tue + tue + wed + thu + length + mar + apr						
	+ may + d.mon + d.tue + d.wed + d.thu + dos. 1 + dos. 2						
1053.460	numprods + body + home + cleaning + clothes + aveperc + highperc + price1 + price2						
	+ price3 + price4 + price5 + is.sale + start.tue + tue + wed + thu + mar + apr + may						
	+ d.mon + d.tue + d.wed + d.thu + dos.1 + dos.2						
1051.480	numprods + home + cleaning + clothes + aveperc + highperc + price1 + price2 + price3						
	+ price4 + price5 + is.sale + start.tue + tue + wed + thu + mar + apr + may + d.mon						
	+ d.tue + d.wed + d.thu + dos.1 + dos.2						
1049.642	numprods + home + cleaning + clothes + aveperc + highperc + price2 + price3 + price4						
	$+ \text{price}_5 + \text{is.sale} + \text{start.tue} + \text{tue} + \text{wed} + \text{thu} + \text{mar} + \text{apr} + \text{may} + \text{d.mon} + \text{d.tue} +$						
	d.wed + d.thu + dos.1 + dos.2						
1048.193	numprods + home + cleaning + clothes + aveperc + highperc + price3 + price4 + price5						
	+ is.sale + start.tue + tue + wed + thu + mar + apr + may + d.mon + d.tue + d.wed +						
	d.thu + dos.1 + dos.2						

${f SALES}, continued$						
AIC	Model					
1046.247	home + cleaning + clothes + aveperc+highperc + price3 + price4 + price5 + is.sale + start.tue + tue + wed + thu + mar + apr + may + d.mon + d.tue + d.wed + d.thu + dos.1 + dos.2					
1044.754						
	start.tue + tue + thu + mar + apr + may + d.mon + d.tue + d.wed + d.thu + dos.1 + dos.2					
1043.410	home + clothes + aveperc + highperc + price3 + price4 + price5 + is.sale + start.tue + tue + thu + mar + apr + may + d.mon + d.tue + d.wed + d.thu + dos.1 + dos.2					
1042.481	home + clothes + aveperc + highperc + price3 + price4 + price5 + is.sale + tue + thu + mar + apr + may + d.mon + d.tue + d.wed + d.thu + dos.1 + dos.2					
1041.496	home + clothes + aveperc + highperc + price3 + price4 + price5 + tue + thu + mar + apr + may + d.mon + d.tue + d.wed + d.thu + dos.1 + dos.2					
1040.390	home + clothes + aveperc + highperc + price3 + price4 + price5 + tue + mar + apr + may + d.mon + d.tue + d.wed + d.thu + dos.1 + dos.2					
1039.709	home + aveperc + highperc + price3 + price4 + price5 + tue + mar + apr + may + d.mon + d.tue + d.wed + d.thu + dos.1 + dos.2					
1038.810	home + aveperc + highperc + price3 + price5 + tue + mar + apr + may + d.mon + d.tue + d.wed + d.thu + dos.1 + dos.2					
1038.369	aveperc + highperc + price 3 + price 5 + tue + mar + apr + may + d.mon + d.tue + d.wed + d.thu + dos. 1 + dos. 2					
1036.939	aveperc + highperc + price3 + price5 + mar + apr + may + d.mon + d.tue + d.wed + d.thu + dos.1 + dos.2					
1036.591	aveperc + highperc + price 5 + mar + apr + may + d.mon + d.tue + d.wed + d.thu + dos. 1 + dos. 2					
	FORWARD SELECTION					
982.320	aveperc + highperc + price5 + mar + apr + may + d.mon + d.tue + d.wed + d.thu + $dos.1 + dos.2 + d.fri$					
967.440	aveperc + highperc + price5 + mar + apr + may + d.mon + d.tue + d.wed + d.thu + dos.1 + dos.2 + d.fri + xmas					
960.610	aveperc + highperc + price 5 + mar + apr + may + d.mon + d.tue + d.wed + d.thu + dos. 1 + dos. 2 + d.fri + xmas + oct					
949.138	aveperc + highperc + price5 + mar + apr + may + d.mon + d.tue + d.wed + d.thu + $dos.1 + dos.2 + d.fri + xmas + oct + sep$					
943.982	aveperc + highperc + price5 + mar + apr + may + d.mon + d.tue + d.wed + d.thu + dos.1 + dos.2 + d.fri + xmas + oct + sep + aug					
938.341	aveperc + highperc + price5 + mar + apr + may + d.mon + d.tue + d.wed + d.thu + $dos.1 + dos.2 + d.fri + xmas + oct + sep + aug + nov$					
937.880	aveperc + highperc + price5 + mar + apr + may + d.mon + d.tue + d.wed + d.thu + $dos.1 + dos.2 + d.fri + xmas + oct + sep + aug + nov + thu$					

REVENUE								
AIC	Model							
2738.294	flyers + numprods + body + home + food + clothes + aveperc + highperc + price1 +							
	price2 + price3 + price4 + price5 + is.sale + start.tue + tue + wed + thu + length + apr							
	+ may + dec + d.mon + d.tue + d.wed + d.thu + dos.1 + dos.2							
	BACKWARD SELECTION							
2724.790 numprods + body + home + food + clothes + aveperc + highperc + price1 + price2 +								
	price3 + price4 + price5 + is.sale + start.tue + tue + wed + thu + length + apr + may +							
	$\frac{1}{1000} = \frac{1}{1000} = 1$							
	All Days and Months Added							
	FORWARD SELECTION							
2658.567	numprods + body + home + food + clothes + aveperc + highperc + price1 + price2 +							
2000.00.	price3 + price4 + price5 + is.sale + start.tue + tue + wed + thu + length + apr + may +							
	dec + d.mon + d.tue + d.wed + d.thu + dos.1 + dos.2 + d.fri + d.sat + feb + mar + jun							
	+ jul $+$ aug $+$ sep $+$ oct $+$ nov							
2650.373	numprods + body + home + food + clothes + aveperc + highperc + price1 + price2 +							
2000.010	price3 + price4 + price5 + is.sale + start.tue + tue + wed + thu + length + apr + may +							
	dec + d.mon + d.tue + d.wed + d.thu + dos.1 + dos.2 + d.fri + d.sat + feb + mar + jun							
	+ jul $+$ aug $+$ sep $+$ oct $+$ nov $+$ sat.sun							
2645.179								
	price3 + price4 + price5 + is.sale + start.tue + tue + wed + thu + length + apr + may +							
	dec + d.mon + d.tue + d.wed + d.thu + dos.1 + dos.2 + d.fri + d.sat + feb + mar + jun							
	+ jul + aug + sep + oct + nov + sat.sun + dos.6							
2640.379	numprods + body + home + food + clothes + aveperc + highperc + price1 + price2 +							
	price3 + price4 + price5 + is.sale + start.tue + tue + wed + thu + length + apr + may +							
	dec + d.mon + d.tue + d.wed + d.thu + dos.1 + dos.2 + d.fri + d.sat + feb + mar + jun							
	+ jul + aug + sep + oct + nov + sat.sun + dos.6 + start.sat							
2620.08	numprods + body + home + food + clothes + aveperc + highperc + price1 + price2 +							
	price3 + price4 + price5 + is.sale + start.tue + tue + wed + thu + length + apr + may +							
	dec + d.mon + d.tue + d.wed + d.thu + dos.1 + dos.2 + d.fri + d.sat + feb + mar + jun							
	+ jul + aug + sep + oct + nov + sat.sun + dos.6 + start.sat + xmas							
2615.69	numprods + body + home + food + clothes + aveperc + highperc + price1 + price2 +							
	price3 + price4 + price5 + is.sale + start.tue + tue + wed + thu + length + apr + may +							
	dec + d.mon + d.tue + d.wed + d.thu + dos.1 + dos.2 + d.fri + d.sat + feb + mar + jun							
	+ jul + aug + sep + oct + nov + sat.sun + dos.6 + start.sat + xmas + cleaning							
2612.726	numprods + body + home + food + clothes + aveperc + highperc + price1 + price2 +							
	price3 + price4 + price5 + is.sale + start.tue + tue + wed + thu + length + apr + may +							
	dec + d.mon + d.tue + d.wed + d.thu + dos.1 + dos.2 + d.fri + d.sat + feb + mar + jun							
	+ jul + aug + sep + oct + nov + sat.sun + dos.6 + start.sat + xmas + cleaning + dos.5							
2610.785	numprods + body + home + food + clothes + aveperc + highperc + price1 + price2 +							
	price3 + price4 + price5 + is.sale + start.tue + tue + wed + thu + length + apr + may +							
	dec + d.mon + d.tue + d.wed + d.thu + dos.1 + dos.2 + d.fri + d.sat + feb + mar + jun							
	+ jul + aug + sep + oct + nov + sat.sun + dos.6 + start.sat + xmas + cleaning + dos.5							
	+ dos.3							
	Singular fits: +start.mon, +start.wed, +start.thu, +mon, +fri, +dos.4. Therefore, dos.4							
replaced is	s.sale, and the others are left out.							

REVENUE PREDICTIONS-forward selection model						
Date	Prediction	Lowest Error	Highest Error	True Value	Correct Prediction	Difference
9/5/01	37.02215	24.8319655	49.21234	50.62934	F	-13.607188
9/6/01	38.53679	26.3466064	50.72698	33.93184	T	4.604949
9/7/01	30.68114	18.4909580	42.87133	46.04563	F	-15.364486
9/18/01	19.21817	6.8087652	31.62758	46.41077	F	-27.192601
9/19/01	16.80153	4.3921237	29.21094	46.07114	F	-29.269608
9/20/01	12.21636	-0.1930513	24.62577	36.48767	F	-24.271312
10/2/01	38.30832	25.5879879	51.02865	51.69042	F	-13.382108
10/3/01	35.19260	22.4722759	47.91293	41.25458	T	-6.061971
10/4/01	30.93362	18.2132863	43.65394	45.89989	F	-14.966276
10/16/01	39.78964	26.9613398	52.61794	50.57994	T	-10.790298
10/17/01	36.94859	24.1202912	49.77689	62.04982	F	-25.101229
10/18/01	32.35930	19.5310045	45.18760	52.28642	F	-19.927119

average difference: -16.27744 t-statistic for testing if this is different than zero: -0.1735632

p-value: 0.8653615

Appendix F

The Analysis of Revenue Outliers

As seen in the diagnostic plots for the final revenue model, there are two distinct outliers. One is observation number 116 (Christmas Day 2000), and observation number 361 (August 27, 2001–a Monday that does not seem to have any notable characteristic) Removal of these observations yields the diagnostic plots in Figure ?? and summary below. However removing the outliers only slightly affected the coefficient values, and only changed price4's significance to the model. In addition, the removal does not improve the prediction validity for the regression model; prediction data is presented after the model summary.

```
Generalized least squares fit by REML
  Model: newform
  Data: rellystats[ - c(116, 361), ]
      AIC
                BIC
                      logLik
  2604.321 2761.399 -1262.161
Correlation Structure: AR(1)
Parameter estimate(s):
      Phi
0.3237973
Coefficients:
                Value Std.Error
                                  t-value p-value
(Intercept) 32.42763
                        1.87265
                                  17.31648
                                            <.0001
            -0.44632
                        2.94822
                                  -0.15139
                                            0.8798
  numprods
                        2.56683
       body
             -2.91997
                                  -1.13758
                                            0.2560
       home
              4.90553
                        2.62278
                                  1.87035
                                            0.0622
       food
             0.00465
                        2.41330
                                  0.00193
                                            0.9985
    clothes
             -0.50351
                        3.31081
                                  -0.15208
                                            0.8792
    aveperc -14.39064
                       34.10724
                                  -0.42192
                                            0.6733
            -6.05818
                       17.96919
                                  -0.33714
  highperc
     price1
             -1.81419
                        3.13438
                                  -0.57880
                                            0.5631
     price2
             -3.10990
                        2.49304
                                  -1.24743
                                            0.2130
     price3
             0.88352
                        3.20008
                                   0.27609
                                            0.7826
             -6.17035
                        3.01578
                                  -2.04602
                                            0.0415
    price4
             -6.95408
                        4.28465
                                  -1.62302
                                            0.1054
    price5
            11.13708
                       12.93187
    is.sale
                                   0.86121
                                            0.3897
  start.tue
             4.07850
                        7.12017
                                   0.57281
                                            0.5671
             -2.39850
        tue
                        5.88771
                                  -0.40737
                                            0.6840
             1.66173
                        4.90895
                                   0.33851
                                            0.7352
        wed
        thu
             0.24315
                        6.86350
                                   0.03543
                                            0.9718
    length
             -0.41982
                        1.38820
                                  -0.30242
                                            0.7625
                        2.42412
        apr
              3.42139
                                   1.41140
                                            0.1590
                        2,50766
                                   1.66255
        may
              4.16912
                                            0.0972
        dec
              6.27582
                        2.41493
                                   2.59877
                                            0.0097
      d.mon
              7.10945
                        1.01296
                                   7.01849
                                            < .0001
              7,11224
                        1.23765
      d.tue
                                   5.74658
                                            < .0001
      d.wed
              4.72119
                        1.28899
                                   3.66271
                                            0.0003
              5.13645
                        1.26347
                                   4.06535
                                            0.0001
      d.thu
      dos.1
              4.98701
                        1.61331
                                   3.09117
                                            0.0021
      dos.2
              5.04633
                        1.43115
                                   3.52607
                                            0.0005
              3.89928
                        1.15409
                                   3.37867
                                            0.0008
      d.fri
      d.sat
             -1.86995
                        0.99166
                                  -1.88569
                                            0.0601
              0.25387
                        2,49665
                                            0.9191
        feb
                                   0.10169
        mar
              4.38716
                        2.42659
                                   1.80795
                        2.42646
        jun
              3.79533
                                   1.56414
                                            0.1186
        jul
              0.29415
                        2.40825
                                   0.12214
                                            0.9029
             -0.33552
                        2.42885
                                  -0.13814
                                            0.8902
        aug
             -3.53167
                        2.10433
                                  -1.67829
        sep
                                            0.0941
             -5.03373
                        2.15896
                                  -2.33155
                                            0.0203
             -2.55160
                        2.58131
                                  -0.98849
                                            0.3236
        nov
```

```
Correlation:
         (Intr) nmprds
                       body home food cloths aveprc hghprc
numprods 0.025
    body -0.048 -0.348
    home 0.019 -0.253 0.160
    food 0.006 -0.457 0.433 0.096
 clothes 0.011 0.082 -0.151 -0.256 -0.023
 aveperc -0.032 0.190 0.013 0.256 -0.130 -0.241
highperc 0.024 -0.041 0.137 -0.269 0.108 0.239 -0.870
  price1 -0.066 -0.488 0.241 0.114 0.314 -0.178 0.202 -0.249
  price2 -0.052 0.104 0.096 -0.022 0.242 -0.070 0.112 0.058
  price3 -0.037 -0.230 0.282 0.230 0.097 -0.408 0.479 -0.413
  price4 -0.028 -0.096 0.130 -0.300 0.148 0.271 -0.424 0.411
  price5 -0.039 -0.600 0.529 -0.015 0.490 -0.123 -0.003 -0.072
 is.sale 0.062 -0.550 -0.211 0.140 0.090 0.019 -0.350 0.128
start.tue 0.156 -0.178 -0.239 -0.096 -0.195 -0.207 0.331 -0.482
     tue -0.151 0.047 0.235 0.035 0.290 0.150 -0.277 0.356
     wed 0.045 0.580 -0.324 -0.355 -0.508 0.117 0.070 -0.004
     thu -0.166 -0.336  0.420  0.097  0.300  0.081 -0.294  0.244
  length 0.037 0.261 -0.006 -0.237 -0.100 -0.022 0.155 -0.132
     apr -0.670 -0.019 0.090 -0.077 0.007 0.064 -0.010 0.045
     may -0.639 0.073 0.005 0.011 -0.048 -0.044 -0.008 0.016
     dec -0.621 0.046 -0.060 -0.125 -0.029 0.036 0.019 0.003
   d.mon -0.271 0.022 -0.043 -0.031 0.001 0.016 0.037 -0.034
   d.tue -0.327 0.006 -0.012 -0.016 0.004 0.009 0.012 -0.014
   d.wed -0.317 0.011 -0.010 -0.016 0.005 0.007 0.011 -0.010
   d.thu -0.284 0.026 -0.016 -0.015 0.003 0.007 0.018 -0.013
   dos.1 0.053 0.022 -0.017 -0.009 0.000 0.004 0.014 -0.008
   dos.2 0.033 0.017 -0.017 -0.009 0.000 0.005 0.013 -0.009
   d.fri -0.286  0.017 -0.008 -0.008  0.002  0.003  0.014 -0.007
   d.sat -0.266 0.002 0.006 -0.003 0.000 0.000 0.002 0.001
     feb -0.614 -0.006  0.088  0.092 -0.032 -0.042  0.146 -0.099
     jun -0.651 -0.056 -0.014 -0.065 -0.066 0.036 0.042 -0.056
     jul -0.674 -0.083 0.074 -0.033 0.021 0.007
                                                0.035 -0.071
     aug -0.650 -0.012 0.022 -0.016 -0.019 -0.056 0.025 -0.053
     sep -0.754 -0.072 0.054 0.069 0.025 -0.009 0.013 -0.017
     oct -0.730 0.025 0.068 -0.012 -0.004 -0.081 0.068 -0.015
     nov -0.596 -0.142 0.141 0.031 -0.025 -0.034 -0.091 0.090
        price1 price2 price3 price4 price5 is.sal strt.t
numprods
    body
    home
    food
 clothes
 aveperc
highperc
  price1
  price2 0.164
  price3 0.588 0.238
  price4 0.127 0.416 -0.160
  price5 0.580 -0.002 0.308 0.155
 is.sale 0.165 -0.076 -0.014 0.102 0.038
start.tue 0.280 -0.308 0.388 -0.324 0.099 0.260
     tue -0.245 0.224 -0.389 0.284 -0.019 -0.303 -0.888
     wed -0.493 -0.199 -0.301 -0.207 -0.406 -0.502 0.071 -0.152
     thu 0.018 -0.123 -0.269 0.164 0.379 -0.234 -0.598 0.694
  length -0.165 -0.237  0.069 -0.176  0.019 -0.641  0.287 -0.137
     apr 0.023 0.059 -0.029 0.108 0.079 -0.080 -0.200 0.176
     may -0.037 0.077 -0.045 0.005 -0.200 -0.029 -0.201 0.165
     dec -0.008 0.067 -0.056 0.008 -0.034 -0.052 -0.132 0.170
   d.mon 0.001 0.006 -0.007 -0.001 -0.021 -0.025 0.066 -0.070
   d.tue 0.002 0.004 -0.002 0.009 -0.006 -0.001 0.002 -0.064
```

```
d.wed 0.003 0.017 0.006 0.017 -0.004 -0.022 0.003 -0.015
   d.thu -0.003 0.021 -0.001 0.013 -0.008 -0.049 0.005 -0.014
   dos.1 -0.004 0.012 -0.005 0.001 -0.008 -0.106 0.005 0.017
   dos.2 -0.003 0.006 -0.008 -0.003 -0.008 -0.083 0.005 0.001
   d.fri -0.002 0.018 0.002 0.012 -0.003 -0.051 0.013 0.033
   d.sat -0.004 0.005 -0.001 0.006 0.004 -0.003 -0.005 0.004
     feb 0.160 -0.002 0.098 -0.098 0.069 -0.143 -0.102
                                                       0.076
     mar 0.164 0.051 0.091 0.037 0.056 0.001 -0.118 0.096
     jun 0.036 -0.049 0.043 -0.008 0.022 -0.051 -0.034
     jul 0.098 0.036 0.085 0.064 0.124 -0.021 -0.097
                                                       0.098
     aug -0.038 -0.046 -0.077 -0.055 0.042 -0.053 -0.135
                                                       0.140
     sep 0.106 0.051 0.034 0.045
                                   0.088 -0.041 -0.175
                                                       0.168
     oct 0.048 0.149 0.116 0.057 0.037 -0.127 -0.163 0.165
     nov 0.028 -0.028 0.033 0.000 0.057 0.133 -0.161 0.195
           wed
                thu length
                               apr
                                    may
                                            dec d.mon d.tue
numprods
    body
    home
    food
 clothes
 aveperc
highperc
  price1
  price2
  price3
  price4
  price5
 is.sale
start.tue
     tue
     wed
     thu -0.199
  length 0.429 -0.085
     apr -0.019 0.186 -0.041
     may 0.007 0.091 -0.099 0.498
     dec 0.059 0.087 -0.107 0.485
                                   0.471
   d.mon 0.048 -0.041 0.053 0.005 0.006 0.028
   d.tue -0.004 -0.015 0.063 0.058 0.046 -0.006 0.537
   d.wed -0.052 -0.023 0.088 0.043 0.029 0.003 0.416 0.648
   d.thu -0.001 -0.067 0.108 0.016 0.002 0.002 0.381 0.503
   dos.1 0.024 -0.027 0.090 -0.024 -0.030 0.022 -0.033 -0.226
   dos.2 0.038 -0.018 0.066 -0.021 -0.022 0.021 0.004 -0.105
   d.fri -0.010 -0.030 0.088 0.004 -0.016 -0.002 0.376 0.408
   d.sat 0.001 -0.001 0.001 0.021 0.000 -0.002 0.333 0.365
     feb 0.058 0.123 -0.053 0.475 0.459 0.469 0.004 0.007
     mar -0.087 0.123 -0.068 0.517 0.513 0.474 0.005 0.046
     jun 0.013 0.154 0.025 0.509 0.491 0.474 0.020 0.043
     jul -0.069 0.156 -0.034 0.528 0.487 0.475 0.004 0.044
     aug 0.022 0.186 -0.029 0.513 0.500 0.481 0.013 0.043
     sep -0.106 0.239 -0.103 0.586 0.553 0.545 0.018
                                                       0.035
     oct -0.047 0.112 0.010 0.572 0.544 0.535 -0.005 0.025
     nov -0.186 0.193 -0.260 0.468 0.458 0.493 -0.032 -0.029
          d.wed d.thu dos.1 dos.2 d.fri d.sat
                                                feb
numprods
    body
    home
    food
 clothes
 aveperc
highperc
  price1
  price2
  price3
  price4
```

```
price5
 is.sale
start.tue
     tue
     wed
     thu
  length
     apr
     may
     dec
   d.mon
   d.tue
   d.wed
   d.thu 0.660
   dos.1 -0.109 0.108
   dos.2 -0.216 0.008 0.547
   d.fri 0.486 0.618 0.049 0.019
   d.sat 0.384 0.431 -0.012 0.010 0.570
     feb -0.006 -0.012 -0.010 -0.005 -0.013 -0.001
     mar 0.029 -0.016 -0.037 -0.027 -0.032 -0.019 0.495
     aug 0.006 -0.022 -0.034 -0.018 -0.036 -0.001 0.473 0.494
     sep 0.022 -0.019 -0.031 -0.020 -0.018 -0.011 0.557 0.587
     oct 0.038 0.011 -0.016 -0.023 0.007 0.005 0.525 0.560
     nov -0.018 -0.048 -0.044 -0.047 -0.011 0.000 0.438 0.467
           jun
                jul
                       aug sep
                                     oct
numprods
    body
    home
    food
 clothes
 aveperc
highperc
  {\tt price1}
  price2
  price3
  price4
  price5
 is.sale
start.tue
     tue
     wed
     thu
  length
     apr
     may
     dec
   d.mon
   d.tue
   d.wed
   d.thu
   dos.1
   dos.2
   d.fri
   d.sat
     feb
     mar
     jun
     jul 0.532
     aug 0.505 0.526
     sep 0.582 0.592 0.583
     oct 0.553 0.573 0.549 0.652
     nov 0.457 0.474 0.465 0.547 0.522
```

Standardized residuals:

Min Q1 Med Q3 Max -3.689739 -0.5574653 0.02155516 0.5805586 3.425508

Residual standard error: 6.559293

Degrees of freedom: 413 total; 375 residual

Diagnostic Plots for Final Revenue Model Without Outliers

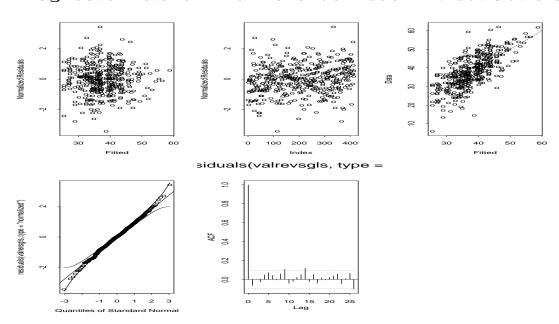


Figure 54: Diagnostic Plots for Regression of Revenue on Selected Variables without the two outliers

REVENUE PREDICTIONS-Without Outliers							
Date	Prediction	Lowest Error	Highest Error	True Value	Correct Prediction	Difference	
9/5/01	38.64592	26.44952	50.84232	50.62934	T	-11.983419	
9/6/01	40.08106	27.88466	52.27746	33.93184	${ m T}$	6.149214	
9/7/01	32.47117	20.27477	44.66757	46.04563	F	-13.574456	
9/18/01	33.72362	21.59712	45.85012	46.41077	F	-12.687156	
9/19/01	31.37988	19.25338	43.50638	46.07114	F	-14.691260	
9/20/01	26.88664	14.76014	39.01314	36.48767	${ m T}$	-9.601030	
10/2/01	37.19949	24.82316	49.57582	51.69042	F	-14.490934	
10/3/01	34.17862	21.80229	46.55495	41.25458	T	-7.075956	
10/4/01	29.97643	17.60010	42.35276	45.89989	F	-15.923463	
10/16/01	38.82160	26.30901	51.33419	50.57994	T	-11.758336	
10/17/01	36.02445	23.51185	48.53704	62.04982	F	-26.025374	
10/18/01	31.47536	18.96277	43.98795	52.28642	F	-20.811063	
average difference: -12.7061							
t-statistic for testing if this is different than zero: -0.2118939							
p-value: 0.8360649							