PFG Bank: Credit Card Exercise

true true

Preliminaries

Determine notebook defaults:

Load packages:

Mailing 1

First, let's start by summarising our previous marketing campaign results.

Note: Throughout these steps I am retaining the same (or similar) columns so they can merged.

```
# Response Rates
solicitation.results = read.csv("MKT_482_CreditCard.csv", header = TRUE)
solicitation.results
```

```
Date APR
                       Type Fee Card_Type Num_Mailed Num_Accounts Avg_BK
       April 16.8
                      Fixed
                                        MC
                                                167000
1
                             20
                                                                 1533
                                                                         210
2
                                                                 2896
              16.8
                      Fixed
                               0
                                        MC
                                                 81000
                                                                         210
3
             19.8
                      Fixed
                              20
                                        MC
                                                143000
                                                                 590
                                                                         210
4
             19.8
                      Fixed
                               0
                                        MC
                                                100000
                                                                 2052
                                                                         210
                                                                         255
5
   September 14.9
                              20
                                      Visa
                                                177000
                                                                 4329
                      Fixed
6
             14.9 Variable
                              20
                                      Visa
                                                170000
                                                                 3004
                                                                         255
7
                                                                 2983
                                                                         255
              16.8
                      Fixed 20
                                      Visa
                                                255000
8
             19.8
                      Fixed 20
                                      Visa
                                                 35000
                                                                 175
                                                                         255
9
             16.8
                               0
                                                                 2516
                                                                         255
                      Fixed
                                      Visa
                                                 65000
             19.8
                      Fixed
                               0
                                                                 2115
                                                                         255
10
                                      Visa
                                                 95000
11
   November 14.9
                      Fixed 20
                                      Visa
                                                 82000
                                                                 1761
                                                                         190
12
             14.9
                      Fixed
                               0
                                      Visa
                                                 50000
                                                                 2451
                                                                         190
13
              14.9 Variable
                              20
                                      Visa
                                                 50000
                                                                  708
                                                                         190
             16.8
                      Fixed
                             20
                                      Visa
                                                 50000
                                                                  372
                                                                         190
```

```
solicitation.results <- solicitation.results %>%
  mutate(Fee=factor(Fee), APR=factor(APR)) %>%
  group_by(APR, Type, Fee) %>%
  select(APR, Type, Fee, Num_Mailed, Num_Accounts, Avg_BK) %>%
  summarise(
    Tot_Mailed=sum(Num_Mailed),
    Tot_Accounts=sum(Num_Accounts),
    Tot_Avg_BK=weighted.mean(Avg_BK, Num_Mailed)
    ) %>% mutate(Resp_Rate=Tot_Accounts / Tot_Mailed)
solicitation.results
```

```
# A tibble: 7 x 7
# Groups: APR, Type [4]
APR Type Fee Tot_Mailed Tot_Accounts Tot_Avg_BK Resp_Rate
<fct> <fct> <fct> <int> <int> <dbl> <dbl>
```

```
1 14.9 Fixed
                             50000
                                            2451
                                                        190
                                                               0.0490
2 14.9 Fixed
                  20
                            259000
                                            6090
                                                        234.
                                                               0.0235
                                                        240.
3 14.9 Variable 20
                            220000
                                            3712
                                                               0.0169
4 16.8 Fixed
                                                        230.
                 Ω
                            146000
                                            5412
                                                               0.0371
5 16.8 Fixed
                  20
                            472000
                                            4888
                                                        232.
                                                               0.0104
6 19.8 Fixed
                                                        232.
                                                               0.0214
                  0
                            195000
                                            4167
7 19.8 Fixed
                            178000
                                             765
                                                               0.00430
                 20
                                                        219.
```

Second, we'll merge a Full Factorial design into our partial results.

```
# Partial Factorial Design
solicitation.design <- list(APR=c("14.9", "16.8", "19.8"), Type=c("Fixed", "Variable"), Fee=c("20", "0"
solicitation.design <- expand.grid(solicitation.design)
solicitation.design <- full_join(solicitation.design, solicitation.results) %>% arrange(APR)
solicitation.design
```

```
APR.
            Type Fee Tot_Mailed Tot_Accounts Tot_Avg_BK
                                                            Resp_Rate
                                                 234.4208 0.023513514
  14.9
                          259000
1
           Fixed
                  20
                                         6090
2
  14.9 Variable
                  20
                          220000
                                         3712
                                                 240.2273 0.016872727
                                                190.0000 0.049020000
3
  14.9
           Fixed
                   0
                          50000
                                         2451
  14.9 Variable
                   0
                              NA
                                           NA
                                                       NA
  16.8
                                                232.1928 0.010355932
5
           Fixed
                  20
                          472000
                                         4888
  16.8 Variable
6
                  20
                              NA
                                           NA
                                                       NA
                                                230.0342 0.037068493
7
  16.8
           Fixed
                   0
                          146000
                                         5412
8
  16.8 Variable
                   0
                                           NA
                                                       NA
                              NΑ
  19.8
           Fixed
                  20
                          178000
                                          765
                                                218.8483 0.004297753
10 19.8 Variable
                  20
                              NA
                                           NA
                                                       NA
                                                                   NA
11 19.8
           Fixed
                          195000
                                         4167
                                                 231.9231 0.021369231
                   0
12 19.8 Variable
                              NA
                                           NA
                                                       NA
                                                                   NA
                   0
```

Third, we'll predict what the response rate is to a solicitation for each product offer.

```
lr <- glm(Resp_Rate~APR*Type*Fee, data=solicitation.design, family=binomial)
predictions <- predict(lr, newdata=solicitation.design, type="response")
solicitation.design <- solicitation.design %>% mutate(Pred_Resp_Rate = predictions)
solicitation.design %>% select(APR, Type, Fee, Resp_Rate, Pred_Resp_Rate)
```

```
APR
                       Resp_Rate Pred_Resp_Rate
            Type Fee
  14.9
           Fixed 20 0.023513514
                                    0.023513514
1
  14.9 Variable
                  20 0.016872727
                                    0.016872727
3
  14.9
           Fixed
                   0 0.049020000
                                    0.049020000
  14.9 Variable
                                    0.035436986
                   0
  16.8
           Fixed 20 0.010355932
5
                                    0.010355932
  16.8 Variable
6
                  20
                              NA
                                    0.007402994
7
  16.8
                  0 0.037068493
                                    0.037068493
           Fixed
 16.8 Variable
                  0
                              NA
                                    0.026704144
 19.8
           Fixed
                  20 0.004297753
                                    0.004297753
10 19.8 Variable
                  20
                              NA
                                    0.003066918
11 19.8
                   0 0.021369231
                                    0.021369231
           Fixed
12 19.8 Variable
                   0
                              NA
                                    0.015324538
```

Fourth, we'll create a similar table of the CLV estimates that were given to us in Exhibit 2 and merge them into our analysis.

```
# CLV Estimates
clv.design <- list( APR=c("14.9", "16.8", "19.8"), Type=c("Fixed", "Variable"), Fee=c("20", "0"))</pre>
clv.full <- expand.grid(clv.design) %>% arrange(APR)
clv.results <- clv.full %>%
   mutate(
      BK_150=c(83,93,52,62,103,113,72,82,131,141,100,110),
      BK_200=c(63,73,32,42,83,93,52,62,111,121,80,90),
      BK_250=c(33,43,2,12,53,63,22,32,81,91,50,60)
   ) %>% arrange(APR)
solicitation.design <- full_join(solicitation.design, clv.results)</pre>
solicitation.design %>% select(APR, Type, Fee, Pred_Resp_Rate, BK_150, BK_200, BK_250)
    APR
            Type Fee Pred_Resp_Rate BK_150 BK_200 BK_250
1 14.9
                  20
                        0.023513514
           Fixed
                                         83
                                                63
                                                       33
2 14.9 Variable
                  20
                        0.016872727
                                         93
                                                73
                                                       43
                                                        2
3 14.9
                                         52
                                                32
           Fixed
                   0
                        0.049020000
4 14.9 Variable
                   0
                        0.035436986
                                        62
                                                42
                                                       12
5 16.8
           Fixed
                  20
                        0.010355932
                                        103
                                                83
                                                       53
6 16.8 Variable
                  20
                        0.007402994
                                       113
                                                93
                                                       63
7 16.8
           Fixed
                   0
                        0.037068493
                                        72
                                                52
                                                       22
8 16.8 Variable
                   0
                        0.026704144
                                        82
                                                62
                                                       32
9 19.8
           Fixed 20
                        0.004297753
                                       131
                                               111
                                                       81
10 19.8 Variable
                  20
                        0.003066918
                                       141
                                               121
                                                       91
11 19.8
           Fixed
                        0.021369231
                                        100
                                                80
                                                       50
                   0
12 19.8 Variable
                        0.015324538
                   0
                                        110
                                                90
                                                       60
Fifth, we'll estimate the results of sending 100,000 marketing deals of each product to each CLV customer
variable cost <- 0.50 # from Capital One ("PFG Bank"): Credit Card Exercise doc
solicitation.profit <- solicitation.design %>%
      BK_150_Profit=dollar((100000 * Pred_Resp_Rate * BK_150) - (100000 * variable_cost)),
      BK_200_Profit=dollar((100000 * Pred_Resp_Rate * BK_200) - (100000 * variable_cost)),
      BK_250_Profit=dollar((100000 * Pred_Resp_Rate * BK_250) - (100000 * variable_cost)),
   ) %>% select(APR, Type, Fee, Resp_Rate, Pred_Resp_Rate, BK_150, BK_200, BK_250, BK_150_Profit, BK_20
solicitation.profit %>% select(APR, Type, Fee, Pred_Resp_Rate, BK_150_Profit, BK_200_Profit, BK_250_Pro
   APR
            Type Fee Pred_Resp_Rate BK_150_Profit BK_200_Profit BK_250_Profit
1 14.9
           Fixed
                  20
                        0.023513514
                                          $145,162
                                                         $98,135
                                                                     $27,594.59
2 14.9 Variable 20
                        0.016872727
                                          $106,916
                                                         $73,171
                                                                    $22,552.73
3 14.9
           Fixed
                   0
                        0.049020000
                                          $204,904
                                                        $106,864
                                                                   -$40,196.00
4 14.9 Variable
                                          $169,709
                   0
                        0.035436986
                                                         $98,835
                                                                    -$7,475.62
 16.8
           Fixed 20
                        0.010355932
                                           $56,666
                                                         $35,954
                                                                     $4,886.44
6 16.8 Variable
                  20
                                           $33,654
                                                         $18,848
                                                                    -$3,361.14
```

Mailing 2

7 16.8

9 19.8

11 19.8

8 16.8 Variable

10 19.8 Variable

12 19.8 Variable

Fixed

Fixed

Fixed 20

0

0

20

0

0

First, let's get the results from the first mailing into our analysis (New CSV File with added rows)

0.007402994

0.037068493

0.026704144

0.004297753

0.003066918

0.021369231

0.015324538

\$216,893

\$168,974

\$6,301

-\$6,756

\$163,692

\$118,570

\$142,756

\$115,566

-\$2,295

-\$12,890

\$120,954

\$87,921

\$31,550.68

\$35,453.26

-\$15,188.20

-\$22,091.04

\$56,846.15

\$41,947.23

```
solicitation.results2 = read.csv("MKT_482_CreditCard_v2.csv", header = TRUE)
solicitation.results2 <- solicitation.results2 %>%
   mutate(
      Resp_Rate=Num_Accounts / Num_Mailed,
      Fee=factor(Fee),
      APR=factor(APR)
   )
# NOTE: This time we include Avg_BK into the regression & don't group first
lr2 <- glm(Resp_Rate~APR*Type*Fee, data=solicitation.results2, family=binomial)</pre>
solicitation.results2 <- solicitation.results2 %>%
   group_by(APR, Type, Fee) %>%
   select(APR, Type, Fee, Num_Mailed, Num_Accounts, Avg_BK) %>%
   summarise(
      Tot_Mailed=sum(Num_Mailed),
      Tot_Accounts=sum(Num_Accounts),
      Tot_Avg_BK=weighted.mean(Avg_BK, Num_Mailed)
   ) %>% mutate(Resp_Rate=Tot_Accounts / Tot_Mailed)
# change back to column names - not sure why it wouldn't allow me to keep them as-is
colnames(solicitation.results2)[4] <- "Num_Mailed"</pre>
colnames(solicitation.results2)[5] <- "Num_Accounts"</pre>
colnames(solicitation.results2)[6] <- "Avg_BK"</pre>
# Full Design
solicitation.design2 <- list(APR=c("14.9", "16.8", "19.8"), Type=c("Fixed", "Variable"), Fee=c("20", "0
solicitation.design2 <- expand.grid(solicitation.design2)</pre>
solicitation.design2 <- full_join(solicitation.design2, solicitation.results2) %>% arrange(APR)
# New Predictions - note, we don't get predictions this time because we included "BK" which is NA
predictions2 <- predict(lr2, newdata=solicitation.design2, type="response")</pre>
solicitation.design2 <- solicitation.design2 %>% mutate(Pred_Resp_Rate = predictions2)
# CLV
solicitation.design2 <- full_join(solicitation.design2, clv.results)</pre>
# New Profit
solicitation.profit2 <- solicitation.design2 %>%
  mutate(
      BK_150_Profit=dollar((100000 * Pred_Resp_Rate * BK_150) - (100000 * variable_cost)),
      BK_200_Profit=dollar((100000 * Pred_Resp_Rate * BK_200) - (100000 * variable_cost)),
      BK_250_Profit=dollar((100000 * Pred_Resp_Rate * BK_250) - (100000 * variable_cost)),
   ) %>% select(APR, Type, Fee, Resp_Rate, Pred_Resp_Rate, BK_150, BK_200, BK_250, BK_150_Profit, BK_20
solicitation.profit2 %>% select(APR, Type, Fee, Pred_Resp_Rate, BK_150_Profit, BK_200_Profit, BK_250_Pr
   APR.
            Type Fee Pred_Resp_Rate BK_150_Profit BK_200_Profit BK_250_Profit
1 14.9
           Fixed 20
                        0.022966618
                                         $140,623
                                                         $94,690
                                                                    $25,789.84
2 14.9 Variable 20
                        0.015915294
                                          $98,012
                                                         $66,182
                                                                    $18,435.76
3 14.9
           Fixed
                        0.049020000
                                         $204,904
                                                        $106,864
                                                                   -$40,196.00
4 14.9 Variable
                                                         $95,152
                                                                    -$8,528.00
                  0
                        0.034560000
                                         $164,272
           Fixed 20
                                                         $28,346
                                                                        $27.90
5 16.8
                        0.009439227
                                          $47,224
                                                                    -$6,226.95
6 16.8 Variable 20
                        0.006948103
                                          $28,514
                                                         $14,617
7 16.8
        Fixed
                        0.027437417
                                         $147,549
                                                         $92,675
                                                                    $10,362.32
```

8	16.8 Variable	0	0.020480000	\$117,936	\$76,976	\$15,536.00
9	19.8 Fixed	20	0.004562937	\$9,774	\$649	-\$13,040.21
10	19.8 Variable	20	0.003394746	-\$2,134	-\$8,924	-\$19,107.81
11	19.8 Fixed	0	0.020373645	\$153,736	\$112,989	\$51,868.23
12	19.8 Variable	0	0.015360000	\$118,960	\$88,240	\$42,160.00

Preparation Questions

Please see accompanying pdf