Exercise 1

Average and dispersion in product characteristics.

```
> print(dispersion)
                        PBB Stk
                                                          PHse Stk
      PPk Stk
                                         PF1 Stk
                                                                           PGen_Stk
                                                                                              PImp Stk
                                                                                                                 PSS Tub
                                                                                                                                   PPk Tub
0.0226554865 0.0144797566 0.0018399974 0.0141208621 0.0012366513 0.0131437214 0.0037468593 0.0008836431
      PF1 Tub
                      PHse Tub
0.0001975293 0.0052497277
 average=apply(as.matrix(choiceprice[,3:12]),2,mean)
> print(average)
PPK_Stk PBB_Stk PFl_Stk PHSe_Stk PGen_Stk PImp_Stk PSS_Tub PPK_Tub PFl_Tub PHSe_Tub 0.5184362 0.5432103 1.0150201 0.4371477 0.3452819 0.7807785 0.8250895 1.0774094 1.1893758 0.5686734 #Market share and market share by choicentic characteristics
```

Market share, and market share by product characteristics.

```
> share
    pk_stk    bb_stk    fl_stk    hse_stk    gen_stk    imp_stk    ss_tub    pk_tub
[1,] 0.3164004 0.1230866 0.09887261 0.09316123 0.04474122 0.02247123 0.09984262 0.08753436
    fl_tub    hse_tub
[1,] 0.1075665 0.006323178
```

By type

Illustrate the mapping between observed attributes and choices.

```
> merge(choiceprice, demos, by = "hhid", all.x = TRUE)
      hhid choice PPk_Stk PBB_Stk PFl_Stk PHse_Stk PGen_Stk PImp_Stk PSS_Tub PPk_Tub PFl_Tub PHse_Tub sales
   2100016
                                                                                                        0.33
                      0.66
                               0.67
                                        1.09
                                                 0.57
                                                           0.36
                                                                     0.93
                                                                              0.85
                                                                                      1.09
                                                                                               1.19
                                                                                                               0.66
   2100016
                      0.63
                                                                     1.03
                                                                              0.85
   2100016
                      0.29
                               0.50
                                        0.99
                                                 0.57
                                                           0.36
                                                                     0.69
                                                                              0.79
                                                                                      1.09
                                                                                               1.19
                                                                                                         0.59
                                                                                                               0.29
   2100016
                                                                     0.75
                                                                              0.85
                      0.62
                                        0.99
                                                 0.57
                                                                                      1.09
                                                                                               1.19
                                                                                                         0.59
                                                                                                               0.62
                               0.61
                                                           0.36
   2100016
                      0.50
                               0.58
                                        0.99
                                                  0.45
                                                           0.33
                                                                     0.72
                                                                              0.85
                                                                                       1.07
                                                                                               1.19
                                                                                                               0.50
   2100016
                      0.58
                                        0.99
                                                 0.45
                                                                                      1.07
                                                                                               1.19
                                                                                                               0.45
                               0.45
                                                           0.33
                                                                     0.72
                                                                              0.85
                                                                                                         0.59
   2100016
                               0.51
                                        0.99
  2100024
                 1
                      0.66
                               0.45
                                        1.08
                                                 0.57
                                                           0.36
                                                                     0.93
                                                                              0.85
                                                                                      1.09
                                                                                               1.19
                                                                                                         0.33
   2100024
                      0.66
                               0.59
                                        1.08
                                                                     0.93
                                                                                       1.09
10 2100024
                      0.66
                               0.67
                                        1.09
                                                 0.57
                                                           0.36
                                                                     0.93
                                                                              0.85
                                                                                      1.09
                                                                                               1.19
                                                                                                         0.33
                                                                                                               0.66
11 2100024
                      0.63
                               0.59
                                        1.08
                                                                              0.85
                                                                                       1.09
                                                                                                        0.59
12 2100024
                 8
                      0.63
                               0.59
                                        0.99
                                                 0.57
                                                           0.36
                                                                     0.88
                                                                              0.85
                                                                                      1.09
                                                                                               1.19
13 2100024
                                        0.99
                                                  0.49
                      0.62
                                                           0.33
                                                                                       1.09
                                                                                               1.19
                               0.61
                                                                              0.85
14 2100024
15 2100024
                      0.58
                               0.45
                                        0.99
                                                 0.45
                                                           0.33
                                                                     0.72
                                                                              0.65
                                                                                      1.07
                                                                                               1.19
                                                                                                         0.59
                                                                                                               0.99
                      0.58
                               0.58
                                        0.99
                                                  0.29
                                                                                       1.07
                                                                                               1.19
                                                                                                         0.59
                                                                                                               0.58
                                                           0.34
                                                                     0.72
                                                                              0.85
  2100024
                                        0.99
                                                           0.33
                                                                                       1.07
                                                                                               1.19
                                        0.99
                                                                     0.69
                                                                                      1.09
17 2100024
                      0.39
                               0.58
                                                 0.29
                                                           0.33
                                                                              0.79
                                                                                               1.19
                                                                                                         0.56
                                                                                                               0.39
18 2100024
                               0.58
                                                                                       1.09
                                                                     0.69
19 2100495
                      0.25
                               0.61
                                        0.99
                                                 0.45
                                                           0.33
                                                                     0.75
                                                                              0.85
                                                                                      1.09
                                                                                               1.19
                                                                                                         0.59
                                                                                                               0.25
20 2100495
                                                           0.34
                      0.58
                               0.61
                                        0.99
                                                                              0.85
                                                                                       1.07
                                                                                               1.19
                                                                                                         0.59
                                                                                                               0.58
21 2100495
                                        0.99
```

Exercise 2

We are interested in the effect of price on demand. Propose a model specification.

To consider the effect of price, we can use Conditional logit model

Interpret the coeffcient on price.

```
[1] -6.6566340 -0.9543259 1.2969965 -1.7173298 -2.9040264 -1.5153021 0.2517927 1.4648942 2.3575437 [10] -3.8966267
```

- -6.65 means that if price increases, the demand of choosing alternatives will decrease.
- $-0.95 \sim -3.89$ are intercepts.

Exercise 3

We are interested in the e ect of family income on demand

family income varies among individuals are not the alternatives, use Multinomial logit model

Interpret the coe cient on family

```
[1] -0.003156338 0.014507166 0.003980338 -0.001328126 0.030527384 -0.007002723 0.022807121 0.017661767 [9] 0.010698254 -0.843545649 -2.397656003 -1.199428121 -1.688616844 -4.137055731 -1.529169108 -2.846055103 [17] -2.573291074 -4.279712751
```

For $-0.003 \sim 0.0107$ are beta, for example, -0.003 means that if income increases, the demand of choosing the first choice will decrease.

 $-0.84 \sim -4.279$ are intercepts.

Exercise 4

Model 1

^	V1 [‡]	c2 [‡]	c3 [‡]	c4 [‡]	c5 ‡	c6 [‡]	c7 [‡]	c8 [‡]	c9 [‡]	c10 ‡
me_1	-0.005445123	0.0257883274	-0.002369137	0.0093607645	0.0012362530	-0.0047487142	-0.0097322916	-2.660125e-03	-0.0099320814	-0.0014978724
me_2	0.009441594	-0.0245109415	-0.000733189	0.0109781919	0.0033886871	0.0007139751	0.0015043232	8.066422e-04	-0.0022713999	0.0006821166
me_3	-0.003052725	-0.0039661740	0.003974207	-0.0033627107	-0.0016207354	0.0009496521	0.0024570433	9.808530e-04	0.0032920827	0.0003485076
me_4	0.005430990	-0.0019480329	0.001021167	-0.0084423676	0.0072759930	0.0006231949	-0.0041844119	-1.749300e-03	0.0025010528	-0.0005282851
me_5	-0.005001979	-0.0044114959	0.005240391	-0.0045305572	-0.0018993181	0.0010527309	0.0048465905	2.543472e-04	0.0041854229	0.0002638679
me_6	-0.000491919	-0.0013467361	0.001110464	-0.0007926256	-0.0003632848	0.0003699668	0.0003805465	1.869490e-04	0.0007791040	0.0001675357
me_7	0.008613176	0.0069350729	-0.014000196	0.0047601420	-0.0001714568	0.0012668334	-0.0009180520	-1.361555e-03	-0.0054080124	0.0002840482
me_8	-0.004738241	0.0031729439	0.002063896	-0.0035410825	-0.0040360370	-0.0002702457	0.0020691270	2.297484e-03	0.0027509550	0.0002312007
me_9	-0.003666668	-0.0008142912	0.003147927	-0.0037813006	-0.0030375824	0.0001950433	0.0028837401	1.183046e-03	0.0037776213	0.0001124649
me_10	-0.001086302	0.0010876174	0.000545847	-0.0006397423	-0.0007768236	-0.0001526322	0.0006985302	6.146215e-05	0.0003270326	-0.0000649895

Element in table

For example, in $me_1 - v1$:

-0.00544 means that one unit increase in the price of product 1 will decrease 0.00544 in the probability to buy the product 1

Model2

```
[,1]
[1,] -0.0010504137
[2,] -0.0009016311
[3,] 0.0006266867
[4,] 0.0001660472
[5,] -0.0002794477
[6,] 0.0004431356
[7,] -0.0006821378
[8,] 0.0008861440
[9,] 0.0007338590
[10,] 0.0000577577
```

For example, -0.0010504 means that one unit change increase in family income will decrease 0.0010504 in the probability of choosing first choice compared with other 9 choices

Exercise 5

Beta_f

```
> beta_f
[1] -6.659699884 -0.004333800 0.014258958 0.004025557 -0.001264787 0.029710007 -0.009327126 0.021914644
[9] 0.016902350 0.008674428 -0.838705945 0.891148169 -1.826370582 -2.871247434 -2.454001559 0.498968897
[17] 0.805453868 1.866785193 -4.140083624
```

Beta r

Remove choice 1

```
> beta_r
[1] 2.059202266 0.016721323 0.006614508 0.001215756 0.032891379 -0.003689518 0.025468878 0.020231747
[9] 0.012479752 -1.470467400 -1.261403167 -0.565696438 -2.812995853 -1.139907155 -2.511165831 -2.759864325
[17] -4.705006196
```

MTT

MTT is 7821.209

MTT > the critical value of chi_square, reject the null hypothesis that the two results are the same.