assign1-sta-1039580

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Q₁a

The first 5 phenotypes in study1 and study2 are shown in the output.

```
#Read data
setwd("C:/Users/iefad/Desktop/course2021/bioinfosta/assignment/data-assignmen
t1")
gt1 <- read.csv('genotypes1.csv')</pre>
gt2 <- read.csv('genotypes2.csv')</pre>
gt3 <- read.csv('genotypes3.csv')</pre>
pt1 <- read.csv('phenotype1.csv')</pre>
pt2 <- read.csv('phenotype2.csv')</pre>
#check the study sizes. As shown in the output below, the study sizes are con
sistent with what's reported.
dim(gt1) # sample size for genotypes1
## [1] 500 201
dim(gt2) # sample size for genotypes2
## [1] 1500 201
dim(gt3) # sample size for genotypes3
## [1] 100 201
dim(pt1) # sample size for phenotypes1
## [1] 500 2
dim(pt2) # sample size for phenotypes2
## [1] 1500
               2
#Show the first 5 phenotypes in study1 and study2.
pt1[1:5,2] # in study 1
## [1] 26.7 23.5 22.8 19.3 27.4
pt2[1:5,2] # in study 2
## [1] TRUE TRUE TRUE TRUE FALSE
```

Q₁b

```
recordpvalue <- data.frame(genotype = colnames(gt1)[2:201], pvalue = rep(0, 2</pre>
00))
for (i in 1:200) {
  model <- lm(pt1$BMI ~ gt1[,i+1])</pre>
  recordpvalue[i,2] = anova(model)[1,5]
}
recordpvalue # record p-value
##
       genotype
                       pvalue
## 1
         snp001 2.788045e-01
## 2
         snp002 4.213277e-02
## 3
         snp003 1.106544e-02
## 4
         snp004 4.598057e-01
## 5
         snp005 4.773127e-01
## 6
         snp006 6.269859e-01
## 7
         snp007 1.180413e-01
## 8
         snp008 5.823757e-02
## 9
         snp009 9.247002e-01
## 10
         snp010 2.928088e-01
## 11
         snp011 3.567580e-01
## 12
         snp012 6.542079e-02
## 13
         snp013 6.278523e-02
## 14
         snp014 6.534726e-02
## 15
         snp015 1.663554e-01
## 16
         snp016 9.426174e-02
## 17
         snp017 6.009006e-01
## 18
         snp018 5.801509e-01
## 19
         snp019 3.733518e-01
## 20
         snp020 7.043405e-04
## 21
         snp021 5.358903e-01
## 22
         snp022 9.937614e-02
## 23
         snp023 1.358734e-01
## 24
         snp024 8.037127e-01
## 25
         snp025 6.565804e-01
## 26
         snp026 3.640620e-01
## 27
         snp027 1.415343e-01
## 28
         snp028 2.404250e-01
## 29
         snp029 5.957152e-01
## 30
         snp030 2.979699e-01
## 31
         snp031 4.335758e-01
## 32
         snp032 7.584683e-03
## 33
         snp033 1.447568e-02
         snp034 7.685264e-01
## 34
## 35
         snp035 1.509939e-01
## 36
         snp036 1.308951e-01
## 37
         snp037 9.744083e-01
## 38
         snp038 1.403803e-04
## 39
         snp039 5.448880e-01
## 40
         snp040 6.025946e-01
```

```
## 41
         snp041 3.586497e-04
## 42
         snp042 8.194404e-02
## 43
         snp043 7.576538e-01
## 44
         snp044 6.649132e-03
## 45
         snp045 7.188082e-01
## 46
         snp046 1.912356e-01
## 47
         snp047 1.332697e-03
## 48
         snp048 5.376787e-01
## 49
         snp049 7.584683e-03
## 50
         snp050 6.045586e-01
## 51
         snp051 5.682905e-05
## 52
         snp052 2.280280e-07
## 53
         snp053 9.539833e-06
## 54
         snp054 5.173863e-04
## 55
         snp055 3.443949e-01
## 56
         snp056 9.714320e-05
## 57
         snp057 3.016446e-01
## 58
         snp058 1.234194e-01
## 59
         snp059 1.572343e-02
## 60
         snp060 4.493258e-02
## 61
         snp061 4.763588e-01
## 62
         snp062 9.275089e-01
## 63
         snp063 2.776576e-01
## 64
         snp064 2.432992e-02
## 65
         snp065 7.536183e-02
## 66
         snp066 9.828575e-02
## 67
         snp067 2.002265e-02
## 68
         snp068 2.655050e-01
## 69
         snp069 7.664848e-01
## 70
         snp070 8.204722e-02
## 71
         snp071 1.745189e-01
## 72
         snp072 7.124668e-03
## 73
         snp073 2.270115e-01
## 74
         snp074 2.923243e-01
## 75
         snp075 4.030894e-01
## 76
         snp076 8.539780e-03
## 77
         snp077 9.883839e-02
## 78
         snp078 9.651996e-03
## 79
         snp079 1.150581e-02
## 80
         snp080 7.428456e-02
## 81
         snp081 5.460508e-01
## 82
         snp082 6.463677e-01
## 83
         snp083 5.671337e-01
## 84
         snp084 3.178181e-01
## 85
         snp085 2.068897e-02
## 86
         snp086 6.739211e-02
## 87
         snp087 4.497546e-02
## 88
         snp088 3.433718e-01
## 89
         snp089 7.141285e-03
## 90
         snp090 7.349284e-01
```

```
## 91
         snp091 3.103389e-01
## 92
         snp092 3.789345e-01
## 93
         snp093 1.064869e-01
## 94
         snp094 3.256670e-01
## 95
         snp095 1.155049e-02
## 96
         snp096 7.824368e-01
## 97
         snp097 1.959854e-01
## 98
         snp098 2.469217e-03
## 99
         snp099 4.673300e-01
## 100
         snp100 2.940438e-01
## 101
         snp101 4.141442e-02
## 102
         snp102 1.077333e-02
## 103
         snp103 1.067146e-03
## 104
         snp104 5.380541e-01
## 105
         snp105 3.280120e-02
## 106
         snp106 8.048262e-03
## 107
         snp107 4.088464e-03
## 108
         snp108 6.298973e-01
## 109
         snp109 7.401832e-01
## 110
         snp110 5.864720e-01
## 111
         snp111 7.884391e-01
## 112
         snp112 4.293351e-01
## 113
         snp113 2.933660e-01
## 114
         snp114 4.493641e-01
## 115
         snp115 1.748858e-02
## 116
         snp116 7.759868e-02
## 117
         snp117 5.656057e-01
## 118
         snp118 5.424069e-01
## 119
         snp119 9.489495e-01
## 120
         snp120 2.194668e-01
## 121
         snp121 2.656927e-02
## 122
         snp122 1.897578e-01
## 123
         snp123 2.615075e-01
## 124
         snp124 3.306293e-01
## 125
         snp125 1.117821e-01
## 126
         snp126 6.405270e-01
## 127
         snp127 3.880675e-01
## 128
         snp128 7.469934e-01
## 129
         snp129 2.056248e-01
## 130
         snp130 1.174946e-01
## 131
         snp131 9.904980e-01
## 132
         snp132 7.994084e-01
## 133
         snp133 5.923786e-02
## 134
         snp134 4.849095e-01
## 135
         snp135 9.297724e-01
## 136
         snp136 3.202203e-01
## 137
         snp137 1.129403e-02
## 138
         snp138 9.275942e-01
## 139
         snp139 6.976210e-01
## 140
         snp140 6.773687e-03
```

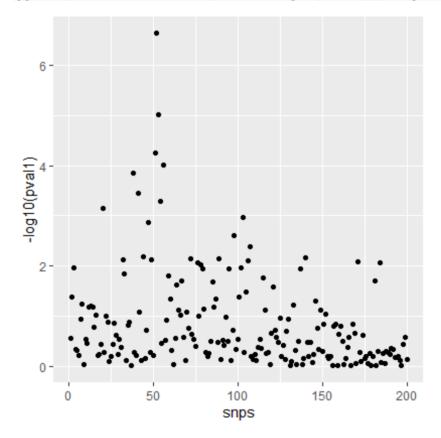
```
## 141
         snp141 3.329425e-01
## 142
         snp142 6.521029e-01
## 143
         snp143 3.311811e-01
## 144
         snp144 8.389249e-01
## 145
         snp145 5.848875e-01
## 146
         snp146 5.119488e-02
## 147
         snp147 1.787775e-01
## 148
         snp148 4.705875e-01
## 149
         snp149 7.472226e-02
## 150
         snp150 5.142107e-01
## 151
         snp151 1.433640e-01
## 152
         snp152 9.357016e-02
## 153
         snp153 6.490185e-01
## 154
         snp154 7.048606e-01
## 155
         snp155 6.486447e-01
## 156
         snp156 9.967293e-01
## 157
         snp157 1.633182e-01
## 158
         snp158 1.487430e-01
## 159
         snp159 9.660547e-01
## 160
         snp160 2.277225e-01
## 161
         snp161 1.613559e-01
## 162
         snp162 3.283292e-01
## 163
         snp163 9.351326e-01
## 164
         snp164 7.165016e-01
## 165
         snp165 4.255025e-01
## 166
         snp166 2.610420e-01
## 167
         snp167 9.964303e-01
## 168
         snp168 1.491455e-01
## 169
         snp169 2.194073e-01
## 170
         snp170 9.059113e-01
## 171
         snp171 8.126962e-03
## 172
         snp172 5.222187e-01
## 173
         snp173 8.019461e-01
## 174
         snp174 2.404460e-01
## 175
         snp175 7.108361e-01
## 176
         snp176 6.514491e-01
## 177
         snp177 8.921099e-01
## 178
         snp178 5.559946e-01
## 179
         snp179 9.874595e-01
## 180
         snp180 6.370010e-01
## 181
         snp181 2.000435e-02
## 182
         snp182 9.795191e-01
## 183
         snp183 5.187020e-01
## 184
         snp184 8.827462e-03
## 185
         snp185 8.606555e-01
## 186
         snp186 5.593104e-01
## 187
         snp187 8.837700e-01
## 188
         snp188 4.991781e-01
## 189
         snp189 5.381265e-01
## 190
         snp190 5.873973e-01
```

```
## 191
         snp191 4.364517e-01
## 192
         snp192 4.659470e-01
## 193
         snp193 6.878316e-01
## 194
         snp194 6.756790e-01
## 195
         snp195 6.310356e-01
## 196
         snp196 7.883439e-01
## 197
         snp197 9.943127e-01
## 198
         snp198 3.735410e-01
## 199
         snp199 2.639042e-01
## 200
         snp200 7.562790e-01
```

Q₁c

From the plot we can conclude that most p-values are larger than 0.01, which indicates a less significant association between the corresponding SNPs and BMI. The peak y value is higher than 6, which stands for less than e-6 p-value and the strongest association among these SNPs.

```
library("ggplot2")
snps <- 1:200
pval1 <- recordpvalue$pvalue
ggplot(recordpvalue, aes(snps, -log10(pval1))) + geom_point()</pre>
```



Q₁d

22

23

snp022 1.608155e-01

snp023 3.175448e-03

As shown in output, snp052 has the smallest p-value at 2.28028e-07.

```
recordpvalue[order(recordpvalue$pvalue), ][1,]
                    pvalue
      genotype
## 52
        snp052 2.28028e-07
O2a
colnames(pt1)[2] = 'overweight'
pt1[,2] = as.logical(pt1[,2] > 25) # treat phenotypes from study1 the same as
study2
pt = rbind(pt1,pt2) #creating a single data frame for the phenotype
gt = rbind(gt1,gt2) ##creating a single data frame for the genotype
Q<sub>2</sub>b
combinepvalue <- data.frame(genotype = colnames(gt)[2:201], pvalue = rep(0, 2
00))
for (i in 1:200) {
  model <- lm(as.numeric(pt$overweight) ~ as.numeric(gt[,i+1]))</pre>
  combinepvalue[i,2] = summary(model)$coefficients[2,4]
}
combinepvalue
##
                      pvalue
       genotype
## 1
         snp001 7.347895e-01
## 2
         snp002 2.754467e-02
## 3
         snp003 7.606861e-01
## 4
         snp004 6.202933e-01
## 5
         snp005 6.447473e-02
## 6
         snp006 3.606788e-01
## 7
         snp007 1.539003e-01
## 8
         snp008 1.039244e-01
## 9
         snp009 3.465682e-01
## 10
         snp010 3.137228e-01
## 11
         snp011 5.913890e-01
## 12
         snp012 2.078579e-03
## 13
         snp013 4.423170e-01
## 14
         snp014 1.616898e-01
## 15
         snp015 4.813904e-01
## 16
         snp016 4.405304e-01
## 17
         snp017 1.845063e-01
## 18
         snp018 1.504788e-01
## 19
         snp019 7.077208e-01
## 20
         snp020 1.199570e-01
## 21
         snp021 3.729892e-01
```

```
## 24
         snp024 3.381555e-01
## 25
         snp025 1.552742e-01
## 26
         snp026 7.442203e-01
## 27
         snp027 6.283863e-03
## 28
         snp028 1.737209e-01
## 29
         snp029 3.273679e-01
## 30
         snp030 6.200770e-01
## 31
         snp031 9.924207e-01
## 32
         snp032 2.323039e-01
## 33
         snp033 2.830157e-04
## 34
         snp034 6.873381e-01
## 35
         snp035 8.799028e-01
## 36
         snp036 4.630821e-01
## 37
         snp037 9.218493e-01
## 38
         snp038 2.394928e-07
## 39
         snp039 7.933904e-01
## 40
         snp040 3.574962e-01
## 41
         snp041 8.027248e-07
## 42
         snp042 5.996413e-01
## 43
         snp043 9.694138e-01
## 44
         snp044 1.513415e-04
## 45
         snp045 3.001582e-01
## 46
         snp046 2.954667e-04
## 47
         snp047 8.563084e-04
## 48
         snp048 4.215389e-01
## 49
         snp049 4.629563e-01
## 50
         snp050 8.343850e-01
## 51
         snp051 1.090388e-13
## 52
         snp052 2.853124e-14
## 53
         snp053 5.688590e-11
## 54
         snp054 7.754202e-10
## 55
         snp055 5.104635e-03
## 56
         snp056 1.073751e-10
## 57
         snp057 1.996013e-01
## 58
         snp058 7.938272e-01
## 59
         snp059 4.923808e-03
## 60
         snp060 8.173204e-03
## 61
         snp061 6.127101e-01
## 62
         snp062 9.823904e-01
## 63
         snp063 1.379992e-03
## 64
         snp064 1.357014e-02
## 65
         snp065 8.083341e-01
## 66
         snp066 9.884708e-01
## 67
         snp067 1.309211e-01
## 68
         snp068 1.035369e-01
## 69
         snp069 1.239875e-02
## 70
         snp070 8.021752e-01
## 71
         snp071 4.359181e-01
## 72
         snp072 2.401995e-02
## 73
         snp073 2.131951e-01
```

```
## 74
         snp074 6.901060e-02
## 75
         snp075 3.732020e-02
## 76
         snp076 9.018782e-03
## 77
         snp077 3.497538e-02
## 78
         snp078 1.248096e-02
## 79
         snp079 1.925664e-04
## 80
         snp080 4.062044e-02
## 81
         snp081 5.903523e-01
## 82
         snp082 7.499138e-01
## 83
         snp083 3.689904e-01
## 84
         snp084 7.171029e-02
## 85
         snp085 1.328008e-01
## 86
         snp086 7.349165e-05
## 87
         snp087 8.088520e-02
## 88
         snp088 3.147495e-01
## 89
         snp089 7.030465e-05
## 90
         snp090 7.889398e-01
## 91
         snp091 1.619470e-01
## 92
         snp092 4.602575e-01
## 93
         snp093 1.779591e-01
## 94
         snp094 6.758913e-01
## 95
         snp095 3.509545e-02
## 96
         snp096 4.391856e-01
## 97
         snp097 4.529272e-02
## 98
         snp098 6.269115e-05
## 99
         snp099 7.065321e-01
## 100
         snp100 5.788417e-01
## 101
         snp101 4.175910e-04
## 102
         snp102 4.991869e-04
## 103
         snp103 1.053401e-04
## 104
         snp104 8.646844e-01
## 105
         snp105 1.986769e-10
## 106
         snp106 5.010754e-10
## 107
         snp107 7.394690e-11
## 108
         snp108 4.495587e-01
## 109
         snp109 6.431232e-01
## 110
         snp110 3.228068e-02
## 111
         snp111 6.020478e-01
## 112
         snp112 5.954196e-01
## 113
         snp113 9.355466e-01
## 114
         snp114 4.851323e-01
## 115
         snp115 2.397480e-02
## 116
         snp116 1.382865e-01
## 117
         snp117 7.083962e-01
## 118
         snp118 7.101746e-01
## 119
         snp119 2.717641e-01
## 120
         snp120 1.256549e-01
## 121
         snp121 1.388144e-02
## 122
         snp122 1.794045e-01
## 123
         snp123 8.610190e-01
```

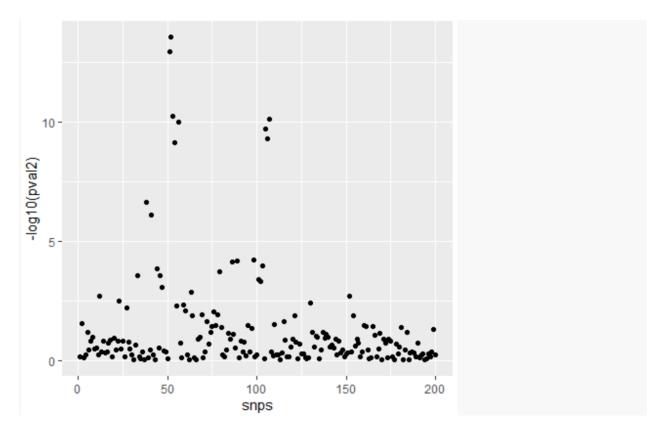
```
## 124
         snp124 2.071795e-01
## 125
         snp125 5.346964e-01
## 126
         snp126 5.247947e-01
## 127
         snp127 7.852816e-01
## 128
         snp128 8.616783e-01
## 129
         snp129 8.205817e-01
## 130
         snp130 4.080885e-03
## 131
         snp131 6.930556e-02
## 132
         snp132 2.771219e-01
## 133
         snp133 1.024566e-01
## 134
         snp134 1.127692e-01
## 135
         snp135 8.977938e-01
## 136
         snp136 3.855438e-01
## 137
         snp137 6.498843e-02
## 138
         snp138 1.176825e-01
## 139
         snp139 8.496159e-02
## 140
         snp140 1.099622e-01
## 141
         snp141 2.678742e-01
## 142
         snp142 2.237624e-01
## 143
         snp143 3.058052e-01
## 144
         snp144 1.361713e-01
## 145
         snp145 6.114179e-01
## 146
         snp146 1.601984e-01
## 147
         snp147 4.910927e-01
## 148
         snp148 3.647457e-01
## 149
         snp149 7.311475e-01
## 150
         snp150 5.327648e-01
## 151
         snp151 4.865474e-01
## 152
         snp152 2.003915e-03
## 153
         snp153 4.387514e-01
## 154
         snp154 1.369534e-02
## 155
         snp155 2.422154e-01
## 156
         snp156 1.296499e-01
## 157
         snp157 1.827772e-01
## 158
         snp158 6.965121e-01
## 159
         snp159 4.464146e-01
## 160
         snp160 3.487072e-02
## 161
         snp161 3.844111e-02
## 162
         snp162 3.543502e-01
## 163
         snp163 9.039203e-01
## 164
         snp164 7.620743e-01
## 165
         snp165 3.973554e-02
## 166
         snp166 9.036475e-02
## 167
         snp167 7.380562e-01
## 168
         snp168 3.257838e-01
## 169
         snp169 7.338117e-02
## 170
         snp170 9.812604e-01
## 171
         snp171 1.303396e-01
## 172
         snp172 1.935454e-01
## 173
         snp173 7.861820e-01
```

```
## 174
         snp174 1.309960e-01
## 175
         snp175 1.598008e-01
## 176
         snp176 7.310219e-01
## 177
         snp177 9.764182e-01
## 178
         snp178 2.161579e-01
## 179
         snp179 5.274178e-01
## 180
         snp180 2.807450e-01
## 181
         snp181 4.359697e-02
## 182
         snp182 9.086116e-01
## 183
         snp183 3.615387e-01
## 184
         snp184 6.723081e-02
## 185
         snp185 9.737579e-01
## 186
         snp186 4.785079e-01
## 187
         snp187 4.483336e-01
## 188
         snp188 4.816559e-01
## 189
         snp189 7.138295e-01
## 190
         snp190 1.957596e-01
## 191
         snp191 8.033078e-01
## 192
         snp192 6.672748e-01
## 193
         snp193 5.409684e-01
## 194
         snp194 9.344393e-01
## 195
         snp195 8.568820e-01
## 196
         snp196 5.433710e-01
## 197
         snp197 7.324146e-01
## 198
         snp198 4.587318e-01
## 199
         snp199 5.304996e-02
## 200
         snp200 6.074201e-01
```

Q₂c

From the plot we can conclude that most p-values are still larger than 0.01, which means weaker association with the overweight state. However, compared with the plot before combining data from study1 and study2, peak y values are higher and less y values are below 2, which indicates an overall stronger association with the overweight state(trait) here in this plot.

```
pval2 <- combinepvalue$pvalue
ggplot(combinepvalue, aes(x=snps, y=-log10(pval2))) + geom_point()</pre>
```



Q2d

As shown in output, snp052 has the smallest pvalue at 2.853124e-14

```
sortedpvalue <- combinepvalue[order(combinepvalue$pvalue), ]
sortedpvalue[1,]

## genotype pvalue
## 52 snp052 2.853124e-14</pre>
```

Q2e(i)

The number is 16.

```
m = length(combinepvalue$pvalue)
sum(combinepvalue$pvalue < 0.05/m)
## [1] 16</pre>
```

Q2e(ii)

The number is 29.

```
max(which(sort(combinepvalue$pvalue) <= 0.05*seq(1, m)/m))</pre>
```

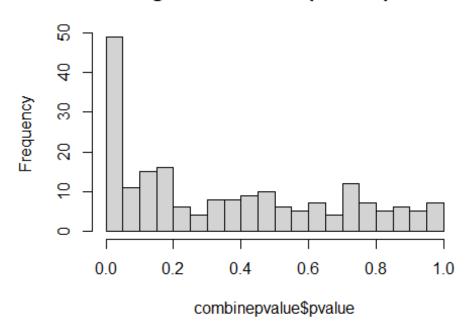
```
## [1] 29
```

Q2e(iii)

The number is 21, the resulting FDR estimate is 0.007407407 as shown in output.

```
hist(combinepvalue$pvalue,n=20)
```

Histogram of combinepvalue\$pvalue



```
nsig = sum(combinepvalue$pvalue < 0.001)
nullfrac = mean(combinepvalue$pvalue>0.1)/0.9
falsep = nullfrac*m*0.001
FDR = falsep/nsig
print(list(nsig,FDR))
## [[1]]
## [1] 21
##
## [[2]]
## [1] 0.007407407
```

Q2f

I would report the number of significantly associated SNPs as 29 by using BH method. BH and Storey methods are better than Bonferroni since Bonferroni is too strict and can miss valuable true discovery. If choosing between BH and Storey, here I think the FDR of Storey method, 0.007407407, might be too strict. So I will report the 29 SNPs as significantly

associated and the possibility of error (here I use False Discovery Rate) would be less than 0.05.

Q3a

The SNPs with 8 smallest p-values and their p-values are shown as output.

```
combinepvalue[order(combinepvalue$pvalue),][1:8, ]
##
      genotype
                     pvalue
        snp052 2.853124e-14
## 52
## 51
        snp051 1.090388e-13
## 53
        snp053 5.688590e-11
## 107
        snp107 7.394690e-11
## 56
        snp056 1.073751e-10
        snp105 1.986769e-10
## 105
## 106
        snp106 5.010754e-10
## 54
        snp054 7.754202e-10
```

Q3b

The correlation matrix is shown in output.

The linkage disequilibrium between some pairs of SNPs are relatively high with correlation higher than 0.5.

```
small8 <- combinepvalue[order(combinepvalue$pvalue),][1:8, ]</pre>
cormatrix <- matrix(ncol = 8, nrow = 8)</pre>
colnames(cormatrix) <- small8$genotype</pre>
rownames(cormatrix) <- small8$genotype</pre>
index <- as.numeric(row.names(small8))</pre>
for (i in 1:8) {
  for (j in 1:8) {
    cormatrix[i,j] <-</pre>
cor(as.numeric(gt[,index[i]+1]),as.numeric(gt[,index[j]+1]))
  }
}
cormatrix
                       snp051
             snp052
                                 snp053
                                           snp107
                                                     snp056
                                                               snp105
## snp052 1.0000000 0.8547424 0.8965812 0.1462807 0.7937844 0.1312771 0.1634972
## snp051 0.8547424 1.0000000 0.7808815 0.1395784 0.9012220 0.1253443 0.1528309
## snp053 0.8965812 0.7808815 1.0000000 0.1334606 0.7382154 0.1253515 0.1503977
## snp107 0.1462807 0.1395784 0.1334606 1.0000000 0.1600531 0.9400909 0.9379026
## snp056 0.7937844 0.9012220 0.7382154 0.1600531 1.0000000 0.1419182 0.1704282
## snp105 0.1312771 0.1253443 0.1253515 0.9400909 0.1419182 1.0000000 0.9046226
## snp106 0.1634972 0.1528309 0.1503977 0.9379026 0.1704282 0.9046226 1.0000000
## snp054 0.7777999 0.8943596 0.8066411 0.1300315 0.8526201 0.1188114 0.1458209
```

```
## snp052 0.7777999
## snp051 0.8943596
## snp053 0.8066411
## snp107 0.1300315
## snp056 0.8526201
## snp105 0.1188114
## snp106 0.1458209
## snp054 1.0000000

sum(cormatrix>0.5) #check the correlation > 0.5 which might be helpful to con clude
## [1] 34
```

Q₃c

Tag SNPs are shown in the output.

```
i <- 1
j <- 1
while (i <= 2){
  while (j <= nrow(cormatrix)){</pre>
    if (cormatrix[i,j] > 0.5 & (i != j)){
      cormatrix <- cormatrix[-j,-j]</pre>
    }
    else {
      j <- j+1
  }
  j <- 1
  i < -i+1
cormatrix
##
              snp052
                        snp107
## snp052 1.0000000 0.1462807
## snp107 0.1462807 1.0000000
```

Q4a

The parameter estimates and standard errors are shown in the output.

```
overweightstate <- pt$overweight
has_052 <- as.numeric(gt[,53])
has_107 <- as.numeric(gt[,108])

fit1 = glm(overweightstate ~ has_052 + has_107,family="binomial")
coef(summary(fit1))[2:3,1:2]</pre>
```

```
## Estimate Std. Error
## has_052 0.5029238 0.07573746
## has_107 0.4025903 0.07375765
```

Q4b

The OR for SNP052 and SNP107 are 1.653549 and 1.495694 respectively.

Odds ratio = Odds(x1+1)/Odds(x1) = $\exp(\beta 0 + \beta 1(x1+1) + \beta 2x2)/\exp(\beta 0 + \beta 1x1 + \beta 2x2)$ = $\exp(\beta 1)$. Here ORs for SNP052 and SNP107 are greater than 1, which means the associations between overwight state and SNP052, and between overwight state and SNP107. And since OR for SNP052 is higher than OR for SNP107, association between overweight state and SNP052 is stronger than that for SNP107.

```
beta052 <- as.numeric(coef(fit1)[2])
beta107 <- as.numeric(coef(fit1)[3])

OR_052 <- exp(beta052)
OR_107 <- exp(beta107)

OR_052
## [1] 1.653549

OR_107
## [1] 1.495694</pre>
```

Q4c

C.I for SNP052 is (1.425441, 1.918160). C.I for SNP052 is (1.294375, 1.728325).

```
#Calculate SE
se_052 <- coef(summary(fit1))[2,2]
se_107 <- coef(summary(fit1))[3,2]
se_052

## [1] 0.07573746

se_107

## [1] 0.07375765

#Calculate C.I.
C.I_052 <- exp(beta052 + c(-1,1) * qnorm(0.975) * se_052)
C.I_107 <- exp(beta107 + c(-1,1) * qnorm(0.975) * se_107)

C.I_052
```

```
## [1] 1.425441 1.918160
C.I_107
## [1] 1.294375 1.728325
```

Q5a

The risk is as shown in the output.

```
new <- data.frame(has_052 = as.numeric(gt3[,53]), has_107 = as.numeric(gt3[,1</pre>
081))
prerisk <- predict.glm(fit1, new, type = "response")</pre>
prerisk
##
                                                                                  8
                     2
                                          4
                                                    5
           1
                               3
                                                              6
## 0.5803120 0.2526774 0.2526774 0.2526774 0.2526774 0.4306492 0.2526774 0.3585968
                    10
                              11
                                        12
                                                   13
                                                             14
                                                                       15
## 0.3585968 0.2526774 0.4554015 0.3358612 0.2526774 0.2526774 0.2526774 0.2526774
          17
                    18
                              19
                                        20
                                                   21
                                                             22
                                                                       23
## 0.2526774 0.3358612 0.4306492 0.2526774 0.3358612 0.4803761 0.2526774 0.5556981
          25
                    26
                              27
                                        28
                                                   29
                                                             30
                                                                       31
## 0.4554015 0.4306492 0.3585968 0.3358612 0.2526774 0.5556981 0.2526774 0.2526774
                    34
                              35
                                                   37
                                                             38
##
                                        36
## 0.4554015 0.2526774 0.3585968 0.2526774 0.4306492 0.2526774 0.4554015 0.3358612
                    42
                              43
                                        44
                                                   45
                                                             46
                                                                       47
## 0.5556981 0.2526774 0.2526774 0.2526774 0.2526774 0.3358612 0.3358612 0.2526774
          49
                    50
                              51
                                        52
                                                   53
                                                             54
                                                                       55
                                                                                  56
## 0.2526774 0.2526774 0.3585968 0.4554015 0.4803761 0.3585968 0.2526774 0.3585968
          57
                    58
                              59
##
                                        60
                                                   61
                                                             62
                                                                       63
## 0.2526774 0.3358612 0.3358612 0.2526774 0.3585968 0.4554015 0.2526774 0.2526774
                                        68
                    66
                              67
                                                   69
                                                             70
                                                                       71
          65
## 0.3585968 0.3358612 0.4306492 0.3358612 0.3358612 0.4306492 0.2526774 0.4554015
                                                             78
                    74
                              75
                                                                       79
##
          73
                                        76
                                                   77
                                                                                  ลล
## 0.2526774 0.2526774 0.4306492 0.2526774 0.2526774 0.2526774 0.4554015 0.2526774
          81
                    82
                              83
                                        84
                                                   85
                                                             86
                                                                       87
## 0.3358612 0.4554015 0.4554015 0.3358612 0.3358612 0.2526774 0.2526774 0.4554015
          89
                              91
                                        92
                                                  93
                                                             94
                    90
                                                                       95
## 0.2526774 0.4803761 0.3358612 0.3585968 0.5556981 0.3358612 0.3585968 0.3358612
                    98
                              99
## 0.5556981 0.2526774 0.2526774 0.5556981
```

Q5b

The risk is as shown in the output.

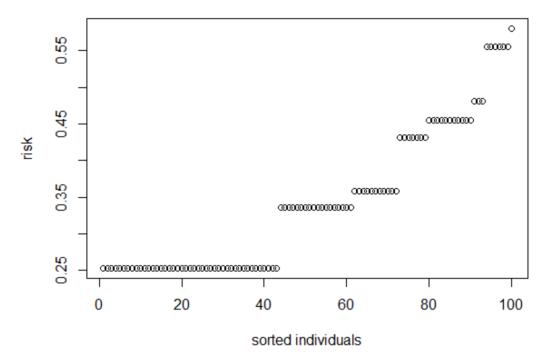
```
premodel <- data.frame(individuals = gt3$X, risk = prerisk)
premodel[order(premodel$risk), ]

## individuals risk
## 2 indiv2002 0.2526774
## 3 indiv2003 0.2526774
## 4 indiv2004 0.2526774
## 5 indiv2005 0.2526774</pre>
```

```
## 7
         indiv2007 0.2526774
## 10
         indiv2010 0.2526774
## 13
         indiv2013 0.2526774
## 14
         indiv2014 0.2526774
## 15
         indiv2015 0.2526774
## 16
         indiv2016 0.2526774
## 17
         indiv2017 0.2526774
## 20
         indiv2020 0.2526774
## 23
         indiv2023 0.2526774
## 29
         indiv2029 0.2526774
## 31
         indiv2031 0.2526774
## 32
         indiv2032 0.2526774
## 34
         indiv2034 0.2526774
## 36
         indiv2036 0.2526774
## 38
         indiv2038 0.2526774
## 42
         indiv2042 0.2526774
## 43
         indiv2043 0.2526774
## 44
         indiv2044 0.2526774
## 45
         indiv2045 0.2526774
## 48
         indiv2048 0.2526774
## 49
         indiv2049 0.2526774
## 50
         indiv2050 0.2526774
## 55
         indiv2055 0.2526774
## 57
         indiv2057 0.2526774
## 60
         indiv2060 0.2526774
## 63
         indiv2063 0.2526774
## 64
         indiv2064 0.2526774
## 71
         indiv2071 0.2526774
## 73
         indiv2073 0.2526774
## 74
         indiv2074 0.2526774
## 76
         indiv2076 0.2526774
## 77
         indiv2077 0.2526774
## 78
         indiv2078 0.2526774
## 80
         indiv2080 0.2526774
## 86
         indiv2086 0.2526774
## 87
         indiv2087 0.2526774
## 89
         indiv2089 0.2526774
## 98
         indiv2098 0.2526774
## 99
         indiv2099 0.2526774
## 12
         indiv2012 0.3358612
## 18
         indiv2018 0.3358612
## 21
         indiv2021 0.3358612
## 28
         indiv2028 0.3358612
## 40
         indiv2040 0.3358612
## 46
         indiv2046 0.3358612
## 47
         indiv2047 0.3358612
## 58
         indiv2058 0.3358612
## 59
         indiv2059 0.3358612
## 66
         indiv2066 0.3358612
## 68
         indiv2068 0.3358612
```

```
## 69
         indiv2069 0.3358612
## 81
         indiv2081 0.3358612
## 84
         indiv2084 0.3358612
## 85
         indiv2085 0.3358612
## 91
         indiv2091 0.3358612
## 94
         indiv2094 0.3358612
## 96
         indiv2096 0.3358612
## 8
         indiv2008 0.3585968
## 9
         indiv2009 0.3585968
## 27
         indiv2027 0.3585968
## 35
         indiv2035 0.3585968
## 51
         indiv2051 0.3585968
## 54
         indiv2054 0.3585968
## 56
         indiv2056 0.3585968
## 61
         indiv2061 0.3585968
## 65
         indiv2065 0.3585968
## 92
         indiv2092 0.3585968
## 95
         indiv2095 0.3585968
## 6
         indiv2006 0.4306492
## 19
         indiv2019 0.4306492
## 26
         indiv2026 0.4306492
## 37
         indiv2037 0.4306492
## 67
         indiv2067 0.4306492
## 70
         indiv2070 0.4306492
## 75
         indiv2075 0.4306492
## 11
         indiv2011 0.4554015
## 25
         indiv2025 0.4554015
## 33
         indiv2033 0.4554015
## 39
         indiv2039 0.4554015
## 52
         indiv2052 0.4554015
## 62
         indiv2062 0.4554015
## 72
         indiv2072 0.4554015
## 79
         indiv2079 0.4554015
## 82
         indiv2082 0.4554015
## 83
         indiv2083 0.4554015
## 88
         indiv2088 0.4554015
## 22
         indiv2022 0.4803761
## 53
         indiv2053 0.4803761
## 90
         indiv2090 0.4803761
## 24
         indiv2024 0.5556981
## 30
         indiv2030 0.5556981
## 41
         indiv2041 0.5556981
## 93
         indiv2093 0.5556981
## 97
         indiv2097 0.5556981
## 100
         indiv2100 0.5556981
## 1
         indiv2001 0.5803120
plot(premodel[order(premodel$risk), ]$risk, xlab = "sorted individuals", ylab
= "risk", main = "risks with the individuals sorted in order of increasing r
isk")
```

risks with the individuals sorted in order of increasing risk



Q₅c

The risk of indiv2001 is 0.580312.

```
premodel[premodel$individuals=='indiv2001',]
## individuals risk
## 1 indiv2001 0.580312
```

Q5d

The OR is 4.089562.

```
maxrisk <- max(prerisk)
minrisk <- min(prerisk)

ODmax <- maxrisk/(1 - maxrisk)
ODmin <- minrisk/(1 - minrisk)
OR <- ODmax/ODmin
OR

## [1] 4.089562</pre>
```