1 Testing

We implemented testing functions for each method to ensure that each function takes proper inputs and returns desired outputs. Each method functions properly when tested using small data sets. In order to test the functionality of our genetic algorithm, we employed a larger, more realistic data set. We compared the models selected using our genetic algorithm with a well-known model selection method, the stepwise model selection using AIC, implemented in R in the stepAIC function available in the MASS package.

This data set was obtained from surveys about how video games affect grades. There are 15 variables in the data set – time (number of hours play), like (whether like to play), where (where to play), freq (how often), busy (play if busy), educ (playing educational), sex, age, home (computer at home), math (hate math), work (number of hours work per weeek), own (own PC), cdrom (PC has CD-rom), email (have Email) and grade. The dependent variable is grade. Completed data were obtained from 91 students during Fall 1994 at Berkeley. The data source can be found at the Stat Labs website for University of California, Berkeley.

The following results are obtained using our genetic algorithm.

```
res <- summary(ga)
## Model 1 :
    grade ~ where + freq + busy + sex + home + math
##
    AIC = 157.6
##
## Model 2 :
##
    grade ~ freq + educ + sex + home + math
##
   AIC = 158.2
##
## Model 3 :
    grade ~ freq + busy + sex + home + math
##
   AIC = 158.3
##
##
## Model 4 :
    grade ~ where + freq + busy + sex + home + math + own
  AIC = 158.4
```

```
## -----
## Model 5 :
## grade ~ where + freq + busy + sex + home + math + email
## AIC = 158.6
## ------
```

The following results are obtained using the stepAIC function.

```
library(MASS)
mod <- glm(grade ~ ., data = data)</pre>
res_step <- stepAIC(mod)</pre>
## Start: AIC=167.2
## grade ~ time + like + where + freq + busy + educ + sex + age +
##
   home + math + work + own + cdrom + email
##
         Df Deviance AIC
##
## - age
                 23.6 165
         1
## - where 1
                 23.6 166
## - time 1
                23.6 166
## - like 1
                23.7 166
## - educ 1
                 23.8 166
                 23.8 166
## - cdrom 1
## - work 1
                23.9 166
## - email 1
                23.9 167
## - busy 1
                23.9 167
## <none>
                 23.6 167
## - math 1
                24.2 168
## - own
                24.2 168
           1
## - freq 1
                 24.6 169
## - home 1
                 25.8 174
## - sex 1
                 27.4 179
##
## Step: AIC=165.3
## grade ~ time + like + where + freq + busy + educ + sex + home +
##
     math + work + own + cdrom + email
##
##
         Df Deviance AIC
## - where 1
                23.7 164
## - time 1
                 23.7 164
## - like
           1
                 23.8 164
## - educ 1
                 23.8 164
## - cdrom 1
                23.8 164
## - work 1
                 23.9 165
## - busy 1
                 24.0 165
## - email 1 24.0 165
```

```
## <none> 23.6 165
## - math 1 24.2 166
## - own 1 24.3 166
## - own 1
## - freq 1
              24.6 167
## - home 1
              25.9 172
## - sex
         1
              27.5 178
##
## Step: AIC=163.7
## grade \tilde{} time + like + freq + busy + educ + sex + home + math +
## work + own + cdrom + email
##
##
        Df Deviance AIC
## - like 1 23.9 162
## - cdrom 1
               23.9 162
## - busy 1
              24.0 163
## - time 1
              24.0 163
## - work 1
              24.0 163
             24.1 164
## - educ 1
## - math 1
              24.2 164
## <none>
               23.7 164
              24.2 164
## - email 1
## - own 1
               24.4 165
## - freq 1
              24.8 166
## - home 1
               26.1 170
## - sex 1
             27.9 177
##
## Step: AIC=162.4
## grade ~ time + freq + busy + educ + sex + home + math + work +
## own + cdrom + email
##
##
        Df Deviance AIC
## - cdrom 1 24.1 161
## - time 1
               24.2 162
## - work 1
              24.2 162
## - busy 1
              24.2 162
## - math 1
              24.3 162
## - email 1
              24.4 162
## - educ 1
              24.4 162
## <none>
               23.9 162
## - own
               24.6 163
          1
## - freq 1
              25.0 164
## - home 1
              26.2 169
## - sex
        1
              27.9 175
##
## Step: AIC=161.2
```

```
## grade ~ time + freq + busy + educ + sex + home + math + work +
## own + email
##
##
        Df Deviance AIC
## - time 1 24.4 160
## - work 1
              24.4 160
## - busy 1
              24.5 161
## - math 1
              24.5 161
## - educ 1
              24.6 161
             24.1 161
## <none>
            24.6 161
## - email 1
## - own 1
              24.7 162
## - freq 1
              25.1 163
              26.6 168
## - home 1
## - sex 1
              28.6 175
##
## Step: AIC=160.3
## grade ~ freq + busy + educ + sex + home + math + work + own +
## email
##
##
        Df Deviance AIC
## - work 1 24.7 160
## - busy 1
              24.8 160
## - email 1
              24.8 160
              24.9 160
## - educ 1
## - math 1 24.9 160
## <none>
              24.4 160
## - own 1
              25.0 161
## - freq 1
              25.6 163
              27.1 168
## - home 1
## - sex 1
              28.7 173
##
## Step: AIC=159.6
## grade ~ freq + busy + educ + sex + home + math + own + email
##
         Df Deviance AIC
## - email 1 25.1 159
## - busy 1
               25.2 159
## - own 1
              25.2 159
            25.2 159
25.2 159
## - educ 1
## <none>
               24.7 160
              25.8 162
## - math 1
## - freq 1
              25.9 162
## - home
         1
              27.3 167
## - sex 1
               28.8 171
```

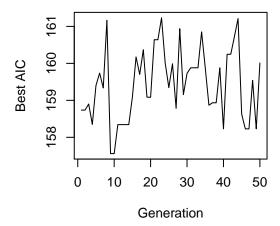
```
##
## Step: AIC=159.2
   grade ~ freq + busy + educ + sex + home + math + own
##
          Df Deviance AIC
##
## - own
                 25.5 159
           1
## - educ
           1
                 25.6 159
## - busy
           1
                 25.6 159
## <none>
                 25.1 159
## - math
           1
                 26.2 161
## - freq
           1
                 26.3 161
           1
## - home
                 27.8 166
## - sex
           1
                 29.2 171
##
## Step: AIC=158.6
## grade ~ freq + busy + educ + sex + home + math
##
##
          Df Deviance AIC
## - busy
                 26.0 158
          1
## - educ
                 26.0 158
                 25.5 159
## <none>
## - math
                 26.6 160
          1
## - freq
                 26.7 161
           1
## - home
           1
                 27.8 164
## - sex
           1
                 29.4 169
##
## Step: AIC=158.2
## grade ~ freq + educ + sex + home + math
##
##
          Df Deviance AIC
## <none>
                 26.0 158
## - freq
                 26.7 159
          1
## - math
           1
                 26.8 159
## - educ
           1
                 27.4 161
## - home
           1
                 28.4 164
## - sex
                 29.8 168
           1
```

The best model found using genetic algorithm was: $y \sim \text{where} + \text{freq} + \text{busy} + \text{sex} + \text{home} + \text{math}$, with an AIC of 157.56. This result is better than that of 158.23 that we obtained using the stepAIC function.

Finally, we plotted the best AIC for each generation to see how the best AIC has changed over generations.

```
par(cex = 0.8)
plot(ga)
```

Evolution of best model through generations



From the plot, we can see that the best model was found at generation 9.