## Appendix C1: Code used to generate simulated data in R

#Code used to simulate data for those data sets with no random effects.

#Values for the parameters need to be obtained from SAS proc mixed #and then saved into variables Beta and Lambda.

#Creating the data set.

datasets <- function() { dataset <- data.frame(matrix(rep(0, n\*ni\*(2+p+299)), nrow = n\*ni, ncol = (2+p+299)))

names(dataset) <- c("id", "X1", "Gender", "Age", "Gender\_Age", "y1", "y2","y3","y4","y5","y6","y7","y8","y9","y10","y11","y12", "y13","y14","y15","y16","y17","y18","y19","y20","y21","y22" "y23","y24","y25","y26","y27","y28","y29","y30","y31","y32", "y33","y34","y35","y36","y37","y38","y38","y40","y41","y42", "y43","y44","y45","y46","y47","y48","y49","y50","y51","y52", "y53","y54","y55","y56","y57","y58","y59","y60","y61","y62", "y63","y64","y65","y66","y67","y68","y69","y70","y71","y72", "y73", "y74", "y75", "y76", "y77", "y78", "y79", "y80", "y81", "y82", "y83","y84","y85","y86","y87","y88","y89","y90","y91","y92", "y93","y94","y95","y96","y97","y98","y99","y100","y101", "y102", "y103", "y104", "y105", "y106", "y107", "y108", "y109", "y110", "y111", "y112", "y113", "y114", "y115", "y116", "y117", "y118","y119","y120","y121","y122","y123","y124","y125", "y126", "y127", "y128", "y129", "y130", "y131", "y132", "y133", "y134", "y135", "y136", "y137", "y138", "y138", "y140", "y141", "y142", "y143", "y144", "y145", "y146", "y147", "y148", "y149", "y150", "y151", "y152", "y153", "y154", "y155", "y156", "y157", "y158","y159","y160","y161","y162","y163","y164","y165", "y166", "y167", "y168", "y169", "y170", "y171", "y172", "y173", "y174", "y175", "y176", "y177", "y178", "y179", "y180", "y181", "y182", "y183", "y184", "y185", "y186", "y187", "y188", "y189", "y190", "y191", "y192", "y193", "y194", "y195", "y196", "y197", "y198", "y199", "y200", "y201", "y202", "y203", "y204", "y205", "y206", "y207", "y208", "y209", "y210", "y211", "y212", "y213", "y214", "y215", "y216", "y217", "y218", "y219", "y220", "y221", "y222","y223","y224","y225","y226","y227","y228","y229", "y230", "y231", "y232", "y233", "y234", "y235", "y236", "y237", "y238", "y238", "y240", "y241", "y242", "y243", "y244", "y245", "y246", "y247", "y248", "y249", "y250")

#For loops used to simulate the data.

#j is the index for individual. The first 11 individuals are girls
and #and the second 16 individuals are boys.
#The default mean for the normal random generator rmnorm is zero. The
#covariance matrix is specified with varcov. Lambda holds the
#covariance matrix for the random errors.
 for (j in 1:n) {
 for (j in 1:1) {
 X <- cbind(1, 1, Age[(((i-1)\*4+(1:4))%%4)+1],
 Age[(((i-1)\*4+(1:4))%%4)+1])
 dataset[(j-1)\*4 + (1:4), (1:5)] <- cbind(j,X)
 }
 for (j in 12:n) {
 X <- cbind(1, 0, Age[(((i-1)\*4+(1:4))%%4)+1], 0)
 dataset[(j-1)\*4 + (1:4), (1:5)] <- cbind(j,X)
 }
</pre>

```
}
for (k in 1:250) {
for (i in 1:n) {
for (i in 1:11) {
X <- cbind(1, 1, Age[((((i-1)*4+(1:4))%%4)+1],
   Age[((((i-1)*4+(1:4))%%4)+1])
epsilon <- t(rmnorm(n=1, varcov = Lambda))</pre>
y <- X%*%Beta + epsilon
dataset[(i-1)*4 + (1:4), (k+5)] <- y</pre>
for (i in 12:n) {
X <- cbind(1, 0, Age[(((i-1)*4+(1:4))%%4)+1], 0)
epsilon <- t(rmnorm(n=1, varcov = Lambda))</pre>
y <- X%*%Beta + epsilon
dataset[(i-1)*4 + (1:4), (k+5)] <- y</pre>
ł
}
dataset
}
```

#Code used to simulate data for those data sets with a random #intercept and slope. #Values for the parameters need to be obtained from SAS proc mixed #and then saved into variables Beta, Phi and Lambda. #Creating the data set. datasets <- function() { dataset <- data.frame(matrix(rep(0,</pre> n\*ni\*(2+p+299)), nrow = n\*ni, ncol = (2+p+299)))names(dataset) <- c("id", "X1", "Gender", "Age", "Gender\_Age","y1",</pre> "y2","y3","y4","y5","y6","y7","y8","y9","y10","y11","y12", "y13","y14","y15","y16","y17","y18","y19","y20","y21","y22", "y23","y24","y25","y26","y27","y28","y29","y30","y31","y32", "y33","y34","y35","y36","y37","y38","y38","y40","y41","y42", "y43","y44","y45","y46","y47","y48","y49","y50","y51","y52", "y53","y54","y55","y56","y57","y58","y59","y60","y61","y62", "y63","y64","y65","y66","y67","y68","y69","y70","y71","y72", "y73","y74","y75","y76","y77","y78","y79","y80","y81","y82", "y83","y84","y85","y86","y87","y88","y89","y90","y91","y92", "y93","y94","y95","y96","y97","y98","y99","y100","y101", "y102", "y103", "y104", "y105", "y106", "y107", "y108", "y109", "y110", "y111", "y112", "y113", "y114", "y115", "y116", "y117", "y118", "y119", "y120", "y121", "y122", "y123", "y124", "y125", "y126", "y127", "y128", "y129", "y130", "y131", "y132", "y133", "y134", "y135", "y136", "y137", "y138", "y138", "y140", "y141", "y142", "y143", "y144", "y145", "y146", "y147", "y148", "y149", "y150", "y151", "y152", "y153", "y154", "y155", "y156", "y157", "y158", "y159", "y160", "y161", "y162", "y163", "y164", "y165", "y166", "y167", "y168", "y169", "y170", "y171", "y172", "y173", "y174", "y175", "y176", "y177", "y178", "y179", "y180", "y181", "y182","y183","y184","y185","y186","y187","y188","y189", "y190","y191","y192","y193","y194","y195","y196","y197", "y198","y199","y200","y201","y202","y203","y204","y205", "y206","y207","y208","y209","y210","y211","y212","y213", "y214", "y215", "y216", "y217", "y218", "y219", "y220", "y221", "y222", "y223", "y224", "y225", "y226", "y227", "y228", "y229", "y230", "y231", "y232", "y233", "y234", "y235", "y236", "y237", "y238", "y238", "y240", "y241", "y242", "y243", "y244", "y245", "y246","y247","y248","y249","y250") #For loops used to simulate the data.

#j is the index for individual. The first 11 individuals are girls and #and the second 16 individuals are boys. #The default mean for the normal random generator rmnorm is zero. The #covariance matrix is specified with varcov. Lambda holds the #covariance matrix for the random errors and Phi holds the covariance #matrix for the random effects.

```
for (j in 1:n) {
  for (j in 1:1) {
    X <- cbind(1, 1, Age[(((i-1)*4+(1:4))%%4)+1],
        Age[(((i-1)*4+(1:4))%%4)+1])
    dataset[(j-1)*4 + (1:4), (1:5)] <- cbind(j,X)
    }
    for (j in 12:n) {
    X <- cbind(1, 0, Age[(((i-1)*4+(1:4))%%4)+1], 0)
    dataset[(j-1)*4 + (1:4), (1:5)] <- cbind(j,X)</pre>
```

```
}
į
for (k in 1:250) {
for (i in 1:n) {
for (i in 1:11) {
X <- cbind(1, 1, Age[((((i-1)*4+(1:4))%%4)+1],
   Age[((((i-1)*4+(1:4))%%4)+1])
Z <- cbind(1, Age[(((i-1)*4+(1:4))%%4)+1])</pre>
bi <- t(rmnorm(n=1, varcov = Phi))</pre>
epsilon <- t(rmnorm(n=1, varcov = Lambda))</pre>
y <- X%*%Beta + Z%*%bi + epsilon
dataset[(i-1)*4 + (1:4), (k+5)] <- y</pre>
for (i in 12:n) {
X \leftarrow cbind(1, 0, Age[(((i-1)*4+(1:4))%%4)+1], 0)
Z <- cbind(1, Age[(((i-1)*4+(1:4))%%4)+1])</pre>
bi <- t(rmnorm(n=1, varcov = Phi))</pre>
epsilon <- t(rmnorm(n=1, varcov = Lambda))</pre>
y <- X%*%Beta + Z%*%bi + epsilon
dataset[(i-1)*4 + (1:4), (k+5)] <- y</pre>
}
dataset
}
```

#Code used to simulate data for those data sets with a random #intercept only. #Values for the parameters need to be obtained from SAS proc mixed #and then saved into variables Beta, Phi and Lambda. #Creating the data set. datasets <- function() { dataset <- data.frame(matrix(rep(0,</pre> n\*ni\*(2+p+299)), nrow = n\*ni, ncol = (2+p+299))) names(dataset) <- c("id", "X1", "Gender", "Age", "Gender\_Age","y1",</pre> "y2","y3","y4","y5","y6","y7","y8","y9","y10","y11","y12", "y13","y14","y15","y16","y17","y18","y19","y20","y21","y22", "y23","y24","y25","y26","y27","y28","y29","y30","y31","y32", "y33","y34","y35","y36","y37","y38","y38","y40","y41","y42", "y43","y44","y45","y46","y47","y48","y49","y50","y51","y52", "y53","y54","y55","y56","y57","y58","y59","y60","y61","y62", "y63","y64","y65","y66","y67","y68","y69","y70","y71","y72", "y73","y74","y75","y76","y77","y78","y79","y80","y81","y82", "y83","y84","y85","y86","y87","y88","y89","y90","y91","y92", "y93","y94","y95","y96","y97","y98","y99","y100","y101", "y102", "y103", "y104", "y105", "y106", "y107", "y108", "y109", "y110", "y111", "y112", "y113", "y114", "y115", "y116", "y117", "y118", "y119", "y120", "y121", "y122", "y123", "y124", "y125", "y126", "y127", "y128", "y129", "y130", "y131", "y132", "y133", "y134", "y135", "y136", "y137", "y138", "y138", "y140", "y141", "y142", "y143", "y144", "y145", "y146", "y147", "y148", "y149", "y150", "y151", "y152", "y153", "y154", "y155", "y156", "y157", "y158", "y159", "y160", "y161", "y162", "y163", "y164", "y165", "y166", "y167", "y168", "y169", "y170", "y171", "y172", "y173", "y174", "y175", "y176", "y177", "y178", "y179", "y180", "y181", "y182","y183","y184","y185","y186","y187","y188","y189", "y190","y191","y192","y193","y194","y195","y196","y197", "y198","y199","y200","y201","y202","y203","y204","y205", "y206","y207","y208","y209","y210","y211","y212","y213", "y214", "y215", "y216", "y217", "y218", "y219", "y220", "y221", "y222", "y223", "y224", "y225", "y226", "y227", "y228", "y229", "y230", "y231", "y232", "y233", "y234", "y235", "y236", "y237", "y238", "y238", "y240", "y241", "y242", "y243", "y244", "y245", "y246","y247","y248","y249","y250") #For loops used to simulate the data. #j is the index for individual. The first 11 individuals are girls and #and the second 16 individuals are boys.

#The default mean for the normal random generator rmnorm is zero. The #covariance matrix is specified with varcov. Lambda holds the #covariance matrix for the random errors and Phi holds the covariance #matrix for the random effects.

```
for (j in 1:n) {
for (j in 1:1) {
    X <- cbind(1, 1, Age[(((i-1)*4+(1:4))%%4)+1],
        Age[(((i-1)*4+(1:4))%%4)+1])
    dataset[(j-1)*4 + (1:4), (1:5)] <- cbind(j,X)
    }
    for (j in 12:n) {
    X <- cbind(1, 0, Age[(((i-1)*4+(1:4))%%4)+1], 0)
    dataset[(j-1)*4 + (1:4), (1:5)] <- cbind(j,X)
    }
</pre>
```

```
}
for (k in 1:250) {
for (i in 1:n) {
for (i in 1:11) {
X <- cbind(1, 1, Age[((((i-1)*4+(1:4))%%4)+1],
   Age[((((i-1)*4+(1:4))%%4)+1])
Z < - c(1, 1, 1, 1)
bi <- t(rmnorm(n=1, varcov = Phi))</pre>
epsilon <- t(rmnorm(n=1, varcov = Lambda))</pre>
y <- X%*%Beta + Z%*%bi + epsilon
dataset[(i-1)*4 + (1:4), (k+5)] <- y</pre>
for (i in 12:n) {
X \leftarrow cbind(1, 0, Age[(((i-1)*4+(1:4))%%4)+1], 0)
Z < - c(1, 1, 1, 1)
bi <- t(rmnorm(n=1, varcov = Phi))</pre>
epsilon <- t(rmnorm(n=1, varcov = Lambda))</pre>
y <- X%*%Beta + Z%*%bi + epsilon
dataset[(i-1)*4 + (1:4), (k+5)] <- y</pre>
}
dataset
}
```