Final Project

2023-05-03

```
#First we need to make sure that the necessary packages
#Specify the packages that will be necessary here
necessarypackages=c("lubridate", "psych", "ggplot2", "lme4", "lmerTest", "sjmisc", "sjPlot", "mgcv", "lomb", "bi
#check the names of the current packages that are installed
currentpackagenames=rownames(installed.packages())
#select the packages which are not yet installed
packagestoinstall=necessarypackages[!(necessarypackages%in%currentpackagenames)]
#if packages are not yet installed, install them via CRAN.
if(length(packagestoinstall)>0){
  install.packages(packagestoinstall)
}
#now load all packages using lapply
packageout=lapply(necessarypackages, library, character.only = TRUE)
## Attaching package: 'lubridate'
## The following objects are masked from 'package:base':
##
       date, intersect, setdiff, union
##
## Attaching package: 'ggplot2'
## The following objects are masked from 'package:psych':
##
##
       %+%, alpha
## Loading required package: Matrix
## Attaching package: 'lmerTest'
## The following object is masked from 'package:lme4':
##
##
       lmer
```

```
##
##
       step
## Loading required package: nlme
##
## Attaching package: 'nlme'
## The following object is masked from 'package:lme4':
##
##
       lmList
## This is mgcv 1.8-42. For overview type 'help("mgcv-package")'.
## biwavelet 0.20.21 loaded.
##
## Attaching package: 'biwavelet'
## The following object is masked from 'package:ggplot2':
##
##
       arrow
R. Markdown
fit_data = read.csv('daily_fitbit_sema_df_unprocessed.csv')
var.names.data <- tolower(colnames(fit_data))</pre>
colnames(fit_data)<-var.names.data</pre>
fit_data$id <- as.integer(factor(fit_data$id, levels = unique(fit_data$id)))</pre>
fit_data$date <- as.Date(fit_data$date)</pre>
for(i in 1:length(unique(fit data$id))){
  tempdates=fit_data$date[fit_data$id==unique(fit_data$id)[i]]
  tempdates=as.numeric((tempdates-min(tempdates)))
  fit_data$day[fit_data$id==unique(fit_data$id)[i]]=tempdates
}
fit_data=fit_data[,c(colnames(fit_data)[1:3], "day", colnames(fit_data)[4:63])]
fit_data <- subset(fit_data, select = -c(step_goal, step_goal_label,x,date))</pre>
```

The following object is masked from 'package:stats':

completed_data <- read.csv('Complete.csv')</pre>

```
ggplot(data = completed_data, aes(x = day, y = lightly_active_minutes , group = id, color=factor(id)))
  geom_point() +
  geom_line()
                                                                   19 - 37 - 55
  600 -
                                                                   20
                                                                          38 ---
                                                                   21
                                                                      → 39 →
                                                                   22
                                                                      → 40 →
                                                                   23 -- 41 --
                                                                                 59
                                                                   24
                                                                     → 42 →
ightly_active_minutes
   400
                                                                   25 - 43 - 61
                                                                   26 -- 44 -- 62
                                                                   27 - 45 - 63
                                                                   28 - 46 - 64
                                                               → 29 → 47 → 65
                                                            12
                                                               → 30 → 48 → 66
                                                               → 31 → 49 → 67
                                                               → 32 → 50 → 68
                                                            15 - 33 - 51 - 69
                                                               → 34 → 52 → 70
    0
                                                                          53 - 71
                                                                   35
       Ö
                50
                        100
                                 150
                                          200
                                                  250
                            day
lmer_data = completed_data
lmer_data <- subset(lmer_data, select = -c(activitytype, badgetype))</pre>
lmer_data$daySCALED=scale(lmer_data$day)
model1<- lmer(calories ~ . +(daySCALED | id), data = lmer_data)</pre>
```

```
model1<- lmer(calories ~ . +(daySCALED | id), data = lmer_data)

## fixed-effect model matrix is rank deficient so dropping 2 columns / coefficients

## Warning: Some predictor variables are on very different scales: consider

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## rescaling

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## rescaling</pre>
```

```
## Linear mixed model fit by REML. t-tests use Satterthwaite's method [
## lmerModLmerTest]
## Formula: calories ~ . + (daySCALED | id)
## Data: lmer_data
##
```

```
## REML criterion at convergence: 100555.6
##
## Scaled residuals:
##
                                   3Q
       Min
                 1Q
                      Median
                                           Max
  -11.6907 -0.3232
                      0.0159
                               0.3433
                                        8.5697
##
## Random effects:
##
   Groups
            Name
                        Variance Std.Dev. Corr
##
             (Intercept) 51051
                                 225.9
##
            daySCALED
                        26232
                                 162.0
                                          -0.04
## Residual
                        44596
                                 211.2
## Number of obs: 7410, groups: id, 71
## Fixed effects:
##
                                     Estimate Std. Error
                                                                 df t value
## (Intercept)
                                    1.235e+03 2.859e+02 3.597e+03
                                                                      4.320
## X
                                    2.062e-01 5.236e-02 8.717e+02
                                                                      3.939
## id
                                   -2.249e+01
                                               5.451e+00 6.610e+02
## day
                                   -7.452e-01 3.670e-01 7.448e+01
                                                                     -2.030
## nightly_temperature
                                   -1.070e+01
                                              2.620e+00 7.256e+03
                                                                     -4.085
## nremhr
                                    3.212e-01 2.989e-01 7.243e+03
                                                                      1.075
## rmssd
                                    4.042e-01 1.886e-01 7.292e+03
                                                                      2.143
## spo2
                                    3.921e+00 2.481e+00 7.250e+03
                                                                      1.580
## full_sleep_breathing_rate
                                               9.092e-01 7.268e+03
                                    1.710e+00
                                                                      1.880
## stress score
                                    9.027e-01 6.738e-01 7.221e+03
                                                                      1.340
## sleep_points_percentage
                                   -3.624e+01
                                               1.076e+01 7.226e+03
                                                                     -3.368
## exertion_points_percentage
                                   -3.478e+01
                                               3.803e+01 7.228e+03
                                                                     -0.915
## responsiveness_points_percentage -6.868e+01
                                               3.550e+01 7.226e+03
                                                                     -1.935
## daily_temperature_variation
                                    9.694e+00
                                              3.135e+00 7.289e+03
                                                                      3.092
## filtereddemographicvo2max
                                    5.267e+00 7.594e-01 7.326e+03
                                                                      6.936
## distance
                                    2.223e-02
                                               4.583e-03 7.266e+03
                                                                      4.851
## bpm
                                    9.683e-01 3.025e-01 7.232e+03
                                                                      3.201
## lightly_active_minutes
                                    2.843e+00 5.072e-02 7.299e+03
                                                                     56.040
                                    4.073e+00 1.794e-01 7.264e+03
## moderately_active_minutes
                                                                     22.703
## very_active_minutes
                                    9.803e+00 1.487e-01
                                                          7.268e+03
                                                                     65.919
                                    2.061e-01 2.029e-02 7.258e+03 10.160
## sedentary_minutes
## mindfulness sessionFalse
                                   -3.423e+02 3.306e+01 5.839e+03 -10.353
## mindfulness_sessionTrue
                                   -3.511e+02 3.787e+01 6.675e+03
                                                                    -9.271
## scl_avg
                                    1.593e-01
                                               6.331e-01
                                                          7.281e+03
                                                                      0.252
## resting_hr
                                   -2.944e+00 6.696e-01 7.297e+03
                                                                     -4.397
## sleep duration
                                   -2.178e-06 2.557e-06 7.220e+03
                                                                     -0.852
                                    1.432e+00 7.664e-01 7.221e+03
## minutestofallasleep
                                                                      1.868
## minutesasleep
                                    2.061e-01 1.648e-01 7.225e+03
                                                                      1.250
## minutesawake
                                    1.938e-01 2.536e-01 7.246e+03
                                                                      0.764
## minutesafterwakeup
                                    4.755e-01 9.134e-01 7.238e+03
                                                                      0.521
## sleep_efficiency
                                                          7.192e+03
                                   -3.163e-01 8.125e-01
                                                                     -0.389
## sleep_deep_ratio
                                    3.998e+00 9.230e+00 7.227e+03
                                                                      0.433
## sleep_wake_ratio
                                   -3.489e+00 1.432e+01 7.249e+03
                                                                     -0.244
## sleep_light_ratio
                                   -2.012e+01
                                              1.650e+01 7.236e+03
                                                                     -1.219
## sleep_rem_ratio
                                    6.326e+00 6.605e+00
                                                         7.229e+03
                                                                      0.958
## steps
                                   -1.693e-02 3.260e-03 7.264e+03
                                                                     -5.195
## minutes_in_default_zone_1
                                    1.282e-01 3.636e-02 7.303e+03
                                                                      3.525
## minutes_below_default_zone_1
                                    1.027e-01 1.259e-02 7.269e+03
                                                                      8.156
## minutes in default zone 2
                                    1.746e-01 1.429e-01 7.248e+03
                                                                      1.222
```

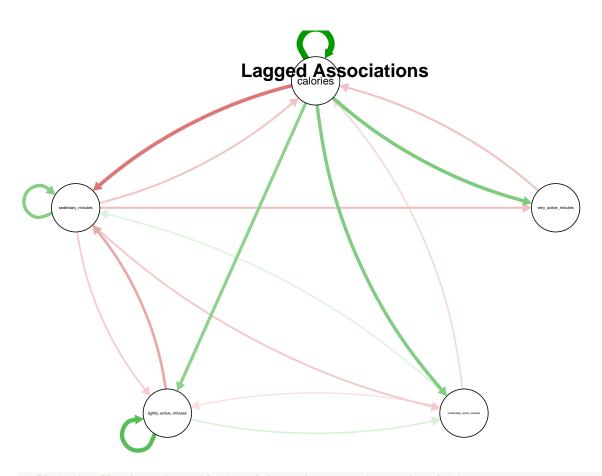
```
## minutes_in_default_zone_3
                                   -9.540e-03 4.087e-01 7.226e+03 -0.023
                                    2.111e+02 2.818e+02 4.705e+01
                                                                     0.749
## age<30
                                    2.001e+02 2.884e+02 4.734e+01
## age>=30
                                                                     0.694
                                                                     0.690
## genderFEMALE
                                    1.753e+02 2.541e+02 4.988e+01
## genderMALE
                                    5.081e+02 2.416e+02 5.028e+01
                                                                     2.103
## bmi<19
                                   -5.997e+02 1.904e+02 4.824e+01 -3.150
## bmi>=25
                                   -3.155e+02 1.980e+02 5.386e+01 -1.594
## bmi>=30
                                    1.539e+02 1.995e+02 4.783e+01
                                                                     0.772
## bmi19.0
                                   -2.999e-01 2.150e+02 4.846e+01 -0.001
## bmi20.0
                                   -4.043e+02 1.860e+02 4.842e+01 -2.174
## bmi21.0
                                   -2.614e+02 1.859e+02 4.820e+01 -1.407
## bmi22.0
                                   -2.608e+02 1.918e+02 4.825e+01 -1.359
## bmi23.0
                                   -2.742e+02 1.922e+02 4.839e+01 -1.427
## bmi24.0
                                   -1.160e+02 1.810e+02 4.907e+01 -0.641
## bmi25.0
                                   -1.964e+00 2.361e+02 4.847e+01 -0.008
## bmi26.0
                                   -2.638e+01 2.046e+02 4.819e+01
                                                                    -0.129
## bmi27.0
                                   -8.141e+01 2.121e+02 4.826e+01 -0.384
## bmi28.0
                                   -4.871e+01 2.303e+02 4.964e+01 -0.212
## min_goal
                                    1.044e-03 3.252e-03 7.245e+03
                                                                    0.321
                                   -8.568e-04 2.606e-03 7.245e+03 -0.329
## max goal
## alert
                                   -5.180e+00 8.041e+00 7.252e+03 -0.644
## happy
                                   -7.809e-01 6.352e+00 7.234e+03 -0.123
                                    2.753e+00 6.247e+00 7.247e+03
## neutral
                                                                     0.441
## rested.relaxed
                                    1.256e+01 5.944e+00 7.239e+03
                                                                     2.113
## sad
                                   -2.835e+01 1.084e+01 7.235e+03 -2.614
## tense.anxious
                                    4.998e+00 6.594e+00 7.235e+03
                                                                     0.758
## tired
                                    9.445e+00 5.725e+00 7.236e+03
                                                                     1.650
## entertainment
                                   -1.149e+01 9.134e+00 7.229e+03 -1.258
                                   -9.836e+01 3.205e+01 7.228e+03 -3.069
## gym
## home
                                   -6.852e+00 7.113e+00 7.229e+03 -0.963
## home_office
                                   -7.875e+00 1.135e+01 7.246e+03
                                                                    -0.694
## other
                                   -3.113e+00 1.762e+01 7.221e+03 -0.177
## outdoors
                                    5.076e+00 8.128e+00 7.228e+03
                                                                     0.624
## transit
                                   -3.042e+00 9.419e+00 7.226e+03 -0.323
## work.school
                                   -1.070e+00 6.494e+00 7.240e+03 -0.165
                                   Pr(>|t|)
## (Intercept)
                                   1.60e-05 ***
## X
                                   8.85e-05 ***
## id
                                   4.16e-05 ***
## day
                                   0.045904 *
## nightly_temperature
                                   4.46e-05 ***
## nremhr
                                   0.282544
## rmssd
                                   0.032142 *
                                   0.114046
## spo2
## full_sleep_breathing_rate
                                   0.060103 .
## stress_score
                                   0.180384
## sleep_points_percentage
                                   0.000760 ***
## exertion_points_percentage
                                   0.360467
## responsiveness_points_percentage 0.053039 .
## daily_temperature_variation
                                   0.001995 **
## filtereddemographicvo2max
                                   4.39e-12 ***
## distance
                                   1.26e-06 ***
## bpm
                                   0.001375 **
## lightly_active_minutes
                                    < 2e-16 ***
```

```
## moderately_active_minutes
                                     < 2e-16 ***
## very_active_minutes
                                     < 2e-16 ***
                                     < 2e-16 ***
## sedentary_minutes
## mindfulness_sessionFalse
                                     < 2e-16 ***
## mindfulness_sessionTrue
                                      < 2e-16 ***
## scl avg
                                     0.801398
## resting hr
                                     1.11e-05 ***
## sleep_duration
                                     0.394487
## minutestofallasleep
                                     0.061829 .
## minutesasleep
                                     0.211215
## minutesawake
                                     0.444704
## minutesafterwakeup
                                     0.602695
## sleep_efficiency
                                     0.697066
## sleep_deep_ratio
                                     0.664913
## sleep_wake_ratio
                                     0.807549
## sleep_light_ratio
                                     0.222848
## sleep_rem_ratio
                                     0.338176
## steps
                                     2.11e-07 ***
## minutes_in_default_zone_1
                                     0.000426 ***
## minutes_below_default_zone_1
                                     4.05e-16 ***
## minutes_in_default_zone_2
                                     0.221779
## minutes_in_default_zone_3
                                     0.981377
## age<30
                                     0.457466
## age>=30
                                     0.491063
## genderFEMALE
                                     0.493506
## genderMALE
                                     0.040500 *
## bmi<19
                                     0.002806 **
## bmi>=25
                                     0.116888
## bmi>=30
                                     0.444196
## bmi19.0
                                     0.998892
## bmi20.0
                                     0.034602 *
## bmi21.0
                                     0.165963
## bmi22.0
                                     0.180336
## bmi23.0
                                     0.160074
## bmi24.0
                                     0.524398
## bmi25.0
                                     0.993396
## bmi26.0
                                     0.897947
## bmi27.0
                                     0.702755
## bmi28.0
                                     0.833341
## min_goal
                                     0.748187
## max goal
                                     0.742364
## alert
                                     0.519466
                                     0.902152
## happy
## neutral
                                     0.659516
## rested.relaxed
                                     0.034596 *
## sad
                                     0.008961 **
## tense.anxious
                                     0.448548
## tired
                                     0.099057 .
## entertainment
                                     0.208278
## gym
                                     0.002157 **
## home
                                     0.335462
## home office
                                     0.487680
## other
                                     0.859783
## outdoors
                                     0.532346
```

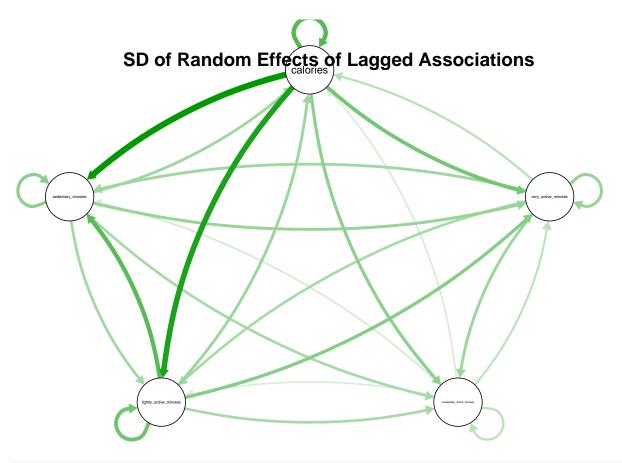
```
## transit
                                    0.746717
## work.school
                                    0.869162
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## Correlation matrix not shown by default, as p = 74 > 12.
## Use print(x, correlation=TRUE) or
##
       vcov(x)
                      if you need it
## fit warnings:
## fixed-effect model matrix is rank deficient so dropping 2 columns / coefficients
## Some predictor variables are on very different scales: consider rescaling
Data appears stationary.
# Estimate the relationship between v1 and v2 using the mlVAR function
fit1 <- mlVAR(completed_data, vars = c("calories", "very_active_minutes", "moderately_active_minutes", "li
## Estimating temporal and between-subjects effects
##
     1
## Estimating contemporaneous effects
     1
                                                                                      1
##
## Computing random effects
##
# Display the summary of the fit
summary(fit1)
## mlVAR estimation completed. Input was:
        - Variables: calories very_active_minutes moderately_active_minutes lightly_active_minutes sede
##
##
        - Lags: 1
        - Estimator: lmer
##
        - Temporal: correlated
##
##
## Information indices:
##
                          var
                                   aic
##
                     calories 14431.97 14652.80
          very_active_minutes 18799.70 19020.53
##
   moderately_active_minutes 18209.95 18430.78
##
       lightly_active_minutes 14242.20 14463.03
##
            sedentary_minutes 12978.32 13199.15
##
##
## Temporal effects:
```

```
SE
##
                          from
                                                        to lag fixed
                                                                0.518 0.064 0.000
##
                      calories
                                                 calories
                                                                0.263 0.063 0.000
##
                      calories
                                     very active minutes
##
                      calories moderately_active_minutes
                                                                0.254 0.055 0.000
##
                      calories
                                  lightly_active_minutes
                                                                0.231 0.077 0.003
##
                      calories
                                        sedentary minutes
                                                             1 -0.277 0.080 0.001
##
          very active minutes
                                                 calories
                                                             1 -0.123 0.027 0.000
                                     very_active_minutes
##
          very active minutes
                                                             1 -0.009 0.037 0.805
##
          very active minutes moderately active minutes
                                                             1 -0.027 0.035 0.443
                                  lightly_active_minutes
##
                                                             1 -0.035 0.031 0.253
          very_active_minutes
##
          very_active_minutes
                                        sedentary_minutes
                                                             1 0.054 0.031 0.085
                                                             1 -0.079 0.018 0.000
##
    moderately_active_minutes
                                                 calories
                                     very_active_minutes
                                                             1 -0.043 0.026 0.102
    moderately_active_minutes
##
    moderately_active_minutes moderately_active_minutes
                                                             1 -0.008 0.026 0.748
    moderately_active_minutes
                                   lightly_active_minutes
                                                             1 -0.059 0.018 0.001
##
    moderately_active_minutes
                                        sedentary_minutes
                                                             1 0.066 0.018 0.000
##
       lightly_active_minutes
                                                 calories
                                                                0.031 0.040 0.430
##
                                                                0.018 0.048 0.710
       lightly active minutes
                                     very_active_minutes
##
       lightly_active_minutes moderately_active_minutes
                                                             1 0.078 0.040 0.049
##
       lightly active minutes
                                  lightly_active_minutes
                                                                0.340 0.049 0.000
##
       lightly_active_minutes
                                        sedentary_minutes
                                                             1 -0.179 0.052 0.001
##
            sedentary minutes
                                                 calories
                                                             1 -0.119 0.030 0.000
##
                                                             1 -0.128 0.035 0.000
            sedentary_minutes
                                     very_active_minutes
##
            sedentary minutes moderately active minutes
                                                             1 -0.109 0.032 0.001
##
            sedentary_minutes
                                                             1 -0.099 0.030 0.001
                                  lightly_active_minutes
            sedentary_minutes
                                        sedentary_minutes
##
                                                             1 0.248 0.034 0.000
##
    ran_SD
##
     0.354
     0.287
##
##
     0.236
##
     0.468
##
     0.522
##
     0.146
##
     0.217
     0.205
##
##
     0.182
##
     0.199
##
     0.087
     0.139
##
##
     0.144
##
     0.084
     0.092
##
##
     0.206
##
     0.250
##
     0.184
     0.298
##
##
     0.344
##
     0.198
     0.214
##
##
     0.185
##
     0.191
     0.240
##
##
##
```

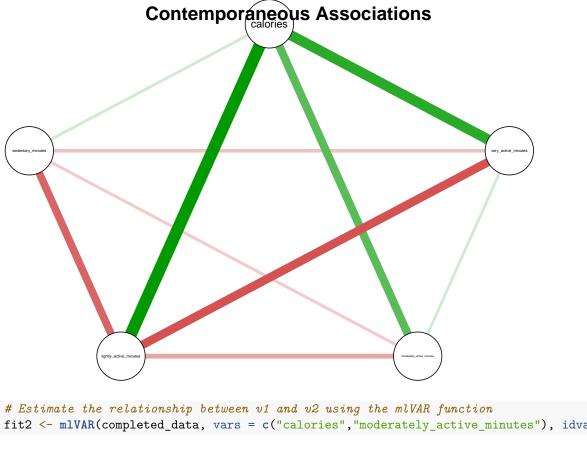
```
## Contemporaneous effects (posthoc estimated):
##
                                                      v2 P 1->2 P 1<-2
                           v1
                                                                          pcor
                                                calories
                                                               0.000
                                                                         0.665
##
          very active minutes
    moderately_active_minutes
                                                                  0.000 0.517
##
                                                calories
##
    moderately active minutes
                                     very active minutes
                                                               0
                                                                  0.029 0.146
##
       lightly active minutes
                                                               Λ
                                                                  0.000 0.793
                                                calories
                                     very_active_minutes
##
       lightly active minutes
                                                                  0.000 - 0.537
                                                               0
##
       lightly_active_minutes moderately_active_minutes
                                                                  0.000 -0.281
                                                               0
##
            sedentary minutes
                                                calories
                                                               0
                                                                  0.000 0.150
                                                              0
##
            sedentary_minutes
                                                                  0.000 -0.192
                                     very_active_minutes
##
            sedentary_minutes moderately_active_minutes
                                                               0 0.000 -0.159
                                  lightly_active_minutes
                                                              0 0.000 -0.480
##
            sedentary_minutes
                   cor ran SD cor
##
    ran_SD_pcor
##
          0.251 0.896
                            0.160
##
          0.269
                 0.910
                            0.139
##
          0.442 0.883
                            0.147
##
          0.216 0.868
                            0.170
##
          0.268 0.648
                            0.237
##
          0.324 0.710
                            0.219
##
          0.266 - 0.763
                            0.219
##
          0.212 -0.659
                            0.179
##
          0.221 - 0.694
                            0.182
          0.220 -0.798
##
                            0.155
##
##
##
  Between-subject effects:
##
                                                      v2 P 1->2 P 1<-2
                                                                          pcor
                                                calories 0.000 0.000
                                                                         0.461
##
          very_active_minutes
##
                                                                  0.582 -0.064
    moderately_active_minutes
                                                calories
                                                          0.418
##
    moderately_active_minutes
                                     very_active_minutes
                                                          0.000
                                                                  0.000
                                                                         0.455
##
       lightly_active_minutes
                                                calories
                                                          0.083
                                                                  0.085
                                                                         0.187
##
       lightly_active_minutes
                                     very_active_minutes
                                                          0.007
                                                                  0.001 -0.309
                                                          0.000
                                                                  0.001 0.372
##
       lightly_active_minutes moderately_active_minutes
##
            sedentary_minutes
                                                          0.886
                                                                  0.403 0.041
                                                calories
##
            sedentary minutes
                                     very active minutes
                                                          0.001
                                                                  0.002 - 0.335
##
            sedentary_minutes moderately_active_minutes
                                                          0.273
                                                                  0.980 -0.046
##
            sedentary minutes
                                  lightly active minutes
                                                          0.000
                                                                  0.000 - 0.784
##
       cor
##
     0.692
     0.585
##
##
     0.754
##
     0.590
     0.631
##
##
     0.814
##
   -0.603
   -0.712
##
    -0.811
##
##
    -0.923
# Plot the lagged associations of fit1
plot(fit1, "temporal", layout = "circle", nonsig="hide")
title("Lagged Associations")
```



Plot the SD of random effects of lagged associations for fit1
plot(fit1,"temporal",layout = "circle",nonsig="hide",SD=TRUE)
title("SD of Random Effects of Lagged Associations")

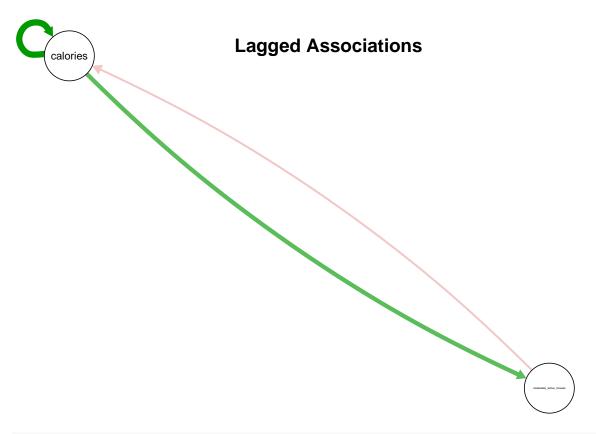


Plot the contemporaneous associations of fit1
plot(fit1, "contemporaneous", layout = "circle", nonsig="hide")
title("Contemporaneous Associations")

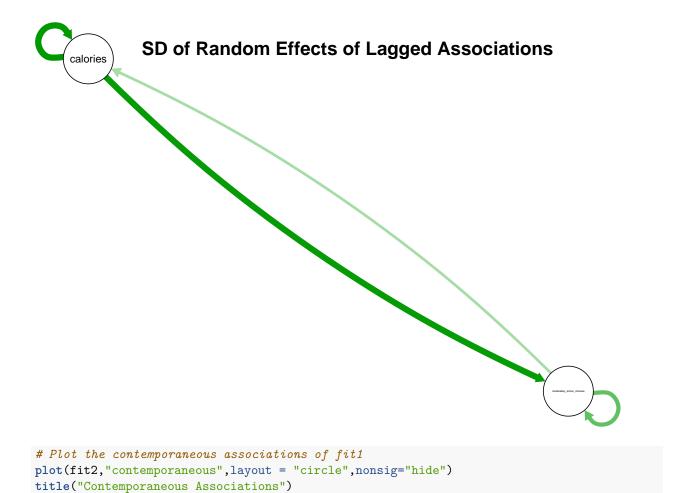


```
fit2 <- mlVAR(completed_data, vars = c("calories", "moderately_active_minutes"), idvar = "id", lags = 1,</pre>
## Estimating temporal and between-subjects effects
     1
##
                                                                                       1
## Estimating contemporaneous effects
##
     ## Computing random effects
##
\# Display the summary of the fit
summary(fit2)
##
## mlVAR estimation completed. Input was:
        - Variables: calories moderately_active_minutes
##
##
        - Lags: 1
##
        - Estimator: lmer
##
        - Temporal: correlated
## Information indices:
```

```
##
                         var
                                 aic
##
                    calories 14828.42 14904.33
   moderately_active_minutes 18492.80 18568.72
##
##
##
## Temporal effects:
##
                        from
                                                   to lag fixed
                                                                   SE
                                                      1 0.611 0.037 0.000
##
                    calories
                                             calories
##
                    calories moderately_active_minutes
                                                      1 0.394 0.039 0.000
                                                      1 -0.134 0.018 0.000
##
  moderately_active_minutes
                                             calories
## moderately_active_minutes moderately_active_minutes 1 -0.031 0.027 0.262
## ran_SD
##
    0.268
##
    0.263
##
    0.093
    0.166
##
##
##
## Contemporaneous effects (posthoc estimated):
                              v2 P 1->2 P 1<-2 pcor ran_SD_pcor cor
##
                         v1
##
   moderately_active_minutes calories
                                         0
                                               0 0.74
                                                             0.142 0.74
   ran_SD_cor
##
        0.142
##
##
## Between-subject effects:
                          v1
                                  v2 P 1->2 P 1<-2 pcor
## moderately_active_minutes calories 0
                                               0 0.549 0.549
# Plot the lagged associations of fit1
plot(fit2,"temporal",layout = "circle",nonsig="hide")
title("Lagged Associations")
```



Plot the SD of random effects of lagged associations for fit1
plot(fit2,"temporal",layout = "circle",nonsig="hide",SD=TRUE)
title("SD of Random Effects of Lagged Associations")

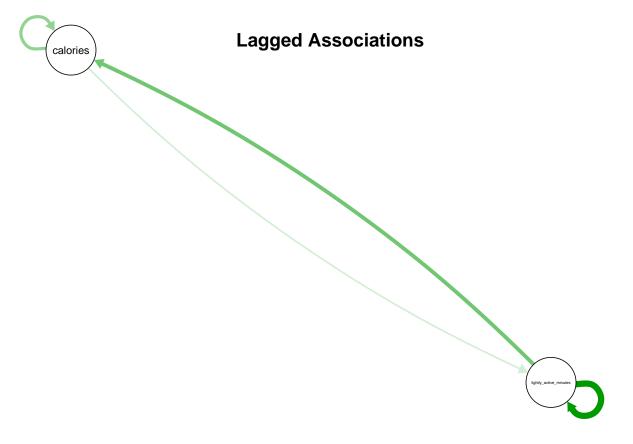


. . .

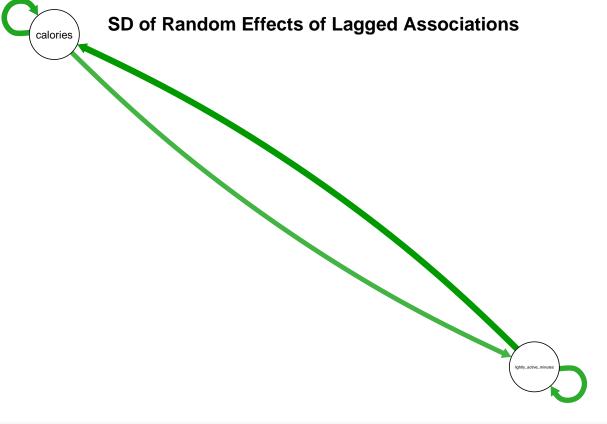
Contemporaneous Associations calories # Estimate the relationship between v1 and v2 using the mlVAR function fit3 <- mlVAR(completed_data, vars = c("calories", "lightly_active_minutes"), idvar = "id", lags = 1, tender to the completed to the complete of the complete ## Estimating temporal and between-subjects effects 1 ## 1 ## Estimating contemporaneous effects ## 1 ## Computing random effects ## # Display the summary of the fit summary(fit3) ## ## mlVAR estimation completed. Input was: - Variables: calories lightly_active_minutes ## - Lags: 1 ## - Estimator: lmer ## - Temporal: correlated

Information indices:

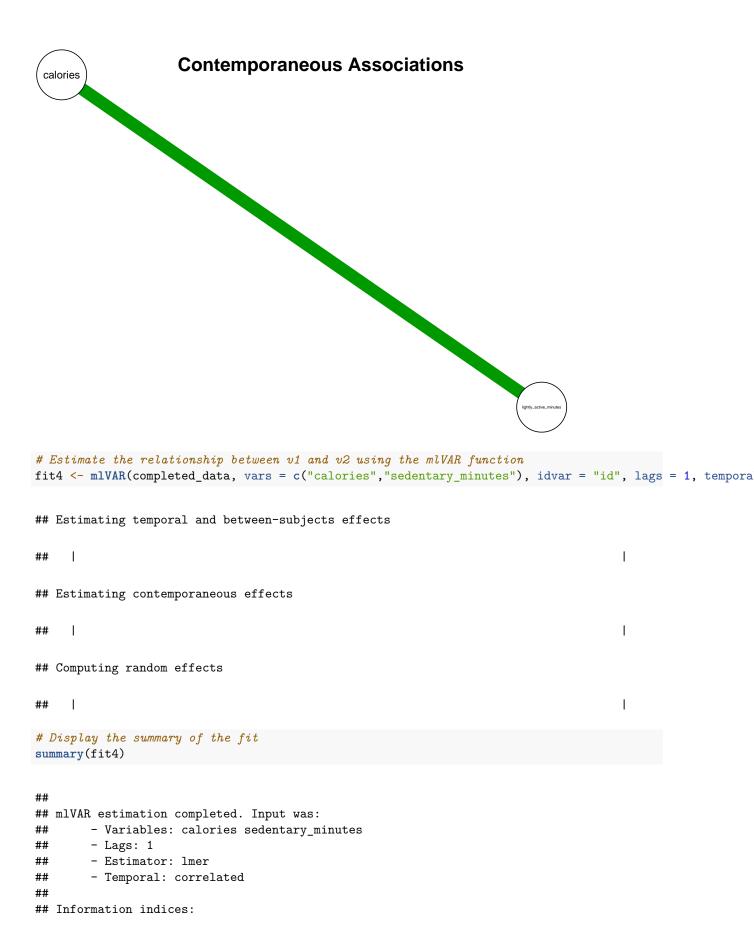
```
##
                             aic
##
                calories 14651.07 14726.98
   lightly_active_minutes 14450.35 14526.26
##
##
##
## Temporal effects:
                    from
                                           to lag fixed
                                                                P ran SD
                                                         SE
                                     ##
                calories
##
                calories lightly_active_minutes 1 0.082 0.033 0.014 0.206
                                     calories 1 0.279 0.039 0.000 0.280
##
  lightly_active_minutes
  lightly_active_minutes lightly_active_minutes 1 0.499 0.034 0.000 0.232
##
##
## Contemporaneous effects (posthoc estimated):
                              v2 P 1->2 P 1<-2 pcor ran_SD_pcor cor
##
                      v1
##
   lightly_active_minutes calories
                                  0 0.787
                                                       0.164 0.787
##
   ran_SD_cor
        0.164
##
##
##
## Between-subject effects:
                              v2 P 1->2 P 1<-2 pcor cor
## lightly_active_minutes calories 0
                                          0 0.481 0.481
# Plot the lagged associations of fit1
plot(fit3,"temporal",layout = "circle",nonsig="hide")
title("Lagged Associations")
```



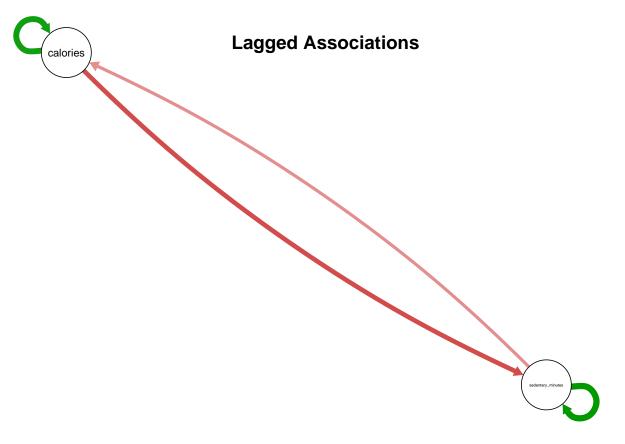
```
# Plot the SD of random effects of lagged associations for fit1
plot(fit3,"temporal",layout = "circle",nonsig="hide",SD=TRUE)
title("SD of Random Effects of Lagged Associations")
```



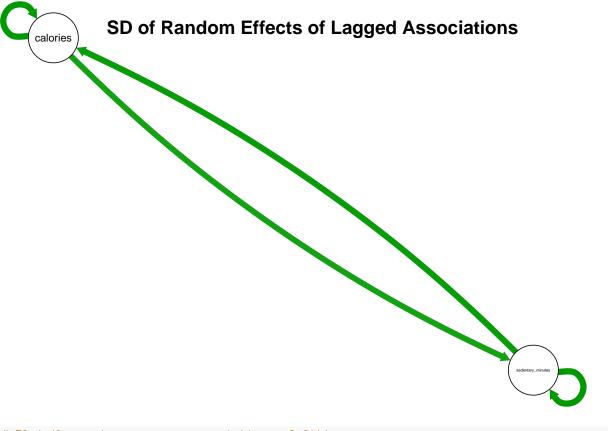
Plot the contemporaneous associations of fit1
plot(fit3,"contemporaneous",layout = "circle",nonsig="hide")
title("Contemporaneous Associations")



```
##
                         aic
##
            calories 14677.97 14753.88
##
   sedentary_minutes 13550.05 13625.96
##
##
## Temporal effects:
##
                from
                                   to lag fixed
                                                    SE P ran_SD
                                       1 0.347 0.033 0 0.233
            calories
##
                             calories
##
            calories sedentary_minutes 1 -0.260 0.031 0 0.215
##
   sedentary_minutes
                             calories 1 -0.163 0.032 0 0.226
   sedentary_minutes sedentary_minutes 1 0.370 0.032 0 0.234
##
##
## Contemporaneous effects (posthoc estimated):
                          v2 P 1->2 P 1<-2 pcor ran_SD_pcor cor ran_SD_cor
##
                  v1
                                      0 -0.546
##
   sedentary_minutes calories
                                0
                                                      0.205 -0.546
##
##
## Between-subject effects:
                  v1
                          v2 P 1->2 P 1<-2 pcor
   sedentary_minutes calories
                                0 0 -0.468 -0.468
\# Plot the lagged associations of fit1
plot(fit4,"temporal",layout = "circle",nonsig="hide")
title("Lagged Associations")
```



```
# Plot the SD of random effects of lagged associations for fit1
plot(fit4,"temporal",layout = "circle",nonsig="hide",SD=TRUE)
title("SD of Random Effects of Lagged Associations")
```



```
# Plot the contemporaneous associations of fit1
plot(fit4,"contemporaneous",layout = "circle",nonsig="hide")
title("Contemporaneous Associations")
```

