Nina_sleep

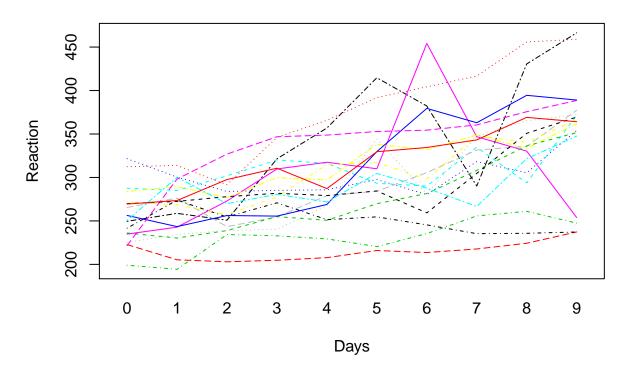
Exploratory analysis

```
sleep <- read.table('sleep.txt')</pre>
```

Spaghetti Plot

```
n <- sleep$Subject %>% unique %>% length
interaction.plot(sleep$Days, sleep$Subject, sleep$Reaction, xlab="Days", ylab="Reaction", col=c(1:n), l
```

Spaghetti Plot



Descriptive Statistics

Overview

```
sleep.mean <- tapply(sleep$Reaction, list(sleep$Days), mean)
sleep.sd <- tapply(sleep$Reaction, list(sleep$Days), sd)
sleep.var <- tapply(sleep$Reaction, list(sleep$Days), var)
sleep.n <- table(sleep$Days)

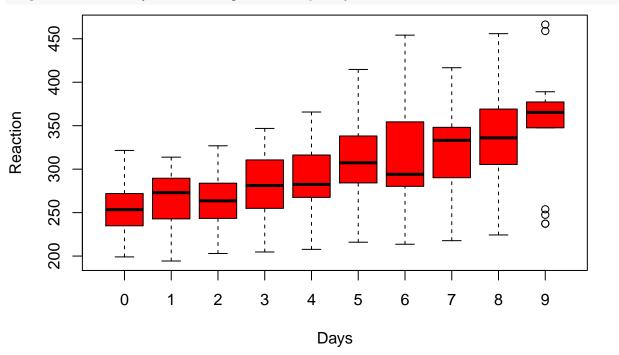
overview <- cbind(c(0:9), sleep.mean, sleep.sd, sleep.var, sleep.n)
colnames(overview) <- c('Days', 'Mean', 'SD', 'Var', 'n')
round(overview, 2)</pre>
```

```
## Days Mean SD Var n
## 0 0 256.65 32.13 1032.30 18
```

```
1 264.50 33.43 1117.59 18
## 1
## 2
        2 265.36 29.47 868.68 18
## 3
       3 282.99 38.86 1509.92 18
        4 288.65 42.54 1809.47 18
## 4
## 5
       5 308.52 51.77 2680.09 18
## 6
       6 312.18 63.17 3990.92 18
        7 318.75 50.10 2510.41 18
       8 336.63 60.20 3624.01 18
## 8
## 9
       9 350.85 66.99 4487.15 18
```

Boxplot

boxplot(Reaction~Days, data=sleep, xlab='Days', ylab='Reaction', col=2)



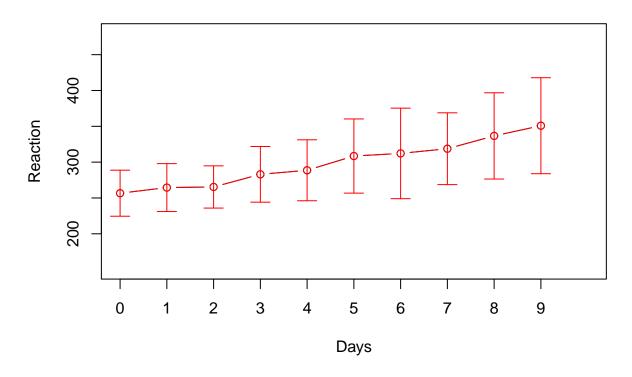
Mean evolution

```
# General function to plot error bars
errbar=function(x,y,height,width,lty=1,col="black"){
arrows(x,y,x,y+height,angle=90,length=width,lty=lty, col=col)
arrows(x,y,x,y-height,angle=90,length=width,lty=lty, col=col)}

## Plotting mean evolution
plot(c(0:9), overview[,2] ,type="b",xlim=c(0,10), ylim=c(150,480),xlab="Days",ylab="Reaction",axes=F, maxis(side=1,at=c(0:9),labels=c(0:9))
axis(side=2,at=seq(200,450,50))

box()
points(c(0:9), overview[,2],type="b",col="red")
errbar(c(0:9),overview[,2], sleep.sd, 0.1, col="red")
```

Mean evolution (with 1 SE intervals)



Correlations

```
## Reshaping the data into a wide form
sleep.resh <- reshape(sleep, timevar = "Days", idvar = c("Subject"), direction = "wide")
sleep.resh</pre>
```

```
##
       Subject Reaction.0 Reaction.1 Reaction.2 Reaction.3 Reaction.4
## 1
                                                      321.4398
           308
                  249.5600
                              258.7047
                                          250.8006
                                                                 356.8519
## 11
           309
                  222.7339
                              205.2658
                                          202.9778
                                                      204.7070
                                                                 207.7161
## 21
           310
                  199.0539
                              194.3322
                                          234.3200
                                                     232.8416
                                                                 229.3074
## 31
           330
                  321.5426
                              300.4002
                                          283.8565
                                                      285.1330
                                                                 285.7973
## 41
                  287.6079
                              285.0000
                                          301.8206
                                                      320.1153
           331
                                                                 316.2773
## 51
           332
                  234.8606
                              242.8118
                                          272.9613
                                                      309.7688
                                                                 317.4629
## 61
           333
                  283.8424
                              289.5550
                                          276.7693
                                                      299.8097
                                                                 297.1710
## 71
           334
                  265.4731
                              276.2012
                                          243.3647
                                                      254.6723
                                                                 279.0244
## 81
           335
                  241.6083
                              273.9472
                                          254.4907
                                                     270.8021
                                                                 251.4519
## 91
           337
                  312.3666
                              313.8058
                                          291.6112
                                                     346.1222
                                                                 365.7324
## 101
           349
                  236.1032
                              230.3167
                                          238.9256
                                                      254.9220
                                                                 250.7103
## 111
           350
                  256.2968
                              243.4543
                                          256.2046
                                                      255.5271
                                                                 268.9165
## 121
           351
                  250.5265
                              300.0576
                                          269.8939
                                                      280.5891
                                                                 271.8274
## 131
           352
                  221.6771
                              298.1939
                                          326.8785
                                                      346.8555
                                                                 348.7402
## 141
           369
                  271.9235
                              268.4369
                                          257.2424
                                                      277.6566
                                                                 314.8222
## 151
           370
                  225.2640
                              234.5235
                                                      240.4730
                                                                 267.5373
                                          238.9008
## 161
           371
                  269.8804
                              272.4428
                                          277.8989
                                                      281.7895
                                                                 279.1705
##
   171
           372
                  269.4117
                              273.4740
                                          297.5968
                                                      310.6316
                                                                 287.1726
##
       Reaction.5 Reaction.6 Reaction.7 Reaction.8 Reaction.9
## 1
         414.6901
                     382.2038
                                             430.5853
                                                         466.3535
                                 290.1486
## 11
         215.9618
                     213.6303
                                 217.7272
                                             224.2957
                                                         237.3142
```

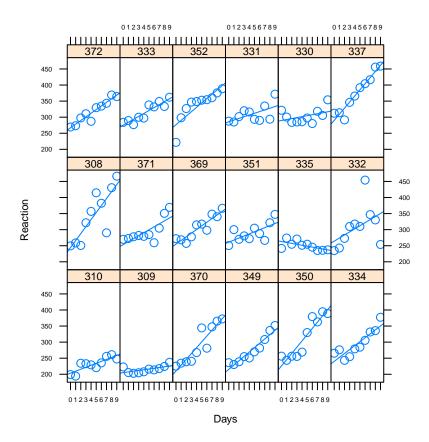
```
## 21
         220.4579
                    235.4208
                                255.7511
                                           261.0125
                                                      247.5153
## 31
         297.5855
                    280.2396
                                318.2613
                                           305.3495
                                                      354.0487
## 41
         293.3187
                    290.0750
                                334.8177
                                           293.7469
                                                      371.5811
                    454.1619
                                346.8311
                                           330.3003
## 51
         309.9976
                                                      253.8644
## 61
         338.1665
                    332.0265
                                348.8399
                                           333.3600
                                                      362.0428
## 71
         284.1912
                    305.5248
                                331.5229
                                           335.7469
                                                      377.2990
         254.6362
                                235.3110
## 81
                    245.4523
                                           235.7541
                                                      237.2466
## 91
         391.8385
                    404.2601
                                416.6923
                                           455.8643
                                                      458.9167
## 101
         269.7744
                    281.5648
                                308.1020
                                           336.2806
                                                      351.6451
## 111
         329.7247
                    379.4445
                                362.9184
                                           394.4872
                                                      389.0527
## 121
         304.6336
                    287.7466
                                266.5955
                                           321.5418
                                                      347.5655
                    354.4266
## 131
         352.8287
                                360.4326
                                           375.6406
                                                      388.5417
## 141
         317.2135
                    298.1353
                                348.1229
                                           340.2800
                                                      366.5131
                    281.1481
                                           365.1630
                                                      372.2288
## 151
         344.1937
                                347.5855
## 161
                    259.2658
                                           350.7807
         284.5120
                                304.6306
                                                      369.4692
## 171
         329.6076
                    334.4818
                                343.2199
                                           369.1417
                                                      364.1236
## Correlation between the Reaction scores at different days
```

cor(sleep.resh[, 2:11])

```
##
             Reaction.0 Reaction.1 Reaction.2 Reaction.3 Reaction.4
## Reaction.0 1.0000000 0.7367164 0.4698205 0.4636914 0.4488568
## Reaction.1
             0.7367164 1.0000000 0.7704196 0.7414557
                                                       0.6510015
## Reaction.2 0.4698205 0.7704196 1.0000000 0.8750718 0.6940106
## Reaction.3 0.4636914 0.7414557 0.8750718 1.0000000 0.9136854
## Reaction.4 0.4488568 0.6510015 0.6940106 0.9136854
                                                       1.0000000
## Reaction.5 0.3719603 0.5289910 0.4921226 0.7220647
                                                       0.8541181
## Reaction.6 0.2217822 0.3149630 0.4543265 0.6748239 0.7493110
## Reaction.7 0.4928691 0.4762225 0.5903260 0.5995546 0.6948864
## Reaction.8
             0.3290845 0.3951707
                                  0.4063653 0.5958373
                                                       0.7445692
## Reaction.9
             0.5157377 0.5464951
                                  0.4232455 0.5657073
                                                       0.7155773
##
             Reaction.5 Reaction.6 Reaction.7 Reaction.8 Reaction.9
## Reaction.0 0.3719603 0.2217822 0.4928691 0.3290845
                                                       0.5157377
## Reaction.1 0.5289910 0.3149630 0.4762225 0.3951707
                                                       0.5464951
## Reaction.2 0.4921226 0.4543265 0.5903260 0.4063653 0.4232455
## Reaction.3 0.7220647 0.6748239 0.5995546 0.5958373 0.5657073
## Reaction.4 0.8541181 0.7493110 0.6948864 0.7445692 0.7155773
## Reaction.5 1.0000000 0.7431791 0.6903115 0.9009653
                                                       0.8377065
## Reaction.6 0.7431791 1.0000000 0.7034522 0.7287104 0.4601183
## Reaction.7 0.6903115 0.7034522 1.0000000 0.7616930 0.6586754
## Reaction.8 0.9009653 0.7287104 0.7616930 1.0000000 0.8813894
## Reaction.9 0.8377065 0.4601183 0.6586754 0.8813894 1.0000000
```

Regression per person

```
## Trellis graph
## Displaying the linear regression per person
cf <-sapply(sleep$Subject, function(x) coef(lm(Reaction~Days, data=subset(sleep, Subject==x))))
Sx <-reorder(sleep$Subject, cf[1,])</pre>
xyplot(Reaction ~ Days|Sx, data=sleep, type=c('p', 'r'), auto.key=T,aspect="xy", par.settings=list(axis
```



Between subject variability

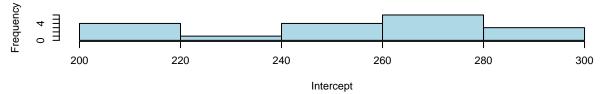
```
## Linear regression per participant of Reaction on Days

## Coefficients
lin.reg.coef <- by(sleep, sleep$Subject, function(data) coef(lm(Reaction ~ Days, data=data)))
lin.reg.coef1 <- unlist(lin.reg.coef)
names(lin.reg.coef1) <- NULL
lin.reg.coef2=matrix(lin.reg.coef1,length(lin.reg.coef1)/2,2,byrow = TRUE)

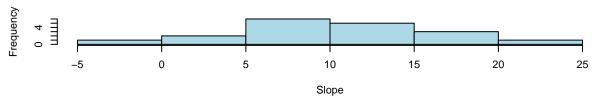
## R squared
lin.reg.r.squared <- by(sleep, sleep$Subject, function(data) summary(lm(Reaction ~ Days, data=data))$r.
lin.reg.r.squared1<- as.vector(unlist(lin.reg.r.squared))

## Histograms
par(mfrow=c(3,1))
hist(lin.reg.coef2[,1],xlab="Intercept",col="lightblue",main="Histogram of individual intercepts")
hist(lin.reg.coef2[,2],xlab="Slope",col="lightblue",main="Histogram of individual slopes")
hist(lin.reg.r.squared1,xlab="R squared",col="lightblue",main="Histogram of individual R squared")</pre>
```

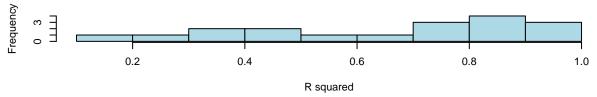
Histogram of individual intercepts



Histogram of individual slopes



Histogram of individual R squared



Fitting the model - with REML

```
sleep.reml <- lmer(formula = Reaction ~ 1+Days + (1 + Days|Subject), data=sleep)
summary(sleep.reml)</pre>
```

```
## Linear mixed model fit by REML ['lmerMod']
## Formula: Reaction ~ 1 + Days + (1 + Days | Subject)
##
      Data: sleep
##
## REML criterion at convergence: 1743.6
##
## Scaled residuals:
                1Q Median
##
       Min
                                3Q
                                       Max
##
  -3.9536 -0.4634 0.0231 0.4633
                                    5.1793
##
## Random effects:
   Groups
             Name
                         Variance Std.Dev. Corr
##
   Subject (Intercept) 611.90
                                  24.737
##
##
             Days
                          35.08
                                   5.923
                                            0.07
   Residual
                         654.94
                                  25.592
## Number of obs: 180, groups: Subject, 18
##
## Fixed effects:
               Estimate Std. Error t value
##
## (Intercept) 251.405
                             6.824 36.843
## Days
                 10.467
                             1.546
                                      6.771
##
```

```
## Correlation of Fixed Effects:
## (Intr)
## Days -0.138
```

Testing fixed effects

```
confint(sleep.reml, par=5:6, method='Wald', oldNames=F)
                   2.5 %
##
                            97.5 %
## (Intercept) 238.030755 264.77945
## Days
                7.437264 13.49731
confint(sleep.reml, method='boot', boot.type='perc', oldNames=F, nsim=500)
## Computing bootstrap confidence intervals ...
## 8 message(s): boundary (singular) fit: see ?isSingular
## 156 warning(s): Model failed to converge with max|grad| = 0.00202609 (tol = 0.002, component 1) (and
                                     2.5 %
                                                97.5 %
                                11.1936511 35.8815139
## sd_(Intercept)|Subject
## cor_Days.(Intercept)|Subject -0.5051895
                                            0.9388739
## sd_Days|Subject
                                 3.1110509
                                            8.4512733
## sigma
                                22.6945301 28.6024327
## (Intercept)
                               237.3863827 264.5817853
                                 6.9845360 13.5586691
## Days
confint(sleep.reml, level=0.95, method='profile', oldNames=F)
## Computing profile confidence intervals ...
                                     2.5 %
                                                97.5 %
## sd_(Intercept)|Subject
                                14.3821019 37.7137452
## cor_Days.(Intercept)|Subject -0.4814998
                                            0.6849868
## sd_Days|Subject
                                3.8011759
                                            8.7540501
                               22.8982726 28.8579976
## sigma
## (Intercept)
                               237.6806976 265.1295138
## Days
                                 7.3586543 13.5759173
```