

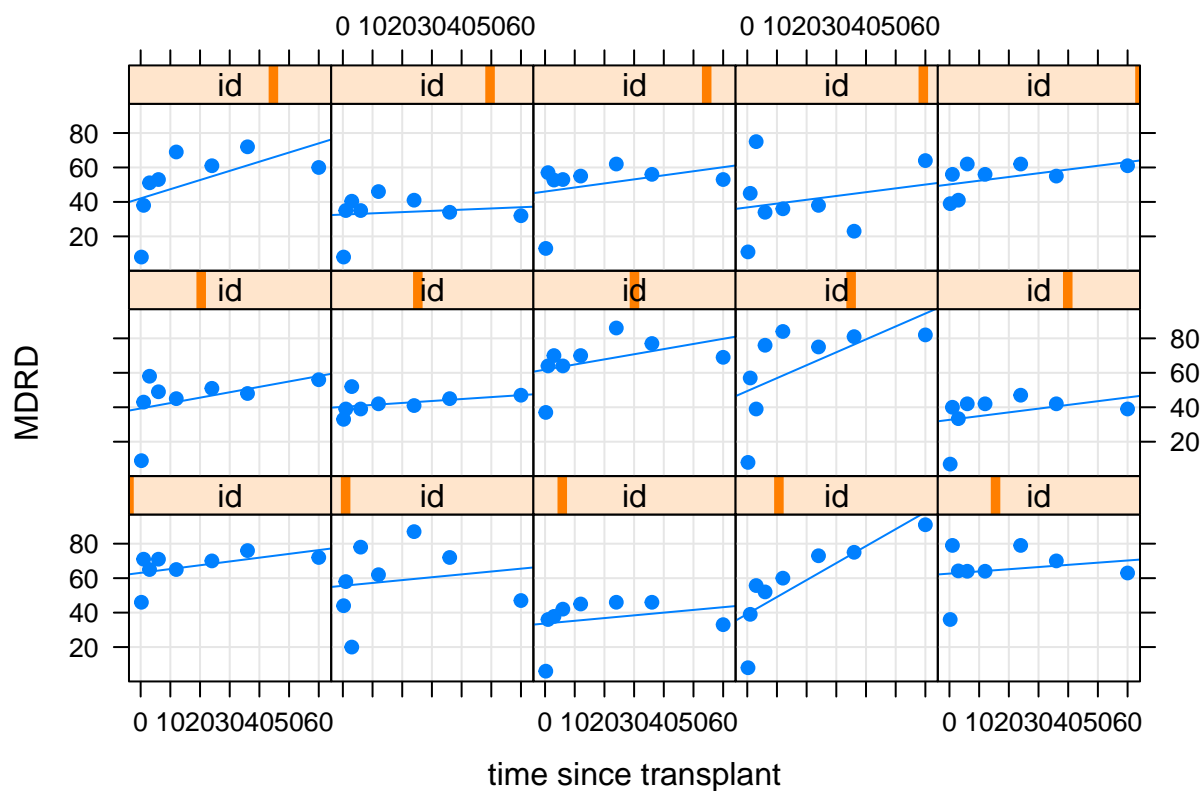
Complex data - project

Stanisław Wilczyński, Anna Zaleska

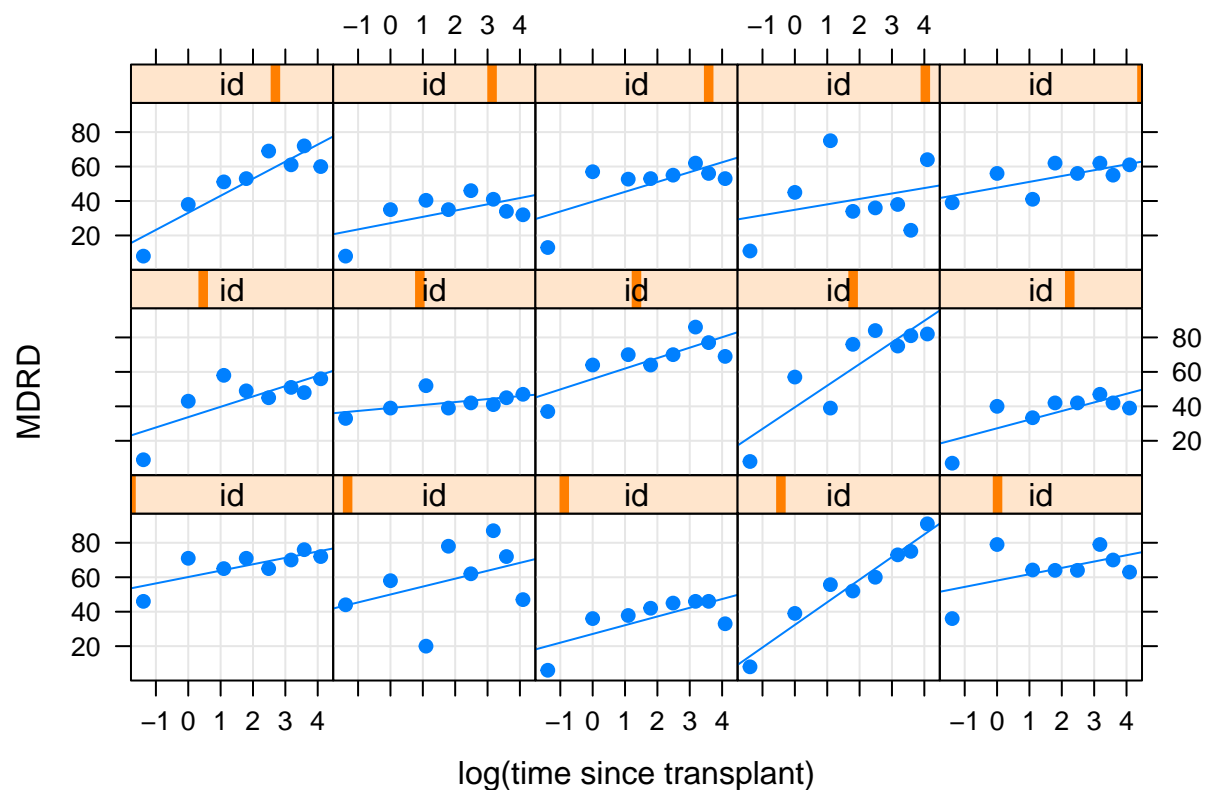
```
lkidney <- reshape(kidney, direction = "long", varying = list(9:16), v.names = c("MDRD"), times = c(1/4),
lkidney$ltime <- log(lkidney$time)

lkidney.plot <- reshape(kidney[1:15,], direction = "long", varying = list(9:16), v.names = c("MDRD"), t
lkidney.plot$ltime <- log(lkidney.plot$time)

xyplot(MDRD ~ time | id, lkidney.plot, type=c("g","p","r"), xlab = "time since transplant", ylab = "MDRD")
```



```
xyplot(MDRD ~ ltime | id, lkidney.plot, type=c("g","p","r"), xlab = "log(time since transplant)", ylab = "MDRD")
```



Analiza bez efektów losowych (Stachu)

Analiza z efektami losowymi (Ania)

```
const.mixed.model <- lmer(MDRD~ltime+ (1|id),
  data = lkidney, REML = FALSE)
summary(const.mixed.model)
```

```
## Linear mixed model fit by maximum likelihood ['lmerMod']
## Formula: MDRD ~ ltime + (1 | id)
## Data: lkidney
##
##      AIC      BIC   logLik deviance df.resid
## 22550.1 22573.7 -11271.1 22542.1    2668
##
## Scaled residuals:
##      Min       1Q   Median       3Q      Max
## -4.7452 -0.4866  0.0206  0.5402  4.4121
##
## Random effects:
## Groups   Name                Variance Std.Dev.
## id       (Intercept)         140.7    11.86
## Residual                    214.8    14.66
## Number of obs: 2672, groups: id, 334
##
```

```

## Fixed effects:
##           Estimate Std. Error t value
## (Intercept) 40.1081    0.7691   52.15
## ltime       4.5119    0.1614   27.95
##
## Correlation of Fixed Effects:
##      (Intr)
## ltime -0.390

lin.mixed.model <- lmer(MDRD~ltime+ (ltime|id),
                        data = lkidney, REML = FALSE)
print(summary(lin.mixed.model))

## Linear mixed model fit by maximum likelihood ['lmerMod']
## Formula: MDRD ~ ltime + (ltime | id)
## Data: lkidney
##
##      AIC      BIC   logLik deviance df.resid
## 22445.1 22480.5 -11216.6 22433.1     2666
##
## Scaled residuals:
##      Min       1Q   Median       3Q      Max
## -4.3317 -0.4637 -0.0046  0.4961  3.8846
##
## Random effects:
## Groups   Name      Variance Std.Dev. Corr
## id      (Intercept) 135.112   11.624
##         ltime       8.375    2.894  -0.16
## Residual          185.263   13.611
## Number of obs: 2672, groups: id, 334
##
## Fixed effects:
##           Estimate Std. Error t value
## (Intercept) 40.1081    0.7425   54.02
## ltime       4.5119    0.2181   20.69
##
## Correlation of Fixed Effects:
##      (Intr)
## ltime -0.355

quadr.mixed.model <- lmer(MDRD~ltime + I(ltime^2) + (ltime + I(ltime^2)|id),
                          data = lkidney, REML = FALSE)

### nie dziala dla kwadratowego, bo nie zbiega odpowiednio szybko
# quadr.mixed.model <- lme(MDRD~ltime + I(ltime^2),
#                          random = ~ltime + I(ltime^2)|factor(id),
#                          data = lkidney)
# summary(quadr.mixed.model)

anova(const.mixed.model,lin.mixed.model,quadr.mixed.model)

## Data: lkidney
## Models:
## const.mixed.model: MDRD ~ ltime + (1 | id)
## lin.mixed.model: MDRD ~ ltime + (ltime | id)
## quadr.mixed.model: MDRD ~ ltime + I(ltime^2) + (ltime + I(ltime^2) | id)

```

```

##           Df    AIC    BIC logLik deviance  Chisq Chi Df Pr(>Chisq)
## const.mixed.model  4 22550 22574 -11271    22542
## lin.mixed.model    6 22445 22481 -11217    22433 108.96      2 < 2.2e-16
## quadr.mixed.model 10 22059 22118 -11020    22039 393.72      4 < 2.2e-16
##
## const.mixed.model
## lin.mixed.model    ***
## quadr.mixed.model ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

full.model <- lmer(MDRD~donor.age + recipient.age + therapy + diabetes + bpl.drugs + discrepancy.AB + d
summary(full.model)

## Linear mixed model fit by maximum likelihood ['lmerMod']
## Formula:
## MDRD ~ donor.age + recipient.age + therapy + diabetes + bpl.drugs +
##      discrepancy.AB + discrepancy.DR + ltime + I(ltime^2) + (ltime +
##      I(ltime^2) | id)
## Data: lkidney
##
##      AIC      BIC   logLik deviance df.resid
## 21983.1 22089.2 -10973.6 21947.1    2654
##
## Scaled residuals:
##      Min       1Q   Median       3Q      Max
## -4.3697 -0.4479 -0.0326  0.4543  4.1356
##
## Random effects:
## Groups   Name                Variance Std.Dev. Corr
## id       (Intercept)    126.397   11.243
##          ltime           28.749    5.362  -0.01
##          I(ltime^2)      2.392    1.547  -0.25 -0.80
## Residual              134.108   11.581
## Number of obs: 2672, groups: id, 334
##
## Fixed effects:
##              Estimate Std. Error t value
## (Intercept)  68.80701    3.41005  20.178
## donor.age    -0.30158    0.05014  -6.015
## recipient.age -0.14409    0.05866  -2.456
## therapycm    -1.41613    1.56778  -0.903
## therapytc    -4.75645    1.47247  -3.230
## diabetes      2.76100    1.48430   1.860
## bpl.drugs    -2.14935    0.54826  -3.920
## discrepancy.AB -0.79371    0.71056  -1.117
## discrepancy.DR -0.38099    1.15298  -0.330
## ltime         8.86844    0.38998  22.741
## I(ltime^2)    -1.54412    0.11580 -13.335
##
## Correlation of Fixed Effects:
##              (Intr) donr.g rcpnt. thrpyc thrpyt diabts bpl.dr dsc.AB dsc.DR
## donor.age    -0.331
## recipient.g  -0.573 -0.219
## therapycm    -0.132 -0.145  0.114

```

```

## therapytc -0.077 -0.268 0.135 0.399
## diabetes 0.139 -0.015 -0.244 -0.027 -0.004
## bpl.drugs -0.231 -0.106 -0.065 -0.046 -0.104 -0.100
## dscrpnycy.AB -0.399 -0.076 0.009 -0.002 0.046 0.004 -0.062
## dscrpnycy.DR -0.264 0.010 0.023 -0.004 -0.069 -0.086 0.140 -0.058
## ltime -0.007 0.000 0.000 0.000 0.000 0.000 0.000 0.000 0.000
## I(ltime^2) -0.053 0.000 0.000 0.000 0.000 0.000 0.000 0.000 0.000
##
## ltime
## donor.age
## recipient.g
## therapycm
## therapytc
## diabetes
## bpl.drugs
## dscrpnycy.AB
## dscrpnycy.DR
## ltime
## I(ltime^2) -0.829

```

```
anova(full.model)
```

```

## Analysis of Variance Table
##
## Df Sum Sq Mean Sq F value
## donor.age 1 9696 9696 72.3003
## recipient.age 1 536 536 4.0003
## therapy 2 1736 868 6.4719
## diabetes 1 297 297 2.2152
## bpl.drugs 1 2124 2124 15.8391
## discrepancy.AB 1 174 174 1.2953
## discrepancy.DR 1 15 15 0.1092
## ltime 1 58576 58576 436.7797
## I(ltime^2) 1 23846 23846 177.8114

```