Data analysis Pilot 2

2024-11-22

Contents

Fit algorithm definition	L
Dataset loading	3
Dataset preparation	3
Variables plot (violin & boxplot + density)	1
Statistical models	

Fit algorithm definition

```
fit_algo <- function(new_call,</pre>
                      newData = NULL,
                       type = "lmer")
  if (type != "lmer" && type != "glmer")
    stop("type must be lmer or glmer")
  new_call["start"] <- NULL</pre>
  new_call["control"] <-</pre>
    parse(text = paste0(
       'Control(optimizer ="bobyqa", optCtrl = list(maxfun=1000000))'
  error_msg <- tryCatch({</pre>
    rval <- eval(new_call)</pre>
    if (length(rval@optinfo$conv$lme4) != 0)
      "convergence"
    }
    else
      "ok"
  }, error = function(e) {
    "error"
  })
  count <- 0
  while (error_msg != "ok" && count < 4)</pre>
    if (error_msg == "convergence")
      new_call["start"] <- parse(text = "list(fixef = fixef(rval))")</pre>
```

```
count <- count + 1</pre>
  error_msg <- tryCatch({</pre>
    rval <- eval(new_call)</pre>
    if (length(rval@optinfo$conv$lme4) != 0)
       "convergence"
    else
    {
      "ok"
  }, error = function(e) {
    "error"
  })
new_call["start"] <- NULL</pre>
new_call["control"] <-</pre>
  parse(text = paste0(
     'Control(optimizer ="Nelder_Mead", optCtrl = list(maxfun=1000000))'
  ))
count <- 0
while (error_msg != "ok" && count < 5)</pre>
  count <- count + 1</pre>
  error_msg <- tryCatch({</pre>
    rval <- eval(new call)</pre>
    if (length(rval@optinfo$conv$lme4) != 0)
       "convergence"
    }
    else
      "ok"
  }, error = function(e) {
    "error"
  })
  if (error_msg == "convergence")
    new_call["start"] <- parse(text = "list(fixef = fixef(rval))")</pre>
  }
new_call["start"] <- NULL</pre>
new_call["control"] <- NULL</pre>
count <- 0
while (error_msg != "ok" && count < 5)</pre>
  count <- count + 1</pre>
  error_msg <- tryCatch({</pre>
    rval <- eval(new_call)</pre>
    if (length(rval@optinfo$conv$lme4) != 0)
```

```
{
    "convergence"
}
else
{
    "ok"
}
}, error = function(e) {
    "error"
})
if (error_msg == "convergence")
{
    new_call["start"] <- parse(text = "list(fixef = fixef(rval))")
}

if (!exists("rval"))
{
    eval(new_call)
}
return(rval)
}</pre>
```

Dataset loading

Dataset preparation

```
d <- d %>% mutate(Subject = rep(seq_len(length(datasets)), each = 100))
```

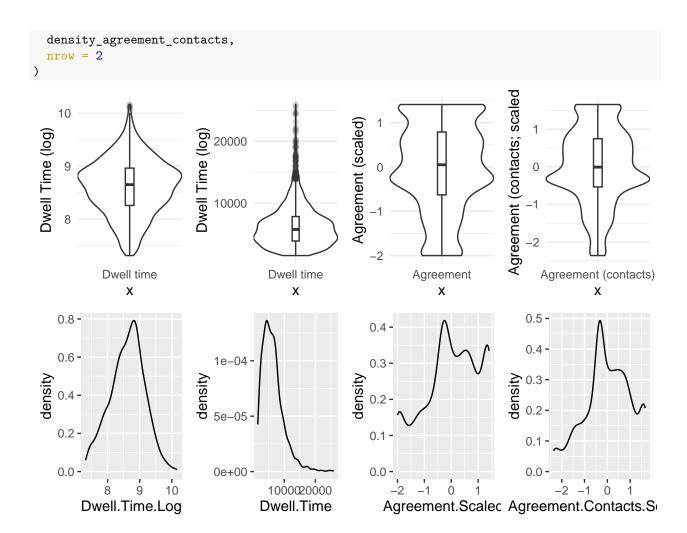
Then we remove total dwell times ≤ 1500 ms, scale the Agreement feature and take its square, and log-transform Dwell. Time. We do the same with Agreement. Contacts

```
d_final <- d %>% filter(Dwell.Time > 1500) %>%
mutate(
   Dwell.Time.Log = log(Dwell.Time),
   Agreement.Scaled = (Agreement - mean(Agreement)) / sd(Agreement),
   Squared.Agreement.Scaled = Agreement.Scaled ^ 2,
   Agreement.Contacts.Scaled = (Agreement.Contacts - mean(Agreement.Contacts)) /
   sd(Agreement.Contacts),
   Squared.Agreement.Contacts.Scaled = Agreement.Contacts.Scaled ^
   2,
```

```
Index = as.factor(Index),
    Subject = as.factor(Subject)
)
d_final$Condition <- as.factor(d_final$Condition_Share)
levels(d_final$Condition) <- c("Reading", "Sharing")</pre>
```

Variables plot (violin & boxplot + density)

```
violin fixation log <-
  ggplot(d_final, aes(x = "Dwell time", y = Dwell.Time.Log)) +
  ylab("Dwell Time (log)") + theme_minimal() +
  theme(legend.position = "none") +
  geom_violin(width = 1.2) + geom_boxplot(width = 0.1, alpha = 0.2)
violin_fixation <-</pre>
  ggplot(d_final, aes(x = "Dwell time", y = Dwell.Time)) +
  ylab("Dwell Time (log)") + theme_minimal() +
  theme(legend.position = "none") +
  geom_violin(width = 1.2) + geom_boxplot(width = 0.1, alpha = 0.2)
violin_agreement <-</pre>
  ggplot(d_final, aes(x = "Agreement", y = Agreement.Scaled)) +
  ylab("Agreement (scaled)") + theme_minimal() +
  theme(legend.position = "none") +
  geom_violin(width = 1.2) + geom_boxplot(width = 0.1, alpha = 0.2)
violin_agreement_contacts <-</pre>
  ggplot(d_final,
         aes(x = "Agreement (contacts)", y = Agreement.Contacts.Scaled)) +
  ylab("Agreement (contacts; scaled)") + theme minimal() +
  theme(legend.position = "none") +
  geom_violin(width = 1.2) + geom_boxplot(width = 0.1, alpha = 0.2)
density_fixation_log <-</pre>
  ggplot(d_final, aes(x = Dwell.Time.Log)) + geom_density()
density_fixation <-</pre>
  ggplot(d_final, aes(x = Dwell.Time)) + geom_density()
density_agreement <-</pre>
  ggplot(d_final, aes(x = Agreement.Scaled)) + geom_density()
density_agreement_contacts <-</pre>
  ggplot(d_final, aes(x = Agreement.Contacts.Scaled)) + geom_density()
grid.arrange(
 violin_fixation_log,
 violin fixation,
  violin_agreement,
  violin_agreement_contacts,
  density_fixation_log,
  density_fixation,
  density_agreement,
```



Statistical models

Agreement

boundary (singular) fit: see help('isSingular')

```
## boundary (singular) fit: see help('isSingular')
## boundary (singular) fit: see help('isSingular')
summary(fit_personal_log)
## Linear mixed model fit by REML. t-tests use Satterthwaite's method [
## lmerModLmerTest]
## Formula: Dwell.Time.Log ~ Agreement.Scaled + Squared.Agreement.Scaled +
       Condition_Share + Agreement.Scaled * Condition_Share + Squared.Agreement.Scaled *
##
##
       Condition_Share + (1 | Index) + (Agreement.Scaled + Squared.Agreement.Scaled |
##
       Subject)
##
      Data: d_final
## REML criterion at convergence: 2632
##
## Scaled residuals:
      Min
               1Q Median
                                       Max
## -3.6092 -0.6398 -0.0055 0.5816 4.0266
## Random effects:
## Groups
                                      Variance Std.Dev. Corr
            Name
##
   Index
             (Intercept)
                                      2.270e-02 0.150654
##
   Subject (Intercept)
                                      1.118e-01 0.334403
##
             Agreement.Scaled
                                      8.792e-05 0.009377 0.58
             Squared.Agreement.Scaled 5.818e-04 0.024120 -0.50 -1.00
##
##
  Residual
                                      1.615e-01 0.401920
## Number of obs: 2315, groups: Index, 100; Subject, 26
## Fixed effects:
##
                                              Estimate Std. Error
## (Intercept)
                                              8.701902 0.095539 25.021471
## Agreement.Scaled
                                             -0.012183
                                                         0.013592 149.340784
## Squared.Agreement.Scaled
                                             -0.005727
                                                         0.014419
                                                                   24.948833
                                             -0.280702
## Condition_Share
                                                         0.133497
                                                                   23.856726
## Agreement.Scaled:Condition_Share
                                              0.045423
                                                         0.019247 162.805445
## Squared.Agreement.Scaled:Condition_Share
                                              0.020520
                                                         0.020802 27.114539
##
                                            t value Pr(>|t|)
## (Intercept)
                                             91.082
                                                      <2e-16 ***
## Agreement.Scaled
                                             -0.896
                                                      0.3715
## Squared.Agreement.Scaled
                                             -0.397
                                                      0.6946
## Condition_Share
                                             -2.103
                                                      0.0462 *
## Agreement.Scaled:Condition_Share
                                              2.360
                                                      0.0195 *
## Squared.Agreement.Scaled:Condition_Share
                                              0.986
                                                      0.3326
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Correlation of Fixed Effects:
               (Intr) Agrm.S Sq.A.S Cndt_S A.S:C_
##
## Agrmnt.Scld 0.058
## Sqrd.Agrm.S -0.343 0.168
## Conditn_Shr -0.697 -0.042 0.241
## Agrmn.S:C_S -0.044 -0.618 -0.105 0.060
## Sqr.A.S:C_S 0.234 -0.114 -0.668 -0.339 0.234
## optimizer (nloptwrap) convergence code: 0 (OK)
## boundary (singular) fit: see help('isSingular')
```

```
personal_call <-
  parse(text = 'lmer(Dwell.Time ~ Agreement.Scaled + Squared.Agreement.Scaled + Condition_Share + Agree
                    (1 \mid Index) +
                    (1 | Subject),
                  data=d_final)')[[1]]
fit_personal <- fit_algo(personal_call)</pre>
summary(fit_personal)
## Linear mixed model fit by REML. t-tests use Satterthwaite's method [
## lmerModLmerTest]
## Formula:
## Dwell.Time ~ Agreement.Scaled + Squared.Agreement.Scaled + Condition_Share +
       Agreement.Scaled * Condition_Share + Squared.Agreement.Scaled *
##
##
       Condition_Share + (1 | Index) + (1 | Subject)
      Data: d_final
## Control: lmerControl(optimizer = "bobyqa", optCtrl = list(maxfun = 1e+06))
## REML criterion at convergence: 43324.4
##
## Scaled residuals:
##
      Min
                1Q Median
                                30
                                       Max
## -2.6058 -0.6081 -0.1498 0.4009 6.0044
##
## Random effects:
## Groups Name
                        Variance Std.Dev.
             (Intercept) 1148897 1072
## Subject (Intercept) 3379417 1838
                         7298004 2701
## Residual
## Number of obs: 2315, groups: Index, 100; Subject, 26
## Fixed effects:
                                            Estimate Std. Error
                                                                      df t value
## (Intercept)
                                             6717.48
                                                         533.63
                                                                   27.18 12.588
## Agreement.Scaled
                                              -20.07
                                                          89.10 2289.05 -0.225
## Squared.Agreement.Scaled
                                              -41.39
                                                          83.83 2274.14 -0.494
## Condition_Share
                                                         739.96
                                            -1315.29
                                                                   25.15 -1.778
## Agreement.Scaled:Condition Share
                                              294.71
                                                         126.14 2225.07 2.336
## Squared.Agreement.Scaled:Condition_Share
                                                         121.71 2234.12 1.011
                                              123.03
                                            Pr(>|t|)
## (Intercept)
                                            7.46e-13 ***
## Agreement.Scaled
                                              0.8218
## Squared.Agreement.Scaled
                                              0.6216
## Condition_Share
                                              0.0876 .
## Agreement.Scaled:Condition_Share
                                              0.0196 *
## Squared.Agreement.Scaled:Condition_Share
                                              0.3122
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Correlation of Fixed Effects:
               (Intr) Agrm.S Sq.A.S Cndt_S A.S:C_
## Agrmnt.Scld -0.060
## Sqrd.Agrm.S -0.161 0.320
```

```
## Conditn_Shr -0.691 0.043 0.111
## Agrmn.S:C_S 0.039 -0.612 -0.207 -0.061
## Sqr.A.S:C_S 0.106 -0.217 -0.656 -0.158 0.392
d_final$personal_log_prediction <-</pre>
  exp(predict(fit_personal_log, re.form = NA))
d_final$personal_prediction <- predict(fit_personal, re.form = NA)</pre>
p1 <- ggplot(d_final) +</pre>
  geom_line(
    aes(
      x = Agreement.Scaled,
      personal_log_prediction,
      color = Condition,
      group = Condition
    ),
    linewidth = 1.5
  theme_minimal_grid(12) + labs(y = "TDT", x = "Agreement")
p2 <- ggplot(d_final) +</pre>
  geom_line(
    aes(
      x = Agreement.Scaled,
      personal_prediction,
      color = Condition,
```

group = Condition

theme_minimal_grid(12) + labs(y = "TDT", x = "Agreement")

labels = c("Log-transformed", "Normal-assumed errors"),

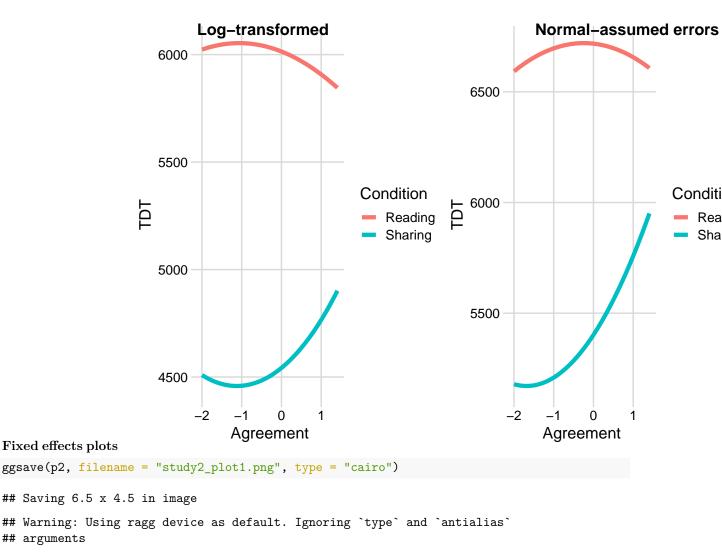
linewidth = 1.5

label_size = 12

),

plot_grid(
 p1,
 p2,

)



Agreement (contacts)

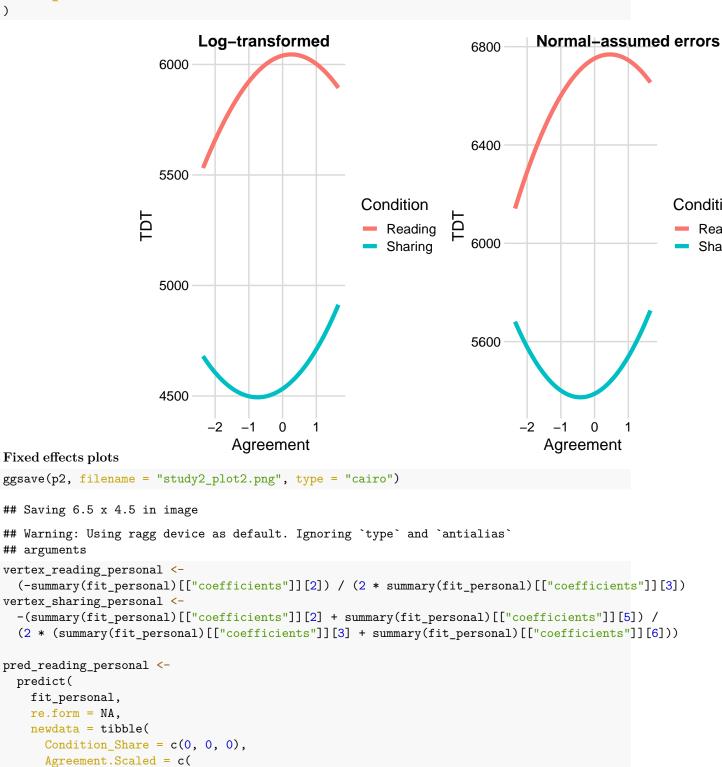
```
## boundary (singular) fit: see help('isSingular')
```

```
## boundary (singular) fit: see help('isSingular')
summary(fit contacts log)
## Linear mixed model fit by REML. t-tests use Satterthwaite's method [
## lmerModLmerTest]
## Formula:
## Dwell.Time.Log ~ Agreement.Contacts.Scaled + Squared.Agreement.Contacts.Scaled +
       Condition Share + Agreement.Contacts.Scaled * Condition Share +
       Squared.Agreement.Contacts.Scaled * Condition_Share + (1 |
##
##
       Index) + (Agreement.Contacts.Scaled + Squared.Agreement.Contacts.Scaled |
##
       Subject)
      Data: d_final
##
##
## REML criterion at convergence: 2636.9
##
## Scaled residuals:
##
      Min
                1Q Median
                                       Max
## -3.6476 -0.6340 0.0012 0.5744 3.9408
##
## Random effects:
## Groups
                                               Variance Std.Dev. Corr
                                               0.0228457 0.151148
## Index
             (Intercept)
   Subject (Intercept)
                                               0.1079789 0.328601
##
             Agreement.Contacts.Scaled
                                               0.0001021 0.010104 -1.00
             Squared.Agreement.Contacts.Scaled 0.0000495 0.007035 -1.00 1.00
##
##
  Residual
                                               0.1623486 0.402925
## Number of obs: 2315, groups: Index, 100; Subject, 26
## Fixed effects:
##
                                                       Estimate Std. Error
## (Intercept)
                                                       8.706192 0.093677
## Agreement.Contacts.Scaled
                                                                  0.013365
                                                       0.006698
## Squared.Agreement.Contacts.Scaled
                                                      -0.012983
                                                                  0.010674
                                                      -0.287188
## Condition_Share
                                                                  0.130958
## Agreement.Contacts.Scaled:Condition_Share
                                                       0.016318
                                                                  0.018881
## Squared.Agreement.Contacts.Scaled:Condition_Share
                                                       0.028508
                                                                  0.015926
##
                                                             df t value Pr(>|t|)
## (Intercept)
                                                      24.853105 92.939
                                                                          <2e-16
                                                                 0.501
## Agreement.Contacts.Scaled
                                                     267.499796
                                                                          0.6167
## Squared.Agreement.Contacts.Scaled
                                                     334.703612 -1.216
                                                                          0.2247
## Condition_Share
                                                      23.743559 -2.193
                                                                          0.0383
## Agreement.Contacts.Scaled:Condition_Share
                                                     270.638917
                                                                  0.864
                                                                          0.3882
## Squared.Agreement.Contacts.Scaled:Condition_Share 413.064541
                                                                  1.790
                                                                          0.0742
## (Intercept)
                                                      ***
## Agreement.Contacts.Scaled
## Squared.Agreement.Contacts.Scaled
## Condition_Share
```

```
## Agreement.Contacts.Scaled:Condition_Share
## Squared.Agreement.Contacts.Scaled:Condition_Share .
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Correlation of Fixed Effects:
               (Intr) Ag.C.S Sq.A.C.S Cndt_S A.C.S:
## Agrmnt.Cn.S -0.230
## Sqrd.Ag.C.S -0.287 0.257
## Conditn_Shr -0.696 0.164 0.203
## Agr.C.S:C_S 0.162 -0.647 -0.173
                                      -0.242
## S.A.C.S:C_S 0.191 -0.173 -0.652
                                      -0.285 0.341
## optimizer (nloptwrap) convergence code: 0 (OK)
## boundary (singular) fit: see help('isSingular')
contacts_call <-</pre>
  parse(text = 'lmer(Dwell.Time ~ Agreement.Contacts.Scaled + Squared.Agreement.Contacts.Scaled + Condi
                    (1 \mid Index) +
                    (1 | Subject),
                  data=d_final)')[[1]]
fit_contacts <- fit_algo(contacts_call)</pre>
summary(fit_contacts)
## Linear mixed model fit by REML. t-tests use Satterthwaite's method [
## lmerModLmerTest]
## Formula:
## Dwell.Time ~ Agreement.Contacts.Scaled + Squared.Agreement.Contacts.Scaled +
       Condition_Share + Agreement.Contacts.Scaled * Condition_Share +
##
       Squared.Agreement.Contacts.Scaled * Condition_Share + (1 |
##
##
       Index) + (1 | Subject)
      Data: d_final
## Control: lmerControl(optimizer = "bobyqa", optCtrl = list(maxfun = 1e+06))
## REML criterion at convergence: 43329.4
##
## Scaled residuals:
##
               1Q Median
      Min
                                3Q
                                       Max
## -2.6140 -0.6151 -0.1511 0.3950 6.1987
##
## Random effects:
## Groups
           Name
                         Variance Std.Dev.
             (Intercept) 1148847 1072
## Index
## Subject (Intercept) 3344721
                                 1829
## Residual
                         7313227 2704
## Number of obs: 2315, groups: Index, 100; Subject, 26
## Fixed effects:
##
                                                      Estimate Std. Error
                                                      6752.037
                                                                  528.759
## (Intercept)
## Agreement.Contacts.Scaled
                                                        72.086
                                                                   88,260
## Squared.Agreement.Contacts.Scaled
                                                       -79.218
                                                                   70.935
## Condition_Share
                                                     -1364.082
                                                                  733.992
## Agreement.Contacts.Scaled:Condition_Share
                                                        -3.012
                                                                  124.555
```

```
## Squared.Agreement.Contacts.Scaled:Condition_Share
                                                       161.221 105.953
##
                                                            df t value Pr(>|t|)
## (Intercept)
                                                        26.704 12.770 6.98e-13
## Agreement.Contacts.Scaled
                                                      2296.505
                                                                0.817
                                                                          0.414
                                                      2261.690 -1.117
## Squared.Agreement.Contacts.Scaled
                                                                          0.264
## Condition Share
                                                        24.810 -1.858
                                                                        0.075
## Agreement.Contacts.Scaled:Condition Share
                                                      2235.007 -0.024 0.981
                                                                1.522
## Squared.Agreement.Contacts.Scaled:Condition_Share 2235.681
                                                                          0.128
##
## (Intercept)
                                                     ***
## Agreement.Contacts.Scaled
## Squared.Agreement.Contacts.Scaled
## Condition_Share
## Agreement.Contacts.Scaled:Condition_Share
## Squared.Agreement.Contacts.Scaled:Condition_Share
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Correlation of Fixed Effects:
               (Intr) Ag.C.S Sq.A.C.S Cndt_S A.C.S:
## Agrmnt.Cn.S -0.032
## Sqrd.Ag.C.S -0.132 0.235
## Conditn_Shr -0.690 0.022 0.092
## Agr.C.S:C_S 0.021 -0.643 -0.157
                                      -0.043
## S.A.C.S:C_S 0.086 -0.158 -0.650 -0.138 0.324
d_final$contacts_log_prediction <-</pre>
  exp(predict(fit_contacts_log, re.form = NA))
d_final$contacts_prediction <- predict(fit_contacts, re.form = NA)</pre>
p1 <- ggplot(d_final) +
  geom_line(
   aes(
     x = Agreement.Contacts.Scaled,
     contacts_log_prediction,
     color = Condition,
     group = Condition
   ),
   linewidth = 1.5
  ) +
  theme_minimal_grid(12) + labs(y = "TDT", x = "Agreement")
p2 <- ggplot(d_final) +</pre>
  geom_line(
   aes(
     x = Agreement.Contacts.Scaled,
     contacts_prediction,
     color = Condition,
     group = Condition
   ),
   linewidth = 1.5
 ) +
  theme_minimal_grid(12) + labs(y = "TDT", x = "Agreement")
```

```
plot_grid(
  p1,
  p2,
  labels = c("Log-transformed", "Normal-assumed errors"),
  label_size = 12
```



arguments

predict(

```
min(d_final$Agreement.Scaled),
        vertex_reading_personal,
        max(d_final$Agreement.Scaled)
      Squared.Agreement.Scaled = Agreement.Scaled ** 2
  )
pred_sharing_personal <-</pre>
 predict(
    fit_personal,
    re.form = NA,
    newdata = tibble(
      Condition_Share = c(1, 1, 1),
      Agreement.Scaled = c(
        min(d_final$Agreement.Scaled),
        vertex_sharing_personal,
        max(d_final$Agreement.Scaled)
      Squared.Agreement.Scaled = Agreement.Scaled ** 2
  )
vertex_reading_contacts <-</pre>
  (-summary(fit_contacts)[["coefficients"]][2]) / (2 * summary(fit_contacts)[["coefficients"]][3])
vertex_sharing_contacts <-</pre>
  -(summary(fit_contacts)[["coefficients"]][2] + summary(fit_contacts)[["coefficients"]][5]) /
  (2 * (summary(fit_contacts)[["coefficients"]][3] + summary(fit_contacts)[["coefficients"]][6]))
pred_reading_contacts <-</pre>
 predict(
    fit_contacts,
    re.form = NA,
    newdata = tibble(
      Condition_Share = c(0, 0, 0),
      Agreement.Contacts.Scaled = c(
        min(d_final$Agreement.Contacts.Scaled),
        vertex_reading_contacts,
        max(d_final$Agreement.Contacts.Scaled)
      Squared.Agreement.Contacts.Scaled = Agreement.Contacts.Scaled ** 2
    )
  )
pred_sharing_contacts <-</pre>
 predict(
    fit_contacts,
    re.form = NA,
    newdata = tibble(
      Condition_Share = c(1, 1, 1),
      Agreement.Contacts.Scaled = c(
        min(d_final$Agreement.Contacts.Scaled),
        vertex_sharing_contacts,
```

```
max(d_final$Agreement.Contacts.Scaled)
      ),
      Squared.Agreement.Contacts.Scaled = Agreement.Contacts.Scaled ** 2
    )
  )
table <-
  round(matrix(
    c(
      vertex_reading_personal,
      vertex_sharing_personal,
      vertex_reading_contacts,
      vertex_sharing_contacts,
      min(d_final$Agreement.Scaled),
      min(d_final$Agreement.Scaled),
      min(d_final$Agreement.Contacts.Scaled),
      min(d_final$Agreement.Contacts.Scaled),
      max(d_final$Agreement.Scaled),
      max(d_final$Agreement.Scaled),
      max(d_final$Agreement.Contacts.Scaled),
      max(d_final$Agreement.Contacts.Scaled),
      pred_reading_personal[2] - pred_reading_personal[1],
      pred_sharing_personal[2] - pred_sharing_personal[1],
      pred_reading_contacts[2] - pred_reading_contacts[1],
      pred_sharing_contacts[2] - pred_sharing_contacts[1],
      pred_reading_personal[2] - pred_reading_personal[3],
      pred_sharing_personal[2] - pred_sharing_personal[3],
      pred_reading_contacts[2] - pred_reading_contacts[3],
      pred_sharing_contacts[2] - pred_sharing_contacts[3]
    ),
    ncol = 4,
    byrow = TRUE
  ), 3)
rownames(table) <-</pre>
    'Vertex position',
    'min agreement',
    'max agreement',
    'diff min vs. vertex',
    'diff max vs. vertex'
  )
colnames(table) <-</pre>
  c(
    "Personal agreement, reading",
    "Personal agreement, sharing",
    "Contacts agreement, reading",
    "Contacts agreement, sharing"
table <- as.table(table)
table
```

```
## Personal agreement, reading Personal agreement, sharing
## Vertex position -0.242 -1.682
```

##	min agreement			-1.998		-1.99	98
##	max agreement			1.408		1.4	80
##	diff min vs. vertex			127.567		-8.1	58
##	diff max vs. vertex			112.704		-779.3	58
##		Contacts	agreement,	reading	Contacts	agreement, shari	ng
##	Vertex position			0.455		-0.4	21
##	min agreement			-2.359		-2.3	59
##	max agreement			1.655		1.6	55
##	diff min vs. vertex			627.130		-307.8	30
##	diff max vs. vertex			114.001		-353.3	37