

# Tapping into linguistic rhythm: Summary of statistical analyses and best-fit models

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## Section 3.2. Annotator agreement

```
##  
## Pearson's product-moment correlation  
##  
## data: data0$annotator_1 and data0$annotator_2  
## t = 595.6, df = 39, p-value < 2.2e-16  
## alternative hypothesis: true correlation is not equal to 0  
## 95 percent confidence interval:  
## 0.9998962 0.9999709  
## sample estimates:  
## cor  
## 0.999945  
  
## [1] -0.002350901  
  
## [1] 0.007166244
```

## Section 4.1. Motor activity in SMS vs. NMR

### i. One-sample Kolmogorov-Smirnov tests for NMR

```
## S1 S2 M1 M2 L1 L2  
## D 0.2030399 0.1478367 0.1352294 0.2702486 0.3463238 0.2882722
```

### ii. One-sample Kolmogorov-Smirnov tests for SMS

```
## S1 S2 M1 M2 L1 L2  
## D 0.2795753 0.2912242 0.1823565 0.1193687 0.07250568 0.1271021
```

## Section 4.2. Landmark comparisons

Factor “landmark” has 5 levels: vowel onset, syllable onset, maxE, maxD, LAM

```
## Single term deletions using Satterthwaite's method:  
##
```

```

## Model:
## log(absasync) ~ landmark + (1 + landmark | participant) + (1 | sentence)
##           Sum Sq Mean Sq NumDF DenDF F value    Pr(>F)
## landmark 61.312   15.328      4     125.74  13.889 2.07e-09 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

## Linear mixed model fit by REML. t-tests use Satterthwaite's method [
## lmerModLmerTest]
## Formula: log(absasync) ~ landmark + (1 + landmark | participant) + (1 |
##         sentence)
## Data: data1
## Control:
## lmerControl(optimizer = "optimx", calc.derivs = FALSE, optCtrl = list(method = "nlminb",
##         starttests = FALSE, kkt = FALSE))
##
## REML criterion at convergence: 15120.6
##
## Scaled residuals:
##   Min     1Q Median     3Q    Max
## -7.0217 -0.4354  0.2571  0.7086  1.4662
##
## Random effects:
## Groups      Name        Variance Std.Dev. Corr
## participant (Intercept) 0.0117669 0.10848
##             landmarkintmax 0.0014881 0.03858   0.99
##             landmarkmaxD   0.0002964 0.01721  -1.00 -1.00
##             landmarkmaxE   0.0006468 0.02543   0.84  0.91 -0.88
##             landmarksyllable 0.0069708 0.08349  -1.00 -1.00  1.00 -0.88
## sentence    (Intercept) 0.0040647 0.06375
## Residual            1.1036209 1.05053
## Number of obs: 5130, groups: participant, 29; sentence, 6
##
## Fixed effects:
##             Estimate Std. Error    df t value Pr(>|t|)
## (Intercept) 3.365e+00 4.648e-02 1.870e+01 72.414 < 2e-16 ***
## landmarkintmax 1.028e-01 4.717e-02 4.346e+02  2.179 0.02987 *
## landmarkmaxD  4.186e-02 4.595e-02 1.646e+03  0.911 0.36245
## landmarkmaxE  1.459e-01 4.638e-02 1.092e+02  3.145 0.00214 **
## landmarksyllable 3.319e-01 4.884e-02 1.124e+02  6.795 5.42e-10 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Correlation of Fixed Effects:
##          (Intr) lndmrkn lndmrD lndmrE
## landmarkkntmx -0.415
## landmarkkxD -0.524  0.476
## landmarkkxE -0.451  0.496   0.488
## lndmrksyllb -0.602  0.409   0.492   0.436

```

### Section 4.3. Probability of a tap in the SMS task

Reference of metrical\_status is 0 (weak), compared to 1 (strong) and 2 (accented)

```

## Single term deletions
##
## Model:
## SMS ~ metrical_status + S2S + (1 | participant)
##          npar      AIC      LRT  Pr(Chi)
## <none>           750.75
## metrical_status    2 771.42 24.6756 4.383e-06 ***
## S2S                1 754.23  5.4849  0.01918 *
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

## Generalized linear mixed model fit by maximum likelihood (Laplace
## Approximation) [glmerMod]
## Family: binomial ( logit )
## Formula: SMS ~ metrical_status + S2S + (1 | participant)
## Data: data
## Control: glmerControl(optimizer = "bobyqa", optCtrl = list(maxfun = 1e+05))
##
##      AIC      BIC  logLik deviance df.resid
## 750.7    776.2   -370.4    740.7     1184
##
## Scaled residuals:
##    Min     1Q  Median     3Q     Max
## -7.5216  0.1617  0.2188  0.3368  1.4077
##
## Random effects:
## Groups   Name        Variance Std.Dev.
## participant (Intercept) 1.459     1.208
## Number of obs: 1189, groups: participant, 29
##
## Fixed effects:
##                  Estimate Std. Error z value Pr(>|z|)
## (Intercept)      2.2621    0.3007  7.524 5.32e-14 ***
## metrical_status1 0.9972    0.3037  3.283  0.00103 **
## metrical_status2 0.9812    0.2182  4.498 6.88e-06 ***
## S2Slow          -0.4702    0.1983 -2.371  0.01775 *
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Correlation of Fixed Effects:
##          (Intr) mtrc_1 mtrc_2
## mtrcl_stts1 -0.198
## mtrcl_stts2 -0.260  0.272
## S2Slow       -0.436  0.080  0.074

```

## Section 4.4. SMS accuracy

```

## Single term deletions using Satterthwaite's method:
##
## Model:
## log(abs_async) ~ log(risetime) + musicality + (1 + log(risetime) | participant) + (1 | sentence)
##          Sum Sq Mean Sq NumDF DenDF F value  Pr(>F)
## log(risetime) 7.6294  7.6294     1  1044  6.2262 0.01274 *

```

```

## musicality    6.3385  6.3385      1  1044  5.1728 0.02315 *
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

## Linear mixed model fit by REML. t-tests use Satterthwaite's method [
## lmerModLmerTest]
## Formula: log(abs_async) ~ log(risetime) + musicality + (1 + log(risetime) |
##   participant) + (1 | sentence)
## Data: data
## Control:
## lmerControl(optimizer = "optimx", calc.derivs = FALSE, optCtrl = list(method = "nlminb",
##   starttests = FALSE, kkt = FALSE))
##
## REML criterion at convergence: 3198.8
##
## Scaled residuals:
##   Min     1Q Median     3Q    Max
## -4.8085 -0.4744  0.2448  0.7382  1.3368
##
## Random effects:
## Groups       Name        Variance Std.Dev. Corr
## participant (Intercept) 0.000e+00 0.000e+00
##             log(risetime) 5.197e-11 7.209e-06  NaN
## sentence    (Intercept) 0.000e+00 0.000e+00
## Residual            1.225e+00 1.107e+00
## Number of obs: 1047, groups: participant, 29; sentence, 6
##
## Fixed effects:
##           Estimate Std. Error      df t value Pr(>|t|)
## (Intercept) 2.979e+00 1.960e-01 1.044e+03 15.202 <2e-16 ***
## log(risetime) 1.072e-01 4.295e-02 1.044e+03  2.495  0.0127 *
## musicality -1.355e-02 5.958e-03 1.044e+03 -2.274  0.0231 *
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Correlation of Fixed Effects:
##          (Intr) lg(rs)
## log(risetm) -0.967
## musicality  -0.185  0.000

```

## Section 4.5. Anticipation in SMS

```

## Single term deletions using Satterthwaite's method:
##
## Model:
## signed_async ~ log(risetime) + riseslope + serial_order + (1 + log(risetime) + riseslope | participant
##               Sum Sq Mean Sq NumDF DenDF F value    Pr(>F)
## log(risetime) 44253   44253      1  41.71 17.7614 0.0001311 ***
## riseslope     31469   31469      1  80.00 12.6305 0.0006403 ***
## serial_order  13242   13242      1 704.58  5.3149 0.0214331 *
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

```

```

## Linear mixed model fit by REML. t-tests use Satterthwaite's method [
## lmerModLmerTest]
## Formula: signed_async ~ log(risetime) + riseslope + serial_order + (1 +
##   log(risetime) + riseslope | participant) + (1 | sentence)
## Data: data
## Control:
## lmerControl(optimizer = "optimx", calc.derivs = FALSE, optCtrl = list(method = "nlminb",
##   starttests = FALSE, kkt = FALSE))
##
## REML criterion at convergence: 11182.4
##
## Scaled residuals:
##    Min     1Q Median     3Q    Max
## -2.40263 -0.70614 -0.01529  0.63493  2.94164
##
## Random effects:
## Groups      Name        Variance Std.Dev. Corr
## participant (Intercept) 464.0949 21.5429
##             log(risetime) 20.7073  4.5505 -0.94
##             riseslope     0.5861  0.7656 -0.65  0.87
## sentence    (Intercept) 53.1966  7.2936
## Residual           2491.5347 49.9153
## Number of obs: 1047, groups: participant, 29; sentence, 6
##
## Fixed effects:
##            Estimate Std. Error      df t value Pr(>|t|)
## (Intercept) 30.1942   11.0217    39.2950  2.740 0.009205 **
## log(risetime) -9.7028   2.3023   41.7086 -4.214 0.000131 ***
## riseslope    -1.6082   0.4525   79.9975 -3.554 0.000640 ***
## serial_order  1.6717   0.7251  704.5778  2.305 0.021433 *
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Correlation of Fixed Effects:
##          (Intr) lg(rs) risslp
## log(risetm) -0.891
## riseslope    -0.305  0.156
## serial_ordr -0.126 -0.182  0.267

```

### Correlation of rise-time and rise-slope

```

##
## Pearson's product-moment correlation
##
## data: data_sentence$rise.time and data_sentence$rise.slope
## t = -0.74809, df = 39, p-value = 0.4589
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## -0.4115314 0.1958783
## sample estimates:
##       cor
## -0.1189397

```

## Section 4.6. Number of repetitions in SMS

### i. Repetition cycle during which participants preferred to start tapping

```
## [1] 3

## 0% 25% 50% 75% 100%
## 1   2   3   3   11
```

### ii. Repetition cycle during which participants started tapping on the first trial

```
## [1] 3

## 0% 25% 50% 75% 100%
## 1   2   3   4   10
```

### iii. Repetition cycle during which participants started tapping on the last trial

```
## [1] 2

## 0% 25% 50% 75% 100%
## 2   2   2   3   6
```

### iv. Number of tapping cycles until participants reached their personal point of stability

```
## [1] 5

## 0% 25% 50% 75% 100%
## 1   3   5   7   13
```

### v. Factors influencing the beginning of tapping

```
## Cumulative Link Mixed Model fitted with the Laplace approximation
##
## formula: as.factor(first_tap_cycle) ~ confident_beat_tapping + musicality +
##           task_order + (1 | participant) + (1 | sentence)
## data:    data2
##
## link threshold nobs logLik AIC   niter   max.grad cond.H
## probit equidistant 174 -265.33 544.66 444(1335) 1.20e-05 1.6e+03
##
## Random effects:
## Groups      Name        Variance Std.Dev.
## participant (Intercept) 1.1982   1.0946
## sentence    (Intercept) 0.1176   0.3429
## Number of groups: participant 29, sentence 6
##
## Coefficients:
##                         Estimate Std. Error z value Pr(>|z|)
## confident_beat_tapping -0.002297  0.149162 -0.015    0.988
```

```

## musicality           -0.003701   0.043365  -0.085    0.932
## task_order          0.688338   0.440087   1.564    0.118
##
## Threshold coefficients:
##                   Estimate Std. Error z value
## threshold.1 -0.65217    1.09314  -0.597
## spacing      1.10998    0.07332  15.138

```

## v. Factors influencing the point of stabilising

### Number of tapped cycles as the dependent variable

```

## Cumulative Link Mixed Model fitted with the Laplace approximation
##
## formula: as.factor(change_point_cycle_own) ~ confident_beat_tapping +
##           musicality + task_order + (1 | participant) + (1 | sentence)
## data:     data2
##
## link threshold nobs logLik AIC   niter   max.grad cond.H
## probit equidistant 174 -428.65 871.29 481(964) 2.88e-04 1.8e+03
##
## Random effects:
## Groups       Name       Variance Std.Dev.
## participant (Intercept) 0.02742  0.1656
## sentence    (Intercept) 0.02168  0.1472
## Number of groups: participant 29, sentence 6
##
## Coefficients:
##                   Estimate Std. Error z value Pr(>|z|)
## confident_beat_tapping 0.01085  0.05632  0.193   0.847
## musicality            0.02327  0.01643  1.417   0.157
## task_order             0.02515  0.16557  0.152   0.879
##
## Threshold coefficients:
##                   Estimate Std. Error z value
## threshold.1 -0.97445  0.41723 -2.336
## spacing      0.32214  0.02048 15.733

```

### Number of perceived cycles as the dependent variable

```

## Cumulative Link Mixed Model fitted with the Laplace approximation
##
## formula: as.factor(change_point_cycle_total) ~ confident_beat_tapping +
##           musicality + task_order + (1 | participant) + (1 | sentence)
## data:     data2
##
## link threshold nobs logLik AIC   niter   max.grad cond.H
## probit equidistant 174 -438.96 891.93 460(923) 3.84e-03 2.0e+03
##
## Random effects:
## Groups       Name       Variance Std.Dev.
## participant (Intercept) 0.09034  0.3006
## sentence    (Intercept) 0.02762  0.1662

```

```

## Number of groups: participant 29, sentence 6
##
## Coefficients:
##                               Estimate Std. Error z value Pr(>|z|)
## confident_beat_tapping   0.01426   0.06453   0.221   0.825
## musicality                0.02222   0.01882   1.180   0.238
## task_order                 0.24180   0.19010   1.272   0.203
##
## Threshold coefficients:
##                               Estimate Std. Error z value
## threshold.1 -1.03003    0.47808 -2.155
## spacing       0.33313    0.02055 16.214

```

## Section 4.7. Task comparisons

### i. ITI

ITI refers to inter-tap intervals, IOI to inter-onset intervals

```

## Single term deletions using Satterthwaite's method:
##
## Model:
## log(tap_ITI) ~ task * log(vowel_IOI) + task * log(spontaneous_right_mean_ITI) + (1 + log(vowel_IOI)
##                                         Sum Sq Mean Sq NumDF DenDF F value
## task:log(vowel_IOI)                  0.23411 0.23411     1 310.78 6.9274
## task:log(spontaneous_right_mean_ITI) 0.14577 0.14577     1 310.78 4.3134
##                                         Pr(>F)
## task:log(vowel_IOI)                  0.008912 **
## task:log(spontaneous_right_mean_ITI) 0.038634 *
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

## Linear mixed model fit by REML. t-tests use Satterthwaite's method [
## lmerModLmerTest]
## Formula:
## log(tap_ITI) ~ task * log(vowel_IOI) + task * log(spontaneous_right_mean_ITI) +
## (1 + log(vowel_IOI) | participant) + (1 | sentence)
## Data: data3
## Control:
## lmerControl(optimizer = "optimx", calc.derivs = FALSE, optCtrl = list(method = "nlminb",
## starttests = FALSE, kkt = FALSE))
##
## REML criterion at convergence: -69.1
##
## Scaled residuals:
##      Min      1Q Median      3Q      Max
## -3.7442 -0.6425 -0.0380  0.6763  4.2702
##
## Random effects:
## Groups      Name           Variance Std.Dev. Corr
## participant (Intercept) 1.258504 1.1218
##             log(vowel_IOI) 0.024494 0.1565  -1.00
## sentence    (Intercept) 0.003881 0.0623

```

```

## Residual          0.033794 0.1838
## Number of obs: 348, groups: participant, 29; sentence, 6
##
## Fixed effects:
##                               Estimate Std. Error      df t value
## (Intercept)                1.65438   1.11971 26.84920  1.478
## taskNMR                   0.38306   0.60312 310.77729  0.635
## log(vowel_IOI)             0.61303   0.12891  5.65748  4.756
## log(spontaneous_right_mean_ITI) 0.13402   0.13955 33.41163  0.960
## taskNMR:log(vowel_IOI)     -0.22464   0.08535 310.77729 -2.632
## taskNMR:log(spontaneous_right_mean_ITI) 0.12955   0.06238 310.77730  2.077
## Pr(>|t|)
## (Intercept)               0.15117
## taskNMR                  0.52582
## log(vowel_IOI)            0.00367 **
## log(spontaneous_right_mean_ITI) 0.34379
## taskNMR:log(vowel_IOI)     0.00891 **
## taskNMR:log(spontaneous_right_mean_ITI) 0.03863 *
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Correlation of Fixed Effects:
##           (Intr) tskNMR l(_IOI l(__I tNMR:(_I
## taskNMR    -0.269
## lg(vwl_IOI) -0.635  0.254
## lg(s__ITI)  -0.771  0.143  0.000
## tNMR:(_IOI)  0.207 -0.768 -0.331  0.000
## tNMR:(__IT)  0.172 -0.640  0.000 -0.223  0.000

```

## ii. CV of ITI

```

## Single term deletions using Satterthwaite's method:
##
## Model:
## tap_CV ~ task + (1 + task | participant) + (1 | sentence)
##           Sum Sq Mean Sq NumDF DenDF F value Pr(>F)
## task    0.13373 0.13373     1     28   6.515 0.01644 *
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

## Linear mixed model fit by REML. t-tests use Satterthwaite's method [
## lmerModLmerTest]
## Formula: tap_CV ~ task + (1 + task | participant) + (1 | sentence)
## Data: data3
## Control:
## lmerControl(optimizer = "optimx", calc.derivs = FALSE, optCtrl = list(method = "nlminb",
## starttests = FALSE, kkt = FALSE))
##
## REML criterion at convergence: -270.6
##
## Scaled residuals:
##       Min     1Q Median     3Q    Max
## -2.49108 -0.68947  0.07773  0.69278  2.48593

```

```

##
## Random effects:
##   Groups      Name      Variance Std.Dev. Corr
##   participant (Intercept) 0.011507 0.10727
##                  taskNMR     0.005959 0.07720 -0.53
##   sentence    (Intercept) 0.005917 0.07692
##   Residual        0.020526 0.14327
## Number of obs: 348, groups: participant, 29; sentence, 6
##
## Fixed effects:
##             Estimate Std. Error      df t value Pr(>|t|)    
## (Intercept)  0.47298   0.03874  9.88296 12.209 2.78e-07 ***
## taskNMR     -0.05363   0.02101 28.00033 -2.552  0.0164 *  
## ---      
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Correlation of Fixed Effects:
##          (Intr) 
## taskNMR -0.331

```