M21 RT (Continuous Predictors)

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Setup

Load libraries

1. Set ggplot2 parameters

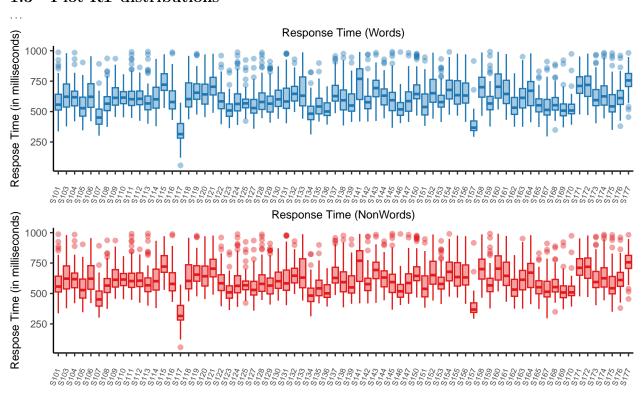
1 Load Files and Format Files

1.1 Load Files

```
rt <- read_csv("rt_data_chrt1.csv", show_col_types = FALSE)
frq_w <- read_csv("frq_cw.csv", show_col_types = FALSE)
frq_nw <- read_csv("frq_nw.csv", show_col_types = FALSE)
dmg <- read_csv("demo_lang_vsl_pca_hc.csv", show_col_types = FALSE)</pre>
```

1.2 Format Files

1.3 Plot RT distributions



1.4 Test for Skewness

```
Response Time

# Words Skewness values
skewness(rt_words_frq$response_time, na.rm = TRUE)

|| [1] 0.4868724
skewness(rt_words_frq$LogRT, na.rm = TRUE)

|| [1] -0.4362045

# Words Raw RT Distribution
p1 <- rt_words_frq |> ggplot(aes(x = response_time)) +
geom_density(colour = "#1F78B4", fill = "#1F78B4", alpha = .4) +
labs(title = "Raw RT Distribution (Words)") +
theme( plot.title = element_text(size = 9, hjust = .5),
```

```
legend.title = element_blank(),
         axis.title.x = element_blank(),
         axis.text.x = element_text(size = 8))
# Words Log RT Distribution
p2 <- rt_words_frq |> ggplot(aes(x = InvRT)) +
  geom_density(colour = "#A6CEE3", fill = "#A6CEE3", alpha = .4) +
  labs(title = "Log RT Distribution (Words)") +
  theme( plot.title = element_text(size = 9, hjust = .5),
         legend.title = element_blank(),
         axis.title.x = element_blank(),
         axis.text.x = element_text(size = 8))
plot_grid(p1, p2, ncol = 2)
                 Raw RT Distribution (Words)
                                                                             Log RT Distribution (Words)
                                                               1200
   0.003
                                                               900
density 0.002
                                                           density
                                                               600
   0.001
                                                               300
```

0

0.005

0.010

0.015

NONWORDS # Skewness values skewness(rt_nwords_frq\$response_time, na.rm = TRUE)

500

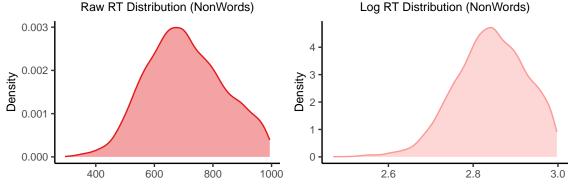
750

1000

|| [1] 0.1000102 skewness(rt_nwords_frq\$LogRT, na.rm = TRUE)

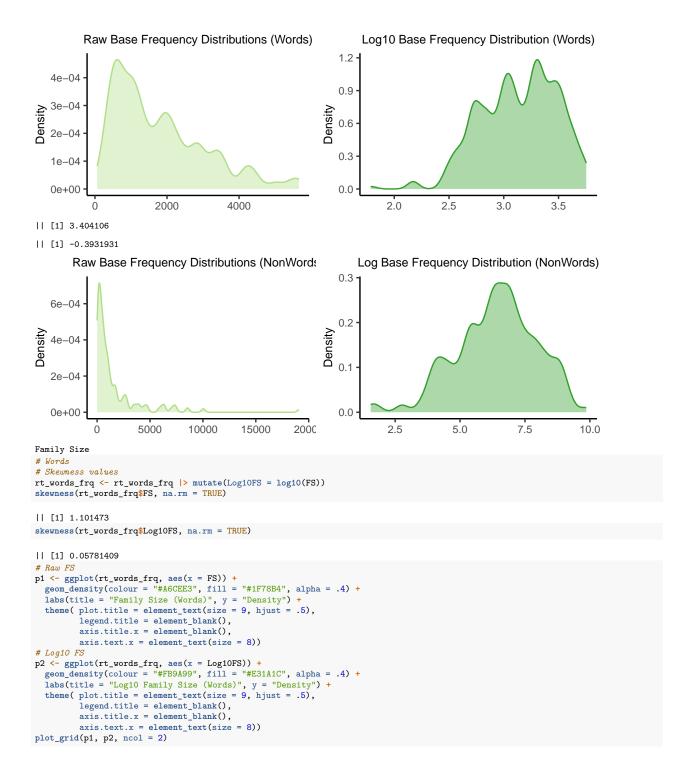
250

0.000



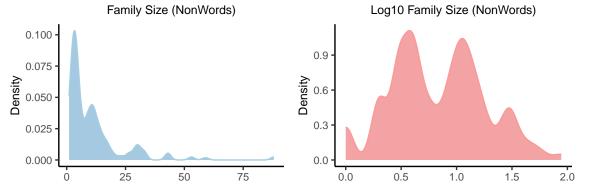
Base Frequency

- || [1] 0.9870676
- || [1] -0.4166518



```
Family Size (Words)
                                                                               Log10 Family Size (Words)
   0.100 -
                                                                1.5
   0.075
                                                             Density
Density
                                                                1.0
   0.050
                                                                0.5
   0.025
   0.000
                                                                0.0
                     10
                                  20
                                                30
                                                                      0.50
                                                                                 0.75
                                                                                            1.00
                                                                                                      1.25
                                                                                                                 1.50
# NonWords
# Skewness values
rt_nwords_frq <- rt_nwords_frq |> mutate(Log10FS = log10(FS))
skewness(rt_nwords_frq$FS, na.rm = TRUE)
skewness(rt_nwords_frq$Log10FS, na.rm = TRUE)
|| [1] 0.1536901
```





1.5 ANOVA Words

Use complete.cases() to find which rows had missing data in the model-relevant variables:

```
Standardize the predictors

rt_words_cmpl$Log10BF_std <- as.numeric(scale(rt_words_cmpl$Log10BF, center = TRUE, scale = TRUE))

rt_words_cmpl$FS_std <- as.numeric(scale(rt_words_cmpl$FS, center = TRUE, scale = TRUE))

rt_words_cmpl$Log10WF_std <- as.numeric(scale(rt_words_cmpl$Log10WF, center = TRUE, scale = TRUE))

rt_words_cmpl$Log10FS_std <- as.numeric(scale(rt_words_cmpl$Log10FS, center = TRUE, scale = TRUE))

rt_words_cmpl$Dim.2_std <- as.numeric(scale(rt_words_cmpl$Dim.2, center = TRUE, scale = TRUE))
```

1.5.1 Anova with Continuous Log10BF and Continuous Log10FS

```
# Anova with Continuous Log10BF AND Continuous FS
anova_model <- mixed(
  response_time ~ Log10BF_std * Log10FS_std * Orthographic_Sensitivity + (1 | SubjID),</pre>
```

```
data = rt_words_cmpl,
 method = "KR"
)
|| Mixed Model Anova Table (Type 3 tests, KR-method)
|| Model: response_time ~ Log10BF_std * Log10FS_std * Orthographic_Sensitivity +  
|| Model: (1 | SubjID)
|| Data: rt_words_cmpl
                                              Effect
                                                             df
                                                                        F p.value
                                         Log10BF_std 1, 5792.73 44.34 ***
|| 1
                                                                            <.001
11 2
                                         Log10FS_std 1, 5792.42 31.10 ***
                                                                            <.001
                                                                             .067
11.3
                             Orthographic_Sensitivity 1, 64.04 3.48 +
11 4
                             Log10BF_std:Log10FS_std 1, 5792.49
                                                                    0.09
                                                                             .764
                                                                             .180
|| 5
                Log10BF_std:Orthographic_Sensitivity 1, 5792.73
                                                                     1.80
116
                Log10FS_std:Orthographic_Sensitivity 1, 5792.42
                                                                     0.06
                                                                             .804
                                                                             .317
|| 7 Log10BF_std:Log10FS_std:Orthographic_Sensitivity 1, 5792.49
                                                                     1.00
11 ---
|| Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '+' 0.1 ' ' 1
summary(anova_model)
|| Linear mixed model fit by REML. t-tests use Satterthwaite's method ['lmerModLmerTest']
|| Formula: response_time ~ Log10BF_std * Log10FS_std * Orthographic_Sensitivity +
                                                                                      (1 | SubjID)
     Data: data
|| REML criterion at convergence: 71992
11
|| Scaled residuals:
     Min 1Q Median
                               30
  -3.0178 -0.6874 -0.1449 0.5139 4.7355
\Pi
11
| | Random effects:
|| Groups Name Variance Std.Dev
|| SubjID (Intercept) 5272 72.61
                        Variance Std.Dev.
  Residual
                        12136
                                 110.16
|| Number of obs: 5864, groups: SubjID, 66
|| Fixed effects:
                                                      Estimate Std. Error
                                                                                df t value Pr(>|t|)
                                                      610.6175 9.0723 63.8685 67.306 < 2e-16 ***
|| (Intercept)
|| Log10BF_std
                                                      -10.1087
                                                                  1.5181 5792.5608 -6.659 3.02e-11 ***
|| Log10FS_std
                                                      -8.1418
                                                                  1.4599 5792.2546 -5.577 2.56e-08 ***
|| Orthographic_Sensitivity1
                                                      -16.9147
                                                                  9.0723 63.8685 -1.864 0.0669
|| Log10BF_std:Log10FS_std
                                                       0.4676
                                                                  1.5576 5792.3235
                                                                                     0.300
                                                                                             0.7640
|| Log10BF_std:Orthographic_Sensitivity1
                                                      -2.0361
                                                                 1.5181 5792.5608 -1.341
|| Log10FS_std:Orthographic_Sensitivity1
                                                       0.3628
                                                                  1.4599 5792.2546 0.248
                                                                                             0.8038
|| Log10BF_std:Log10FS_std:Orthographic_Sensitivity1 -1.5574
                                                                 1.5576 5792.3235 -1.000 0.3174
|| Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
|| Correlation of Fixed Effects:
                 (Intr) Lg10BF_ Lg10FS_ Ort_S1 Lg10BF_:L10FS_ L10BF_:O L10FS_:
|| Log10BF_std
                  -0.005
|| Log10FS_std
                  0.002 -0.134
                  -0.060 -0.001 0.002
|| Orthgrph_S1
|| Lg10BF_:L10FS_ -0.018 0.298
                                -0.120 0.000
|| L10BF_:0_S1
                 -0.001 -0.017 0.000 -0.005 0.007
|| L10FS_:0_S1
                  0.002 0.000 -0.044 0.002 -0.005
                                                               -0.134
|| L10BF_:L10FS_: 0.000 0.007 -0.005 -0.018 -0.022
                                                               0.298
                                                                       -0.120
eta_squared(anova_model, partial = TRUE)
|| # Effect Size for ANOVA (Type III)
|| Parameter
                                                   | Eta2 (partial) |
                                                                            95% CI
|| Log10BF_std
                                                           7.60e-03 | [0.00, 1.00]
|| Log10FS_std
                                                           5.34e-03 | [0.00, 1.00]
                                                              0.05 |
                                                                      [0.00, 1.00]
|| Orthographic_Sensitivity
|| Log10BF_std:Log10FS_std
                                                           1.56e-05 | [0.00, 1.00]
|| Log10BF_std:Orthographic_Sensitivity
                                                           3.10e-04 | [0.00, 1.00]
|| Log10FS_std:Orthographic_Sensitivity
                                                           1.07e-05 | [0.00, 1.00]
|| Log10BF_std:Log10FS_std:Orthographic_Sensitivity |
                                                           1.73e-04 | [0.00, 1.00]
|| - One-sided CIs: upper bound fixed at [1.00].
```

1.5.2 Effects

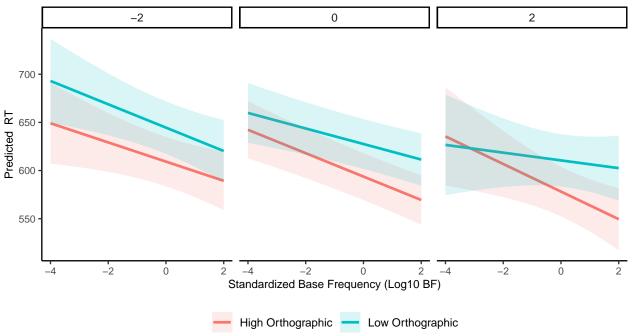
```
Effect
                                                                          p.value
\begin{array}{c} Log10BF\_std \\ Log10FS\_std \end{array}
                                                           44.34 ***
                                          1, 5792.73
                                                                           <.001
                                                           31.10 ***
                                          1, 5792.42
                                                                           <.001
Orthographic_Sensitivity
                                          1, 64.04
                                                           3.48 +
                                                                           .067
Log10BF:FS:Ortho_Sensitivity
                                          1,5792.49
                                                           1.00
                                                                           .317
```

```
Main Effect of Family Size, Orthographic Sensitivity, Base Frequency
emm options(pbkrtest.limit = 5864)
emtrends(anova_model, ~1, var = "Log10FS_std")
          Log10FS_std.trend SE df lower.CL upper.CL
|| overall
                     -8.14 1.46 5792
                                         -11
11
|| Results are averaged over the levels of: Orthographic_Sensitivity
|| Degrees-of-freedom method: kenward-roger
|| Confidence level used: 0.95
emtrends(anova_model, ~1, var = "Log10BF_std")
          Log10BF_std.trend SE df lower.CL upper.CL
|| overall
                     -10.1 1.52 5793 -13.1
\Pi
|| Results are averaged over the levels of: Orthographic_Sensitivity
|| Degrees-of-freedom method: kenward-roger
|| Confidence level used: 0.95
emmeans_obj <- emmeans(anova_model, pairwise ~ Orthographic_Sensitivity)</pre>
cohensd_df <- as.data.frame(cohens_d(response_time ~ Orthographic_Sensitivity, data = rt_words_cmpl))
contrasts_df <- as.data.frame(emmeans_obj$contrasts)</pre>
(ortho_sens_df <- bind_cols(contrasts_df,cohensd_df))</pre>
|| contrast
                                      estimate
                                                    SE df t.ratio p.value Cohens_d CI
                                                                                              CI_low
|| High Orthographic - Low Orthographic -33.82941 18.14466 64.04 -1.864 0.0668 -0.2458167 0.95 -0.2972398 -0.1943728
|| Degrees-of-freedom method: kenward-roger
(ortho_sens_means <-as.data.frame(emmeans_obj$emmeans))</pre>
627.5322 13.21170 64.01 601.1388 653.9255
|| Low Orthographic
11
|| Degrees-of-freedom method: kenward-roger
|| Confidence level used: 0.95
Base Frequency by Orthographic Sensitivity Interaction
# estimate simple slopes of base frequency by group:
emtrends(anova_model, ~ Orthographic_Sensitivity, var = "Log10BF_std")
\verb|| Orthographic_Sensitivity Log10BF_std.trend SE df lower.CL upper.CL \\
                                    -12.14 2.13 5793
                                                      -16.3 -7.97
-12.3 -3.83
|| High Orthographic
|| Low Orthographic
                                     -8.07 2.17 5793
11
|| Degrees-of-freedom method: kenward-roger
|| Confidence level used: 0.95
emtrends(anova_model, pairwise ~ Orthographic_Sensitivity, var = "Log10BF_std")
|| $emtrends
-12.14 2.13 5793 -16.3 -7.97
|| High Orthographic
|| Low Orthographic
                                     -8.07 2.17 5793
                                                       -12.3
|| Degrees-of-freedom method: kenward-roger
|| Confidence level used: 0.95
\Pi
|| $contrasts
                                     estimate SE df t.ratio p.value
11
  contrast
| High Orthographic - Low Orthographic -4.07 3.04 5793 -1.341 0.1799
|| Degrees-of-freedom method: kenward-roger
# Estimate marginal means of RT at the mean of both predictors
emm <- emmeans(anova_model, ~ Orthographic_Sensitivity, at = list(Log10BF_std = 0, Log10FS_std = 0))
emm_df <- as.data.frame(emm)</pre>
print(emm_df)
SE df lower.CL upper.CL
```

```
|| Low Orthographic 627.5322 13.21170 64.01 601.1388 653.9255 || || Degrees-of-freedom method: kenward-roger || Confidence level used: 0.95
```

1.5.3 Plots

Predicted RT by Base Frequency, Family Size, and Orthographic Sensitivity



1.6 ANOVA Non-Words

|| Welch Two Sample t-test

Use complete.cases() to find which rows had missing data in the model-relevant variables:

```
Standardize the predictors

rt_nwords_cmpl$Log10BF_std <- as.numeric(scale(rt_nwords_cmpl$Log10BF, center = TRUE, scale = TRUE))

rt_nwords_cmpl$FS_std <- as.numeric(scale(rt_nwords_cmpl$FS, center = TRUE, scale = TRUE))

rt_nwords_cmpl$Log10FS_std <- as.numeric(scale(rt_nwords_cmpl$Log10FS, center = TRUE, scale = TRUE))

rt_nwords_cmpl$BF_std <- as.numeric(scale(rt_nwords_cmpl$BF, center = TRUE, scale = TRUE))

rt_nwords_cmpl$Dim.2_std <- as.numeric(scale(rt_nwords_cmpl$Dim.2, center = TRUE, scale = TRUE))

rt_nwords_cmpl <- rt_nwords_cmpl |> select(-complexity.x)

rt_nwords_cmpl <- rename(rt_nwords_cmpl, complexity = complexity.y)

Test Correlation between Base Frequency and Complexity

t.test(Log10BF - complexity, data = rt_nwords_cmpl)
```

```
|| data: Log10BF by complexity
|| t = -0.7232, df = 4547.8, p-value = 0.4696
|| alternative hypothesis: true difference in means between group Complex and group Simple is not equal to 0
|| 95 percent confidence interval:
| | -0.05059200 0.02332506
|| sample estimates:
\mid \mid mean in group Complex mean in group Simple
                2.793225
                                      2.806859
11
# Create a contingency table
table_data <- table(rt_nwords_cmpl$complexity, rt_nwords_cmpl$BF_Split)</pre>
# Run the chi-square test
chisq.test(table_data)
|| Pearson's Chi-squared test with Yates' continuity correction
|| data: table_data
|| X-squared = 3.9314, df = 1, p-value = 0.04739
1.6.1 Anova with Continuous Log10BF and Categorical Complexity
  response_time ~ complexity * Log10FS_std * Orthographic_Sensitivity + (1 | SubjID),
  data = rt_nwords_cmpl,
 method = "KR"
anova_model_2
|| Mixed Model Anova Table (Type 3 tests, KR-method)
|| Model: response_time ~ complexity * Log10FS_std * Orthographic_Sensitivity +
             (1 | SubjID)
|| Model:
|| Data: rt_nwords_cmpl
                                              Effect
                                                                         F p.value
|| 1
                                          complexity 1, 4601.21 106.13 *** <.001
|| 2
                                         Log10FS_std 1, 4600.02
                                                                      2.49
                                                                              .115
                                                                    5.32 *
                            Orthographic_Sensitivity 1, 64.11
                              complexity:Log10FS_std 1, 4600.65
                                                                    3.96 *
                                                                              .047
|| 5
                complexity:Orthographic_Sensitivity 1, 4601.21
                                                                    0.68
                                                                              .408
|| 6
                Log10FS_std:Orthographic_Sensitivity 1, 4600.02
                                                                      0.04
                                                                              .846
| 7 complexity:Log10FS_std:Orthographic_Sensitivity 1, 4600.65
                                                                      0.29
|| Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '+' 0.1 ' ' 1
summary(anova_model_2)
|| Linear mixed model fit by REML. t-tests use Satterthwaite's method ['lmerModLmerTest']
|| Formula: response_time ~ complexity * Log10FS_std * Orthographic_Sensitivity +
                                                                                       (1 | SubjID)
П
     Data: data
|| REML criterion at convergence: 56995.5
  Scaled residuals:
П
              1Q Median
      Min
   -3.1330 -0.7114 -0.0816 0.6377 4.1120
| | Random effects:
|| Groups Name Varian
|| SubjID (Intercept) 7095
                         Variance Std.Dev.
                                  84.23
                        11145
|| Number of obs: 4671, groups: SubjID, 66
|| Fixed effects:
                                                      Estimate Std. Error
                                                                                 df t value Pr(>|t|)
                                                      715.6108    10.5228    62.5863    68.006    <2e-16 ***
|| (Intercept)
|| complexity1
                                                       16.2736
                                                                  1.5797 4599.6974 10.302
                                                                                               <2e-16 ***
|| Log10FS_std
                                                        2.5006
                                                                   1.5854 4598.4808
                                                                                      1.577
                                                                                              0.1148
|| Orthographic_Sensitivity1
                                                      -24.2792
                                                                  10.5228 62.5863 -2.307
                                                                                              0.0244
|| complexity1:Log10FS_std
                                                        3.1569
                                                                   1.5870 4599.1311
                                                                                      1.989
                                                                                              0.0467 *
|| complexity1:Orthographic_Sensitivity1
                                                       -1.3060
                                                                   1.5797 4599.6974
                                                                                     -0.827
                                                                                               0.4084
|| Log10FS_std:Orthographic_Sensitivity1
                                                        0.3085
                                                                   1.5854 4598.4808
                                                                                              0.8457
                                                                                       0.195
|| complexity1:Log10FS_std:Orthographic_Sensitivity1 0.8552
                                                                   1.5870 4599.1311
                                                                                     0.539
                                                                                              0.5900
11
|| Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
11
|| Correlation of Fixed Effects:
|| (Intr) cmplx1 Lg10FS_ Ort_S1 cm1:L10FS_ c1:0_S L10FS_: || complexity1 0.025
```

1.6.2 Effects

Effect	df	F	p.value
complexity	1, 4600.75	106.13 ***	<.001
Orthographic_Sensitivity	1, 64.11	5.32 *	.024
complexity:Log10FS std	1, 4600.65	3.96 *	.047

```
emmeans_obj <- emmeans(anova_model_2, pairwise ~ complexity)</pre>
cohensd_df <- as.data.frame(cohens_d(response_time ~ complexity, data = rt_nwords_cmpl))</pre>
contrasts_df <- as.data.frame(emmeans_obj$contrasts)</pre>
(complexity_df <- bind_cols(contrasts_df,cohensd_df))</pre>
|| Results are averaged over the levels of: Orthographic_Sensitivity
|| Degrees-of-freedom method: kenward-roger
(complexity_means <-as.data.frame(emmeans_obj$emmeans))</pre>

        complexity
        emmean
        SE
        df lower.CL upper.CL
        upper.CL vpper.CL

        Complex
        731.8844
        10.67933
        68.01
        710.5742
        753.1947

        Simple
        699.3372
        10.60207
        66.07
        678.1699
        720.5045

11
              699.3372 10.60207 66.07 678.1699 720.5045
|| Simple
II
|| Results are averaged over the levels of: Orthographic_Sensitivity
|| Degrees-of-freedom method: kenward-roger
|| Confidence level used: 0.95
# Orthographic_Sensitivity
emmeans_obj <- emmeans(anova_model_2, pairwise ~ Orthographic_Sensitivity)</pre>
cohensd_df <- as.data.frame(cohens_d(response_time ~ Orthographic_Sensitivity, data = rt_nwords_cmpl))
contrasts df <- as.data.frame(emmeans obj$contrasts)
(ortho_sens_df <- bind_cols(contrasts_df,cohensd_df))</pre>
|| Results are averaged over the levels of: complexity
|| Degrees-of-freedom method: kenward-roger
(ortho_sens_means <-as.data.frame(emmeans_obj$emmeans))</pre>
|| High Orthographic
|| Low Orthographic
                            739.8901 15.34718 64.46 709.2348 770.5454
|| Results are averaged over the levels of: complexity
|| Degrees-of-freedom method: kenward-roger
|| Confidence level used: 0.95
# Estimate the effect of complexity at low, mean, and high FS
em_complexity <- emmeans(anova_model_2, ~ complexity | Log10FS_std, at = list(Log10FS_std = c(-1, 0, 1)))
summary(em_complexity)
|| Log10FS_std = -1:
|| complexity emmean SE df lower.CL upper.CL
                                 704
                 726 10.9 74.6
    Complex
11
  Simple
                 700 10.8 71.2
                                     678
|| Log10FS_std = 0:
  complexity emmean SE df lower.CL upper.CL
                                  711
\Pi
  Complex
                 732 10.7 68.0
|| Simple
                  699 10.6 66.1
                                     678
11
|| Log10FS_std = 1:
|| complexity emmean SE df lower.CL upper.CL
  Complex
                 738 11.0 75.9
                                 716
                                              759
                  699 10.8 70.8
                                     677
                                              720
|| Results are averaged over the levels of: Orthographic_Sensitivity
|| Degrees-of-freedom method: kenward-roger
|| Confidence level used: 0.95
```

```
# Estimate the slope of Log10FS within each complexity level
em_trends <- emtrends(anova_model_2, ~ complexity, var = "Log10FS_std")</pre>
summary(em_trends)
5.657 2.43 4601
|| Complex
                                       0.885
                                                10.43
П
   Simple
                      -0.656 2.03 4600
                                       -4.644
                                                 3.33
\Pi
\verb|| Results are averaged over the levels of: Orthographic\_Sensitivity\\
|| Degrees-of-freedom method: kenward-roger
|| Confidence level used: 0.95
```

1.6.3 Plots

Interaction of Morphological Complexity and Family Size on RT

