

F06_mci_style_neu_additional_analyses.R

2023-08-07

```
## MCI_STYLE_NEU ADDITIONAL ANALYSES ##
```

```
# This script contains additional control analyses in addition to the planned  
# mixed models to control for semantic contexts instead of item as the random level.  
# Both models are compared using a Likelihood Ratio Test.
```

```
## SETUP ## -----
```

```
# Load packages
```

```
library(MASS)      # Version 7.3-51.6  
library(lme4)      # Version 1.1-23  
library(lmerTest)  # Version 3.1-2  
library(afex)      # Version 0.27-2  
library(emmeans)   # Version 1.4.8  
library(tidyverse) # Version 1.3.0  
library(magrittr)   # Version 1.5
```

```
# Load preprocessed data
```

```
a1 <- readRDS("EEG/export/a1.RDS")
```

```
# Remove trials with errors or invalid RTs/ERPs
```

```
a1 %<>% filter(!error) %>% na.omit()
```

```
# Center behavioral ratings (valence and arousal) around 0
```

```
a1 %<>% mutate(rating_1 = Rating1Resp - 2, rating_2 = Rating2Resp - 2)
```

```
# Define simple contrast coding for context narrative style (normal - fairytale)
```

```
# H0(Intercept): (mu1+mu2)/2 = 0 <-> mu1+mu2 = 0
```

```
# H0(Slope): -mu1 + mu2 = 0
```

```
# with mu1 = mean of the normal style and mu2 = mean of the fairytale style
t(contrasts.style <- t(cbind(c("nor" = -1, "ft1" = 1))))
```

```
##      [,1]
## nor    -1
## ft1     1
```

```
contrasts(a1$style) <- ginv(contrasts.style)
```

```
# Define simple contrast coding for semantics (violation - intuitive, mci - intuitive)
# H0(Intercept): (mu1+mu2+mu3)/3 = 0 <-> mu1+mu2+mu3 = 0
# H0(Slope1): -1*mu1 +1*mu2 + 0*mu3 = 0
# H0(Slope2): -1*mu1 +0*mu2 + 1*mu3 = 0
# with mu1 = mean of intuitive concepts, mu2 = mean of violations, mu3 = mean of MCIs
t(contrasts.semantics <- t(cbind(c("int" = -1, "vio" = 1, "mci" = 0),
                                c("int" = -1, "vio" = 0, "mci" = 1))))
```

```
##      [,1] [,2]
## int    -1   -1
## vio     1    0
## mci     0    1
```

```
contrasts(a1$semantics) <- ginv(contrasts.semantics)
```

```
## LINEAR MIXED-EFFECTS MODELS ## -----
```

```
# Specify settings for optimization in lmer
```

```
control_params <- lmerControl(calc.derivs = FALSE, optimizer = "bobyqa", optCtrl = list(maxfun = 2e5))
```

```
# LMM for verb-related N400
```

```
mod_N400_verb <- lmer_alt(N400_verb ~ semantics*style + (semantics*style||participant) + (semantics*style||item),
                        data = a1, control = control_params)
```

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

```
mod_N400_verb2 <- lmer_alt(N400_verb ~ semantics*style + (semantics*style||participant) + (semantics*style||item)+
                        (semantics*style||kontext_nr) ,
                        data = a1, control = control_params)
```

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

```
anova(mod_N400_verb, mod_N400_verb2)
```

```
## refitting model(s) with ML (instead of REML)
```

```
## Data: data
```

```
## Models:
```

```
## mod_N400_verb: N400_verb ~ semantics * style + (1 + re1.semantics1 + re1.semantics2 + re1.style1 + re1.semantics1_by_style1 + re1.semantics1_by_style2)
```

```
## mod_N400_verb2: N400_verb ~ semantics * style + (1 + re1.semantics1 + re1.semantics2 + re1.style1 + re1.semantics1_by_style1 + re1.semantics1_by_style2)
```

```
##               npar    AIC    BIC logLik deviance  Chisq Df Pr(>Chisq)
```

```
## mod_N400_verb    19 36710 36840 -18336    36672
```

```
## mod_N400_verb2   25 36718 36889 -18334    36668 4.4709  6    0.6132
```

```
# LMM for picture-related N400
```

```
mod_N400_pict <- lmer_alt(N400_pict ~ semantics*style + (semantics*style||participant) + (semantics*style||item),
                        data = a1, control = control_params)
```

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

```
mod_N400_pict2 <- lmer_alt(N400_pict ~ semantics*style + (semantics*style||participant) + (semantics*style||item) +
                        (semantics*style||kontext_nr) ,
                        data = a1, control = control_params)
```

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

```
anova(mod_N400_pict, mod_N400_pict2)
```

```
## refitting model(s) with ML (instead of REML)
```

```
## Data: data
## Models:
## mod_N400_pict: N400_pict ~ semantics * style + (1 + re1.semantics1 + re1.semantics2 + re1.style1 + re1.semantics1_by_style1 + re1.semantics1_by_style1)
## mod_N400_pict2: N400_pict ~ semantics * style + (1 + re1.semantics1 + re1.semantics2 + re1.style1 + re1.semantics1_by_style1 + re1.semantics1_by_style1)
##      npar    AIC    BIC logLik deviance  Chisq Df Pr(>Chisq)
## mod_N400_pict    19 40403 40533 -20182    40365
## mod_N400_pict2   25 40384 40555 -20167    40334 31.032  6    2.5e-05 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

```
# Create a list of all four models
models <- list("N400_VERB" = mod_N400_verb,
               "N400_VERB2" = mod_N400_verb2, "N400_PICT" = mod_N400_pict,
               "N400_PICT2" = mod_N400_pict2)

# F-tests (type III tests)
(tests <- map(models, anova))
```

```
## $N400_VERB
## Type III Analysis of Variance Table with Satterthwaite's method
##      Sum Sq Mean Sq NumDF  DenDF F value Pr(>F)
## semantics      49.615   24.808     2 167.038  2.1461 0.1202
## style           12.252   12.252     1  49.762  1.0599 0.3082
## semantics:style  36.095   18.047     2  58.826  1.5613 0.2184
##
## $N400_VERB2
## Type III Analysis of Variance Table with Satterthwaite's method
##      Sum Sq Mean Sq NumDF  DenDF F value  Pr(>F)
## semantics      56.421   28.211     2 6744.3   2.4454 0.08677 .
## style           10.830   10.830     1  40.7    0.9388 0.33831
## semantics:style  35.961   17.980     2  52.6    1.5586 0.21999
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## $N400_PICT
## Type III Analysis of Variance Table with Satterthwaite's method
##      Sum Sq Mean Sq NumDF  DenDF F value  Pr(>F)
## semantics      73.377   36.688     2  75.8    1.8929 0.157685
## style          134.130  134.130     1 6692.5   6.9202 0.008542 **
```

```
## semantics:style 185.370  92.685      2   82.2  4.7819 0.010851 *
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## $N400_PICT2
## Type III Analysis of Variance Table with Satterthwaite's method
##           Sum Sq Mean Sq NumDF  DenDF F value    Pr(>F)
## semantics      124.09   62.044     2    42.4   3.2039 0.050601 .
## style          134.74  134.736     1  6707.4   6.9577 0.008365 **
## semantics:style 184.34   92.172     2    82.4   4.7597 0.011064 *
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

PLANNED FOLLOW-UP CONTRASTS

```
# Allow emmeans to compute Satterthwaites p-values
emm_options(lmer.df = "Satterthwaite", lmerTest.limit = Inf)

# Follow-up contrasts for the main effect of semantics
(means.semantics <- map(models,function(x){
  emmeans(x, trt.vs.ctrl ~ semantics, infer = TRUE, adjust = "bonferroni")$contrasts
}))
```

NOTE: Results may be misleading due to involvement in interactions

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```
## $N400_VERB
## contrast estimate    SE      df lower.CL upper.CL t.ratio p.value
## vio - int    0.020 0.100 6757.9  -0.205   0.2449   0.199  1.0000
## mci - int   -0.181 0.105  81.3  -0.421   0.0593  -1.719  0.1787
##
## Results are averaged over the levels of: style
## Degrees-of-freedom method: satterthwaite
## Confidence level used: 0.95
## Conf-level adjustment: bonferroni method for 2 estimates
```

```

## P value adjustment: bonferroni method for 2 tests
##
## $N400_VERB2
## contrast estimate SE df lower.CL upper.CL t.ratio p.value
## vio - int 0.0216 0.1 6744 -0.203 0.2462 0.216 1.0000
## mci - int -0.1800 0.1 6725 -0.404 0.0443 -1.800 0.1440
##
## Results are averaged over the levels of: style
## Degrees-of-freedom method: satterthwaite
## Confidence level used: 0.95
## Conf-level adjustment: bonferroni method for 2 estimates
## P value adjustment: bonferroni method for 2 tests
##
## $N400_PICT
## contrast estimate SE df lower.CL upper.CL t.ratio p.value
## vio - int 0.0229 0.192 57.2 -0.420 0.4655 0.119 1.0000
## mci - int -0.3524 0.189 40.6 -0.793 0.0884 -1.861 0.1400
##
## Results are averaged over the levels of: style
## Degrees-of-freedom method: satterthwaite
## Confidence level used: 0.95
## Conf-level adjustment: bonferroni method for 2 estimates
## P value adjustment: bonferroni method for 2 tests
##
## $N400_PICT2
## contrast estimate SE df lower.CL upper.CL t.ratio p.value
## vio - int 0.0241 0.141 43.2 -0.303 0.3515 0.171 1.0000
## mci - int -0.3554 0.157 24.9 -0.729 0.0179 -2.270 0.0642
##
## Results are averaged over the levels of: style
## Degrees-of-freedom method: satterthwaite
## Confidence level used: 0.95
## Conf-level adjustment: bonferroni method for 2 estimates
## P value adjustment: bonferroni method for 2 tests

# Follow-up contrasts for the main effect of context style
(means.style <- map(models, function(x){
  emmeans(x, trt.vs.ctrl ~ style, infer = TRUE, adjust = "bonferroni")$contrasts
}))

```

NOTE: Results may be misleading due to involvement in interactions
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\$N400_VERB

contrast	estimate	SE	df	lower.CL	upper.CL	t.ratio	p.value
ftl - nor	-0.0857	0.0832	49.8	-0.253	0.0815	-1.030	0.3082

Results are averaged over the levels of: semantics
 ## Degrees-of-freedom method: satterthwaite
 ## Confidence level used: 0.95

\$N400_VERB2

contrast	estimate	SE	df	lower.CL	upper.CL	t.ratio	p.value
ftl - nor	-0.0857	0.0884	40.7	-0.264	0.0929	-0.969	0.3383

Results are averaged over the levels of: semantics
 ## Degrees-of-freedom method: satterthwaite
 ## Confidence level used: 0.95

\$N400_PICT

contrast	estimate	SE	df	lower.CL	upper.CL	t.ratio	p.value
ftl - nor	0.279	0.106	6692	0.071	0.486	2.631	0.0085

Results are averaged over the levels of: semantics
 ## Degrees-of-freedom method: satterthwaite
 ## Confidence level used: 0.95

\$N400_PICT2

contrast	estimate	SE	df	lower.CL	upper.CL	t.ratio	p.value
ftl - nor	0.279	0.106	6707	0.0717	0.487	2.638	0.0084

Results are averaged over the levels of: semantics
 ## Degrees-of-freedom method: satterthwaite
 ## Confidence level used: 0.95

```
# Follow-up contrasts for semantics within each context style
(means.nested <- map(models, function(x){
  emmeans(x, trt.vs.ctrl ~ semantics|style, infer = TRUE, adjust = "bonferroni")$contrasts
})))
```

```
## $N400_VERB
## style = nor:
## contrast estimate SE df lower.CL upper.CL t.ratio p.value
## vio - int -0.0241 0.146 294.2 -0.352 0.3041 -0.165 1.0000
## mci - int -0.3805 0.156 90.7 -0.736 -0.0251 -2.440 0.0332
##
## style = ftl:
## contrast estimate SE df lower.CL upper.CL t.ratio p.value
## vio - int 0.0640 0.146 295.6 -0.265 0.3925 0.439 1.0000
## mci - int 0.0192 0.156 90.3 -0.336 0.3743 0.123 1.0000
##
## Degrees-of-freedom method: satterthwaite
## Confidence level used: 0.95
## Conf-level adjustment: bonferroni method for 2 estimates
## P value adjustment: bonferroni method for 2 tests
##
## $N400_VERB2
## style = nor:
## contrast estimate SE df lower.CL upper.CL t.ratio p.value
## vio - int -0.0219 0.144 244 -0.346 0.3022 -0.153 1.0000
## mci - int -0.3799 0.153 107 -0.727 -0.0326 -2.487 0.0288
##
## style = ftl:
## contrast estimate SE df lower.CL upper.CL t.ratio p.value
## vio - int 0.0651 0.144 245 -0.259 0.3896 0.453 1.0000
## mci - int 0.0199 0.153 107 -0.327 0.3668 0.130 1.0000
##
## Degrees-of-freedom method: satterthwaite
## Confidence level used: 0.95
## Conf-level adjustment: bonferroni method for 2 estimates
## P value adjustment: bonferroni method for 2 tests
##
## $N400_PICT
```



```

## style = nor:
## contrast estimate SE df lower.CL upper.CL t.ratio p.value
## vio - int -0.221 0.240 91.6 -0.769 0.327 -0.920 0.7198
## mci - int -0.751 0.230 87.8 -1.275 -0.227 -3.270 0.0031
##
## style = ftl:
## contrast estimate SE df lower.CL upper.CL t.ratio p.value
## vio - int 0.267 0.241 91.7 -0.281 0.815 1.110 0.5399
## mci - int 0.046 0.229 87.5 -0.477 0.569 0.201 1.0000
##
## Degrees-of-freedom method: satterthwaite
## Confidence level used: 0.95
## Conf-level adjustment: bonferroni method for 2 estimates
## P value adjustment: bonferroni method for 2 tests
##
## $N400_PICT2
## style = nor:
## contrast estimate SE df lower.CL upper.CL t.ratio p.value
## vio - int -0.2184 0.202 76.2 -0.679 0.243 -1.083 0.5641
## mci - int -0.7528 0.203 71.0 -1.218 -0.287 -3.703 0.0008
##
## style = ftl:
## contrast estimate SE df lower.CL upper.CL t.ratio p.value
## vio - int 0.2666 0.202 76.2 -0.195 0.728 1.321 0.3807
## mci - int 0.0421 0.203 70.7 -0.423 0.507 0.207 1.0000
##
## Degrees-of-freedom method: satterthwaite
## Confidence level used: 0.95
## Conf-level adjustment: bonferroni method for 2 estimates
## P value adjustment: bonferroni method for 2 tests

# Backup results
save(models, tests, means.semantics, means.style, means.nested, file = "EEG/export/stats.RData")

# System specs and package versions
sessionInfo()

## R version 4.3.1 (2023-06-16)
## Platform: x86_64-apple-darwin20 (64-bit)

```

```

## Running under: macOS Ventura 13.4.1
##
## Matrix products: default
## BLAS:   /System/Library/Frameworks/Accelerate.framework/Versions/A/Frameworks/vecLib.framework/Versions/A/libBLAS.dylib
## LAPACK: /Library/Frameworks/R.framework/Versions/4.3-x86_64/Resources/lib/libRlapack.dylib; LAPACK version 3.11.0
##
## locale:
## [1] en_US.UTF-8/en_US.UTF-8/en_US.UTF-8/C/en_US.UTF-8/en_US.UTF-8
##
## time zone: Europe/Berlin
## tzcode source: internal
##
## attached base packages:
## [1] stats      graphics  grDevices datasets  utils      methods    base
##
## other attached packages:
## [1] magrittr_2.0.3  lubridate_1.9.2 forcats_1.0.0  stringr_1.5.0  dplyr_1.1.2
## [6] purrr_1.0.1     readr_2.1.4    tidyr_1.3.0    tibble_3.2.1   ggplot2_3.4.2
## [11] tidyverse_2.0.0 emmeans_1.8.7  afex_1.3-0     lmerTest_3.1-3 lme4_1.1-34
## [16] Matrix_1.6-0    MASS_7.3-60
##
## loaded via a namespace (and not attached):
## [1] generics_0.1.3    utf8_1.2.3        renv_0.12.0        stringi_1.7.12
## [5] lattice_0.21-8    hms_1.1.3          digest_0.6.33      timechange_0.2.0
## [9] evaluate_0.21     grid_4.3.1         estimability_1.4.1 mvtnorm_1.2-2
## [13] fastmap_1.1.1     plyr_1.8.8         fansi_1.0.4        scales_1.2.1
## [17] numDeriv_2016.8-1.1 abind_1.4-5        cli_3.6.1          rlang_1.1.1
## [21] munsell_0.5.0     splines_4.3.1      withr_2.5.0        yaml_2.3.7
## [25] tools_4.3.1       parallel_4.3.1     tzdb_0.4.0         reshape2_1.4.4
## [29] nloptr_2.0.3      minqa_1.2.5        colorspace_2.1-0   boot_1.3-28.1
## [33] vctr_0.6.3        R6_2.5.1           lifecycle_1.0.3    car_3.1-2
## [37] pkgconfig_2.0.3   pillar_1.9.0       gtable_0.3.3       glue_1.6.2
## [41] Rcpp_1.0.11       tidyselect_1.2.0   xfun_0.39          rstudioapi_0.15.0
## [45] knitr_1.43        htmltools_0.5.5    nlme_3.1-162       rmarkdown_2.23
## [49] carData_3.0-5     compiler_4.3.1

```