## Group analysis

### Load packages

```
pacman::p_load(readr, lme4, emmeans, yarrr, ggplot2, dplyr)
```

#### Load data

```
amp = read_csv("amp.csv")
## Rows: 320 Columns: 7
## -- Column specification -----
## Delimiter: ","
## chr (4): Time, Channel, Deviant, Group
## dbl (3): ID, Amplitude, DeviantLevel
## i Use 'spec()' to retrieve the full column specification for this data.
## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.
amp_all = read_csv("amp_all.csv")
## Rows: 576 Columns: 7
## -- Column specification ------
## Delimiter: ","
## chr (3): Channel, Deviant, Group
## dbl (4): ID, DeviantLevel, Amplitude.T1, Amplitude.T2
## i Use 'spec()' to retrieve the full column specification for this data.
## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.
lat = read_csv("lat.csv")
## Rows: 320 Columns: 7
```

```
## -- Column specification ------
## Delimiter: ","
## chr (4): Time, Channel, Deviant, Group
## dbl (3): ID, Latency_peak, DeviantLevel
## i Use 'spec()' to retrieve the full column specification for this data.
## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.
lat_all = read_csv("lat_all.csv")
## Rows: 576 Columns: 7
## Delimiter: ","
## chr (3): Channel, Deviant, Group
## dbl (4): ID, DeviantLevel, Latency_peak.T1, Latency_peak.T2
## i Use 'spec()' to retrieve the full column specification for this data.
## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.
All_behav = read_csv("All_behav.csv")
## Rows: 752 Columns: 6
## Delimiter: ","
## chr (3): Round, Deviant, Group
## dbl (3): ID, DeviantLevel, AvCor
## i Use 'spec()' to retrieve the full column specification for this data.
## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.
amp$ID=as.factor(amp$ID)
amp$Deviant=as.factor(amp$Deviant)
amp$DeviantLevel=as.factor(amp$DeviantLevel)
amp$Group=as.factor(amp$Group)
amp_all$ID=as.factor(amp_all$ID)
amp_all$Deviant=as.factor(amp_all$Deviant)
amp_all$DeviantLevel=as.factor(amp_all$DeviantLevel)
amp_all$Group=as.factor(amp_all$Group)
lat$ID=as.factor(lat$ID)
lat$Deviant=as.factor(lat$Deviant)
lat$DeviantLevel=as.factor(lat$DeviantLevel)
lat$Group=as.factor(lat$Group)
lat_all$ID=as.factor(lat_all$ID)
```

```
lat_all$Deviant=as.factor(lat_all$Deviant)
lat_all$DeviantLevel=as.factor(lat_all$DeviantLevel)
lat_all$Group=as.factor(lat_all$Group)

All_behav$ID=as.factor(All_behav$ID)
All_behav$Deviant=as.factor(All_behav$Deviant)
All_behav$DeviantLevel=as.factor(All_behav$DeviantLevel)
All_behav$Group=as.factor(All_behav$Group)
```

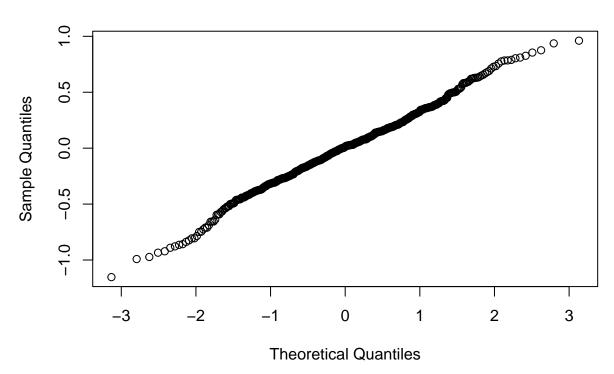
## Hierarchical mixed effects modeling - MMN Amplitude (T2)

```
MO=lmer(Amplitude.T2~1+(1|ID), data=amp_all, REML = FALSE, control = lmerControl(optimizer = "nloptwrap
M1=lmer(Amplitude.T2~Deviant+(1|ID), data=amp_all, REML = FALSE, control = lmerControl(optimizer = "nlo
M2=lmer(Amplitude.T2~Deviant+DeviantLevel+(1|ID), data=amp_all, REML = FALSE, control = lmerControl(opt
M3=lmer(Amplitude.T2~Deviant+DeviantLevel+Group+(1|ID), data=amp_all, REML = FALSE, control = lmerContr
M4=lmer(Amplitude.T2~Deviant*DeviantLevel+Group+(1|ID), data=amp_all, REML = FALSE, control = lmerContr
M5=lmer(Amplitude.T2~Deviant*DeviantLevel+Deviant*Group+(1|ID), data=amp_all, REML = FALSE, control = 1
M6=lmer(Amplitude.T2~Deviant*DeviantLevel+Deviant*Group+DeviantLevel*Group+(1|ID), data=amp_all, REML =
M7=lmer(Amplitude.T2~Deviant*Group*DeviantLevel+(1|ID), data=amp_all, REML = FALSE, control = lmerContr
#comparing models
anova (M0, M1, M2, M3, M4, M5, M6, M7)
## Data: amp_all
## Models:
## MO: Amplitude.T2 ~ 1 + (1 | ID)
## M1: Amplitude.T2 ~ Deviant + (1 | ID)
## M2: Amplitude.T2 ~ Deviant + DeviantLevel + (1 | ID)
## M3: Amplitude.T2 ~ Deviant + DeviantLevel + Group + (1 | ID)
## M4: Amplitude.T2 ~ Deviant * DeviantLevel + Group + (1 | ID)
## M5: Amplitude.T2 ~ Deviant * DeviantLevel + Deviant * Group + (1 | ID)
## M6: Amplitude.T2 ~ Deviant * DeviantLevel + Deviant * Group + DeviantLevel * Group + (1 | ID)
## M7: Amplitude.T2 ~ Deviant * Group * DeviantLevel + (1 | ID)
##
                                           Chisq Df Pr(>Chisq)
     npar
             AIC
                    BIC logLik deviance
## MO
        3 630.01 643.08 -312.00 624.01
## M1
        6 595.29 621.43 -291.64 583.29 40.7199 3 7.498e-09 ***
        9 588.03 627.23 -285.01 570.03 13.2616 3
## M2
                                                     0.004104 **
      11 580.13 628.05 -279.07 558.13 11.8963 2
## M3
                                                     0.002611 **
       20 560.60 647.72 -260.30 520.60 37.5337 9 2.113e-05 ***
## M4
       26 564.79 678.05 -256.40 512.79 7.8036 6
## M5
                                                     0.252851
       32 566.77 706.17 -251.39 502.77 10.0219 6
## M6
                                                      0.123732
## M7
       50 584.80 802.61 -242.40 484.80 17.9704 18
                                                      0.457605
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

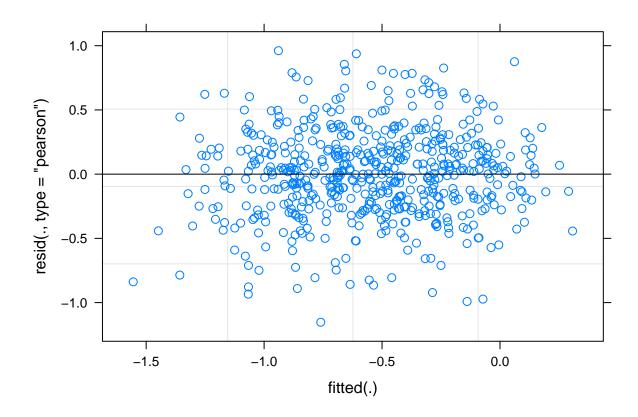
### Best model

qqnorm(resid(M4))

# Normal Q-Q Plot



plot(M4)



#### Post-hoc analysis

```
emm_g <- emmeans(M4, pairwise ~ Group)
emm_gc <- emm_g[[2]]
emm_d <- emmeans(M4, pairwise ~ Deviant)</pre>
```

## NOTE: Results may be misleading due to involvement in interactions

```
emm_dc <- emm_d[[2]]

#Group by deviant interaction

emm_g.d <- emmeans(M4, pairwise ~ Group | Deviant)
IC_g.d <- contrast(emm_g.d[[1]], method = "pairwise")

emm_d.g <- emmeans(M4, pairwise ~ Deviant | Group)
IC_d.g <- contrast(emm_d.g[[1]], method = "pairwise")

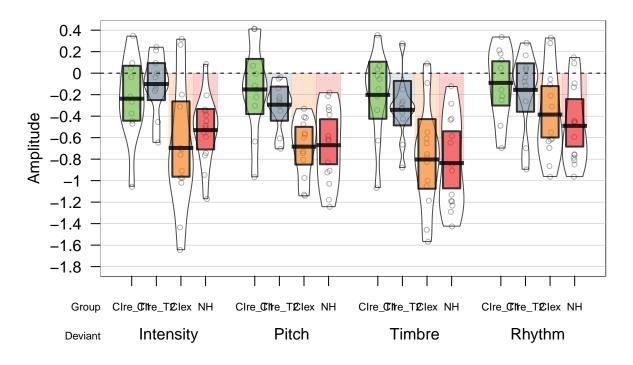
# rbind(emm_gc, emm_dc, IC_g.d[1:4], IC_d.g[1:12], adjust = "mvt")
# rbind(IC_g.d[1:4], adjust = "mvt")
# rbind(IC_g.d[1:4], adjust = "none")
# rbind(IC_g.d[c(1,2,4)], adjust = "none")</pre>
```

```
 \begin{tabular}{ll} \# \ IC\_g.d[1:4] \\ \# \ IC\_d.g[1:12] \\ \# \\ \# \ IC\_IC\_d.g <- \ contrast(emm\_d.g[[1]], \ interaction = c("pairwise", "consec"), \ by = NULL) \\ \# rbind(IC\_IC\_d.g[1:6], \ adjust = "bonferroni") \\ \end{tabular}
```

#### Plot

```
ID_plot_data = read_csv("ID_plot_data_amp.csv")
## Rows: 188 Columns: 5
## Delimiter: ","
## chr (3): Group, Time, Deviant
## dbl (2): ID, Amp
##
## i Use 'spec()' to retrieve the full column specification for this data.
## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.
pirat = ID_plot_data
pirat$Group[pirat$Time =="CIre_T1"]=gsub("CI_re", "CIre_T1", pirat$Group[pirat$Time =="CIre_T1"])
pirat$Group[pirat$Time =="CIre_T2"]=gsub("CI_re", "CIre_T2", pirat$Group[pirat$Time =="CIre_T2"])
pirat$Group=ordered(pirat$Group, levels=c("CIre_T1", "CIre_T2", "CIex", "NH"))
pirat$Deviant=ordered(pirat$Deviant, levels=c("Intensity", "Pitch", "Timbre", "Rhythm"))
pirateplot(formula = Amp ~ Group + Deviant, data = pirat, main = "EEG (MMN-amplitude)", xlab = "group",
 abline(a=0, b=0, lwd=1, lty="dashed")
```

## **EEG (MMN-amplitude)**



## integer(0)

## Hierarchical mixed effects modeling - Latency (T2)

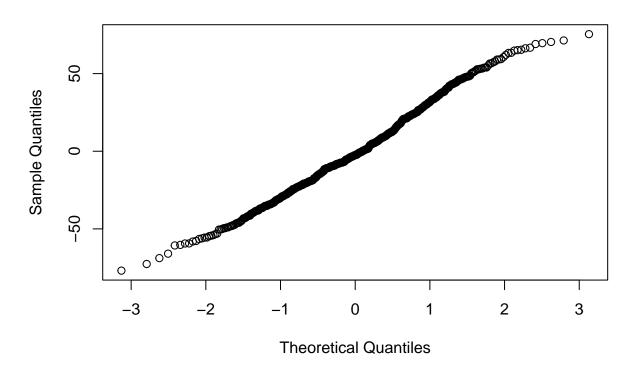
```
M0=lmer(Latency_peak.T2~1+(1|ID), data=lat_all, REML = FALSE, control = lmerControl(optimizer = "nloptw.m1=lmer(Latency_peak.T2~Deviant+(1|ID), data=lat_all, REML = FALSE, control = lmerControl(optimizer = "nloptw.m2=lmer(Latency_peak.T2~Deviant+DeviantLevel+(1|ID), data=lat_all, REML = FALSE, control = lmerControl(omm3=lmer(Latency_peak.T2~Deviant+DeviantLevel+Group+(1|ID), data=lat_all, REML = FALSE, control = lmerControl(omm3=lmer(Latency_peak.T2~Deviant+DeviantLevel+Group+(1|ID), data=lat_all, REML = FALSE, control = lmerControl(omm3=lmer(Latency_peak.T2~Deviant+DeviantLevel+Group+(1|ID), data=lat_all, REML = FALSE, control = lmerControl(omm3=lmerControl(omm3=lmerControl(omm3=lmerControl(omm3=lmerControl(omm3=lmerControl(omm3=lmerControl(omm3=lmerControl(omm3=lmerControl(omm3=lat_all, REML = FALSE, control = lmerControl(omm3=lmerControl(omm3=lat_all, REML = FALSE, control=lmerControl(omm3=lat_all, REML=lat_all, RemL=lat_al
```

```
## Data: lat_all
## Models:
## MO: Latency_peak.T2 ~ 1 + (1 | ID)
## M1: Latency_peak.T2 ~ Deviant + (1 | ID)
## M2: Latency_peak.T2 ~ Deviant + DeviantLevel + (1 | ID)
## M3: Latency_peak.T2 ~ Deviant + DeviantLevel + Group + (1 | ID)
## M4: Latency_peak.T2 ~ Deviant * DeviantLevel + Group + (1 | ID)
## M5: Latency_peak.T2 ~ Deviant * DeviantLevel + Deviant * Group + (1 | ID)
## M6: Latency_peak.T2 ~ Deviant * DeviantLevel + Deviant * Group + DeviantLevel * Group + (1 | ID)
## M7: Latency_peak.T2 ~ Deviant * DeviantLevel * Group + (1 | ID)
     npar
           AIC
                   BIC logLik deviance
                                          Chisq Df Pr(>Chisq)
## MO
        3 5647.3 5660.4 -2820.7
                                 5641.3
        6 5645.7 5671.8 -2816.9 5633.7 7.5894 3 0.0553056 .
## M1
## M2
       9 5648.2 5687.3 -2815.1 5630.2 3.5513 3 0.3141733
## M3
       11 5632.1 5680.0 -2805.1 5610.1 20.0574 2 4.411e-05 ***
       20 5628.1 5715.2 -2794.1 5588.1 21.9737 9 0.0089626 **
## M4
## M5
       26 5616.1 5729.3 -2782.1 5564.1 23.9943 6 0.0005235 ***
## M6
       32 5624.6 5763.8 -2780.3 5560.6 3.5498 6 0.7373360
## M7
       50 5646.3 5863.8 -2773.1 5546.3 14.3246 18 0.7076967
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
```

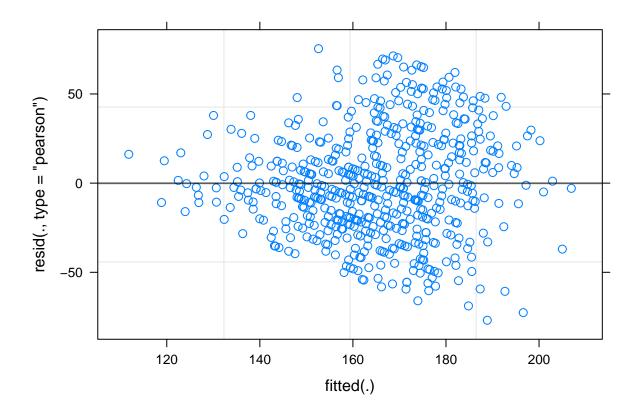
#### Best model

```
qqnorm(resid(M5))
```

# Normal Q-Q Plot

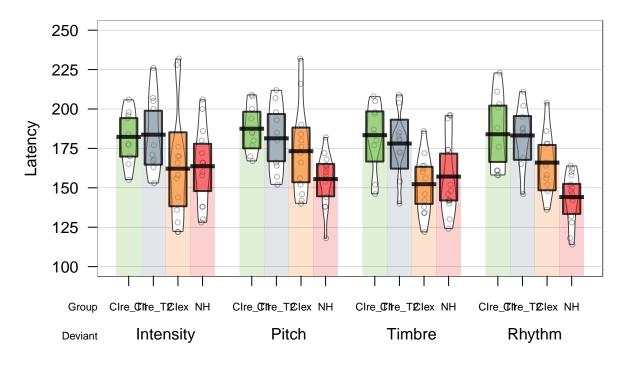


plot(M5)



```
## Plot
```

## **EEG (Latency)**



## Hierarchical mixed effects modeling - Behavioral (T2)

```
M0=glmer(cbind(AvCor*6,6)~1+(1|ID), data=All_behav[All_behav$Group!="CIre_T1",], family="binomial", con
M1=glmer(cbind(AvCor*6,6)~Deviant+(1|ID), data=All_behav[All_behav$Group!="CIre_T1",], family="binomial
M2=glmer(cbind(AvCor*6,6)~Deviant+DeviantLevel+(1|ID), data=All_behav[All_behav$Group!="CIre_T1",], fam
M3=glmer(cbind(AvCor*6,6)~Deviant+DeviantLevel+Group+(1|ID), data=All_behav[All_behav$Group!="CIre_T1",]
M4=glmer(cbind(AvCor*6,6)~Deviant*DeviantLevel+Group+(1|ID), data=All_behav[All_behav$Group!="CIre_T1",]
M5=glmer(cbind(AvCor*6,6)~Deviant*DeviantLevel+Deviant*Group+(1|ID), data=All_behav[All_behav$Group!="C
M6=glmer(cbind(AvCor*6,6)~Deviant*DeviantLevel+Deviant*Group+DeviantLevel*Group+(1|ID), data=All_behav[All_behav$Group!="C
M7=glmer(cbind(AvCor*6,6)~Deviant*DeviantLevel*Group+(1|ID), data=All_behav[All_behav$Group!="CIre_T1",]

#Comparing models
anova(M0, M1, M2, M3, M4, M5, M6, M7)
```

```
## Data: All_behav[All_behav$Group != "CIre_T1", ]
## Models:
## M0: cbind(AvCor * 6, 6) ~ 1 + (1 | ID)
## M1: cbind(AvCor * 6, 6) ~ Deviant + (1 | ID)
## M2: cbind(AvCor * 6, 6) ~ Deviant + DeviantLevel + (1 | ID)
## M3: cbind(AvCor * 6, 6) ~ Deviant + DeviantLevel + Group + (1 | ID)
## M4: cbind(AvCor * 6, 6) ~ Deviant * DeviantLevel + Group + (1 | ID)
## M5: cbind(AvCor * 6, 6) ~ Deviant * DeviantLevel + Deviant * Group + (1 | ID)
## M6: cbind(AvCor * 6, 6) ~ Deviant * DeviantLevel + Deviant * Group + DeviantLevel * Group + (1 | ID)
## M7: cbind(AvCor * 6, 6) ~ Deviant * DeviantLevel * Group + (1 | ID)
     npar
             AIC
                    BIC logLik deviance
                                           Chisq Df Pr(>Chisq)
## MO
        2 3285.4 3294.2 -1640.7
                                3281.4
## M1
        5 3148.9 3170.9 -1569.4 3138.9 142.4992 3 < 2.2e-16 ***
        8 3023.4 3058.6 -1503.7 3007.4 131.5106 3 < 2.2e-16 ***
## M2
## M3
       10 3013.1 3057.2 -1496.5 2993.1 14.2960 2 0.0007865 ***
       19 3000.5 3084.3 -1481.2 2962.5 30.5745 9 0.0003501 ***
## M4
       25 2989.8 3100.0 -1469.9 2939.8 22.7074 6 0.0009006 ***
## M5
## M6
       31 2999.6 3136.4 -1468.8 2937.6 2.1517 6 0.9052355
## M7
       49 3028.3 3244.4 -1465.2 2930.3 7.3054 18 0.9872881
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

#### Plots behavioral

```
ID_plot_data = read_csv("ID_plot_data_behav.csv")

## Rows: 188 Columns: 5

## -- Column specification -------
## Delimiter: ","

## chr (3): Group, Round, Deviant

## dbl (2): ID, AvCor

##

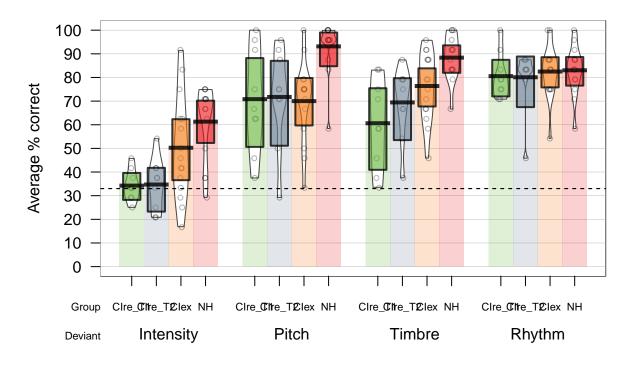
## i Use 'spec()' to retrieve the full column specification for this data.

## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.

ID_plot_data$Group=ordered(ID_plot_data$Group, levels=c("CIre_T1", "CIre_T2", "Clex", "NH"))
ID_plot_data$Deviant=ordered(ID_plot_data$Deviant, levels=c("Intensity", "Pitch", "Timbre", "Rhythm"))

## Creating pirateplot
pirateplot(formula = AvCor ~ Group + Deviant, data = ID_plot_data, main = "Behavioral (average correct) abline(a=33,33, b=0, lwd=1, lty="dashed")
```

# **Behavioral (average correct)**



## integer(0)