# Mixed Design Anova

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# **Happiness Scores**

# **Data Preparation**

## Upload data + packages

```
f <- "/Users/grantweaver/Dropbox/Grant Weaver/Positive Psychology/Data+Code_Book/ahi-cesd.csv"
ahi_cesd <- read.csv(f, header=TRUE, fill=TRUE, sep = ",")
library(tidyverse)
library(ggplot2)
library(lme4)
library(rstatix)
library(ggpubr)</pre>
```

## Take a look at the 1st 10 columns + rows

```
ahi_cesd[1:10, ]
ahi_cesd[, 1:10]
```

The data was uploaded correctly. We can continue with the process.

#### Filter out the subjects who did not complete all tests

```
ahi_cesd <- ahi_cesd %>%
  group_by(id) %>%
  filter(n()==6)
ahi_cesd
```

Anova doesn't deal well with missing subject data, thus we only include subjects who completed all the requirements of the study. The problem is that anova treats each measurement as a separate variable. Anova uses listwise deletion, which means that if one meausrement is missing then the entire case gets dropped. We are not using any techniques to replicate missing data, thus all data must be present from each subject to do the testing.

#### Load and show one random row by intervention group

```
ahi_cesd %>%
  sample_n_by(intervention, size = 1)
```

This is to check if the data looks as it should; which it does.

## Convert id, occasion and intervention into factor variables

```
ahi_cesd <- ahi_cesd %>%
  ungroup(id) %>%
  convert_as_factor(id, occasion, intervention)
```

Converting these 3 variables into factor variables allows us to compute analysis upon them. For when the variables are treated as continuous the analysis doesn't work.

## Inspect some random rows of the data by intervention groups

```
set.seed(123)
ahi_cesd %>%
  sample_n_by(intervention, occasion, intervention, size = 1)
```

Everything looks alright.

#### Here I rename the intervention column

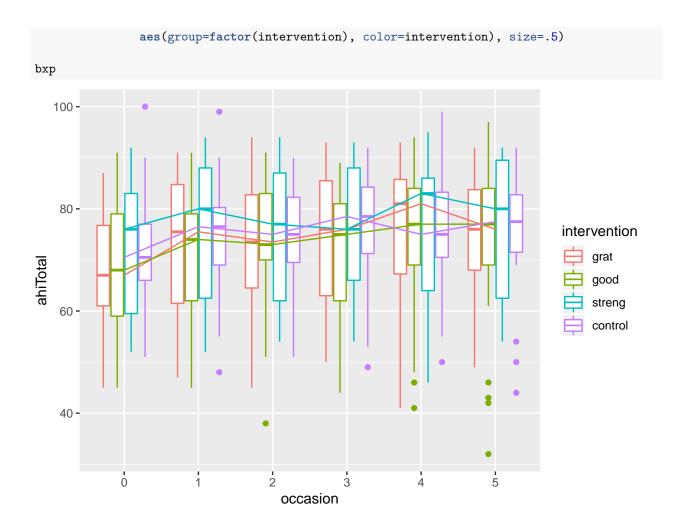
# **Summary statistics**

```
happy_sum <- ahi_cesd %>%
  group_by(intervention, occasion) %>%
  get_summary_stats(ahiTotal, type = "mean_sd") %>%
  print(n=Inf)
```

```
## # A tibble: 24 x 6
##
     occasion intervention variable
                                        n mean
##
      <fct>
              <fct>
                      <chr>
                                    <dbl> <dbl> <dbl>
##
  1 0
                                       18 67.6 12.2
                           ahiTotal
              grat
##
   2 1
                           ahiTotal
                                          72
                                                 14.8
              grat
                                       18
## 3 2
                                       18 71.5 14.6
                           ahiTotal
              grat
## 4 3
                           ahiTotal
                                       18 73.8 14.4
              grat
                                       18 75.3 15.0
## 5 4
                           ahiTotal
              grat
##
   6 5
                                          74.9
                           ahiTotal
                                       18
                                                13.1
              grat
  7 0
                                       25 69.5 11.8
##
              good
                           ahiTotal
  8 1
              good
                           ahiTotal
                                       25 71.5 12.0
## 9 2
                                       25 72.3 12.9
              good
                           ahiTotal
## 10 3
                           ahiTotal
                                       25 71.0 14.0
              good
                                       25 73.2 14.8
## 11 4
              good
                           ahiTotal
## 12 5
                           ahiTotal
                                       25 72.8 16.2
              good
                                       11 72.5 14.5
## 13 0
              streng
                           ahiTotal
## 14 1
                           ahiTotal
                                       11 75.3 14.7
              streng
## 15 2
                           ahiTotal
                                       11 74.8 14.6
              streng
## 16 3
                                       11 75.9 14.3
              streng
                           ahiTotal
## 17 4
                           ahiTotal
                                       11 75.2 15.8
              streng
                                       11 75.9 15.0
## 18 5
                           ahiTotal
              streng
## 19 0
              control
                           ahiTotal
                                       20 71.6 11.9
## 20 1
                           ahiTotal
                                       20 74.2 11.7
              control
## 21 2
                           ahiTotal
                                       20 74.3 11.4
              control
## 22 3
              control
                           ahiTotal
                                       20 75.4 12.3
## 23 4
                                       20 75.6 12.8
              control
                           ahiTotal
## 24 5
                                       20 74.6 12.7
              control
                           ahiTotal
```

# Visualization by boxplot

```
bxp <- ggplot(ahi_cesd, aes(occasion, ahiTotal)) +
  geom_boxplot(aes(color=intervention)) +
  stat_summary(fun.y=median, geom = "line",</pre>
```



# Check assumptions

# Check for outliers

```
ahi_cesd %>%
group_by(intervention, occasion) %>%
identify_outliers(ahiTotal) %>%
select(1:2, 49, 51:52)
```

```
## # A tibble: 15 x 5
##
      occasion intervention ahiTotal is.outlier is.extreme
##
      <fct>
                <fct>
                                 <int> <lgl>
                                                   <1g1>
    1 2
                                    38 TRUE
                                                   FALSE
##
                good
##
    2 4
                                    41 TRUE
                                                   FALSE
                good
    3 4
                                    46 TRUE
                                                   FALSE
##
               good
    4 5
                                    43 TRUE
                                                   FALSE
##
                good
##
    5 5
                                    32 TRUE
                                                   FALSE
                good
##
    6 5
                good
                                    42 TRUE
                                                   FALSE
##
    7 5
                                    46 TRUE
                                                   FALSE
                good
##
    8 0
                control
                                   100 TRUE
                                                   FALSE
##
    9 1
                                    48 TRUE
                                                   FALSE
                control
## 10 1
                control
                                    99 TRUE
                                                   FALSE
                                    49 TRUE
                                                   FALSE
## 11 3
                control
```

##	12	4	control	50	TRUE	FALSE
##	13	5	control	44	TRUE	FALSE
##	14	5	control	50	TRUE	FALSE
##	15	5	control	54	TRUE	FALSE

Values above Q3 + 1.5xIQR or below Q1 - 1.5xIQR are considered as outliers. Values above Q3 + 3xIQR or below Q1 - 3xIQR are considered extreme outliers.

The outliers don't appear to differ significantly from the mean. In othe words, outliers don't pose a problem in this situation. While there are outliers, there are no extreme outliers that would seem to pose a significant impact on the computation. The outliers are easy to notice from the above boxplot.

#### Check normality assumption

```
ahi_cesd %>%
group_by(intervention, occasion) %>%
shapiro_test(ahiTotal) %>%
print(n=Inf)
```

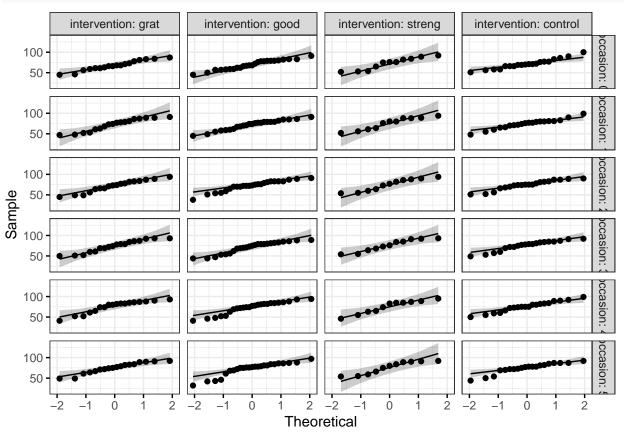
```
## # A tibble: 24 x 5
##
      occasion intervention variable statistic
##
      \langle fct. \rangle
                <fct>
                               <chr>>
                                              <dbl>
                                                      <dbl>
##
    1 0
                               ahiTotal
                                             0.963 0.661
                grat
##
    2 1
                               ahiTotal
                                             0.916 0.111
                grat
##
    3 2
                               ahiTotal
                                             0.952 0.453
                grat
    4 3
                                             0.931 0.206
##
                               ahiTotal
                grat
    5 4
##
                               ahiTotal
                                             0.875 0.0213
                grat
    6 5
##
                               ahiTotal
                                             0.934 0.229
                grat
                                             0.957 0.359
    7 0
                good
                               ahiTotal
##
    8 1
                good
                               ahiTotal
                                             0.954 0.307
##
    9 2
                               ahiTotal
                                             0.932 0.0992
                good
## 10 3
                                             0.904 0.0224
                good
                               ahiTotal
## 11 4
                               ahiTotal
                                             0.910 0.0309
                good
## 12 5
                good
                               ahiTotal
                                             0.861 0.00284
## 13 0
                streng
                               ahiTotal
                                             0.904 0.207
## 14 1
                streng
                               ahiTotal
                                             0.911 0.251
## 15 2
                               ahiTotal
                                             0.918 0.303
                streng
## 16 3
                               ahiTotal
                                             0.916 0.289
                streng
## 17 4
                               ahiTotal
                                             0.917 0.291
                streng
## 18 5
                streng
                               ahiTotal
                                             0.870 0.0767
## 19 0
                control
                               ahiTotal
                                             0.966 0.668
## 20 1
                               ahiTotal
                                             0.968 0.720
                control
## 21 2
                               ahiTotal
                                             0.925 0.124
                control
## 22 3
                               ahiTotal
                                             0.919 0.0952
                control
## 23 4
                               ahiTotal
                                             0.973 0.819
                control
## 24 5
                control
                               ahiTotal
                                             0.892 0.0288
```

The Shapiro-Wilks test for normality is designed to detect all departures from normality. The test rejects the hypothesis of normality when the p-value is <.05. Failing the normality test allows you to state with 95% confidence the data does not fit the normaly distribution. Passing the normality test only allows you to state no significant departure from normality was found. This technique works up to a sample size of 5,000. It works by quantifying the similarity between the observed and normal distributions as a single number: it puts a normal curve over the observed distribution. Then, it computes which percentage of the sample it overlaps with: a similarity percentage. Finally, it computes the probability of finding this observed or more extreme percentage. The null is that the population distribution is normal.

The ahiTotal score was normally distribted except for 5 cases that had p<.05. We will keep these points in consideration when we move to the QQ plots next.

# **QQ-Plot**

```
ggqqplot(ahi_cesd, "ahiTotal", ggtheme = theme_bw()) +
facet_grid(occasion~intervention, labeller = "label_both")
```



QQ plot draws the correlation between the data and the normal distribution.

From the plot above, as all the points fall approximately along the reference line for each cell, we can assume normality.

#### Homogneity of variance assumption

```
ahi_cesd %>%
group_by(occasion) %>%
levene_test(ahiTotal ~ intervention)
```

```
## # A tibble: 6 x 5
##
     occasion
                 df1
                       df2 statistic
##
     <fct>
               <int> <int>
                                <dbl> <dbl>
## 1 0
                   3
                        70
                                0.306 0.821
                        70
## 2 1
                   3
                                0.804 0.496
## 3 2
                   3
                        70
                                0.788 0.505
                   3
                        70
                                0.399 0.754
## 4 3
## 5 4
                   3
                        70
                                0.187 0.905
                   3
                        70
                                0.316 0.814
## 6 5
```

The homogeneity of variance assumption of the between-subject factor (intervention) can be checked using the Levene's test. The test is performed at each level of occasion based on the mean.

There was homogeneity of variance for there are no p-values<.05.

#### Homogeneity of covariances assumption

```
box_m(ahi_cesd[, "ahiTotal", drop = FALSE], ahi_cesd$intervention)
## # A tibble: 1 x 4
##
     statistic p.value parameter method
##
         <dbl>
                 <dbl>
                            <dbl> <chr>
## 1
          3.78
                 0.286
                                3 Box's M-test for Homogeneity of Covariance M~
```

The homogeneity of covariances of the between-subject factor (intervention) can be evaluated using the Box's M-test. If this test is statistically significant at p<.001, you do not have equal covariances, but if the test is not statistically significant, you have not violated the assumption of homogeneity of covariances.

The p-value>.001 thus there is homogeneity of covariances.

## Assumption of sphericity

This assumption is internally calculated in the anova computation below, thus we do not need to worry about this assumption right now.

#### Turn into data frame

```
ahi_cesd <- as.data.frame(ahi_cesd)</pre>
str(ahi cesd)
```

# Variable selection + modification

```
ahi_cesd_happy <- ahi_cesd %>%
  select(id, occasion, intervention, ahiTotal) %>%
  mutate(ahiTotal=as.numeric(ahiTotal))
str(ahi_cesd_happy)
```

# Computation

```
res.aov_happy <- anova_test(data = ahi_cesd_happy, dv = ahiTotal,
                      wid = id,
                      between = intervention, within =occasion,
                      detailed = TRUE)
res.aov_happy
## ANOVA Table (type III tests)
##
## $ANOVA
##
                    Effect DFn DFd
                                            SSn
                                                     SSd
                                                                 F
## 1
               (Intercept)
                                 70 2185215.229 63992.38 2390.364 7.54e-56
                              1
## 2
                              3 70
              intervention
                                        715.034 63992.38
                                                             0.261 8.53e-01
## 3
                             5 350
                                        909.655 13162.35
                                                             4.838 2.72e-04
                  occasion
## 4 intervention:occasion 15 350
                                        277.994 13162.35
                                                             0.493 9.44e-01
##
     p<.05
             ges
## 1
         * 0.966
## 2
           0.009
## 3
         * 0.012
           0.004
## 4
##
## $`Mauchly's Test for Sphericity`
                                        p p<.05
                    Effect
                              W
                  occasion 0.33 1.95e-10
## 1
```

```
## 2 intervention:occasion 0.33 1.95e-10
##
## $`Sphericity Corrections`
##
                    Effect
                             GGe
                                        DF[GG] p[GG] < .05</pre>
## 1
                  occasion 0.75
                                 3.75, 262.53 0.001
                                                                0.798
## 2 intervention:occasion 0.75 11.25, 262.53 0.910
                                                                0.798
            DF[HF]
                     p[HF] p[HF]<.05
     3.99, 279.25 0.00088
## 2 11.97, 279.25 0.91800
```

The mixed design method is the blend of within subjects and between subjects design. Within-subjects is the comparisons of the same subjects under different conditions/interventions. Within-subjects is also known as repeated-measures factor since repeated measurements are taken on each subject. Between-subjects is when a different group of subjects is used for each level of the variable. One nice definition I found is "mixed-design anova model tests for mean differences between two or more independent groups while subjecting participants to repeated measures".

In our case the between-subjects factor is intervention and the within-subjects factor is occasion. A  $4 \times 6$  (Intervention x Occasion) mixed-design anova is used.

There are different types of anova tables and it is important to distinguish between the different types. Type 3 anova table is given. In type 3 and type 2 the sums of squares are not sequential, so any order works out fine. Type 3, unlike type 2 have an interaction effect. Type 1 anova the sums of squares are sequential. Type 2 anova does not have an interaction effect. Type 3 anova is best when you are looking for an interaction effect, thus that is why we use type 3 for our computation.

From the results we see that there was a significant main effect for occasion, which means the subjects got happier as the study went on. The intervention X occasion interaction was not significant, which means that the intervention techniques were no better than the placebo. While the intercept is significant, we don't care about about it, for the intercept has no value in this setting.

## Post-hoc tests

#### Comparions for time variable

```
##
  # A tibble: 15 x 10
##
                                      n2 statistic
                                                        df
      .у.
             group1 group2
                               n1
                                                                  p p.adj
##
      <chr> <chr>
                    <chr>>
                            <int>
                                   <int>
                                              <dbl> <dbl>
                                                              <dbl> <dbl>
##
    1 ahiT~ 0
                                74
                                      74
                                             -3.37
                                                        73 1.00e-3 0.018
                     1
                     2
                                74
##
    2 ahiT~ 0
                                      74
                                             -2.92
                                                        73 5.00e-3 0.07
    3 ahiT~ 0
                     3
                                74
                                             -2.77
##
                                      74
                                                        73 7.00e-3 0.107
##
    4 ahiT~ 0
                     4
                                74
                                      74
                                             -3.78
                                                        73 3.14e-4 0.005
                                74
##
    5 ahiT~ 0
                     5
                                      74
                                             -3.47
                                                        73 8.65e-4 0.013
##
    6 ahiT~ 1
                     2
                                74
                                      74
                                             -0.188
                                                        73 8.51e-1 1
                     3
                                74
##
    7 ahiT~ 1
                                      74
                                             -0.879
                                                        73 3.82e-1 1
    8 ahiT~ 1
                     4
                                74
                                      74
                                             -1.88
                                                        73 6.40e-2 0.968
##
                                74
                     5
                                      74
                                                        73 1.77e-1 1
##
    9 ahiT~ 1
                                             -1.36
## 10 ahiT~ 2
                     3
                                74
                                      74
                                             -0.736
                                                        73 4.64e-1 1
## 11 ahiT~ 2
                     4
                                74
                                      74
                                             -1.99
                                                        73 5.10e-2 0.761
                     5
                                74
                                             -1.24
## 12 ahiT~ 2
                                      74
                                                        73 2.20e-1 1
## 13 ahiT~ 3
                     4
                                74
                                      74
                                                        73 2.98e-1 1
                                             -1.05
## 14 ahiT~ 3
                     5
                                74
                                      74
                                             -0.591
                                                        73 5.56e-1 1
                     5
## 15 ahiT~ 4
                                74
                                      74
                                              0.402
                                                        73 6.89e-1 1
## # ... with 1 more variable: p.adj.signif <chr>
```

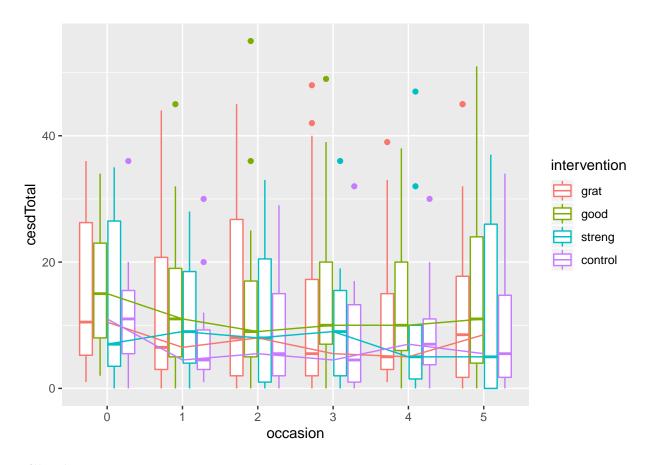
# **Depression Scores**

# **Summary Statistics**

```
sad_sum <- ahi_cesd %>%
 group_by(intervention, occasion) %>%
 get_summary_stats(cesdTotal, type = "mean_sd") %>%
 print(n=Inf)
## # A tibble: 24 x 6
     occasion intervention variable
                                      n mean
##
     <fct>
             <fct> <chr> <dbl> <dbl> <dbl> <dbl>
## 1 0
                         cesdTotal 18 14.7 12.2
             grat
## 2 1
             grat
                         cesdTotal
                                      18 14.2 15.9
## 3 2
                         cesdTotal
                                     18 14.5 15.9
             grat
## 4 3
                         cesdTotal 18 12.3 15.5
             grat
## 5 4
                                   18 11.1 12.1
             grat
                          cesdTotal
## 65
                          cesdTotal
                                     18 13.3 14.5
             grat
## 7 0
                          cesdTotal 25 15.1
                                              9.08
             good
## 8 1
                          cesdTotal 25 13.4 11.3
             good
## 9 2
                          cesdTotal 25 12.7 12.4
             good
## 10 3
                          cesdTotal
                                     25 13.9 12.5
             good
## 11 4
                          cesdTotal
                                   25 14.1 11.2
             good
## 12 5
                          cesdTotal
                                   25 16.6 16.8
             good
## 13 0
                          cesdTotal
                                     11 14.2 13.3
             streng
## 14 1
                                     11 11
                          cesdTotal
                                               9.56
             streng
## 15 2
                         cesdTotal 11 12.1 12.6
             streng
                         cesdTotal 11 10.4 10.9
## 16 3
             streng
## 17 4
                                     11 11
                                              15.0
             streng
                          cesdTotal
                         cesdTotal 11 12.1 14.9
## 18 5
             streng
## 19 0
                         cesdTotal 20 12.0
             control
                                              8.18
                       cesdTotal 20 7.4
## 20 1
             control
                                               6.97
## 21 2
                                     20 9.7
                                               9.40
             control
                         cesdTotal
                       cesdTotal
## 22 3
                                     20 7.55 8.07
             control
## 23 4
             control
                         cesdTotal
                                     20 8.5
                                               7.44
## 24 5
                          cesdTotal
                                     20 10.6 12.0
             control
```

# Visulation by boxplot

```
bxp <- ggplot(ahi_cesd, aes(occasion, cesdTotal)) +
  geom_boxplot(aes(color=intervention)) +
  stat_summary(fun.y = median, geom = "line", aes(group=factor(intervention), color=intervention), size
bxp</pre>
```



# Check assumptions

# Check for outliers

ahi\_cesd %>%

```
group_by(intervention, occasion) %>%
  identify_outliers(cesdTotal) %>%
  select(1:2, 49, 51:52)
## # A tibble: 17 x 5
##
      occasion intervention ahiTotal is.outlier is.extreme
##
      <fct>
                <fct>
                                 <int> <lgl>
                                                   <1g1>
    1 3
                                                   FALSE
##
                                    51 TRUE
                grat
##
    2 3
                grat
                                    50 TRUE
                                                   FALSE
##
    3 4
                                    52 TRUE
                                                   FALSE
                grat
##
    4 5
                grat
                                    49 TRUE
                                                   FALSE
##
    5 5
                                    49 TRUE
                                                   FALSE
                grat
##
    6 1
                                    45 TRUE
                                                   FALSE
                good
    7 2
##
                good
                                    38 TRUE
                                                   TRUE
    8 2
                                    51 TRUE
                                                   FALSE
               good
                                    44 TRUE
    9 3
                                                   FALSE
##
                good
## 10 3
                streng
                                    55 TRUE
                                                   FALSE
                                    55 TRUE
                                                   TRUE
## 11 4
                streng
## 12 4
                                    46 TRUE
                                                   FALSE
                streng
## 13 0
                control
                                    51 TRUE
                                                   FALSE
## 14 1
                                    48 TRUE
                                                   TRUE
                control
## 15 1
                control
                                    60 TRUE
                                                   FALSE
## 16 3
                control
                                    49 TRUE
                                                   FALSE
```

```
## 17 4 control 50 TRUE FALSE
```

Same formula for outliers as previous. There are some outliers and this time there are a few extreme outliers. We will keep note of these moving forward. The outliers are easy to locate in the previous side-by-side boxplots.

### Check normality assumption

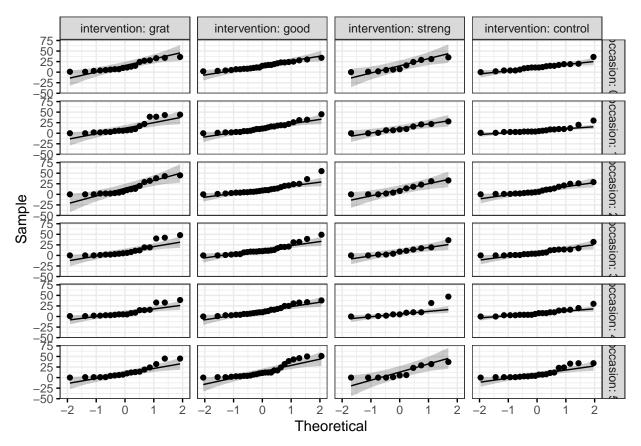
```
ahi_cesd %>%
  group_by(intervention, occasion) %>%
  shapiro_test(cesdTotal) %>%
  print(n=Inf)
```

```
## # A tibble: 24 x 5
##
      occasion intervention variable
                                        statistic
                                                           p
##
      <fct>
                <fct>
                              <chr>>
                                             <dbl>
                                                       <dbl>
##
    1 0
                              cesdTotal
                                             0.873 0.0197
                grat
##
    2 1
                grat
                              cesdTotal
                                             0.774 0.000662
##
    3 2
                                             0.826 0.00363
                              cesdTotal
                grat
##
    4 3
                              cesdTotal
                                             0.762 0.000469
                grat
##
    5 4
                              cesdTotal
                                             0.771 0.000608
                grat
##
    6 5
                grat
                              cesdTotal
                                             0.820 0.00293
##
    7 0
                good
                              cesdTotal
                                             0.952 0.280
##
    8 1
                              cesdTotal
                                             0.910 0.0298
                good
    9 2
                              cesdTotal
                                             0.808 0.000312
##
                good
## 10 3
                              cesdTotal
                                             0.866 0.00365
                good
## 11 4
                good
                              cesdTotal
                                             0.908 0.0269
## 12 5
                good
                              cesdTotal
                                             0.822 0.000534
## 13 0
                              cesdTotal
                                             0.866 0.0697
                streng
## 14 1
                              cesdTotal
                                             0.920 0.316
                streng
## 15 2
                streng
                              cesdTotal
                                             0.867 0.0703
## 16 3
                              cesdTotal
                                             0.866 0.0691
                streng
## 17 4
                streng
                              cesdTotal
                                             0.729 0.00110
## 18 5
                streng
                              cesdTotal
                                             0.778 0.00482
## 19 0
                              cesdTotal
                                             0.915 0.0784
                control
## 20 1
                              cesdTotal
                                             0.755 0.000201
                control
## 21 2
                              cesdTotal
                                             0.860 0.00787
                control
## 22 3
                control
                              cesdTotal
                                             0.828 0.00231
## 23 4
                control
                              cesdTotal
                                             0.868 0.0109
## 24 5
                control
                              cesdTotal
                                             0.779 0.000434
```

There are 16 cases that have p-value < .05. We will keep these in mind while asseing the QQ plots.

#### QQ plot

```
ggqqplot(ahi_cesd, "cesdTotal", ggtheme = theme_bw()) +
facet_grid(occasion~intervention, labeller = "label_both")
```



Unlike when the QQ plots for happy scores, the depression scores aren't all okay. Grat/1, Grat/2, Grat/3, Good/2, Good/5, Streng/4, Control/1 and Control/5 are causes for concern. These are quite a few cases, thus will proceed with caution and take the upcoming results with a grain of salt.

#### Homogneity of variance assumption

```
ahi_cesd %>%
  group_by(occasion) %>%
  levene_test(cesdTotal ~ intervention)
## # A tibble: 6 x 5
##
     occasion
                df1
                       df2 statistic
##
     <fct>
              <int> <int>
                               <dbl> <dbl>
## 1 0
                  3
                        70
                               1.82 0.151
                  3
## 2 1
                        70
                               1.94 0.131
## 3 2
                  3
                        70
                               1.07
                                     0.368
                  3
## 4 3
                        70
                               0.741 0.531
## 5 4
                  3
                        70
                               0.664 0.577
                  3
## 6 5
                        70
                               0.406 0.749
```

There is homogeneity of variance for there are no p-values<.05.

# Homogeneity of covariances assumption

```
box_m(ahi_cesd[, "ahiTotal", drop = FALSE], ahi_cesd$intervention)

## # A tibble: 1 x 4

## statistic p.value parameter method

## <dbl> <dbl> <dbl> <chr>
```

```
## 1 3.78 0.286 3 Box's M-test for Homogeneity of Covariance M~
```

The p-value < .001 thus there is significant cause for concern on homogeneity of covariances. In other words, we can't conclude homogeneity of covariance.

## Assumption of sphericity

This assumption is internally calculated in the anova computation below, thus we do not need to worry about this assumption right now.

#### Variable selection + modification

```
ahi_cesd_sad <- ahi_cesd %>%
  select(id, occasion, intervention, cesdTotal) %>%
  mutate(cesdTotal=as.numeric(cesdTotal))
str(ahi_cesd_happy)
```

# Computation

```
res.aov_sad <- anova_test(data = ahi_cesd_sad, dv = cesdTotal,
                      wid = id,
                      between = intervention, within =occasion,
                      detailed = TRUE)
res.aov_sad
## ANOVA Table (type III tests)
## $ANOVA
##
                    Effect DFn DFd
                                          SSn
                                                   SSd
                                                                     p p<.05
                                70 60246.267 48690.25 86.614 7.26e-14
## 1
               (Intercept)
                             1
## 2
              intervention
                             3
                                70
                                     1816.234 48690.25
                                                        0.870 4.61e-01
## 3
                             5 350
                                      474.780 13544.45
                                                        2.454 3.30e-02
                  occasion
## 4 intervention:occasion 15 350
                                      344.785 13544.45
                                                        0.594 8.80e-01
##
       ges
## 1 0.492
## 2 0.028
## 3 0.008
## 4 0.006
##
## $`Mauchly's Test for Sphericity`
                                        p p<.05
##
                    Effect
                               W
## 1
                  occasion 0.482 6.98e-06
## 2 intervention:occasion 0.482 6.98e-06
##
## $`Sphericity Corrections`
##
                                         DF[GG] p[GG] <.05
                                                                  HFe
                             GGe
## 1
                                                              * 0.802
                  occasion 0.754 3.77, 263.85 0.050
## 2 intervention:occasion 0.754 11.31, 263.85 0.837
                                                                0.802
            DF[HF] p[HF] < .05
## 1 4.01, 280.74 0.046
## 2 12.03, 280.74 0.847
```

As in the happy computation only occasion is significant as well in the depression instance. People got happier as the study went on. Note that the majority of the impact of time occured from the occasion 0 to occasion 1, after that the effect attenuated off. The interaction term was not significant.

# Post-hoc tests

```
ahi_cesd_sad %>%
 pairwise_t_test(cesdTotal~occasion, paired = TRUE,
                 p.adjust.method = "bonferroni")
## # A tibble: 15 x 10
##
                                  n2 statistic
                                                         p p.adj p.adj.signif
      .у.
           group1 group2
                            n1
                                                  df
   * <chr> <chr> <chr> <int> <int>
                                         <dbl> <dbl> <dbl> <dbl> <chr>
                                                  73 0.002 0.035 *
##
   1 cesd~ 0
                            74
                                  74
                                         3.15
                   1
##
                            74
                                         2.00
                                                  73 0.049 0.741 ns
   2 cesd~ 0
                  2
                                  74
## 3 cesd~ 0
                  3
                            74
                                  74
                                         2.79
                                                  73 0.007 0.101 ns
                            74
                                                  73 0.009 0.137 ns
## 4 cesd~ 0
                  4
                                  74
                                         2.68
                                                  73 0.686 1
## 5 cesd~ 0
                  5
                            74
                                  74
                                         0.406
## 6 cesd~ 1
                  2
                            74
                                  74
                                        -0.745
                                                  73 0.459 1
                                                                 ns
## 7 cesd~ 1
                  3
                            74
                                  74
                                         0.453
                                                  73 0.652 1
## 8 cesd~ 1
                  4
                            74
                                  74
                                         0.307
                                                  73 0.76 1
                                                                 ns
                                                  73 0.11 1
## 9 cesd~ 1
                  5
                            74
                                  74
                                        -1.62
                                                                 ns
## 10 cesd~ 2
                  3
                            74
                                  74
                                                  73 0.261 1
                                         1.13
                                                                 ns
## 11 cesd~ 2
                            74
                                  74
                                         0.832
                                                  73 0.408 1
                                                                 ns
## 12 cesd~ 2
                                                  73 0.347 1
                  5
                            74
                                  74
                                        -0.946
                                                                 ns
## 13 cesd~ 3
                  4
                            74
                                  74
                                        -0.110
                                                  73 0.913 1
                                                                 ns
## 14 cesd~ 3
                  5
                            74
                                  74
                                        -1.85
                                                  73 0.068 1
                                                                 ns
## 15 cesd~ 4
                            74
                                  74
                                        -1.92
                                                  73 0.059 0.879 ns
```

# Final summary table

```
final_table <- rbind(happy_sum, sad_sum)</pre>
```