Descriptive Statistics of the NRW80+ Dataset

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Abstract

In this paper, I illustrate the process of importing NRW80+ data (see Zank, Woopen, Wagner, Rietz, & Kaspar, 2022) into R. Additionally, I present descriptive statistics and graphical visualizations to gain insights into Likert-scaled surveys. The paper adheres to the APA style, implementing the R template provided by the 'papaja' package (Aust & Barth, 2023).

Keywords: papaja, NRW80+, descriptive statistics

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All files related to that paper are hostes on github. see: https://github.com/hubchev/ewa. Correspondence concerning this article should be addressed to Prof. Dr. Stephan Huber, Im Mediapark 4e. E-mail: stephan.huber@hs-fresenius.de

4 Cross-Referencing in R Markdown

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1 Technical Note

In the following, I load (and install) packages that I use later on and I show information about my R session with sessionInfo().

```
# (Install and) load pacman package
if (!require(pacman)) install.packages("pacman")
# load packages that are already installed and install packages that are not
# installed yet and then load them:
pacman::p_load(tinylabels,
               papaja,
               haven,
               labelled,
               janitor,
               skimr,
               rstatix,
               HH,
               likert,
               expss,
               tidyr,
               ggstats,
               psych,
               sjlabelled,
               sjmisc,
               tidyverse,
               MASS,
               dplyr,
               magick)
sessionInfo()
## R version 4.3.1 (2023-06-16)
## Platform: x86_64-pc-linux-gnu (64-bit)
## Running under: Debian GNU/Linux 12 (bookworm)
##
## Matrix products: default
           /usr/lib/x86_64-linux-gnu/blas/libblas.so.3.11.0
## BLAS:
## LAPACK: /usr/lib/x86_64-linux-gnu/lapack/liblapack.so.3.11.0
##
## locale:
## [1] LC_CTYPE=en_US.UTF-8
                                   LC_NUMERIC=C
                                                               LC_TIME=en_US.UTF-8
## [5] LC_MONETARY=en_US.UTF-8
                                   LC_MESSAGES=en_US.UTF-8
                                                               LC_PAPER=en_US.UTF-8
```

```
[9] LC ADDRESS=C
##
                                    LC TELEPHONE=C
                                                                LC_MEASUREMENT=en_US.UTF-8 LC
##
## time zone: Europe/Berlin
## tzcode source: system (glibc)
##
## attached base packages:
## [1] grid
                 stats
                            graphics grDevices utils
                                                           datasets methods
                                                                                base
##
## other attached packages:
## [1] magick_2.8.1
                            lubridate_1.9.3
                                                 forcats_1.0.0
                                                                      stringr_1.5.1
                                                                                           dpl
## [6] purrr_1.0.2
                            readr_2.1.4
                                                 tibble_3.2.1
                                                                      tidyverse_2.0.0
                                                                                           sjm
## [11] sjlabelled_1.2.0
                            psych_2.3.9
                                                 ggstats_0.5.1
                                                                      tidyr_1.3.0
                                                                                           exp
## [16] maditr_0.8.4
                            likert_1.3.5
                                                 xtable_1.8-4
                                                                      ggplot2_3.4.4
                                                                                           HH_
## [21] gridExtra_2.3
                            multcomp_1.4-25
                                                 TH.data_1.1-2
                                                                      MASS_7.3-60
                                                                                           sur
## [26] mvtnorm_1.2-3
                            latticeExtra_0.6-30 lattice_0.22-5
                                                                      rstatix_0.7.2
                                                                                           ski
                            labelled_2.12.0
                                                 haven_2.5.3
## [31] janitor_2.2.0
                                                                      papaja_0.1.2.9000
                                                                                           tin
## [36] pacman_0.5.1
##
## loaded via a namespace (and not attached):
##
     [1] sylly_0.1-6
                                    later_1.3.1
                                                               splines_4.3.1
                                                                                          data
##
     [5] rpart_4.1.21
                                    lifecycle_1.0.4
                                                               insight_0.19.6
                                                                                          vcd_
##
     [9] backports_1.4.1
                                    magrittr_2.0.3
                                                               Hmisc_5.1-1
                                                                                          rmar
    [13] yaml_2.3.7
##
                                    httpuv_1.6.12
                                                               RColorBrewer_1.1-3
                                                                                          abin
##
    [17] pkgload_1.3.3
                                                               nnet_7.3-19
                                    rvest_1.0.3
                                                                                          rmdf
##
    [21] sandwich_3.0-2
                                    svglite_2.1.2
                                                               codetools_0.2-19
                                                                                          xm12
##
    [25] tidyselect_1.2.0
                                                               effectsize_0.8.6
                                    gmp_0.7-4
                                                                                          matr
                                                               jsonlite_1.8.7
##
    [29] base64enc_0.1-3
                                    webshot_0.5.5
                                                                                          Form
##
    [33] ellipsis_0.3.2
                                                               systemfonts_1.0.5
                                    emmeans_1.8.9
                                                                                          tool
##
    [37] Rcpp_1.0.11
                                    glue_1.6.2
                                                               mnormt_2.1.1
                                                                                          xfun
##
    [41] withr_2.5.2
                                    fastmap_1.1.1
                                                               fansi_1.0.5
                                                                                          dige
    [45] mime 0.12
                                    timechange_0.2.0
##
                                                               R6_2.5.1
                                                                                          esti
    [49] colorspace_2.1-0
                                    koRpus_0.13-8
                                                               jpeg_0.1-10
##
                                                                                          utf8
##
    [53] generics_0.1.3
                                    data.table_1.14.8
                                                               httr_1.4.7
                                                                                          html
##
    [57] parameters_0.21.3
                                    pkgconfig_2.0.3
                                                               gtable_0.3.4
                                                                                          Rmpf
##
    [61] lmtest_0.9-40
                                    htmltools_0.5.7
                                                               carData_3.0-5
                                                                                          book
##
    [65] scales_1.2.1
                                    leaps_3.1
                                                               png_0.1-8
                                                                                          snak
##
    [69] knitr_1.45
                                    rstudioapi_0.15.0
                                                               tzdb_0.4.0
                                                                                          resh
##
    [73] coda_0.19-4
                                    checkmate_2.3.0
                                                               nlme_3.1-163
                                                                                          repr
    [77] zoo_1.8-12
##
                                    parallel_4.3.1
                                                               foreign_0.8-85
                                                                                          pill
##
    [81] vctrs_0.6.4
                                    promises_1.2.1
                                                               car_3.1-2
                                                                                          clus
    [85] htmlTable_2.4.2
##
                                    evaluate_0.23
                                                               tinytex_0.49
                                                                                          cli_
##
    [89] compiler_4.3.1
                                    rlang_1.1.2
                                                               interp_1.1-5
                                                                                          plyr
##
    [93] stringi_1.8.2
                                    deldir_2.0-2
                                                               viridisLite_0.4.2
                                                                                          asse
    [97] munsell_0.5.0
                                    bayestestR_0.13.1
                                                               Matrix_1.6-3
                                                                                          hms_
## [101] wordcountaddin_0.3.0.9000 shiny_1.8.0
                                                               broom_1.0.5
```

2 Import Data

I host a R script on my GitHub account (see https://raw.githubusercontent.com/hubchev/courses/main/scr/readin_GESIS.R) that explains how to import the NRW80+ data. I have manually saved the data, gesis.RData, in a subfolder named data.

3 How to Use the NRW80+ Data

3.1 Load and Subset Data

I load the data and select some variables that are of particular interest to me.

```
getwd()
```

[1] "/home/sthu/Dropbox/hsf/courses/ewa/ewa_all/rmd_desc"

For simplification, let us focus on the questions that refer to the "Experience of Ageing" and create a new dataset df_alterl that contains only those questions:

Min

1st

Med

Mea

3rd

Max

```
drop_unused_labels()
summary(df_alterl)
```

```
##
       alterl1
                         alter12
                                          alter13
                                                            alter14
                                                                              alter15
##
           :-2.000
                             :-2.000
                                               :-2.000
                                                                 :-2.000
                                                                                   :-2.00
   Min.
                     Min.
                                       Min.
                                                         Min.
                                                                           Min.
   1st Qu.: 1.000
                      1st Qu.: 2.000
##
                                       1st Qu.: 1.000
                                                         1st Qu.: 2.000
                                                                           1st Qu.: 2.00
##
   Median : 3.000
                     Median : 4.000
                                       Median : 2.000
                                                         Median : 3.000
                                                                           Median: 3.00
           : 2.656
                             : 3.282
                                              : 2.349
                                                                 : 2.763
                                                                                  : 2.99
##
   Mean
                     Mean
                                       Mean
                                                         Mean
                                                                           Mean
   3rd Qu.: 4.000
##
                      3rd Qu.: 4.000
                                       3rd Qu.: 3.000
                                                         3rd Qu.: 4.000
                                                                           3rd Qu.: 4.00
           : 5.000
                             : 5.000
                                               : 5.000
##
   Max.
                     Max.
                                       Max.
                                                         Max.
                                                                 : 5.000
                                                                           Max.
                                                                                   : 5.00
##
       alter17
                         alter18
                                          alter19
                                                            alterl10
##
   Min.
           :-2.000
                     Min.
                             :-2.000
                                       Min.
                                               :-2.000
                                                         Min.
                                                                 :-2.000
   1st Qu.: 2.000
                     1st Qu.: 1.000
                                       1st Qu.: 2.000
                                                         1st Qu.: 1.000
##
##
   Median : 3.000
                     Median : 3.000
                                       Median : 3.000
                                                         Median : 2.000
           : 3.237
                             : 2.712
                                                                : 2.305
##
   Mean
                     Mean
                                       Mean
                                              : 2.969
                                                         Mean
   3rd Qu.: 4.000
                      3rd Qu.: 4.000
                                                         3rd Qu.: 3.000
##
                                       3rd Qu.: 4.000
   Max.
           : 5.000
                             : 5.000
                                               : 5.000
                                                                 : 5.000
##
                     Max.
                                       Max.
                                                         Max.
```

3.2 Get an Overview by Counting

3.2.1 table() of R base. With the table() function, you can count how many observations of each unique value a variable contains:

```
table(df_alterl$alterl1)
```

```
## ## Weiß nicht Verweigert Gar nicht Ein wenig Mäßig Stark Sehr stark ## 80 6 390 266 451 511 159
```

To do that for each variable of a dataset is easy using ~, the pipe operator, and map() of the package purrr (Wickham & Henry, 2023):

```
df_alterl |>
  map(~ table(.))
```

```
## $alterl1
## .
## Weiß nicht Verweigert Gar nicht Ein wenig
                                                                  Stark Sehr stark
                                                      Mäßig
                        6
                                 390
                                             266
##
           80
                                                         451
                                                                    511
                                                                                159
##
## $alter12
## Weiß nicht Verweigert Gar nicht
                                      Ein wenig
                                                      Mäßig
                                                                  Stark Sehr stark
##
           36
                        4
                                 196
                                             245
                                                         379
                                                                    648
                                                                                355
```

```
##
## $alter13
## Weiß nicht Verweigert Gar nicht Ein wenig
                                                   Mäßig
                                                              Stark Sehr stark
                               500
          20
               3
                                          577
                                                     403
                                                                244
                                                                           116
##
## $alter14
## .
## Weiß nicht Verweigert Gar nicht Ein wenig
                                                   Mäßig
                                                              Stark Sehr stark
         122
                      8
                               222
                                          260
                                                     527
                                                                543
                                                                           181
##
## $alter15
## Weiß nicht Verweigert Gar nicht Ein wenig
                                                              Stark Sehr stark
                                                   Mäßig
                4
                              199
##
         101
                                          211
                                                     452
                                                                680
                                                                           216
##
## $alter16
## .
## Weiß nicht Verweigert Gar nicht Ein wenig
                                                              Stark Sehr stark
                                                  Mäßig
          19
                      3
                               149
                                          324
                                                     358
                                                                537
                                                                           473
##
## $alter17
## Weiß nicht Verweigert Gar nicht Ein wenig
                                                   Mäßig
                                                              Stark Sehr stark
                      2
                                                     471
##
          20
                               145
                                          362
                                                                525
                                                                           338
##
## $alter18
## Weiß nicht Verweigert Gar nicht Ein wenig
                                                   Mäßig
                                                              Stark Sehr stark
          20
               3
                               516
                                          350
                                                     325
                                                                340
                                                                           309
##
## $alter19
## .
## Weiß nicht Verweigert Gar nicht Ein wenig
                                                   Mäßig
                                                              Stark Sehr stark
          83
                     10
                               261
                                          228
                                                     425
                                                                564
                                                                           292
##
## $alterl10
## Weiß nicht Verweigert Gar nicht Ein wenig
                                                              Stark Sehr stark
                                                   Mäßig
##
          44
                      7
                               537
                                          433
                                                     486
                                                                251
                                                                           105
```

Using proportions() returns the conditional proportions:

```
df_alterl |>
map(~ proportions(table(.)))
```

```
## $alterl1
## .
## Weiß nicht Verweigert Gar nicht Ein wenig Mäßig Stark Sehr stark
## 0.042941492 0.003220612 0.209339775 0.142780462 0.242082662 0.274288782 0.085346216
##
## $alter12
## .
## Weiß nicht Verweigert Gar nicht Ein wenig Mäßig
                                                              Stark Sehr stark
## 0.019323671 0.002147075 0.105206656 0.131508320 0.203435319 0.347826087 0.190552872
## $alter13
## .
## Weiß nicht Verweigert Gar nicht Ein wenig Mäßig Stark Sehr stark
## 0.010735373 0.001610306 0.268384326 0.309715513 0.216317767 0.130971551 0.062265164
##
## $alter14
## .
## Weiß nicht Verweigert Gar nicht Ein wenig Mäßig Stark Sehr stark
## 0.065485776 0.004294149 0.119162641 0.139559850 0.282877080 0.291465378 0.097155126
## $alter15
## .
## Weiß nicht Verweigert Gar nicht Ein wenig Mäßig Stark Sehr stark
## 0.054213634 0.002147075 0.106816962 0.113258186 0.242619431 0.365002684 0.115942029
##
## $alter16
## .
## Weiß nicht Verweigert Gar nicht Ein wenig Mäßig Stark Sehr stark
## 0.010198604 0.001610306 0.079978529 0.173913043 0.192163178 0.288244767 0.253891573
##
## $alter17
## .
## Weiß nicht Verweigert Gar nicht Ein wenig Mäßig Stark Sehr stark
## 0.010735373 0.001073537 0.077831455 0.194310252 0.252818035 0.281803543 0.181427805
##
## $alter18
## Weiß nicht Verweigert Gar nicht Ein wenig Mäßig
                                                              Stark Sehr stark
## 0.010735373 0.001610306 0.276972625 0.187869028 0.174449812 0.182501342 0.165861514
##
## $alter19
## .
## Weiß nicht Verweigert Gar nicht Ein wenig Mäßig
                                                              Stark Sehr stark
## 0.044551798 0.005367687 0.140096618 0.122383253 0.228126677 0.302737520 0.156736447
##
```

```
## $alterl10
## .
## Weiß nicht Verweigert Gar nicht
                                       Ein wenig Mäßig
                                                                   Stark Sehr stark
## 0.023617821 0.003757381 0.288244767 0.232420827 0.260869565 0.134728932 0.056360709
     3.2.2 tabyl() of janitor. With tabyl() which is part of janitor (Firke, 2023),
we can get both nicely:
df_alterl |>
tabyl(alterl1)
## alterl1
                   percent
            n
##
        -2 80 0.042941492
##
        -1
             6 0.003220612
         1 390 0.209339775
         2 266 0.142780462
##
         3 451 0.242082662
##
         4 511 0.274288782
         5 159 0.085346216
##
df_alterl |>
 map(~ tabyl(.))
## $alterl1
##
   . n
              percent
## -2 80 0.042941492
## -1 6 0.003220612
##
   1 390 0.209339775
   2 266 0.142780462
##
##
   3 451 0.242082662
    4 511 0.274288782
##
    5 159 0.085346216
##
## $alter12
##
    . n
             percent
## -2 36 0.019323671
## -1 4 0.002147075
   1 196 0.105206656
   2 245 0.131508320
    3 379 0.203435319
##
    4 648 0.347826087
##
##
    5 355 0.190552872
##
## $alter13
##
        n
              percent
## -2 20 0.010735373
## -1 3 0.001610306
```

```
##
    1 500 0.268384326
##
   2 577 0.309715513
##
    3 403 0.216317767
##
    4 244 0.130971551
    5 116 0.062265164
##
##
## $alter14
##
    . n
           percent
##
   -2 122 0.065485776
## -1 8 0.004294149
   1 222 0.119162641
##
   2 260 0.139559850
##
   3 527 0.282877080
   4 543 0.291465378
    5 181 0.097155126
##
##
## $alter15
    . n
##
            percent
   -2 101 0.054213634
   -1 4 0.002147075
   1 199 0.106816962
##
    2 211 0.113258186
   3 452 0.242619431
##
##
   4 680 0.365002684
##
   5 216 0.115942029
##
## $alter16
   . n
            percent
   -2 19 0.010198604
##
   -1 3 0.001610306
##
   1 149 0.079978529
##
##
   2 324 0.173913043
   3 358 0.192163178
##
   4 537 0.288244767
##
    5 473 0.253891573
##
##
## $alter17
##
    . n
            percent
   -2 20 0.010735373
##
##
   -1 2 0.001073537
   1 145 0.077831455
##
##
   2 362 0.194310252
## 3 471 0.252818035
## 4 525 0.281803543
```

5 338 0.181427805

```
##
## $alter18
##
         n
               percent
##
    -2
        20 0.010735373
         3 0.001610306
##
     1 516 0.276972625
##
     2 350 0.187869028
##
     3 325 0.174449812
##
     4 340 0.182501342
     5 309 0.165861514
##
##
## $alter19
##
         n
               percent
    -2 83 0.044551798
##
##
    -1 10 0.005367687
     1 261 0.140096618
##
##
     2 228 0.122383253
     3 425 0.228126677
##
     4 564 0.302737520
##
##
     5 292 0.156736447
##
## $alter110
##
         n
               percent
       44 0.023617821
##
    -2
##
    -1
         7 0.003757381
##
     1 537 0.288244767
     2 433 0.232420827
##
##
     3 486 0.260869565
##
     4 251 0.134728932
##
     5 105 0.056360709
```

3.2.3 frq() of sjmisc. As the variables df_alterl1 are factors. Thus, we can use the sjmisc package, see Lüdecke (2018) and the cheatsheet of sjmisc http://strengejac ke.de/sjmisc-cheatsheet.pdf. Also worth a reading is browseVignettes("sjmisc").

For example, we can use frq() for nice frequency tables:

```
-1 | Verweigert | 0 | 0.00 | 0.00 |
##
                                           0.00
##
     1 | Gar nicht | 80 | 4.29 |
                                 4.29
                                         4.29
     2 | Ein wenig | 6 | 0.32 | 0.32 |
##
                                         4.62
##
     3 |
             Mäßig | 390 | 20.93 |
                                 20.93 | 25.55
     4 l
             Stark | 266 | 14.28 | 14.28 | 39.83
##
     5 | Sehr stark | 451 | 24.21 | 24.21 | 64.04
##
     6 l
             <NA> | 511 | 27.43 | 27.43 | 91.47
##
     7 |
             <NA> | 159 | 8.53 | 8.53 | 100.00
## <NA> |
             <NA> | 0 | 0.00 | <NA> | <NA>
##
## $alter12
## Gesundheit mehr Aufmerksamkeit widmen (x) <numeric>
## # total N=1863 valid N=1863 mean=3.28 sd=1.45
##
## Value | Label | N | Raw % | Valid % | Cum. %
##
    -2 | Weiß nicht | 0 | 0.00 | 0.00 | 0.00
     -1 | Verweigert | 0 | 0.00 | 0.00 | 0.00
##
##
    1 | Gar nicht | 36 | 1.93 | 1.93 | 1.93
                                         2.15
##
     2 | Ein wenig | 4 | 0.21 | 0.21 |
             Mäßig | 196 | 10.52 | 10.52 | 12.67
##
     3 l
     4 |
##
             Stark | 245 | 13.15 | 13.15 | 25.82
##
     5 | Sehr stark | 379 | 20.34 | 20.34 | 46.16
     6 | <NA> | 648 | 34.78 | 34.78 | 80.94
##
    7 |
            <NA> | 355 | 19.06 | 19.06 | 100.00
##
             <NA> | 0 | 0.00 | <NA> | <NA>
## <NA> |
##
## $alter13
## geistige Leistungsfähigkeit nimmt ab (x) <numeric>
## # total N=1863 valid N=1863 mean=2.35 sd=1.28
##
## Value | Label | N | Raw % | Valid % | Cum. %
## -----
##
     -2 | Weiß nicht | 0 | 0.00 | 0.00 | 0.00
##
    -1 | Verweigert | 0 | 0.00 | 0.00 | 0.00
##
     1 | Gar nicht | 20 | 1.07 |
                                 1.07 |
                                         1.07
##
     2 | Ein wenig | 3 | 0.16 |
                                 0.16 |
                                         1.23
##
     3 |
             Mäßig | 500 | 26.84 | 26.84 | 28.07
     4 |
             Stark | 577 | 30.97 | 30.97 | 59.04
##
##
     5 | Sehr stark | 403 | 21.63 | 21.63 | 80.68
      6 l
            <NA> | 244 | 13.10 | 13.10 | 93.77
##
##
     7 |
             <NA> | 116 | 6.23 | 6.23 | 100.00
   <NA> | <NA> | 0 | 0.00 | <NA> | <NA>
##
##
## $alter14
```

```
## mehr Erfahrung, um Dinge und Menschen einzuschätzen (x) <numeric>
## # total N=1863 valid N=1863 mean=2.76 sd=1.72
##
          Label | N | Raw % | Valid % | Cum. %
## -----
    -2 | Weiß nicht | 0 | 0.00 | 0.00 | 0.00
##
    -1 | Verweigert | 0 | 0.00 | 0.00 | 0.00
##
    1 | Gar nicht | 122 | 6.55 | 6.55 | 6.55
##
     2 | Ein wenig | 8 | 0.43 |
                              0.43 |
                                      6.98
##
     3 |
            Mäßig | 222 | 11.92 |
                              11.92 | 18.89
     4 |
            Stark | 260 | 13.96 |
                              13.96 | 32.85
##
##
     5 | Sehr stark | 527 | 28.29 | 28.29 | 61.14
##
     6 |
           <NA> | 543 | 29.15 | 29.15 | 90.28
    7 I
            <NA> | 181 | 9.72 | 9.72 | 100.00
##
           <NA> | 0 | 0.00 | <NA> | <NA>
## <NA> |
##
## $alter15
## besseres Gespür, was wichtig ist (x) <numeric>
## # total N=1863 valid N=1863 mean=2.99 sd=1.66
## Value | Label | N | Raw % | Valid % | Cum. %
## -----
    -2 | Weiß nicht | 0 | 0.00 | 0.00 | 0.00
##
##
    -1 | Verweigert | 0 | 0.00 | 0.00 | 0.00
                              5.42 |
##
    1 | Gar nicht | 101 | 5.42 |
                                      5.42
##
     2 | Ein wenig | 4 | 0.21 |
                              0.21
     3 l
            Mäßig | 199 | 10.68 | 10.68 | 16.32
##
     4 l
            Stark | 211 | 11.33 | 11.33 | 27.64
     5 | Sehr stark | 452 | 24.26 | 24.26 | 51.91
##
##
     6 | <NA> | 680 | 36.50 | 36.50 | 88.41
     7 |
            <NA> | 216 | 11.59 | 11.59 | 100.00
##
##
## $alter16
## Einschränkung der Aktivitäten (x) <numeric>
## # total N=1863 valid N=1863 mean=3.40 sd=1.38
##
## Value | Label | N | Raw % | Valid % | Cum. %
## -----
##
    -2 | Weiß nicht | 0 | 0.00 | 0.00 | 0.00
    -1 | Verweigert | 0 | 0.00 | 0.00 |
##
                                      0.00
    1 | Gar nicht | 19 | 1.02 | 1.02 |
##
    2 | Ein wenig | 3 | 0.16 | 0.16 |
##
                                      1.18
     3 | Mäßig | 149 | 8.00 | 8.00 |
##
                                      9.18
##
     4 |
          Stark | 324 | 17.39 | 17.39 | 26.57
```

```
5 | Sehr stark | 358 | 19.22 | 19.22 | 45.79
##
      6 | <NA> | 537 | 28.82 | 28.82 | 74.61
##
     7 |
             <NA> | 473 | 25.39 | 25.39 | 100.00
##
##
   <NA> |
            <NA> | 0 | 0.00 | <NA> | <NA>
##
## $alter17
## weniger Energie (x) <numeric>
## # total N=1863 valid N=1863 mean=3.24 sd=1.32
##
## Value |
           Label | N | Raw % | Valid % | Cum. %
## -----
     -2 | Weiß nicht | 0 | 0.00 | 0.00 | 0.00
     -1 | Verweigert | 0 | 0.00 | 0.00 |
                                        0.00
     1 | Gar nicht | 20 | 1.07 | 1.07 |
##
                                         1.07
##
     2 | Ein wenig | 2 | 0.11 |
                                0.11 |
                                          1.18
             Mäßig | 145 | 7.78 |
##
     3 |
                                7.78
                                         8.96
##
     4 |
             Stark | 362 | 19.43 | 19.43 | 28.40
     5 | Sehr stark | 471 | 25.28 | 25.28 | 53.68
##
##
     6 | <NA> | 525 | 28.18 | 28.18 | 81.86
##
     7 |
             <NA> | 338 | 18.14 | 18.14 | 100.00
## <NA> |
           <NA> | 0 | 0.00 | <NA> | <NA>
##
## $alter18
## Abhängigkeit von der Hilfe Anderer (x) <numeric>
## # total N=1863 valid N=1863 mean=2.71 sd=1.53
##
         Label | N | Raw % | Valid % | Cum. %
## Value |
## -----
     -2 | Weiß nicht | 0 | 0.00 | 0.00 |
                                          0.00
##
    -1 | Verweigert | 0 | 0.00 | 0.00 |
                                         0.00
##
     1 | Gar nicht | 20 | 1.07 | 1.07 |
                                         1.07
##
     2 | Ein wenig | 3 | 0.16 |
                                0.16 |
                                         1.23
##
     3 l
             Mäßig | 516 | 27.70 | 27.70 | 28.93
##
     4 l
             Stark | 350 | 18.79 | 18.79 | 47.72
##
     5 | Sehr stark | 325 | 17.44 | 17.44 | 65.16
     6 l
##
             <NA> | 340 | 18.25 | 18.25 | 83.41
             <NA> | 309 | 16.59 | 16.59 | 100.00
##
     7 |
## <NA> |
             <NA> | 0 | 0.00 | <NA> | <NA>
##
## $alter19
## Freiheit, Tage nach eigenem Willen zu verleben (x) <numeric>
## # total N=1863 valid N=1863 mean=2.97 sd=1.68
##
## Value | Label | N | Raw % | Valid % | Cum. %
```

```
##
     -2 | Weiß nicht |
                         0 | 0.00 |
                                        0.00
                                                 0.00
     -1 | Verweigert |
                              0.00 |
                                        0.00 |
##
                         0 |
                                                 0.00
           Gar nicht | 83 |
                              4.46
                                        4.46
##
                                                 4.46
           Ein wenig | 10 | 0.54 |
##
      2 |
                                        0.54 |
                                                 4.99
##
      3 I
               Mäßig | 261 | 14.01 |
                                       14.01
                                                19.00
##
       4 |
               Stark | 228 | 12.24 |
                                       12.24 |
                                                31.24
      5 | Sehr stark | 425 | 22.81 |
##
                                       22.81
                                                54.05
##
       6 |
                <NA> | 564 | 30.27 |
                                       30.27 |
                                                84.33
##
      7 |
                <NA> | 292 | 15.67 |
                                       15.67 | 100.00
##
   <NA> |
                <NA> |
                         0.00
                                        <NA> |
                                                 <NA>
##
## $alterl10
## Motivation fällt schwerer (x) <numeric>
## # total N=1863 valid N=1863 mean=2.31 sd=1.38
##
## Value |
                         N | Raw % | Valid % | Cum. %
               Label |
##
     -2 | Weiß nicht |
                         0.00
                                        0.00
                                                 0.00
##
     -1 | Verweigert |
                         0 |
                              0.00 |
                                        0.00
                                                 0.00
           Gar nicht | 44 |
##
                              2.36
                                        2.36
                                                 2.36
##
      2 |
           Ein wenig |
                       7 | 0.38 |
                                        0.38 |
                                                 2.74
##
      3 |
               Mäßig | 537 | 28.82 |
                                       28.82 |
                                                31.56
##
      4 |
               Stark | 433 | 23.24 |
                                       23.24 |
                                                54.80
      5 | Sehr stark | 486 | 26.09 |
##
                                       26.09 |
                                                80.89
##
      6 I
                <NA> | 251 | 13.47 |
                                       13.47 | 94.36
##
      7 |
                <NA> | 105 | 5.64 |
                                        5.64 | 100.00
   <NA> |
                <NA> |
                         0 0.00
                                        <NA> |
##
                                                 <NA>
```

3.3 First Summary Statistics

3.3.1 Using summary() and get_summary_stats(). First, I am interested in the class of the data and some very basic summary statistics.

summary(df)

##	alterl1	alter12	alter13	alterl4	alter15
##	Min. :-2.000	Min. :-2.000	Min. :-2.000	Min. :-2.000	Min. :-2.00 Min
##	1st Qu.: 1.000	1st Qu.: 2.000	1st Qu.: 1.000	1st Qu.: 2.000	1st Qu.: 2.00 1st
##	Median : 3.000	Median : 4.000	Median : 2.000	Median : 3.000	Median: 3.00 Med
##	Mean : 2.656	Mean : 3.282	Mean : 2.349	Mean : 2.763	Mean : 2.99 Mean
##	3rd Qu.: 4.000	3rd Qu.: 4.000	3rd Qu.: 3.000	3rd Qu.: 4.000	3rd Qu.: 4.00 3rd
##	Max. : 5.000	Max. : 5.000	Max. : 5.000	Max. : 5.000	Max. : 5.00 Max
##					
##	alterl7	alter18	alter19	alterl10	alter_int
##	Min. :-2.000	Min. :-2.000	Min. $:-2.000$	Min. $:-2.000$	Min. : 80.00 Min
##	1st Qu.: 2.000	1st Qu.: 1.000	1st Qu.: 2.000	1st Qu.: 1.000	1st Qu.: 82.00 1s

Мe

Мe

3r

Ma

NA

fa

```
##
   Median : 3.000
                    Median : 3.000
                                    Median : 3.000
                                                     Median : 2.000
                                                                     Median : 86.00
## Mean
          : 3.237
                    Mean
                          : 2.712
                                    Mean
                                           : 2.969
                                                     Mean
                                                            : 2.305
                                                                           : 86.48
                                                                     Mean
##
   3rd Qu.: 4.000
                    3rd Qu.: 4.000
                                    3rd Qu.: 4.000
                                                     3rd Qu.: 3.000
                                                                     3rd Qu.: 90.00
##
   Max.
          : 5.000
                    Max.
                           : 5.000
                                    Max.
                                           : 5.000
                                                     Max.
                                                            : 5.000
                                                                     Max.
                                                                            :102.00
##
                                                                     NA's
                                                                            :6
##
     alterl_m1
                     alterl_m2
                                      alterp
                                                    ALT_agegroup
                                                                     ALT_sex
##
   Min.
          :1.000
                   Min.
                          :1.000
                                  Min.
                                         :-4.000
                                                   Min.
                                                         :1.000
                                                                  Min. :1.000
                                                                                  Min.
##
   1st Qu.:2.600
                   1st Qu.:2.200
                                  1st Qu.:-4.000
                                                   1st Qu.:1.000
                                                                   1st Qu.:1.000
                                                                                  1st Qu
## Median :3.200
                   Median :2.800
                                  Median :-4.000
                                                   Median :2.000
                                                                  Median :2.000
                                                                                  Median
## Mean
          :3.168
                   Mean
                        :2.877
                                  Mean
                                         : 2.632
                                                   Mean :1.883
                                                                  Mean :1.502
                                                                                  Mean
   3rd Qu.:3.800
                   3rd Qu.:3.600
##
                                  3rd Qu.:-4.000
                                                   3rd Qu.:3.000
                                                                   3rd Qu.:2.000
                                                                                  3rd Qu
##
   Max.
          :5.000
                   Max.
                          :5.000
                                  Max.
                                         :99.000
                                                   Max.
                                                          :3.000
                                                                  Max. :2.000
                                                                                  Max.
##
   NA's
          :16
                   NA's
                          :14
##
       famst7
                     demtectcorr
                                        kogstat
                                                         final
                                                                      geschlecht
## Min.
          :-3.000
                    Min.
                          :-11.000
                                     Min.
                                            :-4.00
                                                            :81.00
                                                                    Min.
                                                                           :1.000
                                                     Min.
   1st Qu.:-3.000
                    1st Qu.: -1.000
                                     1st Qu.:-4.00
                                                     1st Qu.:81.00
##
                                                                    1st Qu.:1.000
## Median : 0.000
                    Median : 0.000
                                     Median :-4.00
                                                     Median :81.00
                                                                   Median :2.000
          :-1.179
## Mean
                          : -1.742
                    Mean
                                     Mean
                                           :-3.21
                                                     Mean
                                                          :81.09
                                                                    Mean
                                                                           :1.502
   3rd Qu.: 0.000
                    3rd Qu.: 0.000
                                     3rd Qu.:-4.00
                                                     3rd Qu.:81.00
##
                                                                    3rd Qu.:2.000
##
   Max.
          : 1.000
                    Max.
                          : 2.000
                                     Max. : 7.00
                                                     Max.
                                                            :82.00
                                                                    Max.
                                                                           :2.000
##
sumstat_alter <- df |>
 get_summary_stats(
   alterl1,
   alter12,
   alter13,
   alter14,
   alter15,
   alter16,
   alter17,
   alter18,
   alter19,
   alterl10,
   type = "five_number")
```

Warning: attributes are not identical across measure variables; they will be dropped sumstat_alter

```
## # A tibble: 10 x 7
##
      variable
                                     q1 median
                   n
                        min
                              max
                                                   q3
##
      <fct>
               <dbl> <dbl> <dbl> <dbl>
                                         <dbl> <dbl>
## 1 alterl1
                1863
                        -2
                                5
                                              3
                                                    4
                                      1
##
    2 alterl2
                1863
                         -2
                                5
                                      2
                                              4
                                                    4
   3 alter13
                1863
                        -2
                                5
                                      1
                                              2
                                                    3
   4 alterl4
                1863
                         -2
                                5
                                      2
                                              3
                                                    4
```

```
5 alter15
                                                       4
##
                 1863
                          -2
                                  5
                                         2
                                                3
                          -2
##
    6 alter16
                                  5
                                         2
                                                4
                                                       5
                 1863
                                  5
##
   7 alter17
                          -2
                                         2
                                                3
                                                       4
                 1863
##
    8 alter18
                 1863
                          -2
                                  5
                                         1
                                                3
                                                       4
   9 alter19
                 1863
                          -2
                                  5
                                         2
                                                3
                                                       4
## 10 alterl10 1863
                          -2
                                  5
                                         1
                                                2
                                                       3
```

3.3.2 Using psych::describe(). A powerful alternative for descriptive summary statistics is provided by the function describe() of the psych package (William Revelle, 2023).

```
sumstat_alter_psych <- df |>
  select(starts_with("alterl")) |>
  psych::describe() |>
  as_tibble(rownames="Question") |>
  select(-skew, -kurtosis, -range, -vars)

sumstat_alter_psych
```

```
## # A tibble: 12 x 10
##
      Question
                    n mean
                               sd median trimmed
                                                   mad
                                                         min
                                                               max
##
      <chr>
                <dbl> <dbl> <dbl>
                                   <dbl>
                                           <dbl> <dbl> <dbl> <dbl> <
                                                                     <dbl>
   1 alterl1
                 1863 2.66 1.61
##
                                     3
                                            2.76 1.48
                                                          -2
                                                                 5 0.0374
##
   2 alter12
                 1863 3.28 1.45
                                     4
                                            3.43 1.48
                                                          -2
                                                                 5 0.0336
   3 alter13
                 1863 2.35 1.28
                                            2.28 1.48
                                                          -2
                                                                 5 0.0296
##
                                     2
                                                          -2
## 4 alterl4
                 1863 2.76 1.72
                                            2.96 1.48
                                                                 5 0.0398
                                     3
## 5 alter15
                 1863 2.99 1.66
                                     3
                                            3.20 1.48
                                                          -2
                                                                 5 0.0385
                                            3.54 1.48
   6 alter16
                 1863 3.40 1.38
                                                          -2
                                                                 5 0.0321
##
                                     4
## 7 alter17
                 1863 3.24 1.32
                                     3
                                            3.33 1.48
                                                          -2
                                                                 5 0.0306
## 8 alter18
                 1863 2.71 1.53
                                     3
                                            2.68 1.48
                                                          -2
                                                                 5 0.0355
## 9 alter19
                 1863 2.97 1.68
                                     3
                                            3.14 1.48
                                                          -2
                                                                 5 0.0389
## 10 alter110
                 1863 2.31 1.38
                                     2
                                            2.28 1.48
                                                          -2
                                                                 5 0.0321
## 11 alterl_m1 1847 3.17 0.829
                                     3.2
                                            3.21 0.890
                                                           1
                                                                 5 0.0193
## 12 alterl_m2 1849 2.88 0.958
                                     2.8
                                            2.86 1.04
                                                           1
                                                                 5 0.0223
```

3.3.3 Using summarize() and the tidyverse. As you may be aware, the tidyverse package provides powerful and flexible functions such as filter, select, group_by, and summarize. Here is an example demonstrating how these functions can be utilized to create descriptive statistic tables:

```
descriptives <- dfdta |>
  # filter(alterl1 > 0) |>
  group_by(geschlecht) |>
  summarize(
    Mean = mean(alterl1)
    , Count = n()
    , SD = sd(alterl1)
    , Min = min(alterl1)
```

Table 1				
Summary	Statistics:	Experience	of	Ageing.

variable	n	\min	max	q1	median	q3
alterl1	1,863.00	-2.00	5.00	1.00	3.00	4.00
alterl2	1,863.00	-2.00	5.00	2.00	4.00	4.00
alterl3	1,863.00	-2.00	5.00	1.00	2.00	3.00
alterl4	1,863.00	-2.00	5.00	2.00	3.00	4.00
alterl5	1,863.00	-2.00	5.00	2.00	3.00	4.00
alterl6	1,863.00	-2.00	5.00	2.00	4.00	5.00
alterl7	1,863.00	-2.00	5.00	2.00	3.00	4.00
alterl8	1,863.00	-2.00	5.00	1.00	3.00	4.00
alterl9	1,863.00	-2.00	5.00	2.00	3.00	4.00
alterl10	1,863.00	-2.00	5.00	1.00	2.00	3.00

Anmerkungen. This table contains all variables of 'alterl*'.

```
, Max = max(alter11)
)
descriptives
```

```
## # A tibble: 2 x 6
                  Mean Count
                                 SD Min
##
    geschlecht
                                                    Max
                  <dbl> <int> <dbl> <dbl+lbl>
##
    <dbl+1b1>
                                                    <dbl+1b1>
## 1 1 [Männlich]
                  2.71
                          927 1.50 -2 [Weiß nicht] 5 [Sehr stark]
## 2 2 [Weiblich]
                  2.60
                          936 1.72 -2 [Weiß nicht] 5 [Sehr stark]
```

3.4 Make APA Tables using apa_table()

, escape = TRUE

The R output shown above might not meet publishable standards as it requires proper formatting, including a table with a caption and adherence to APA rules. To achieve this, the apa_table() function is recommended, and further details can be found in Aust and Barth (2020, sec. 4.2).

```
apa_table(
   sumstat_alter
   , caption = "Summary Statistics: Experience of Ageing."
   , note = "This table contains all variables of `alterl*`."
   , escape = TRUE
   )

apa_table(
   sumstat_alter_psych
   , caption = "Summary Statistics: Experience of Ageing (psych)"
   , note = "This table contains all variables of `alterl*`."
```

zummar g zwaretteer. Zupertentee of Tigothy (pogett)									
Question	n	mean	sd	median	$\operatorname{trimmed}$	mad	\min	max	se
alterl1	1,863.00	2.66	1.61	3.00	2.76	1.48	-2.00	5.00	0.04
alterl2	1,863.00	3.28	1.45	4.00	3.43	1.48	-2.00	5.00	0.03
alterl3	1,863.00	2.35	1.28	2.00	2.28	1.48	-2.00	5.00	0.03
alterl4	1,863.00	2.76	1.72	3.00	2.96	1.48	-2.00	5.00	0.04
alterl5	1,863.00	2.99	1.66	3.00	3.20	1.48	-2.00	5.00	0.04
alterl6	1,863.00	3.40	1.38	4.00	3.54	1.48	-2.00	5.00	0.03
alterl7	1,863.00	3.24	1.32	3.00	3.33	1.48	-2.00	5.00	0.03
alterl8	1,863.00	2.71	1.53	3.00	2.68	1.48	-2.00	5.00	0.04
alterl9	1,863.00	2.97	1.68	3.00	3.14	1.48	-2.00	5.00	0.04
alterl10	1,863.00	2.31	1.38	2.00	2.28	1.48	-2.00	5.00	0.03
$alterl_m1$	1,847.00	3.17	0.83	3.20	3.21	0.89	1.00	5.00	0.02
$alterl_m2$	1,849.00	2.88	0.96	2.80	2.86	1.04	1.00	5.00	0.02

Table 2
Summary Statistics: Experience of Ageing (psych)

Anmerkungen. This table contains all variables of 'alterl*'.

Table 3
Experience of Ageing: Valuing Relationships and Other People More (By Gender)

geschlecht	Mean	Count	SD	Min	Max
1	2.71	927	1.50	-2	5
2	2.60	936	1.72	-2	5

```
apa_table(
  descriptives
  , caption = "Experience of Ageing: Valuing Relationships and Other People
  More (By Gender)"
  , escape = TRUE
)
```

Table 1 was created with the function get_summary_stats() of the rstatix package (Kassambara, 2023), Tables 2 and 4 were created with the function describe() of the psych package (William Revelle, 2023), and Table 3 was created with the function summarize() of the dplyr package (Wickham, François, Henry, Müller, & Vaughan, 2023).

3.5 Use the Likert Scale using gglikert()

We have seen that the data contain not only the five different (Likert scaled) answers. Thus, let us remove all values that have, in one or multiple questions, no answer of the Likert scale. The cleaned dataset is named df_alterl_balance.

```
df_alterl_balance <- df_alterl %>%
  rowwise() %>%
  mutate(has_negative = ifelse(any(c(across(alterl1:alterl10)) < 0), 1, 0)) |>
  filter(has_negative == 0) |>
  select(starts_with("alter")) |>
  as_tibble()
```

Using the gglikert() of the ggstats package (Larmarange, 2023) allows us to draw nice graphs. I highly recommend reading the vignette of the package in the R documentation which you get with vignette("gglikert").

Figures 1 and 3 shows the proportions of answers using df_alterl data and Figures 2 and 4 does so using the df_alterl_balance data whereby the latter to show the proportions stacked. Do you see any difference and can you explain the differences?

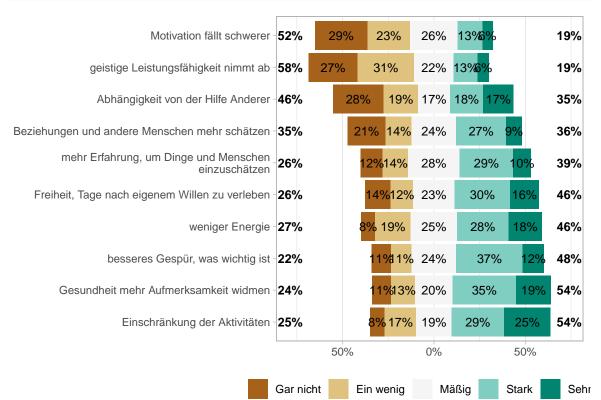


Figure 1. Experience of Ageing: Proportions of Answers (df_alterl)

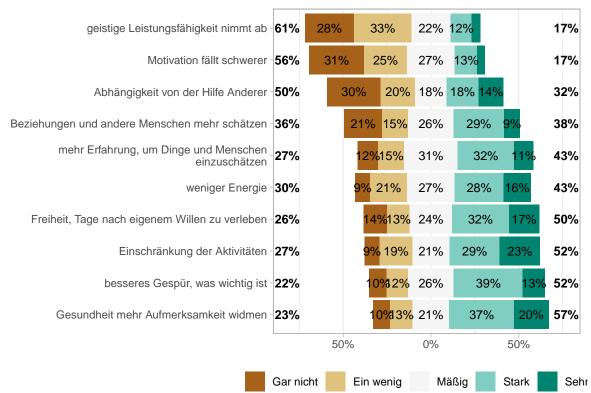
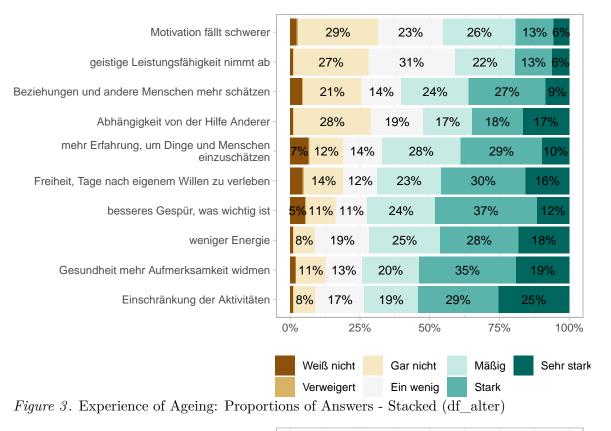


Figure 2. Experience of Ageing: Proportions of Answers (df_alterl_balance)

As we are interested in the differences of the two samples, it makes sense to look as the summary statistics for the df_alter_balance sample. This is shown in Table 4.

```
sumstat_alter_psych_bal <- df_alterl_balance |>
    psych::describe() |>
    as_tibble(rownames="Question") |>
    dplyr::select(-skew, -kurtosis, -range, -vars)

apa_table(
    sumstat_alter_psych_bal
    , caption = "Summary Statistics: Experience of Ageing - balanced (psych)"
    , note = "This table contains all variables of `alterl*` and only observations where all
```



12% geistige Leistungsfähigkeit nimmt ab 28% 33% 22% 13% Motivation fällt schwerer 31% 25% 27% 18% 14% Abhängigkeit von der Hilfe Anderer 30% 20% 18% 21% Beziehungen und andere Menschen mehr schätzen 15% 26% 29% 9% mehr Erfahrung, um Dinge und Menschen 12% 15% 31% 32% 11% einzuschätzen weniger Energie 9% 21% 27% 28% 16% Freiheit, Tage nach eigenem Willen zu verleben 14% 13% 24% 32% 17% besseres Gespür, was wichtig ist 10% 12% 26% 39% 13% Einschränkung der Aktivitäten 9% 19% 21% 29% 23% Gesundheit mehr Aufmerksamkeit widmen 10% 13% 21% 37% 20% 0% 25% 50% 75% 100%

Figure 4. Experience of Ageing: Proportions of Answers - Stacked (df_alterl_balance)

Gar nicht

Ein wenig

Mäßig

Stark

Sehr

 $\begin{array}{c} {\rm Table}\ 4\\ {\it Summary}\ {\it Statistics:}\ {\it Experience}\ of\ {\it Ageing}\ \hbox{-}\ balanced\ (psych) \end{array}$

Question	n	mean	sd	median	$\operatorname{trimmed}$	mad	min	max	se
alterl1	1,596.00	2.89	1.28	3.00	2.87	1.48	1.00	5.00	0.03
alterl2	1,596.00	3.44	1.22	4.00	3.55	1.48	1.00	5.00	0.03
alterl3	1,596.00	2.33	1.15	2.00	2.23	1.48	1.00	5.00	0.03
alterl4	1,596.00	3.16	1.16	3.00	3.20	1.48	1.00	5.00	0.03
alterl5	1,596.00	3.32	1.15	4.00	3.40	1.48	1.00	5.00	0.03
alterl6	1,596.00	3.38	1.26	4.00	3.46	1.48	1.00	5.00	0.03
alterl7	1,596.00	3.21	1.19	3.00	3.24	1.48	1.00	5.00	0.03
alterl8	1,596.00	2.66	1.43	2.00	2.57	1.48	1.00	5.00	0.04
alterl9	1,596.00	3.27	1.27	3.00	3.34	1.48	1.00	5.00	0.03
alterl10	1,596.00	2.35	1.17	2.00	2.26	1.48	1.00	5.00	0.03

Anmerkungen. This table contains all variables of 'alterl*' and only observations where all questions had been answered.

```
, escape = TRUE
)
```

4 Cross-Referencing in R Markdown

In adherence to the APA style guidelines (Association et al., 2022), it is imperative to reference all figures and tables by their respective numbers within the text. Avoid using generic phrases like "the table above" or "the figure below." Additionally, refrain from hard-coding the numbers for a more dynamic and standardized approach. Xie, Dervieux, and Riederer (2023) explains concisely how to do that with R Markdown, see: https://bookdown.org/yihui/rmarkdown-cookbook/cross-ref.html.

For example, I can refer to Table 1 with \@ref(tab:tabrstatix) because I have specified the corresponding label in the R code-chunk, see:

```
fr tabrstatix, echo=TRUE}
apa_table(
  sumstat_alter
  , caption = "Summary Statistics: Experience of Ageing."
  , note = "This table contains all variables of `alterl*`."
  , escape = TRUE
)
```

\clearpage

Exercises

- 1. With `knitr::purl("desc_NRW80.Rmd")` you can extract the whole R code from the R Markdo
- 2. The dataset `gesis.RData` comes with two different tibbles: `dfsav` and `dfdta`. Is the
- 3. Check possible differences in the `gglikert` plots when using `df_alterl_un` instead of
- 4. The stats above show that dealing with missing or non-standard answers is a crucial thi
- 5. The labels of the variables `alterl1:alterl10` have "Alternserleben: " at the beginning.

```
""
# Remove the common prefix from all variables
df <- df |>
   mutate_all(~ set_label(., gsub("^Alternserleben: ", "", get_label(.))))
```

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