

Introduction to R

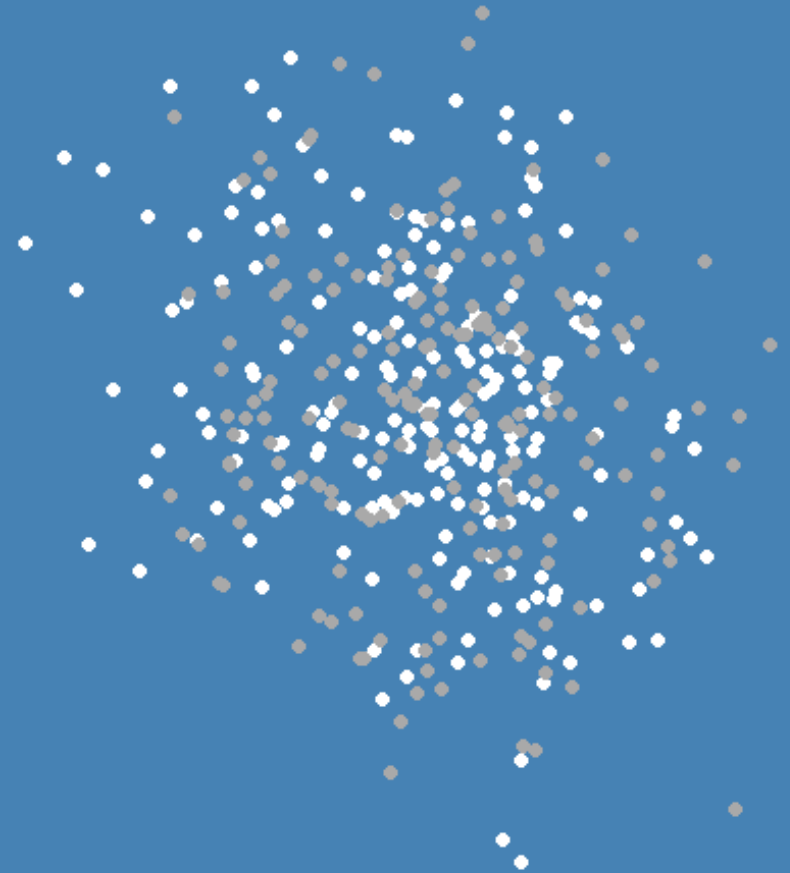
2.5 Transforming Variables

Class conversions, `mutate()`, `recode()`

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Sciences



Data Import

```
library(haven)
ess10 <- haven::read_dta("./dat/ESS10.dta")
dim(ess10) # check dimensionality of data frame
```

```
## [1] 18060    513
```

```
print(ess10[1:10, 1:10])
```

```
## # A tibble: 10 × 10
```

```
##   name      essro...1 edition prodd...2 idno cntry dweight pweight nwspol netus...3
##   <chr>      <dbl> <chr>   <chr>   <dbl> <chr>   <dbl>   <dbl> <dbl+> <dbl+l>
## 1 ESS10e01_2      10 1.2     28.06.... 10002 BG      1.03    0.218   80     1 [Nev...
## 2 ESS10e01_2      10 1.2     28.06.... 10006 BG      0.879    0.218   63     5 [Eve...
## 3 ESS10e01_2      10 1.2     28.06.... 10009 BG      1.01    0.218  390     5 [Eve...
## 4 ESS10e01_2      10 1.2     28.06.... 10024 BG      0.955    0.218   60     5 [Eve...
## 5 ESS10e01_2      10 1.2     28.06.... 10027 BG      0.841    0.218  120     5 [Eve...
## 6 ESS10e01_2      10 1.2     28.06.... 10048 BG      0.946    0.218   60     5 [Eve...
## 7 ESS10e01_2      10 1.2     28.06.... 10053 BG      1.01    0.218   30     5 [Eve...
## 8 ESS10e01_2      10 1.2     28.06.... 10055 BG      1.03    0.218   70     5 [Eve...
## 9 ESS10e01_2      10 1.2     28.06.... 10059 BG      0.991    0.218   60     1 [Nev...
## 10 ESS10e01_2     10 1.2     28.06.... 10061 BG      1.05    0.218   60     1 [Nev...
```

```
## # ... with abbreviated variable names 1essround, 2proddate, 3netusoft
```

Changing the data type: Class conversions

Class Conversions: Overview base R

In **base R**, simply take a function `as._()` and wrap it around the object that should change its data type.

Conceptual

```
as.numeric()  
as.character()  
as.factor()  
as.logical()
```

Class Conversions: Example base R

Sometimes we have to work with messy data, e.g. numeric information coming as a character variable.

Of course, we can convert a [character variable](#) into a [numeric format](#).

First, let's create a [character variable](#):

```
# generate character variable storing numeric information
var_char <- as.character(runif(5, min = 0, max = 10))
```

```
print(var_char)
```

```
## [1] "4.07960083568469" "7.34801860526204" "5.82581334980205" "1.63197547197342"
## [5] "8.23638678062707"
```

Second, let's convert it into [numeric](#):

```
# generate character variable storing numeric information
var_numeric <- as.numeric(var_char)
print(var_numeric)
```

```
## [1] 4.079601 7.348019 5.825813 1.631975 8.236387
```

Class Conversions: Example base R

Since we imported our dataset with the package `haven`, the variable `gndr` is stored as a variable of class `haven_labelled` where `1 = Male` and `2 = Female`.

```
class(ess10$gndr)
```

```
## [1] "haven_labelled" "vctrs_vctr"      "double"
```

```
table(ess10$gndr)
```

```
##  
##      1      2  
## 8100 9960
```

Class Conversions: Example base R

Let's change this variable into a [character variable](#).

```
ess10$gnr_char <- as.character(ess10$gnr) # transform to character  
class(ess10$gnr_char)
```

```
## [1] "character"
```

```
table(ess10$gnr_char)
```

```
##  
##      1      2  
## 8100 9960
```

Class Conversions: Example base R

Alternatively, we can change it into a [factor variable](#).

```
ess10$gndr_fac <- as.factor(ess10$gndr)
class(ess10$gndr_fac)
```

```
## [1] "factor"
```

```
table(ess10$gndr_fac)
```

```
##
##      1      2
## 8100 9960
```


Class Conversions: Example dplyr

The `dplyr` package let's us easily change the classes of variables by combining the respective functions (`as.numeric()`, `as.character()` etc.) with `mutate()`.

```
table(ess10$gndr)
```

```
##  
##      1      2  
## 8100 9960
```

```
class(ess10$gndr)
```

```
## [1] "haven_labelled" "vctrs_vctr"      "double"
```

Class Conversions: Example dplyr

The `dplyr` package let's us easily change the classes of variables by combining the respective functions (`as.numeric()`, `as.character()` etc.) with `mutate()`.

```
table(ess10$lrscale)
```

```
##  
##      0      1      2      3      4      5      6      7      8      9     10  
##  718   371   732  1119  1062  5457  1526  1696  1499   541  1031
```

```
class(ess10$lrscale)
```

```
## [1] "haven_labelled" "vctrs_vctr"      "double"
```

Class Conversions: Example dplyr

The `dplyr` package let's us easily change the classes of variables by combining the respective functions (`as.numeric()`, `as.character()` etc.) with `mutate()`.

```
ess10 <- ess10 %>%  
  mutate(gndr_char = as.character(gndr),  
         lrscale_num = as.numeric(lrscale))
```

```
table(ess10$gndr_char)
```

```
##  
##      1      2  
## 8100 9960
```

```
class(ess10$gndr_char)
```

```
## [1] "character"
```

Class Conversions: Example dplyr

The `dplyr` package let's us easily change the classes of variables by combining the respective functions (`as.numeric()`, `as.character()` etc.) with `mutate()`.

```
ess10 <- ess10 %>%  
  mutate(gndr_char = as.character(gndr),  
         lrscale_num = as.numeric(lrscale))
```

```
table(ess10$lrscale_num)
```

```
##  
##      0      1      2      3      4      5      6      7      8      9     10  
##  718   371   732 1119 1062 5457 1526 1696 1499   541 1031
```

```
class(ess10$lrscale_num)
```

```
## [1] "numeric"
```

Recoding values

Simple Recodings

Simple recodings can be performed in [base R](#).

Let's take our variable gender (coded 1/2)

- let it take on values of either 0 or 1
- convert it into a factor variable
- set 0 to "Male" and 1 to "Female"

Simple Recodings

Simple recodings can be performed in [base R](#).

Let's take our variable gender (coded 1/2)

- let it take on values of either 0 or 1
- convert it into a factor variable
- set 0 to "Male" and 1 to "Female"

```
ess10$female <- ess10$gndr - 1
```

```
table(ess10$female)
```

```
##  
##      0      1  
## 8100 9960
```

Simple Recodings

Simple recodings can be performed in [base R](#).

Let's take our variable gender (coded 1/2)

- let it take on values of either 0 or 1
- convert it into a factor variable
- set 0 to "Male" and 1 to "Female"

```
ess10$female <- as.factor(ess10$female)
```

```
ess10$female <- ifelse(ess10$female == "1",  
                        "Female", "Male")
```

```
table(ess10$female)
```

```
##  
## Female   Male  
##   9960   8100
```


mutate() for Numeric Variables - Transformation of Scale

Let's look at the variable `political interest`.

```
table(ess10$polintr)
```

```
##  
##      1      2      3      4  
## 1319 5469 7093 4137
```

Often, we want a variable's range to `start of 0` such that the constant of a regression model becomes substantively interpretable if the variable is included as an `independent predictor`.

```
ess10 <- ess10 %>%  
  mutate(pol_interest = polintr - 1)
```

```
table(ess10$pol_interest)
```

```
##  
##      0      1      2      3  
## 1319 5469 7093 4137
```

dplyr::mutate() - Reverse Scale of Numeric Variable

What if I told you that...

higher values on the variable `pol_interest` actually indicate lower amounts of political interest?

■ From the European Social Survey Main Questionnaire, Wave 10

SECTION B

Now we want to ask a few questions about politics and government.

B1 How interested would you say you are in politics –
are you... **READ OUT...**

very interested,	1
quite interested,	2
hardly interested,	3
or, not at all interested?	4

dplyr::mutate() - Reverse Scale of Numeric Variable

For numeric variables, there is a straightforward way to reverse the scale.

- if k is the maximum value of the scale
- $var_reversed = (old_var * -1) + k$

```
ess10 <- ess10 %>%  
  mutate(pol_interest_res = (pol_interest * -1) + 3)
```

```
table(ess10$pol_interest)
```

```
##  
##      0      1      2      3  
## 1319 5469 7093 4137
```

```
table(ess10$pol_interest_res)
```

```
##  
##      0      1      2      3  
## 4137 7093 5469 1319
```

dplyr::mutate() - Recoding

Let's collapse respondents into either being [left-leaning](#), [right-leaning](#), or in the [center](#).

```
table(ess10$lrscale)
```

```
##  
##      0      1      2      3      4      5      6      7      8      9     10  
##  718   371   732 1119 1062 5457 1526 1696 1499   541 1031
```

dplyr::mutate() - Recoding

Let's collapse respondents into either being [left-leaning](#), [right-leaning](#), or in the [center](#).

```
ess10 <- ess10 %>%  
  mutate(lr_binary = as.numeric(lrscale)) %>%  
  mutate(lr_binary = recode(lr_binary,  
    `0` = 0,  
    `1` = 0,  
    `2` = 0,  
    `3` = 0,  
    `4` = 0,  
    `5` = 1,  
    `6` = 2,  
    `7` = 2,  
    `8` = 2,  
    `9` = 2,  
    `10` = 2  
  )  
)
```

dplyr::mutate() - Recoding

Let's collapse respondents into either being [left-leaning](#), [right-leaning](#), or in the [center](#).

```
table(ess10$lr_binary, ess10$lrscale)
```

```
##  
##      0      1      2      3      4      5      6      7      8      9     10  
## 0  718  371  732 1119 1062      0      0      0      0      0      0  
## 1      0      0      0      0      0 5457      0      0      0      0      0  
## 2      0      0      0      0      0      0 1526 1696 1499  541 1031
```

dplyr::mutate() - Recoding

If you want to generate (or recode) a factor variable, simply use `recode_factor()`.

The functionality stays the same.

```
ess10 <- ess10 %>%  
  mutate(gender = as.factor(gndr)) %>%  
  mutate(gender = recode_factor(gender,  
                                `1` = "Male",  
                                `2` = "Female"  
  )  
)
```

dplyr::mutate() - Recoding

We can chain several variable transformations into one single statement...

and generate a whole data wrangling pipeline consisting of only few commands!

```
ess10 <- ess10 %>%  
  mutate(gender = as.factor(gndr)) %>%  
  mutate(gender = recode_factor(gender,  
                                `1` = "Male",  
                                `2` = "Female"  
  )  
)
```


dplyr::mutate() - Recoding

We can chain several variable transformations into one single statement...

and generate a whole data wrangling pipeline consisting of only few commands!

```
ess10 <- ess10 %>%  
  mutate(gender = as.factor(gndr),  
         voted = as.factor(vote)) %>%  
  mutate(gender = recode_factor(gender,  
                                `1` = "Male",  
                                `2` = "Female"),  
         voted = recode_factor(voted,  
                                `1` = "Yes",  
                                `2` = "No",  
                                `3` = "Not eligible"  
                                )  
  )
```

```
ess10 <- ess10 %>%  
  mutate(gender = as.factor(gndr),  
         voted = as.factor(vote)) %>%  
  mutate(gender = recode_factor(gender,  
                                `1` = "Male",  
                                `2` = "Female"),  
         voted = recode_factor(voted,  
                                `1` = "Yes",  
                                `2` = "No",  
                                `3` = "Not eligible"  
                                )  
  )
```

```

ess10 <- ess10 %>%
  mutate(gender = as.factor(gndr),
         voted = as.factor(vote),
         party_choice = as.factor(prtvtefr)) %>%
  mutate(gender = recode_factor(gender,
                                `1` = "Male",
                                `2` = "Female"),
         voted = recode_factor(voted,
                                `1` = "Yes",
                                `2` = "No",
                                `3` = "Not eligible"),
         party_choice = recode_factor(party_choice,
                                       `1` = "Lutte Ouvrière",
                                       `2` = "Nouv. Parti Anti-Capitaliste",
                                       `3` = "Parti Communiste Français",
                                       `4` = "La France Insoumise",
                                       `5` = "Parti Socialiste",
                                       `6` = "Europe Ecologie Les Verts",
                                       `7` = "La République en Marche",
                                       `8` = "Mouvement Démocrate",
                                       `9` = "Les Républicains",
                                       `10` = "Debout la France",
                                       `11` = "Front National",
                                       `12` = "Other",
                                       `13` = "Blank",
                                       `14` = "Null"
                                       )
  )

```

```

ess10 <- ess10 %>%
  mutate(gender = as.factor(gndr),
         voted = as.factor(vote),
         party_choice = as.factor(prtvtefr)) %>%
  mutate(gender = recode_factor(gender,
                                `1` = "Male",
                                `2` = "Female"),
         voted = recode_factor(voted,
                                `1` = "Yes",
                                `2` = "No",
                                `3` = "Not eligible"),
         party_choice = recode_factor(party_choice,
                                       `1` = "Lutte Ouvrière",
                                       `2` = "Nouv. Parti Anti-Capitaliste",
                                       `3` = "Parti Communiste Français",
                                       `4` = "La France Insoumise",
                                       `5` = "Parti Socialiste",
                                       `6` = "Europe Ecologie Les Verts",
                                       `7` = "La République en Marche",
                                       `8` = "Mouvement Démocrate",
                                       `9` = "Les Républicains",
                                       `10` = "Debout la France",
                                       `11` = "Front National",
                                       `12` = "Other",
                                       `13` = "Blank",
                                       `14` = "Null"
                                       )
  )

```

```

ess10 <- ess10 %>%
  mutate(gender = as.factor(gndr),
         voted = as.factor(vote),
         party_choice = as.factor(prtvtefr)) %>%
  mutate(gender = recode_factor(gender,
                                `1` = "Male",
                                `2` = "Female"),
         voted = recode_factor(voted,
                                `1` = "Yes",
                                `2` = "No",
                                `3` = "Not eligible"),
         party_choice = recode_factor(party_choice,
                                       `1` = "Lutte Ouvrière",
                                       `2` = "Nouv. Parti Anti-Capitaliste",
                                       `3` = "Parti Communiste Français",
                                       `4` = "La France Insoumise",
                                       `5` = "Parti Socialiste",
                                       `6` = "Europe Ecologie Les Verts",
                                       `7` = "La République en Marche",
                                       `8` = "Mouvement Démocrate",
                                       `9` = "Les Républicains",
                                       `10` = "Debout la France",
                                       `11` = "Front National",
                                       `12` = "Other",
                                       `13` = "Blank",
                                       `14` = "Null"
                                       )
  )

```

```

ess10 <- ess10 %>%
  mutate(gender = as.factor(gndr),
         voted = as.factor(vote),
         party_choice = as.factor(prtvtefr)) %>%
  mutate(gender = recode_factor(gender,
                                `1` = "Male",
                                `2` = "Female"),
         voted = recode_factor(voted,
                                `1` = "Yes",
                                `2` = "No",
                                `3` = "Not eligible"),
         party_choice = recode_factor(party_choice,
                                       `1` = "Lutte Ouvrière",
                                       `2` = "Nouv. Parti Anti-Capitaliste",
                                       `3` = "Parti Communiste Français",
                                       `4` = "La France Insoumise",
                                       `5` = "Parti Socialiste",
                                       `6` = "Europe Ecologie Les Verts",
                                       `7` = "La République en Marche",
                                       `8` = "Mouvement Démocrate",
                                       `9` = "Les Républicains",
                                       `10` = "Debout la France",
                                       `11` = "Front National",
                                       `12` = "Other",
                                       `13` = "Blank",
                                       `14` = "Null"
                                       )
  )

```

```

ess10 <- ess10 %>%
  mutate(gender = as.factor(gndr),
         voted = as.factor(vote),
         party_choice = as.factor(prtvtefr)) %>%
  mutate(gender = recode_factor(gender,
                                `1` = "Male",
                                `2` = "Female"),
         voted = recode_factor(voted,
                                `1` = "Yes",
                                `2` = "No",
                                `3` = "Not eligible"),
         party_choice = recode_factor(party_choice,
                                       `1` = "Lutte Ouvrière",
                                       `2` = "Nouv. Parti Anti-Capitaliste",
                                       `3` = "Parti Communiste Français",
                                       `4` = "La France Insoumise",
                                       `5` = "Parti Socialiste",
                                       `6` = "Europe Ecologie Les Verts",
                                       `7` = "La République en Marche",
                                       `8` = "Mouvement Démocrate",
                                       `9` = "Les Républicains",
                                       `10` = "Debout la France",
                                       `11` = "Front National",
                                       `12` = "Other",
                                       `13` = "Blank",
                                       `14` = "Null"
                                       )
  )

```

```

ess10 <- ess10 %>%
  mutate(gender = as.factor(gndr),
         voted = as.factor(vote),
         party_choice = as.factor(prtvtefr)) %>%
  mutate(gender = recode_factor(gender,
                                `1` = "Male",
                                `2` = "Female"),
         voted = recode_factor(voted,
                                `1` = "Yes",
                                `2` = "No",
                                `3` = "Not eligible"),
         party_choice = recode_factor(party_choice,
                                       `1` = "Lutte Ouvrière",
                                       `2` = "Nouv. Parti Anti-Capitaliste",
                                       `3` = "Parti Communiste Français",
                                       `4` = "La France Insoumise",
                                       `5` = "Parti Socialiste",
                                       `6` = "Europe Ecologie Les Verts",
                                       `7` = "La République en Marche",
                                       `8` = "Mouvement Démocrate",
                                       `9` = "Les Républicains",
                                       `10` = "Debout la France",
                                       `11` = "Front National",
                                       `12` = "Other",
                                       `13` = "Blank",
                                       `14` = "Null"
                                       )
  )

```


Recoding in base R

How can we achieve such recodings using `base R`?

It works equally well, the code just becomes a little convoluted...

```
ess10$gender <- NA  
ess10$gender[ess10$gndr == 1] <- "Male"  
ess10$gender[ess10$gndr == 2] <- "Female"  
ess10$gender <- as.factor(ess10$gender)
```

```
ess10$gender <- NA  
ess10$gender[ess10$gndr == 1] <- "Male"  
ess10$gender[ess10$gndr == 2] <- "Female"  
ess10$gender <- as.factor(ess10$gender)
```

```
ess10$gender <- NA  
ess10$gender[ess10$gndr == 1] <- "Male"  
ess10$gender[ess10$gndr == 2] <- "Female"  
ess10$gender <- as.factor(ess10$gender)
```

```
ess10$gender <- NA  
ess10$gender[ess10$gndr == 1] <- "Male"  
ess10$gender[ess10$gndr == 2] <- "Female"  
ess10$gender <- as.factor(ess10$gender)
```

```
ess10$gender <- NA
ess10$gender[ess10$gndr == 1] <- "Male"
ess10$gender[ess10$gndr == 2] <- "Female"
ess10$gender <- as.factor(ess10$gender)
```

```
ess10$voted <- NA
ess10$voted[ess10$vote == 1] <- "Yes"
ess10$voted[ess10$vote == 2] <- "No"
ess10$voted[ess10$vote == 3] <- "Not eligible"
ess10$voted <- as.factor(ess10$voted)
```

```
ess10$party_choice <- NA
ess10$party_choice[ess10$prtvtefr == 1] <- "Lutte Ouvrière"
ess10$party_choice[ess10$prtvtefr == 2] <- "Nouv. Parti Anti-Capitaliste"
ess10$party_choice[ess10$prtvtefr == 3] <- "Parti Communiste Français"
ess10$party_choice[ess10$prtvtefr == 4] <- "La France Insoumise"
ess10$party_choice[ess10$prtvtefr == 5] <- "Parti Socialiste"
ess10$party_choice[ess10$prtvtefr == 6] <- "Europe Ecologie Les Verts"
ess10$party_choice[ess10$prtvtefr == 7] <- "La République en Marche"
ess10$party_choice[ess10$prtvtefr == 8] <- "Mouvement Démocrate"
ess10$party_choice[ess10$prtvtefr == 9] <- "Les Républicains"
ess10$party_choice[ess10$prtvtefr == 10] <- "Debout la France"
ess10$party_choice[ess10$prtvtefr == 11] <- "Front National"
ess10$party_choice[ess10$prtvtefr == 12] <- "Other"
ess10$party_choice[ess10$prtvtefr == 13] <- "Blank"
ess10$party_choice[ess10$prtvtefr == 14] <- "Null"
ess10$party_choice <- as.factor(ess10$party_choice)
```

The Data Wrangling Pipeline (I/III)

```
library(tidyverse)
ess10 <- haven::read_dta("./dat/ESS10.dta")
ess10 <- ess10 %>% # subset variables
  select(country = cntry, # sociodemographics
         gender = gndr,
         education_years = eduyrs,
         trust_social = ppltrst, # multidimensional trust
         trust_parliament = trstprl,
         trust_legalSys = trstlgl,
         trust_police = trstpplc,
         trust_politicians = trstplt,
         trust_parties = trstprt,
         trust_EP = trstep,
         trust_UN = trstun,
         left_right = lrscle, # attitudes
         life_satisfaction = stflife,
         pol_interest = polintr,
         voted = vote, # turnout
         party_choice = prtvtfr # party choice
  ) %>%
  filter(country == "FR") # subset cases (only include France)
```

The Data Wrangling Pipeline (I/III)

```
library(tidyverse)
ess10 <- haven::read_dta("./dat/ESS10.dta")
ess10 <- ess10 %>% # subset variables
  select(country = cntry, # sociodemographics
         gender = gndr,
         education_years = eduyrs,
         trust_social = ppltrst, # multidimensional trust
         trust_parliament = trstprl,
         trust_legalSys = trstlgl,
         trust_police = trstpplc,
         trust_politicians = trstplt,
         trust_parties = trstprt,
         trust_EP = trstep,
         trust_UN = trstun,
         left_right = lrscle, # attitudes
         life_satisfaction = stflife,
         pol_interest = polintr,
         voted = vote, # turnout
         party_choice = prtvtfr # party choice
  ) %>%
  mutate_at(c("country", "gender", "voted", "party_choice"), as.character) %>% # change types
  mutate_at("pol_interest", as.numeric) %>% # change types
  filter(country == "FR") # subset cases (only include France)
```


The Data Wrangling Pipeline (I/III)

```
library(tidyverse)
ess10 <- haven::read_dta("./dat/ESS10.dta")
ess10 <- ess10 %>% # subset variables
  select(country = cntry, # sociodemographics
    gender = gndr,
    education_years = eduyrs,
    trust_social = ppltrst, # multidimensional trust
    trust_parliament = trstprl,
    trust_legalSys = trstlgl,
    trust_police = trstplc,
    trust_politicians = trstplt,
    trust_parties = trstprt,
    trust_EP = trstep,
    trust_UN = trstun,
    left_right = lrscle, # attitudes
    life_satisfaction = stflife,
    pol_interest = polintr,
    voted = vote, # turnout
    party_choice = prtvtfr # party choice
  ) %>%
  mutate_at(c("country", "gender", "voted", "party_choice"), as.character) %>%
  mutate_at("pol_interest", as.numeric) %>%
  filter(country == "FR") # subset cases (only include France)
```

The Data Wrangling Pipeline (II/III)

```
ess10 <- ess10 %>%  
  mutate(gender = recode_factor(gender,  
                                `1` = "Male",  
                                `2` = "Female"),  
         voted = recode_factor(voted,  
                               `1` = "Yes",  
                               `2` = "No",  
                               `3` = "Not eligible"),  
         party_choice = recode_factor(party_choice,  
                                       `1` = "Lutte Ouvrière",  
                                       `2` = "Nouv. Parti Anti-Capitaliste",  
                                       `3` = "Parti Communiste Français",  
                                       `4` = "La France Insoumise",  
                                       `5` = "Parti Socialiste",  
                                       `6` = "Europe Ecologie Les Verts",  
                                       `7` = "La République en Marche",  
                                       `8` = "Mouvement Démocrate",  
                                       `9` = "Les Républicains",  
                                       `10` = "Debout la France",  
                                       `11` = "Front National",  
                                       `12` = "Other",  
                                       `13` = "Blank",  
                                       `14` = "Null")  
  )
```

The Data Wrangling Pipeline (III/III)

```
ess10 <- ess10 %>%  
  mutate(pol_interest = (pol_interest * -1) + 5, # invert scale  
         life_satisfaction = life_satisfaction + 1 # change scale to [1, 11]  
        )
```

References

Parts of this course are inspired by the following resources:

- Wickham, Hadley and Garrett Grolemund, 2017. *R for Data Science - Import, Tidy, Transform, Visualize, and Model Data*. O'Reilly.
- Bahnsen, Oke and Guido Ropers, 2022. *Introduction to R for Quantitative Social Science*. Course held as part of the GESIS Workshop Series.
- Breuer, Johannes and Stefan Jünger, 2021. *Introduction to R for Data Analysis*. Course held as part of the GESIS Summer School in Survey Methodology.
- Teaching material developed by Verena Kunz, David Weyrauch, Oliver Rittmann and Viktoriia Semenova.