Descriptive Statistics in R

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Basic Data Descriptions

To find out about a dataset in R we can run a names command on the particular dataframe (dataset). Let's return to our example dataset, first loading it into R:

```
library(rio)
D<-import("https://jan-rovny.squarespace.com/s/France.dta")</pre>
```

Let's explore our data:

```
names(D)
```

```
[1] "dpt"
                        "female"
                                            "age"
                                                                "educ"
 [5] "inc"
                        "urban"
                                            "religion"
                                                               "religiosity"
 [9] "lr"
                        "redist"
                                            "feminism"
                                                                "pro_immig"
                        "anti_vax"
                                                               "elit_oppose_rur"
[13] "adopt_homo"
                                            "gilets"
[17] "sov_eu"
                        "str_lead"
                                            "milit"
                                                                "prvt_LFI"
                                                                "prvt_LR"
[21] "prvt_PS"
                        "prvt_EELV"
                                            "prvt_LREM"
[25] "prvt_FN"
                        "prvt_RE"
                                            "vote1"
```

This produces a list of all the variable names in the dataset. Alternatively, we can ask to receive both variable names and some basic summary statistics:

```
summary(D)
```

dpt		female		ag	ge	educ		
Min.	: 1.00	Min.	:0.0000	Min.	:18.00	Min.	:0.00	
1st Qu.	:33.00	1st Qu.	.:0.0000	1st Qu	.:27.00	1st Qu.	:4.00	
Median	:59.00	${\tt Median}$:1.0000	${\tt Median}$:39.00	${\tt Median}$:6.00	
Mean	:53.93	Mean	:0.5331	Mean	:44.03	Mean	:5.39	

```
3rd Qu.:75.00
                 3rd Qu.:1.0000
                                   3rd Qu.:59.00
                                                    3rd Qu.:7.00
Max.
       :95.00
                 Max.
                        :2.0000
                                   Max.
                                          :93.00
                                                    Max.
                                                            :8.00
NA's
       :5
                                      religion
                                                     religiosity
     inc
                      urban
Min.
       : 1.000
                  Min.
                         :1.000
                                   Min.
                                          :1.000
                                                    Min.
                                                           :0.000
1st Qu.: 6.000
                  1st Qu.:1.000
                                   1st Qu.:1.000
                                                    1st Qu.:1.000
Median: 8.000
                  Median :2.000
                                   Median :4.000
                                                    Median :1.000
Mean
       : 7.939
                  Mean
                         :1.888
                                   Mean
                                           :4.171
                                                    Mean
                                                            :1.554
3rd Qu.:10.000
                  3rd Qu.:2.000
                                   3rd Qu.:7.000
                                                    3rd Qu.:2.000
                  Max.
Max.
       :13.000
                         :4.000
                                   Max.
                                           :7.000
                                                    Max.
                                                            :4.000
NA's
                  NA's
                                   NA's
       :140
                         :10
                                           :46
                                                    NA's
                                                            :836
      lr
                     redist
                                     feminism
                                                    pro_immig
                                                                    adopt_homo
                        :1.000
                                                         :1.00
                                                                         :0.000
Min.
       :1.000
                 Min.
                                  Min.
                                          :1.00
                                                  Min.
                                                                  Min.
1st Qu.:2.000
                 1st Qu.:1.000
                                  1st Qu.:2.00
                                                  1st Qu.:2.00
                                                                  1st Qu.:2.000
Median :3.000
                 Median :2.000
                                  Median:3.00
                                                  Median:3.00
                                                                  Median :2.000
       :2.912
                                                          :2.72
Mean
                 Mean
                        :2.297
                                  Mean
                                         :2.68
                                                  Mean
                                                                  Mean
                                                                         :2.093
3rd Qu.:3.000
                 3rd Qu.:3.000
                                  3rd Qu.:4.00
                                                  3rd Qu.:4.00
                                                                  3rd Qu.:3.000
Max.
       :5.000
                 Max.
                        :4.000
                                  Max.
                                          :4.00
                                                          :4.00
                                                  Max.
                                                                  Max.
                                                                          :3.000
NA's
       :78
                 NA's
                        :58
                                  NA's
                                          :73
                                                  NA's
                                                          :91
                                                                  NA's
                                                                          :56
   anti vax
                      gilets
                                    elit oppose rur
                                                         sov eu
Min.
       :0.0000
                  Min.
                         :0.0000
                                    Min.
                                            :0.000
                                                     Min.
                                                            :1.000
1st Qu.:0.0000
                  1st Qu.:0.0000
                                    1st Qu.:1.000
                                                     1st Qu.:2.000
Median :0.0000
                  Median :0.0000
                                    Median :1.000
                                                     Median :3.000
Mean
       :0.5662
                  Mean
                         :0.7594
                                    Mean
                                            :1.356
                                                     Mean
                                                             :2.535
3rd Qu.:2.0000
                  3rd Qu.:2.0000
                                    3rd Qu.:2.000
                                                     3rd Qu.:3.000
Max.
       :2.0000
                          :2.0000
                                            :3.000
                                                             :4.000
                  Max.
                                    Max.
                                                     Max.
NA's
                                    NA's
                                                     NA's
       :46
                  NA's
                          :51
                                            :220
                                                             :145
   str_lead
                      milit
                                       prvt_LFI
                                                         prvt_PS
Min.
       :0.0000
                  Min.
                         :0.0000
                                    Min.
                                            : 1.000
                                                      Min.
                                                             : 1.000
1st Qu.:0.0000
                  1st Qu.:0.0000
                                    1st Qu.: 1.000
                                                      1st Qu.: 1.000
Median :0.0000
                  Median :0.0000
                                    Median : 5.000
                                                      Median : 5.000
Mean
       :0.5971
                  Mean
                         :0.4753
                                    Mean
                                            : 5.135
                                                      Mean
                                                              : 4.809
3rd Qu.:1.0000
                  3rd Qu.:1.0000
                                    3rd Qu.: 8.000
                                                      3rd Qu.: 7.000
Max.
       :3.0000
                  Max.
                         :3.0000
                                            :11.000
                                                              :11.000
                                    Max.
                                                      Max.
NA's
                  NA's
                                    NA's
                                                      NA's
       :64
                          :933
                                            :83
                                                              :97
  prvt EELV
                    prvt LREM
                                       prvt_LR
                                                         prvt FN
       : 1.000
                  Min.
                         : 1.000
                                    Min.
                                           : 1.000
                                                      Min. : 1.000
1st Qu.: 3.000
                  1st Qu.: 1.000
                                    1st Qu.: 1.000
                                                      1st Qu.: 1.000
                  Median : 6.000
Median : 6.000
                                    Median : 5.000
                                                      Median : 1.000
Mean
       : 5.565
                  Mean
                         : 5.284
                                    Mean
                                            : 4.576
                                                      Mean
                                                              : 3.924
3rd Qu.: 8.000
                  3rd Qu.: 8.000
                                    3rd Qu.: 6.000
                                                      3rd Qu.: 7.000
Max.
       :11.000
                  Max.
                         :11.000
                                    Max.
                                            :11.000
                                                      Max.
                                                              :11.000
NA's
       :68
                  NA's
                         :98
                                    NA's
                                            :113
                                                      NA's
                                                              :81
```

```
prvt_RE
                     vote1
Min. : 1.000
                 Min.
                        :1.000
1st Qu.: 1.000
                 1st Qu.:1.000
Median : 1.000
                 Median :3.000
Mean : 2.406
                 Mean
                        :2.939
3rd Qu.: 3.000
                 3rd Qu.:5.000
Max.
       :11.000
                 Max.
                        :6.000
NA's
                 NA's
       :63
                        :575
```

We can also ask about the nature of each variable by typing:

```
is.character(D$vote1)

[1] FALSE

is.numeric(D$age)

[1] TRUE

is.factor(D$religion)

[1] FALSE

is.integer(D$female)
```

[1] FALSE

is.vector(D\$lr)

[1] FALSE

R answers TRUE or FALSE.

Descriptive Statistics

Next, we should run some descriptive statistics on our data. Descriptive statistics do not test any hypotheses and do not try to infer any general rules from the data. They simply describe the data we have in front of us. The most basic descriptive statistics are measures of central tendency, such as mean, mode and median, and measures of dispersion, such as variance and standard deviation.

Measure	Calculation	Description
Mean Mode	$\bar{X} = \mu = \frac{\sum x_i}{N}$	the arithmetic mean the most frequently occurring value
Median Variance	$\sigma^2 = \frac{\sum (x_i - \bar{X})^2}{N-1}$	the central value square deviation from mean
Standard Deviation	$\sigma = \sqrt{\frac{\sum (x_i - \bar{X})^2}{N-1}}$	deviation from mean

In R, we can easily obtain these measures:

```
summary(D$age)
```

```
Min. 1st Qu. Median Mean 3rd Qu. Max. 18.00 27.00 39.00 44.03 59.00 93.00
```

This gives us the minimum, maximum, mean and median values of age. If we want particular statistics, we can (at any point, even within other commands) ask R to produce them by issuing the following commands:

```
mean(D$age, na.rm=T)
```

[1] 44.02613

```
median(D$age, na.rm=T)
```

[1] 39

```
var(D$age, na.rm=T)

[1] 376.66

sd(D$age, na.rm=T)

[1] 19.40773

min(D$age, na.rm=T)

[1] 18

max(D$age, na.rm=T)

[1] 93

range(D$age, na.rm=T)
```

The mode of a vector is a little harder to obtain. To get the mode of vector x, you can get it like this:

```
names(sort(-table(D$age)))[1]
[1] "35"
```

This creates a table of the frequencies of each value, multipling by -1 and sorting puts the largest frequency first, and 'names()[1]' extracts the name of the first element, which is the sample mode. You may need to then use 'as.numeric()' on the result if you want a number.

Statistics Summary

There is a useful package for summarizing data, called 'modelsummary'. We can look at all our continuous variables by specifying

library(modelsummary)
datasummary_skim(D)

	Unique (#)	Missing (%)	Mean	SD	Min	Median	Max
dpt	95	0	53.9	26.5	1.0	59.0	95.0
female	3	0	0.5	0.5	0.0	1.0	2.0
age	76	0	44.0	19.4	18.0	39.0	93.0
educ	9	0	5.4	1.9	0.0	6.0	8.0
inc	14	8	7.9	2.6	1.0	8.0	13.0
urban	5	1	1.9	0.9	1.0	2.0	4.0
religion	8	3	4.2	2.8	1.0	4.0	7.0
religiosity	6	49	1.6	1.1	0.0	1.0	4.0
lr	6	5	2.9	1.0	1.0	3.0	5.0
redist	5	3	2.3	1.0	1.0	2.0	4.0
feminism	5	4	2.7	1.1	1.0	3.0	4.0
pro_immig	5	5	2.7	1.1	1.0	3.0	4.0
$adopt_homo$	5	3	2.1	1.0	0.0	2.0	3.0
anti_vax	4	3	0.6	0.9	0.0	0.0	2.0
gilets	4	3	0.8	0.9	0.0	0.0	2.0
$elit_oppose_rur$	5	13	1.4	1.0	0.0	1.0	3.0
sov_eu	5	8	2.5	1.0	1.0	3.0	4.0
str_lead	5	4	0.6	0.8	0.0	0.0	3.0
milit	5	54	0.5	0.8	0.0	0.0	3.0
prvt _LFI	12	5	5.1	3.6	1.0	5.0	11.0
$prvt_PS$	12	6	4.8	2.9	1.0	5.0	11.0
prvt _EELV	12	4	5.6	3.0	1.0	6.0	11.0
$prvt_LREM$	12	6	5.3	3.3	1.0	6.0	11.0
prvt _LR	12	7	4.6	2.9	1.0	5.0	11.0
$prvt_FN$	12	5	3.9	3.6	1.0	1.0	11.0
$prvt_RE$	12	4	2.4	2.7	1.0	1.0	11.0
vote1	7	33	2.9	1.7	1.0	3.0	6.0

Basic plots

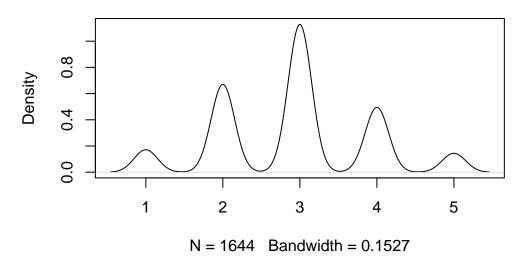
The subsequent step in learning about our data should be the plotting of the data. Mean and variance give us a good idea as to the central tendency and dispersion of a variable, but it is even more interesting to see the frequency distribution across its values. To see a distribution of of a variable we first need to create the distribution density function:

```
den<-density(D$lr, na.rm=T)</pre>
```

Now we can plot d to see the distribution:

plot(den)

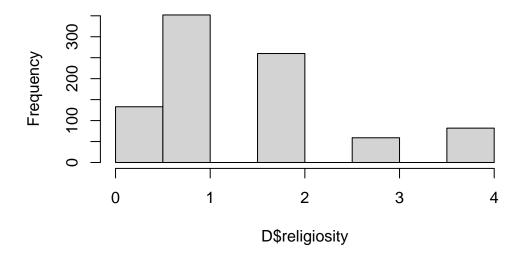
density.default(x = D\$Ir, na.rm = T)



Density functions are, however, only meaningful for continuous data. In the cases of categorical or ordinal data it is more meaningful to look at a histogram. To plot a histogram in R, we simply say:

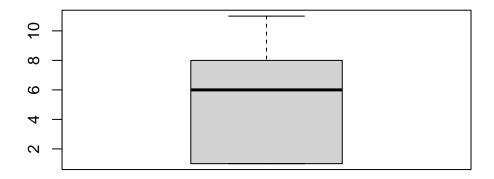
hist(D\$religiosity)

Histogram of D\$religiosity



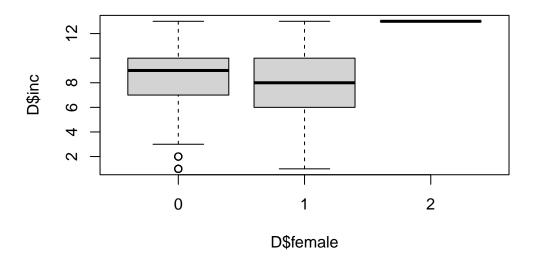
Another useful descriptive tool is a boxplot. A boxplot shows us the median, the quartiles, and the maximum and minimum of a variable. In R, say:





Boxplots are particularly useful for comparing the distributions of certain subsets of a given variable. Say that we are interested in seeing the different income distributions of men and women. We can do this by looking at a boxplot of income by gender:

```
boxplot(D$inc ~ D$female)
```



Nicer plots

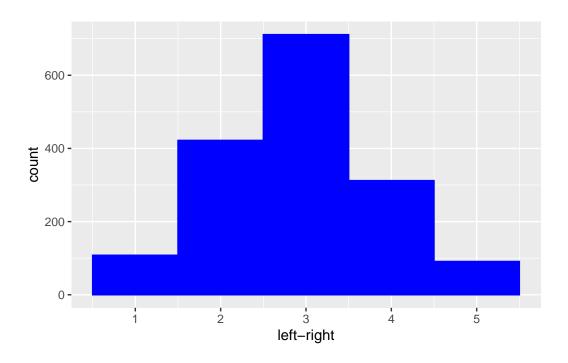
R is famous for being able to create pretty graphics. One of the most commonly used packages for this is 'ggplot2.' Let's see what we can do with it:

```
library(ggplot2) #call up the package
```

Now, let's create some nicer descriptive graphics. Let's look again at the distribution of left-right preferences:

```
ggplot(D,aes(lr)) +
  geom_histogram(binwidth = 1, color="blue", fill="blue")+ #determines type, arguments def
  xlab("left-right") #label x axis
```

Warning: Removed 78 rows containing non-finite values (`stat_bin()`).



Let's consider again income and gender:

```
ggplot(D,aes(y=as.numeric(inc), x=as.factor(female), fill=as.factor(female)))+ #define axe
geom_violin()+ #define violin plot
xlab("Gender")+ylab("Income")+ #label axes
scale_fill_discrete(name="Gender", labels=c("male", "female")) #label fill title and labels
```

Warning: Removed 140 rows containing non-finite values (`stat_ydensity()`).

Warning: Groups with fewer than two data points have been dropped.



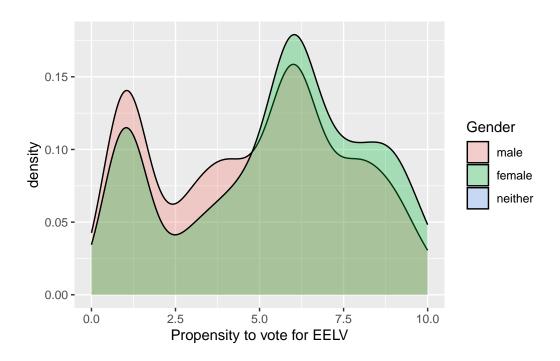
Next, let us look at the propensity of men and women to vote for the Green (EELV) party:

```
ggplot(D,aes(x=prvt_EELV, fill=as.factor(female)))+ #need to specify 'femal' as factor
  geom_density(alpha=0.3)+ #allows transparency, alpha defines level of opacity
  xlim(0,10)+ #defines range of x axis
  xlab("Propensity to vote for EELV")+ #x label
  scale_fill_discrete(name="Gender", labels=c("male", "female", "neither")) #name and label
```

Warning: Removed 176 rows containing non-finite values (`stat_density()`).

Warning: Groups with fewer than two data points have been dropped.

Warning in max(ids, na.rm = TRUE): no non-missing arguments to max; returning -Inf



Note that women are quite more likely to support the Greens.

Tables

Finally, it is very useful to organize our data into a table. A two-way table arranges the values of one variable by the values of another. Such organization is of course only meaningful for categorical or ordinal data, not for continuous variables. Let's make a table summarizing the vote for different candidates by gender (note, we are working with the variable *vote* created in the previous lesson dealing with Operations in R!):

	${\tt Melenchon}$	${\tt Jadot}$	${\tt Macron}$	Peceresse	Le	Pen	Zemmour
0	180	28	149	25		110	39
1	204	42	168	25		145	31
2	1	0	0	0		0	0

This, however, creates a table with raw numbers, which is not very useful. To do this comparison meaningfully, we must compare proportional data. In R we first create a raw table of vote by rich:

```
cand.table<-table(D$female,D$vote)</pre>
```

Now we use the prop.table command to create proportions:

```
prop.table(cand.table) # gives us the proportions by all cells
```

```
prop.table(cand.table,1) #gives us the proportions by rows
```

```
        Melenchon
        Jadot
        Macron
        Peceresse
        Le Pen
        Zemmour

        0 0.467532468
        0.40000000
        0.470031546
        0.500000000
        0.431372549
        0.557142857

        1 0.529870130
        0.600000000
        0.529968454
        0.500000000
        0.568627451
        0.442857143

        2 0.002597403
        0.000000000
        0.000000000
        0.000000000
        0.000000000
        0.000000000
```

In order to test whether there is a difference gender support across parties, we can ask R to provide the χ^2 test:

```
library(MASS) #load the appropriate library
chisq.test(cand.table) #perform the test
```

Warning in chisq.test(cand.table): Chi-squared approximation may be incorrect

Pearson's Chi-squared test

data: cand.table
X-squared = 7.0122, df = 10, p-value = 0.7243

Given the low p-value, we reject the hypothesis that there is no difference between men's and women's party support. Gender seems to map onto party preferences.

A very nice way to create cross-tabulations is to go back to the 'modelsummary' package:

```
library(modelsummary)
datasummary_crosstab(female ~ vote, data = D, statistic = 1 ~ 1 + N + Percent("col"))
```

female		Melenchon	Jadot	Macron	Peceresse	Le Pen	Zemmour	All
0	N	180	28	149	25	110	39	805
	% col	46.8	40.0	47.0	50.0	43.1	55.7	46.7
1	N	204	42	168	25	145	31	916
	% col	53.0	60.0	53.0	50.0	56.9	44.3	53.2
2	N	1	0	0	0	0	0	1
	% col	0.3	0.0	0.0	0.0	0.0	0.0	0.1
All	N	385	70	317	50	255	70	1722
	% col	100.0	100.0	100.0	100.0	100.0	100.0	100.0

This shows the same results as earlier, but in a much nicer format!