## DSCI353-353m-453: Class 11a Tidyverse Review

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#### 7.2.4 Tidyverse Review

library(tidyverse)

## -- Attaching packages ----- tidyverse 1.3.1 --

```
## v ggplot2 3.3.6 v purrr 0.3.5
## v tibble 3.1.7 v dplyr 1.0.10
## v tidyr 1.2.1 v stringr 1.4.1
## v readr 2.1.3
                      v forcats 0.5.2
## -- Conflicts ----- tidyverse_conflicts() --
## x dplyr::filter() masks stats::filter()
## x dplyr::lag() masks stats::lag()
myTib \leftarrow tibble(x = 1:4,
                y = c("london", "beijing", "las vegas", "berlin"))
myTib
7.2.4.1 CREATING TIBBLES WITH tibble() —-
## # A tibble: 4 x 2
##
         х у
##
   <int> <chr>
        1 london
## 1
## 2 2 beijing
## 3 3 las vegas
## 4
       4 berlin
myDf \leftarrow data.frame(x = 1:4,
                   y = c("london", "beijing", "las vegas", "berlin"))
dfToTib <- as_tibble(myDf)</pre>
dfToTib
7.2.4.2 CONVERTING DATA FRAMES TO TIBBLES WITH as_tibble() —-
## # A tibble: 4 x 2
##
        х у
##
   <int> <chr>
## 1
       1 london
## 2
       2 beijing
      3 las vegas
## 3
## 4
       4 berlin
myDf \leftarrow data.frame(x = 1:4,
                   y = c("london", "beijing", "las vegas", "berlin"))
myDfNotFactor <- data.frame(x = 1:4,</pre>
                            y = c("london", "beijing", "las vegas", "berlin"),
                             stringsAsFactors = FALSE)
myTib \leftarrow tibble(x = 1:4,
                y = c("london", "beijing", "las vegas", "berlin"))
class(myDf$y)
```

#### 7.2.4.3 TIBBLES DON'T CONVERT STRINGS TO FACTORS BY DEFAULT —

## 7.2.4.4 IF YOU WANT TO CREATE A FACTOR, WRAP THE c() FUNCTION INSIDE factor() —-

#### 7.2.5 Tidyverse of the starwars dataset of the dplyr package

Starwars characters

- Description
  - This data comes from SWAPI, the Star Wars API, https://swapi.dev/
- Usage
  - starwars
- Format
  - A tibble with 87 rows and 13 variables:

?starwars

```
data(starwars)
glimpse(starwars)
```

#### 7.2.5.1 PRINTING A TIBBLE KEEPS THE OUTPUT CONCISE —

```
<chr> "masculine", "masculine", "masculine", "femini~
## $ gender
## $ homeworld <chr> "Tatooine", "Tatooine", "Naboo", "Tatooine", "Alderaan", "T~
                                  <chr> "Human", "Droid", "Droid", "Human", "Human
                                  <list> <"The Empire Strikes Back", "Revenge of the Sith", "Return~</pre>
## $ films
## $ vehicles
                                  <list> <"Snowspeeder", "Imperial Speeder Bike">, <>, <>, <>, "Imp~
## $ starships <list> <"X-wing", "Imperial shuttle">, <>, <>, "TIE Advanced x1",~
head(as.data.frame(starwars))
                               name height mass hair_color skin_color eye_color birth_year
##
## 1 Luke Skywalker
                                                                                blond
                                                                                                             fair
                                                 172
                                                             77
                                                                                                                                  blue
                                                                                                                                                         19.0
                                                 167
                                                                                                                                                       112.0
## 2
                              C-3P0
                                                             75
                                                                                   <NA>
                                                                                                             gold
                                                                                                                              yellow
## 3
                              R2-D2
                                                  96
                                                             32
                                                                                   <NA> white, blue
                                                                                                                                                         33.0
                                                                                                                                    red
## 4
                Darth Vader
                                                 202 136
                                                                                   none
                                                                                                          white
                                                                                                                             yellow
                                                                                                                                                         41.9
## 5
                Leia Organa
                                                 150
                                                            49
                                                                                                                                                         19.0
                                                                                 brown
                                                                                                          light
                                                                                                                               brown
## 6
                     Owen Lars
                                                 178 120 brown, grey
                                                                                                                                  blue
                                                                                                                                                         52.0
                                                                                                          light
##
                                gender homeworld species
                 sex
## 1
              male masculine Tatooine
                                                                        Human
## 2
             none masculine Tatooine
                                                                        Droid
## 3
              none masculine
                                                       Naboo
                                                                        Droid
## 4
             male masculine Tatooine
                                                                        Human
## 5 female feminine Alderaan
                                                                        Human
               male masculine Tatooine
## 6
                                                                        Human
##
## 1
                                                                                                    The Empire Strikes Back, Revenge of the Sith, Return of
## 2
                                                   The Empire Strikes Back, Attack of the Clones, The Phantom Menace, Revenge of ti
## 3 The Empire Strikes Back, Attack of the Clones, The Phantom Menace, Revenge of the Sith, Return of
                                                                                                                                            The Empire Strikes Back, Revenge of the
## 5
                                                                                                    The Empire Strikes Back, Revenge of the Sith, Return of
## 6
                                                                                                                                                                                              Attack of the
                                                                  vehicles
                                                                                                                     starships
## 1 Snowspeeder, Imperial Speeder Bike X-wing, Imperial shuttle
## 3
## 4
                                                                                                        TIE Advanced x1
## 5
                                      Imperial Speeder Bike
## 6
myDf[, 1]
7.2.5.2 SUBSETTING WITH [ ALWAYS RETURNS ANOTHER TIBBLE —-
## [1] 1 2 3 4
myTib[, 1]
## # A tibble: 4 x 1
##
                   x
           <int>
##
## 1
                   1
                   2
## 2
## 3
                   3
## 4
                   4
myTib[[1]]
```

```
## [1] 1 2 3 4
myTib$x
## [1] 1 2 3 4
sequentialTib \leftarrow tibble(nItems = c(12, 45, 107),
                                                                                             cost = c(0.5, 1.2, 1.8),
                                                                                             totalWorth = nItems * cost)
sequentialTib
7.2.5.3 VARIABLE CREATION IN tibble() IS SEQUENTIAL —-
## # A tibble: 3 x 3
                  nItems cost totalWorth
##
                       <dbl> <dbl>
                                                                                         <dbl>
## 1
                                                      0.5
                                  12
                                                                                                     6
## 2
                                  45
                                                      1.2
                                                                                                54
## 3
                               107
                                                      1.8
                                                                                             193.
7.2.6 EXPLORING THE CO2 DATASET —-
          • Carbon Dioxide Uptake in Grass Plants
                          - Description
                                         * The CO2 data frame has 84 rows and 5 columns of data
                                                      · from an experiment on the cold tolerance
                                                     · of the grass species Echinochloa crus-galli.
data(CO2)
CO2tib <- as_tibble(CO2)
glimpse(CO2tib)
## Rows: 84
## Columns: 5
## $ Plant
                                                         <ord> Qn1, Qn1, Qn1, Qn1, Qn1, Qn1, Qn1, Qn2, Qn2, Qn2, Qn2, Qn2, ~
## $ Type
                                                          <fct> Quebec, 
## $ Treatment <fct> nonchilled, nonchilled, nonchilled, nonchilled, ~
## $ conc
                                                          <dbl> 95, 175, 250, 350, 500, 675, 1000, 95, 175, 250, 350, 500, 6~
                                                          <dbl> 16.0, 30.4, 34.8, 37.2, 35.3, 39.2, 39.7, 13.6, 27.3, 37.1, ~
## $ uptake
selectedData <- select(CO2tib, 1, 2, 3, 5)</pre>
glimpse(selectedData)
7.2.6.1 SELECTING COLUMNS WITH select() —-
## Rows: 84
## Columns: 4
## $ Plant
                                                          <ord> Qn1, Qn1, Qn1, Qn1, Qn1, Qn1, Qn1, Qn2, Qn2, Qn2, Qn2, Qn2, ~
## $ Type
                                                          <fct> Quebec, 
## $ Treatment <fct> nonchilled, nonchilled, nonchilled, nonchilled, ronchilled, ~
```

## \$ uptake

<dbl> 16.0, 30.4, 34.8, 37.2, 35.3, 39.2, 39.7, 13.6, 27.3, 37.1, ~

```
filteredData <- filter(selectedData, uptake > 16)
glimpse(filteredData)
7.2.6.2 FILTERING DATA WITH filter() —-
## Rows: 66
## Columns: 4
## $ Plant
                                <ord> Qn1, Qn1, Qn1, Qn1, Qn1, Qn1, Qn2, Qn2, Qn2, Qn2, Qn2, Qn2, ~
                                <fct> Quebec, 
## $ Type
## $ Treatment <fct> nonchilled, nonchilled, nonchilled, nonchilled, ~
## $ uptake
                                <dbl> 30.4, 34.8, 37.2, 35.3, 39.2, 39.7, 27.3, 37.1, 41.8, 40.6, ~
groupedData <- group_by(filteredData, Plant)</pre>
glimpse(groupedData)
7.2.6.3 GROUPING DATA WITH group_by() —-
## Rows: 66
## Columns: 4
## Groups: Plant [11]
## $ Plant
                                <ord> Qn1, Qn1, Qn1, Qn1, Qn1, Qn1, Qn2, Qn2, Qn2, Qn2, Qn2, Qn2, ~
## $ Type
                                <fct> Quebec, Quebec, Quebec, Quebec, Quebec, Quebec, Quebec, Quebec
## $ Treatment <fct> nonchilled, nonchilled, nonchilled, nonchilled, ~
                                <dbl> 30.4, 34.8, 37.2, 35.3, 39.2, 39.7, 27.3, 37.1, 41.8, 40.6, ~
## $ uptake
summarizedData <- summarize(groupedData, meanUp = mean(uptake),</pre>
                                                             sdUp = sd(uptake))
glimpse(summarizedData)
7.2.6.4 SUMMARIZING DATA WITH summarize() —-
## Rows: 11
## Columns: 3
## $ Plant <ord> Qn1, Qn2, Qn3, Qc1, Qc3, Qc2, Mn3, Mn2, Mn1, Mc3, Mc1
## $ meanUp <dbl> 36.10000, 38.75000, 37.61429, 32.60000, 35.50000, 36.60000, 26.~
## $ sdUp
                      <dbl> 3.4234486, 6.0724789, 10.3499482, 5.0318983, 7.5158499, 5.14470~
mutatedData <- mutate(summarizedData, CV = (sdUp / meanUp) * 100)</pre>
mutatedData
7.2.6.5 CREATING NEW VARIABLES WITH mutate() —-
## # A tibble: 11 x 4
##
            Plant meanUp
                                             sdUp
##
             <ord> <dbl> <dbl> <dbl>
## 1 Qn1
                              36.1 3.42
                                                          9.48
## 2 Qn2
                              38.8 6.07 15.7
## 3 Qn3
                              37.6 10.3
                                                        27.5
```

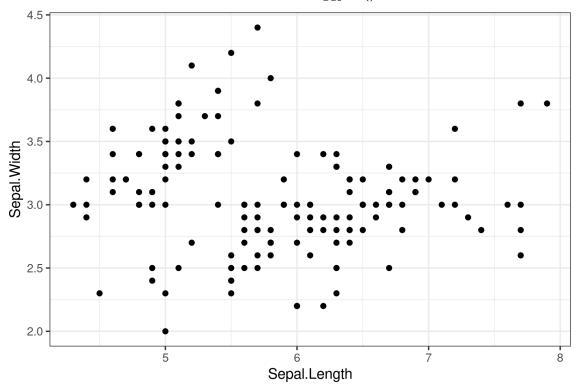
```
## 5 Qc3
             35.5 7.52 21.2
## 6 Qc2
             36.6 5.14 14.1
## 7 Mn3
             26.2 3.49 13.3
             29.9 3.92 13.1
## 8 Mn2
## 9 Mn1
           29.0 5.70 19.6
## 10 Mc3
            18.4 0.826 4.48
## 11 Mc1
          20.1 1.83 9.11
arrangedData <- arrange(mutatedData, CV)</pre>
glimpse(arrangedData)
7.2.6.6 ARRANGING DATA WITH arrange() —-
## Rows: 11
## Columns: 4
## $ Plant <ord> Mc3, Mc1, Qn1, Mn2, Mn3, Qc2, Qc1, Qn2, Mn1, Qc3, Qn3
## $ meanUp <dbl> 18.41667, 20.12000, 36.10000, 29.90000, 26.25000, 36.60000, 32.~
## $ sdUp <dbl> 0.8256311, 1.8335757, 3.4234486, 3.9181628, 3.4852547, 5.144706~
## $ CV
           <dbl> 4.483065, 9.113200, 9.483237, 13.104224, 13.277161, 14.056574, ~
c(1, 4, 7, 3, 5) %>% mean()
7.2.6.7 USING THE \%>\% ("PIPE") OPERATOR —-
## [1] 4
arrangedData <- CO2tib %>%
  select(c(1:3, 5)) %>%
  filter(uptake > 16) %>%
  group_by(Plant) %>%
  summarize(meanUp = mean(uptake), sdUp = sd(uptake)) %>%
 mutate(CV = (sdUp / meanUp) * 100) %>%
  arrange(CV)
glimpse(arrangedData)
7.2.6.8 COMBINING DPLYR VERBS WITH THE %>% OPERATOR —
## Rows: 11
## Columns: 4
## $ Plant <ord> Mc3, Mc1, Qn1, Mn2, Mn3, Qc2, Qc1, Qn2, Mn1, Qc3, Qn3
## $ meanUp <dbl> 18.41667, 20.12000, 36.10000, 29.90000, 26.25000, 36.60000, 32.~
## $ sdUp <dbl> 0.8256311, 1.8335757, 3.4234486, 3.9181628, 3.4852547, 5.144706~
## $ CV
           <dbl> 4.483065, 9.113200, 9.483237, 13.104224, 13.277161, 14.056574, ~
data(iris)
myPlot \leftarrow ggplot(iris, aes(x = Sepal.Length, y = Sepal.Width)) +
 geom_point() +
 theme bw()
```

## 4 Qc1

32.6 5.03 15.4

myPlot

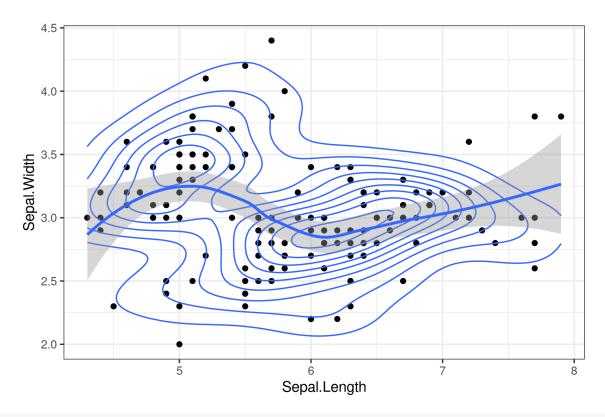
### 7.2.6.9 PLOTTING THE IRIS DATASET WITH ggplot() —-



```
myPlot +
  geom_density_2d() +
  geom_smooth()
```

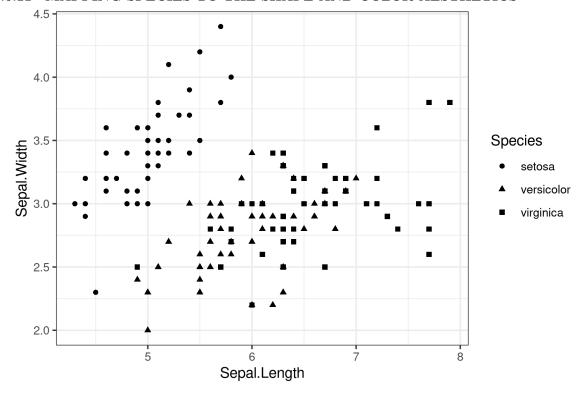
# 7.2.6.10 ADDING ADDITIONAL GEOMETRIC OBJECTS ("GEOMS") AS PLOT LAYERS —-

##  $geom_smooth()$  using method = 'loess' and formula 'y ~ x'



```
ggplot(iris, aes(x = Sepal.Length, y = Sepal.Width, shape = Species)) +
  geom_point() +
  theme_bw()
```

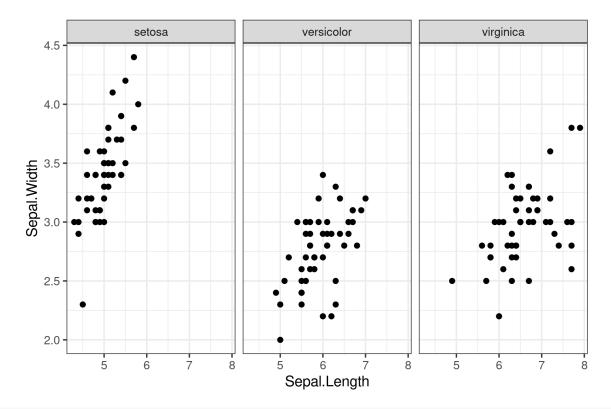
#### 7.2.6.11 MAPPING SPECIES TO THE SHAPE AND COLOR AESTHETICS —



```
ggplot(iris, aes(x = Sepal.Length, y = Sepal.Width, col = Species)) +
  geom_point() +
  theme_bw()
        4.5
        4.0
                                                                                Species
       3.5
     Sepal.Width
                                                                                    setosa
                                                                                    versicolor
       3.0
                                                                                    virginica
        2.5
        2.0
                                     Sepal.Length
ggplot(iris, aes(x = Sepal.Length, y = Sepal.Width)) +
  facet_wrap(~ Species) +
```

#### 7.2.6.12 FACETING BY SPECIES —

geom\_point() +
theme\_bw()



#### 7.2.6.13 CREATING AN UNTIDY TIBBLE —-

```
## Rows: 3
## Columns: 4
## $ Patient <chr> "A", "B", "C"
## $ Month0 <dbl> 21, 17, 29
## $ Month3 <dbl> 20, 21, 27
## $ Month6 <dbl> 21, 22, 23
```

#### 7.2.6.14 CONVERTING UNTIDY DATA TO TIDY FORMAT USING gather()

```
gather(patientData, key = Month, value = BMI, Month0:Month6)
7.2.6.14.1 or the same can be achieved with:
## # A tibble: 9 x 3
##
   Patient Month
                      BMI
##
     <chr> <chr> <dbl>
            Month0
## 1 A
                       21
## 2 B
            Month0
                       17
## 3 C
            Month0
                       29
## 4 A
            Month3
                       20
## 5 B
            Month3
                       21
## 6 C
            Month3
                       27
## 7 A
            Month6
                       21
## 8 B
            Month6
                       22
## 9 C
             Month6
                       23
gather(patientData, key = Month, value = BMI, c(Month0, Month3, Month6))
7.2.6.14.2 or:
## # A tibble: 9 x 3
##
    Patient Month
                      BMI
##
     <chr> <chr> <dbl>
## 1 A
            Month0
                       21
## 2 B
            Month0
                       17
## 3 C
            Month0
                       29
## 4 A
            Month3
                      20
## 5 B
            Month3
                       21
## 6 C
            Month3
                       27
## 7 A
            Month6
                       21
## 8 B
            Month6
                       22
## 9 C
            Month6
                       23
spread(tidyPatientData, key = Month, value = BMI)
7.2.6.15 CONVERTING DATA INTO WIDE FORMAT WITH spread() —-
## # A tibble: 3 x 4
   Patient Month0 Month3 Month6
##
     <chr>
              <dbl> <dbl> <dbl>
## 1 A
                 21
                        20
                               21
## 2 B
                 17
                        21
                               22
## 3 C
                 29
                        27
                               23
a <- 20
pure <- function() {</pre>
  a < -a + 1
  a
```

}

```
side_effect <- function() {</pre>
 a <<- a + 1
}
c(pure(), pure())
7.2.6.16 EXAMPLE OF PURE FUNCTION VS ONE WITH SIDE EFFECTS —
## [1] 21 21
c(side_effect(), side_effect())
## [1] 21 22
listOfNumerics <- list(a = rnorm(5),</pre>
                      b = rnorm(9),
                      c = rnorm(10)
listOfNumerics
7.2.6.17 USING purr FUNCTIONS FOR VECTORIZATION —-
## [1] 0.2336365 0.6387299 -2.4522889 0.7026484 0.8055726
##
## $b
## [1] 1.3834358 2.2914127 -0.5568244 1.1799996 -0.1562491 -1.2957353 1.5716689
## [8] -0.1459925 -0.6674849
##
## $c
## [1] -1.04686734 -0.99372054 -1.31635997 -1.12880287 0.11694195 0.08030374
## [7] 0.81075242 0.40770716 0.34221514 1.41335929
elementLengths <- vector("list", length = 3)</pre>
for (i in seq_along(listOfNumerics)) {
  elementLengths[[i]] <- length(listOfNumerics[[i]])</pre>
elementLengths
## [[1]]
## [1] 5
## [[2]]
## [1] 9
##
## [[3]]
## [1] 10
```

This code is difficult to read,

- requires us to predefine an empty vector
  - to prevent the loop from being slow,
- and has a side effect:

- if we run the loop again,
- it will overwrite the elementLengths list.

Instead, we can replace the for loop with the map() function.

The first argument of all the functions in the map family

• is the data we're iterating over.

The second argument is the function

• we're applying to each list element.

Take a look at figure 2.5, which illustrates how the map() function

- applies a function to every element of a list/vector
- and returns a list containing the outputs.

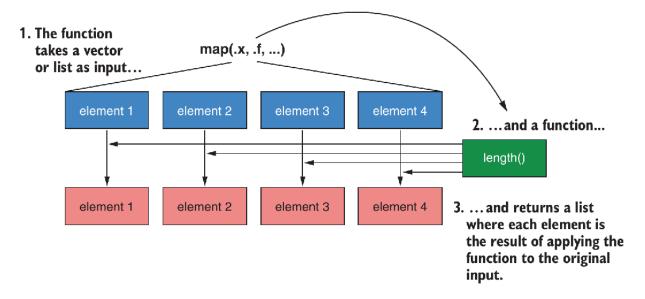


Figure 2.5 The map() function takes a vector or list as input, applies a function to each element individually, and returns a list of the returned values.

Figure 1: map() function

```
map(listOfNumerics, length)

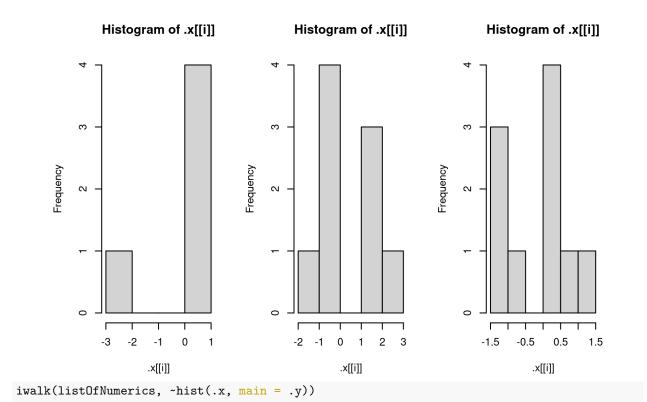
## $a
## [1] 5
##
## $b
## [1] 9
##
## $c
## [1] 10
map_int(listOfNumerics, length)

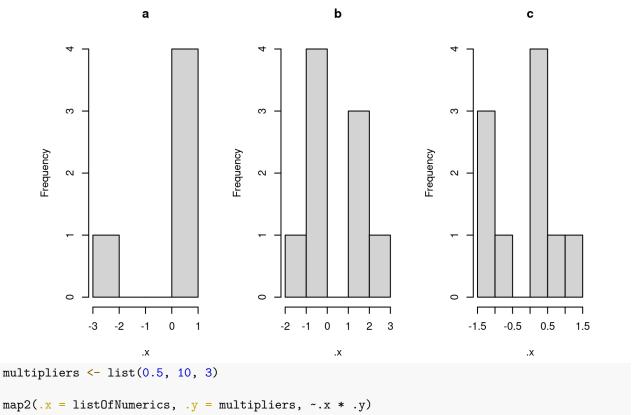
## a b c
## 5 9 10
```

Forcing us to explicitly state the type of output we want to return
 prevents bugs from unexpected types of output.

```
map_df(listOfNumerics, length)
```

```
## # A tibble: 1 x 3
##
             b
        a
##
     <int> <int> <int>
## 1
        5
              9
map(listOfNumerics, ~. + 2)
## $a
## [1] 2.2336365 2.6387299 -0.4522889 2.7026484 2.8055726
##
## $b
## [1] 3.3834358 4.2914127 1.4431756 3.1799996 1.8437509 0.7042647 3.5716689
## [8] 1.8540075 1.3325151
##
## $c
## [1] 0.9531327 1.0062795 0.6836400 0.8711971 2.1169419 2.0803037 2.8107524
## [8] 2.4077072 2.3422151 3.4133593
par(mfrow = c(1, 3))
walk(listOfNumerics, hist)
```





## \$a ## [1] 0.1168182 0.3193650 -1.2261444 0.3513242 0.4027863 ##

```
## $b
##
   [1]
         13.834358
                      22.914127
                                   -5.568244 11.799996 -1.562491 -12.957353 15.716689
         -1.459925
                      -6.674849
##
   [8]
##
##
   $c
##
    [1] -3.1406020 -2.9811616 -3.9490799 -3.3864086
                                                               0.3508258
                                                                            0.2409112
          2.4322573 1.2231215 1.0266454
                                                 4.2400779
arguments \leftarrow expand.grid(n = c(100, 200),
                             mean = c(1, 10),
                             sd = c(1, 10))
arguments
##
        n mean sd
## 1 100
                 1
              1
## 2 200
              1
## 3 100
             10
                 1
## 4 200
             10
                 1
## 5 100
              1 10
## 6 200
              1 10
## 7 100
             10 10
## 8 200
             10 10
par(mfrow = c(2, 4))
pmap(arguments, rnorm) %>%
  iwalk(~hist(.x, main = paste("Element", .y)))
               Element 1
                                        Element 2
                                                                Element 3
                                                                                         Element 4
                                   40
      Frequency
                               Frequency
                                                       Frequency
                                                                                    25
                                   20
                                                                                    10
              -2
                  0
                      2
                                       -2
                                         0
                                            2 4
                                                                8
                                                                   10
                                                                       12
                                                                                        7
                                                                                            9
                                                                                               11
                   .x
                                            .x
                                                                     .x
                                                                                             .x
               Element 5
                                        Element 6
                                                                Element 7
                                                                                         Element 8
                                   40
                                                                                    30
                                                       Frequency
                                                                                Frequency
      Frequency
                               Frequency
                                   20
              -30
                   0
                      20
                                       -30
                                            0
                                               20
                                                               -20
                                                                    0
                                                                       20
                                                                                        -20 0 20 40
                   .x
                                            .X
                                                                     .x
                                                                                             .x
```

#### 7.2.7 Links

[1] Hefin I. Rhys, Machine Learning with R, the tidyverse, and mlr. Shelter Island, New York: Manning Publications, 2020. Available: https://www.manning.com/books/machine-learning-with-r-the-tidyverse-

and-mlr. [Accessed: 20-Oct-2020]