# STA 3100 Programming with Data: Assignment 040 (100 points)

#### Reading the Tidy Data Paper

The purpose of this assignment is to test your reading and understanding of the Tidy Data paper (Wickham 2014), hence forth referred to as "the paper". Since the paper was written, packages such as plyr and reshape2 have been superceded by the tidyverse meta-package, and in particular by the dplyr and tidyr packages, respectively. In this assignment you will answer questions about sections 2 and 3 of the paper and you will reproduce some of the examples using functions from the modern tidyverse package. (If you do this correctly, you will see that the modern tidyverse functions are generally easier to use and understand than the functions and methods used in the R script that accompanies the paper.)

You may find it helpful to consult the vignettes from the tidyr package, but you should think about each question and try to solve it on your own before looking at the vignettes for help. The exercises here will generally require something slightly different from what you will find in the vignettes (and in the paper), so be sure to read the questions carefully.

Note: Throughout this assignment, "data frame" should be taken to be synonymous with "tibble". For the purposes of this assignment, you will be working with tibbles.

### Section 2: Defining Tidy Data

- 1. (4 pts) According to the paper, values in a dataset are organized in two ways: "Every value belongs to a *variable* and an *observation*. What definitions are given for the terms *variable* and *observation*? (Format your solution as a bullet list.)
- A variable contains all values that measure the same underlying attribute (like height, temperature, duration) across units
- An observation contains all values measured on the same unit (like a person, or a day, or a race) across
  attributes.
- 2. (6 pts) List the 3 defining characteristics of tidy data? In tidy data:
- Each variable forms a column.
- Each observation forms a row.
- Each type of observational unit is a table.
- 3. (5 pts) Section 2 of the paper contains an hypothetical example in which there are 3 types of observational unit. Briefly describe the context (in 20 words or less) and then list the 3 types of observational unit in the example.

The hypothetical example in the paper is a trial of a new allergy medication. The three types of observational units listed in the example are:

- Demographic data collected from each person(age, sex, race).
- Medical data collected from each person on each day (number of sneezes, redness of eyes).
- Meteorological data collected on each day (temperate, pollen count).

## Section 3: Tidying Messy Datasets

4. (5 pts) List the five most common problems with messy datasets as given in the paper.

The five most common problems with messy datasets given in the paper are: - Column headers are values, not variable names. - Multiple variables are stored in one column. - Variables are stored in both rows and columns. - Multiple types of observational units are stored in the same table. - A single observational unit is stored in multiple tables.

- 5. The Pew Forum dataset in Table 4 of the paper is included in the tidyr package with the name relig\_income.
  - (a) (5 pts) Which of the five most common problems with messy datasets is/are illustrated by the Pew dataset?

The common problem illustrated in the Pew dataset is that the column headers are values and not variables names.

- (b) (10 pts) Convert 'relig\_income' to a data frame 'pew' in the tidy form illustrated in Table 6 of th
  - Make 'income' an ordered factor by \*first\* replacing "Don't know/refused" with 'NA' and \*then\* Arrange the rows in the data frame in alphabetical order of 'religion' and in ascending order

Display the first 10 rows of 'pew'.

```
library(tidyr)
library(dplyr)
pew <- relig_income %>%
  rename("NA" = "Don't know/refused") %>%
  pivot_longer(!religion, names_to = "income", values_to = "freq") %>%
  arrange(religion)

pew %>% slice_head(n = 10)
```

```
## # A tibble: 10 x 3
##
      religion income
                          freq
##
      <chr>
               <chr>>
                          <dbl>
##
  1 Agnostic <$10k
                             27
  2 Agnostic $10-20k
                             34
## 3 Agnostic $20-30k
                            60
## 4 Agnostic $30-40k
                            81
                            76
## 5 Agnostic $40-50k
## 6 Agnostic $50-75k
                           137
## 7 Agnostic $75-100k
                           122
```

```
## 8 Agnostic $100-150k 109
## 9 Agnostic >150k 84
## 10 Agnostic NA 96
```

- 6. (5 pts) The Billboard dataset in Table 7 of the paper is included in the tidyr package with the name billboard. The billboard dataset does not include the year or the time columns shown in Table 7, so we will not use those columns.
  - (a) (5 pts) Which of the five most common problems with messy datasets is/are illustrated by the Billboard dataset?

(b) (10 pts) Using tidyverse and lubridate commands, create a data frame 'bb' with the tidy form illust

The common problem illustrated by the Billboard dataset is that multiple types of observational units are stored in the same table, column headers are values and not variables, muliple variables are in one column.

```
library(tidyverse)
```

## Warning: package 'stringr' was built under R version 4.2.2

```
## # A tibble: 15 x 5
##
      artist
                   track
                                            date
                                                        week rank
##
      <chr>
                   <chr>
                                            <date>
                                                       <dbl> <dbl>
##
   1 2 Pac
                   Baby Don't Cry (Keep... 2000-02-26
                                                           1
                                                                87
##
   2 2 Pac
                   Baby Don't Cry (Keep... 2000-03-04
                                                                82
                   Baby Don't Cry (Keep... 2000-03-11
##
  3 2 Pac
                                                           3
                                                                72
## 4 2 Pac
                   Baby Don't Cry (Keep... 2000-03-18
                                                           4
                                                                77
## 5 2 Pac
                   Baby Don't Cry (Keep... 2000-03-25
                                                           5
                                                                87
##
  6 2 Pac
                   Baby Don't Cry (Keep... 2000-04-01
                                                                94
                   Baby Don't Cry (Keep... 2000-04-08
  7 2 Pac
                                                           7
                                                                99
##
   8 2Ge+her
                   The Hardest Part Of ... 2000-09-02
                                                           1
                                                                91
## 9 2Ge+her
                   The Hardest Part Of ... 2000-09-09
                                                           2
                                                                87
## 10 2Ge+her
                   The Hardest Part Of ... 2000-09-16
                                                                92
## 11 3 Doors Down Kryptonite
                                           2000-04-08
                                                           1
                                                                81
## 12 3 Doors Down Kryptonite
                                           2000-04-15
                                                           2
                                                                70
## 13 3 Doors Down Kryptonite
                                           2000-04-22
                                                           3
                                                                68
## 14 3 Doors Down Kryptonite
                                           2000-04-29
                                                           4
                                                                67
## 15 3 Doors Down Kryptonite
                                           2000-05-06
                                                           5
                                                                66
```

- 7. A version of tuberculosis (TB) dataset in Table 9 of the paper is included in the tidyr package with the name who. However, the columns of the who dataset are named slightly differently from the columns of Table 9. The meaning of the column names is explained in the R help file for who. The values in the last 56 columns (new\_sp\_m014:newrel\_f65) are case counts.
  - (a) (5 pts) Which of the five most common problems with messy datasets is/are illustrated by the TB dataset?

The problem with the TB dataset is that there are multiple variables stored in one column, and the column headers are values and not variables.

(b) (10 pts) One way in which the 'who' dataset differs from the dataset in Table 9 is that the 'who' d

```
who_countries <- who %>%
  select("country", "iso2", "iso3") %>%
  distinct() %>%
  arrange(country)
who_countries %>% slice_head(n = 6)
## # A tibble: 6 x 3
##
     country
                    iso2 iso3
##
     <chr>>
                    <chr> <chr>
## 1 Afghanistan
                    AF
                          AFG
## 2 Albania
                    AL
                          ALB
## 3 Algeria
                    DΖ
                          DZA
## 4 American Samoa AS
                          ASM
## 5 Andorra
                          AND
                    AD
## 6 Angola
                    ΑO
                          AGO
```

- (c) (10 pts) Using tidyverse functions, create a data frame 'who\_tb' similar to Table 10(b) of the pape
  - the columns are 'iso2', 'year', 'diagnosis' 'sex', 'age', and 'cases' in that order.
    - 'age' should be an ordered factor with levels '0-14', '15-24', '25-34', '35-44', '45-54', '55-6
    - The rows for which 'cases' is missing ('NA') have been removed.
    - The rows are sorted
      - by 'iso2',
      - by 'year' within 'iso2',
      - by 'diagnosis' within 'iso2' and 'year',
      - by 'sex' within 'iso2', 'year', and 'diagnosis', and
      - by 'age' within 'iso2', 'year', 'diagnosis', and 'sex'.

Display the first 15 rows of the 'who\_tb' data frame.

```
who_tb <- who %>%
pivot_longer(cols = new_sp_m014:newrel_f65,
    names_to = c("diagnosis", "sex", "age"),
    names_pattern = "new_?(.*)_(.)(.*)",
    values_to = "cases") %>%
select(-c(country, iso3)) %>%
filter(!is.na(cases))
```

```
num <- "([0-9]{1, })([0-9]{2})"
who_tb$age[which(who_tb$age != "65")] <-
    sub(num, "\\1-\\2", who_tb$age[who_tb$age != "65"])
who_tb$age[which(who_tb$age== "65")] <-
    sub("65", "65\\+", who_tb$age[who_tb$age == "65"])
who_tb$age <- ordered(who_tb$age, levels = c("0-14","15-24","25-34","35-44","45-54","55-64","65+"))
who_tb %>% slice_head(n=15)
```

```
## # A tibble: 15 x 6
##
     iso2
           year diagnosis sex
                                 age
                                       cases
##
     <chr> <int> <chr>
                           <chr> <ord> <int>
## 1 AF
                                 0-14
            1997 sp
                           m
                                          0
## 2 AF
                                 15-24
                                          10
            1997 sp
                           m
## 3 AF
                                 25-34
            1997 sp
                           m
                                          6
## 4 AF
            1997 sp
                           m
                                 35-44
                                           3
## 5 AF
                                 45-54
                                          5
            1997 sp
                           m
## 6 AF
            1997 sp
                                 55-64
                                          2
                           m
## 7 AF
                                 65+
                                          0
            1997 sp
                           m
                                          5
## 8 AF
            1997 sp
                           f
                                 0 - 14
## 9 AF
            1997 sp
                          f
                                 15-24
                                          38
## 10 AF
            1997 sp
                          f
                                 25-34
                                          36
## 11 AF
                           f
            1997 sp
                                 35-44
                                          14
## 12 AF
                           f
                                 45-54
                                          8
            1997 sp
## 13 AF
            1997 sp
                           f
                                 55-64
                                          0
## 14 AF
                           f
            1997 sp
                                 65+
                                          1
## 15 AF
            1998 sp
                                 0 - 14
                                          30
```

- 8. The file weather.csv contains a version of the weather dataset in Table 11 of the paper. In addition to minimum and maxumum temperatures, this version also includes measurements of precipitation (prcp).
  - (a) (5 pts) Which of the five most common problems with messy datasets is/are illustrated by the weather dataset?

The problem with the weather dataset is that variables are stored in both rows and columns.

(b) (15 pts) Read the data into R and convert them to the form seen in Table 12(b) of the paper, execpt

```
mutate(date = make_date(year = weather$year,
                         month =weather$month,
                         day = weather$day),
         .after = id) %>%
 select(-c("year", "month", "day"))
weather <- weather %>%
 pivot wider(names from = element,
             values from = value) %>%
 mutate(tmax = as.character(tmax),
        tmin = as.character(tmin),
        prcp = as.character(prcp)) %>%
 arrange(date)
## Warning: Values from 'value' are not uniquely identified; output will contain list-cols.
## * Use 'values fn = list' to suppress this warning.
## * Use 'values_fn = {summary_fun}' to summarise duplicates.
## * Use the following dplyr code to identify duplicates.
##
    {data} %>%
      dplyr::group_by(id, date, element) %>%
##
##
      dplyr::summarise(n = dplyr::n(), .groups = "drop") %>%
      dplyr::filter(n > 1L)
##
slice_head(weather, n = 10)
## # A tibble: 10 x 5
##
     id
             date
                       tmax tmin prcp
     <chr> <date> <chr> <chr> <chr>
## 1 MX17004 1955-04-01 31
                                    0
                              15
## 2 MX17004 1955-04-02 31
## 3 MX17004 1955-04-03 31
                              16
                                    0
## 4 MX17004 1955-04-04 32
                              15
                                  0
## 5 MX17004 1955-04-05 33
                              16
                                    0
## 6 MX17004 1955-04-06 32
                              16
                                   0
## 7 MX17004 1955-04-07 32
                              16 0
## 8 MX17004 1955-04-08 33
                              16
                                   0
## 9 MX17004 1955-04-09 33
                              16
                                    0
## 10 MX17004 1955-04-10 33
                              17
                                    0
```

#### References

Wickham, Hadley. 2014. "Tidy Data." Journal of Statistical Software 59 (1): 1–23. https://www.jstatsoft.org/index.php/jss/article/view/v059i10.