

Guide 2: Cleaning and Pre-Processing Weather Station Data

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1 Introduction

1.1 Goals

The goal of this guide is to provide a step-by-step process for cleaning and pre-processing weather station data. The data is from the Global Historical Climatology Network (GHCN) Daily dataset. The data is available from the National Oceanic and Atmospheric Administration (NOAA) and is available from the National Centers for Environmental Information (NCEI) at <https://www.ncdc.noaa.gov/data-access/land-based-station-data/land-based-datasets/global-historical-climatol>

1.2 Background

1.2.1 What is GHCN-Daily?

The new dataset is referred to as GHCN-Daily, version 3. The new dataset has a number of improvements over the older dataset, including a more comprehensive and robust quality assurance process. The new dataset also includes more station records and is updated more frequently than the older dataset.

The new dataset is also available in a more user-friendly format, including a set of pre-packaged data files that are available for download from the NCEI website. However, developing instructions to interact with their website is way to time consuming! So, we'll use the R file transfer protocol, via https, to download the data.

In 2011, there was a major update to the daily updates to the GHCN dataset: ??IMMEDIATE – Changes to COOP Daily Form Access. It's a useful history.

1.3 Approach

We need to address several things that might get in the way of our analysis:

1. read station data into R
2. date format (convert to POSIXct, adding month and year as variables)

3. evaluate missing data
4. units conversion
5. outliers
6. Other stuff??

2 Cleaning and Pre-Processing Functions

2.1 Before Starting the Process

Before you begin, make sure you have the stations to read into R. Got to the “Files” tab in RStudio and make sure you see the station csv files in your data folder. If not, please Slack Marc and mentors, so we can troubleshoot the issue!

2.2 R Code with Custom Functions

Run the [Guide2.R](#) code and the functions will be loaded into your environment automatically.

2.3 Function Descriptions and Use

The following functions are used to read the weather stations data into R, clean and pre-process data so we can analyze the data with the next guide.

2.4 Reading csv and Checking dataframe objects

Read all csv files into R The If the data are not in the R environment, you can read them in using the following but you have the uncompressed files, you can read them in using the following function:

```
## function (datafolder)
## {
##   my.stations = read.csv(paste0(datafolder, "my.inventory.csv"))
##   colnames <- c("ID", "DATE", "ELEMENT", "VALUE", "M-FLAG",
##                 "Q-FLAG", "S-FLAG", "OBS-TIME")
##   for (i in 1:nrow(my.stations)) {
##     assign(my.stations$ID[i], read.csv(paste0(datafolder,
##         noquote(my.stations$ID[i]), ".csv"), header = TRUE,
##         col.names = colnames), envir = parent.frame())
##   }
## }
```

Example of how to use the function:

```
datafolder = "/home/mwl04747/RTricks/04_Regional_Climate_Trends/Data/SP24/"
ReadStations2.fun(datafolder)
```

Check the dataframes in the environment You can do this by running the following code:

```
ls()

## [1] "CleanUp.fun"          "ConvertUnits.fun"      "coverage.fun"
## [4] "datafolder"           "fixdates.fun"          "MonthlyAnomalies.fun"
## [7] "MonthlyNormals.fun"   "MonthlyValues.fun"     "QAQC.fun"
## [10] "ReadStations.fun"     "ReadStations2.fun"    "USC00040693"
## [13] "USC00042294"          "USC00043157"          "USC00044412"
## [16] "USW00023271"
```

Check the structure of the dataframes Using `str()`, make sure the datasets look right!

For example:

```
## 'data.frame': 69918 obs. of 8 variables:
## $ ID : chr "USC00044412" "USC00044412" "USC00044412" "USC00044412" ...
## $ DATE : int 18930101 18930102 18930103 18930104 18930105 18930106 18930107 189
## $ ELEMENT : chr "TMAX" "TMAX" "TMAX" "TMAX" ...
## $ VALUE : int 167 189 178 244 217 194 178 161 206 172 ...
## $ M.FLAG : chr "" "" "" "" ...
## $ Q.FLAG : chr "" "" "" "" ...
## $ S.FLAG : chr "6" "6" "6" "6" ...
## $ OBS.TIME: int NA NA NA NA NA NA NA NA NA NA ...
```

2.5 Clean Data

Next we'll “clean” the dataset by fixing the date format and preparing it for the analysis stages.

Function to Fix Dates ## function (station)

```
## {
##   station$Ymd = as.Date(as.character(station$DATE), format = "%Y%m%d")
##   station$MONTH = as.numeric(format(station$Ymd, "%m"))
##   station$YEAR = as.numeric(format(station$Ymd, "%Y"))
##   return(station)
## }
```

Example of how to use the function (Note: the new dataframe name change):

```
USC00042294a <- fixdates.fun(USC00042294)
```

Evaluation Data Coverage We need to know how much data we have for each station. This is important for the next steps in the process.

```
## function (station, element = "TMAX")
## {
##   Dates.all = data.frame(Ymd = seq.Date(from = min(station$Ymd),
##     to = max(station$Ymd), by = "day"))
##   station.full = merge(Dates.all, station, all = TRUE)
##   station.coverage = sum(!is.na(station.full$VALUE[station.full$ELEMENT ==
##     element]))/length(station.full$VALUE[station.full$ELEMENT ==
##     element]) * 100
##   return(round(station.coverage, 2))
## }
```

Example of how to use the function:

```
coverage.fun(USC00042294a)
```

In general, we want something like 95% coverage for the period of record. If you don't have that, please let us know and we'll help you get additional stations with better coverage!

Function to Convert Units According to the NOAA website, the csv.gz files have five core elements include the following units, which we will convert:

PRCP = Precipitation (tenths of mm) → mm

SNOW = Snowfall (mm) → cm

SNWD = Snow depth (mm) → cm

TMAX = Maximum temperature (tenths of degrees C) → degrees C

TMIN = Minimum temperature (tenths of degrees C) → degrees C

```
## function (station)
## {
##   station$VALUE = station$VALUE/10
##   return(station)
## }
```

Example of how to use the function (Note: the new dataframe name change):

```
USC00042294b <- ConvertUnits.fun(USC00042294a)
```

Checking for Outliers NOAA website conducts a very rudimentary data quality check, but every year, we find stations with wacky numbers. Hopefully this function will find them. But if you do have some, let Marc and mentors know so we can figure out how to address them!

Here are some stuff we'll look for:

Extreme Values Plot values with time, is the scale crazy with just a few observations at the extreme?

Sudden Shift ???

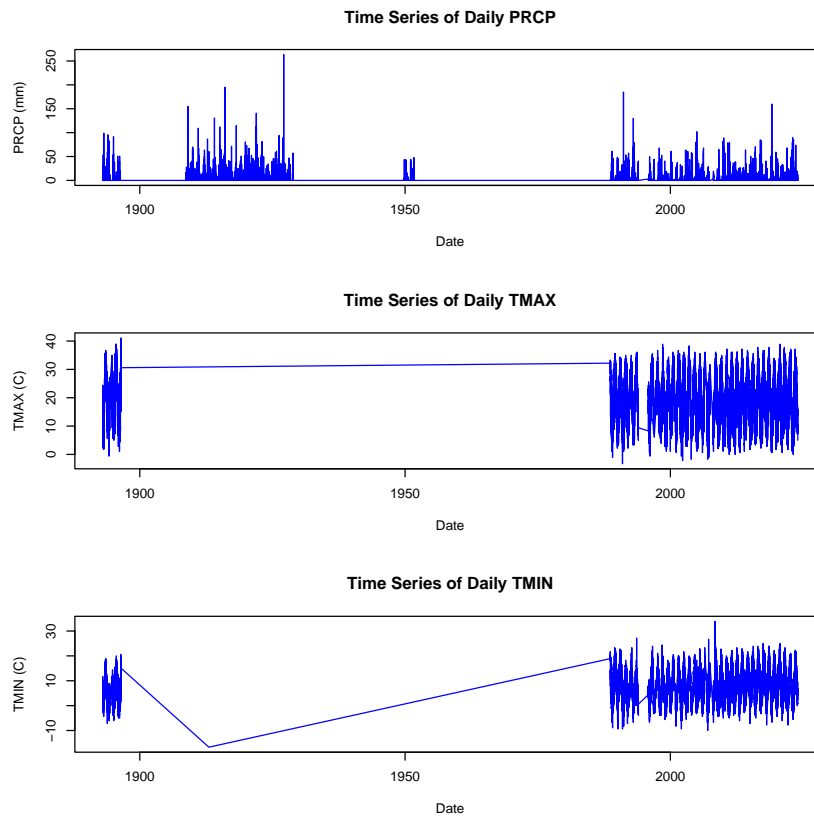
Note QA/QC Flags TBD

Yes, I am still working on this. QA/QC is a big deal and I want to make I can explain it AND make sure the code works.

```
## function (station)
## {
##   par(mfrow = c(3, 1))
##   plot(VALUE ~ Ymd, data = subset(station, subset = ELEMENT ==
##     "PRCP"), type = "l", col = "blue", main = "Time Series of Daily PRCP",
##     xlab = "Date", ylab = "PRCP (mm)")
##   plot(VALUE ~ Ymd, data = subset(station, subset = ELEMENT ==
##     "TMAX"), type = "l", col = "blue", main = "Time Series of Daily TMAX",
##     xlab = "Date", ylab = "TMAX (C)")
##   plot(VALUE ~ Ymd, data = subset(station, subset = ELEMENT ==
##     "TMIN"), type = "l", col = "blue", main = "Time Series of Daily TMIN",
##     xlab = "Date", ylab = "TMIN (C)")
##   station = subset(station, Q.FLAG != "")
##   station = subset(station, M.FLAG != "")
##   station = subset(station, S.FLAG != "")
##   return(station)
## }
```

Example of how to use the function:

```
QAQC.fun(USC00042294b)
```



If you have any hints of data problems, let's sort them out together!

Function to Create Monthly Values and Normals For TMAX and TMIN, we want monthly means, for rainfall, we'll want monthly totals.¹

Here's the function for Monthly Values:

```
## function (x)
## {
##   x.TMAX.monthly = aggregate(VALUE ~ MONTH + YEAR, data = subset(x,
##     ELEMENT == "TMAX"), mean)
##   names(x.TMAX.monthly) <- c("MONTH", "YEAR", "TMAX")
##   x.TMIN.monthly = aggregate(VALUE ~ MONTH + YEAR, data = subset(x,
##     ELEMENT == "TMIN"), mean)
##   names(x.TMIN.monthly) <- c("MONTH", "YEAR", "TMIN")
##   x.PRCP.monthly = aggregate(VALUE ~ MONTH + YEAR, data = subset(x,
```

¹Brody/Evlyn: We need code to exlue months with missing data, these might not be represenative of the month if missing, especially for PRCP!

```
##      ELEMENT == "PRCP"), sum)
##      names(x.PRCP.monthly) <- c("MONTH", "YEAR", "PRCP")
##      return(list(x.TMAX.monthly, x.TMIN.monthly, x.PRCP.monthly))
## }

```

Here's the function for Monthly Normals:

```
## function (x)
## {
##      x.normals = subset(x, Ymd >= "1961-01-01" & Ymd <= "1990-12-31")
##      x.TMAX.normals.monthly = aggregate(VALUE ~ MONTH, data = subset(x.normals,
##      ELEMENT == "TMAX"), mean)
##      names(x.TMAX.normals.monthly) <- c("MONTH", "NORMALS")
##      x.TMIN.normals.monthly = aggregate(VALUE ~ MONTH, data = subset(x.normals,
##      ELEMENT == "TMIN"), mean)
##      names(x.TMIN.normals.monthly) <- c("MONTH", "NORMALS")
##      x.PRCP.normals.month.year = aggregate(VALUE ~ MONTH + YEAR,
##      data = subset(x.normals, ELEMENT == "PRCP"), sum)
##      x.PRCP.normals.monthly = aggregate(VALUE ~ MONTH, data = subset(x.PRCP.normals.month.year,
##      mean)
##      names(x.PRCP.normals.monthly) <- c("MONTH", "NORMALS")
##      return(list(x.TMAX.normals.monthly, x.TMIN.normals.monthly,
##      x.PRCP.normals.monthly))
## }

```

Example of how to use the functions:

```
USC00042294.monthly <- MonthlyValues.fun(USC00042294b)
USC00042294.normals <- MonthlyNormals.fun(USC00042294b)

```

Function to Create Anomalies Here's the function:

```
## function (station.monthly, station.normals)
## {
##      for (i in seq_along(station.monthly)) {
##          TMAX <- merge(station.monthly[[i]], station.normals[[1]],
##          by = "MONTH")
##          TMAX$TMAX.a = TMAX$TMAX - TMAX$NORMALS
##          TMAX$Ymd = as.Date(paste(TMAX$YEAR, TMAX$MONTH, "01",
##          sep = "-"))
##          TMIN <- merge(station.monthly[[i]], station.normals[[2]],
##          by = "MONTH")
##          TMIN$TMIN.a = TMIN$TMIN - TMIN$NORMALS
##          TMIN$Ymd = as.Date(paste(TMIN$YEAR, TMIN$MONTH, "01",

```

```
##         sep = "-"))
##     PRCP <- merge(station.monthly[[3]], station.normals[[3]],
##         by = "MONTH")
##     PRCP$PRCP.a = PRCP$PRCP - PRCP$NORMALS
##     PRCP$Ymd = as.Date(paste(PRCP$YEAR, PRCP$MONTH, "01",
##         sep = "-"))
##     return(list(TMAX = TMAX, TMIN = TMIN, PRCP = PRCP))
## }
## }
```

Example of how to use the function:

```
USC00042294.anomalies <- MonthlyAnomalies.fun(USC00042294.monthly, USC00042294.normals)
```

2.6 Checking on the Results

Getting into the data is a bit tricky. The datasets is a list of dataframes. Each dataframe is a different variable, where 1 is TMAX, 2 is TMIN, and 3 is PRCP.

The get access to each you use the following code:

- `USC00042294.anomalies[[1]]` for TMAX
- `USC00042294.anomalies[[2]]` for TMIN
- `USC00042294.anomalies[[3]]` for PRCP

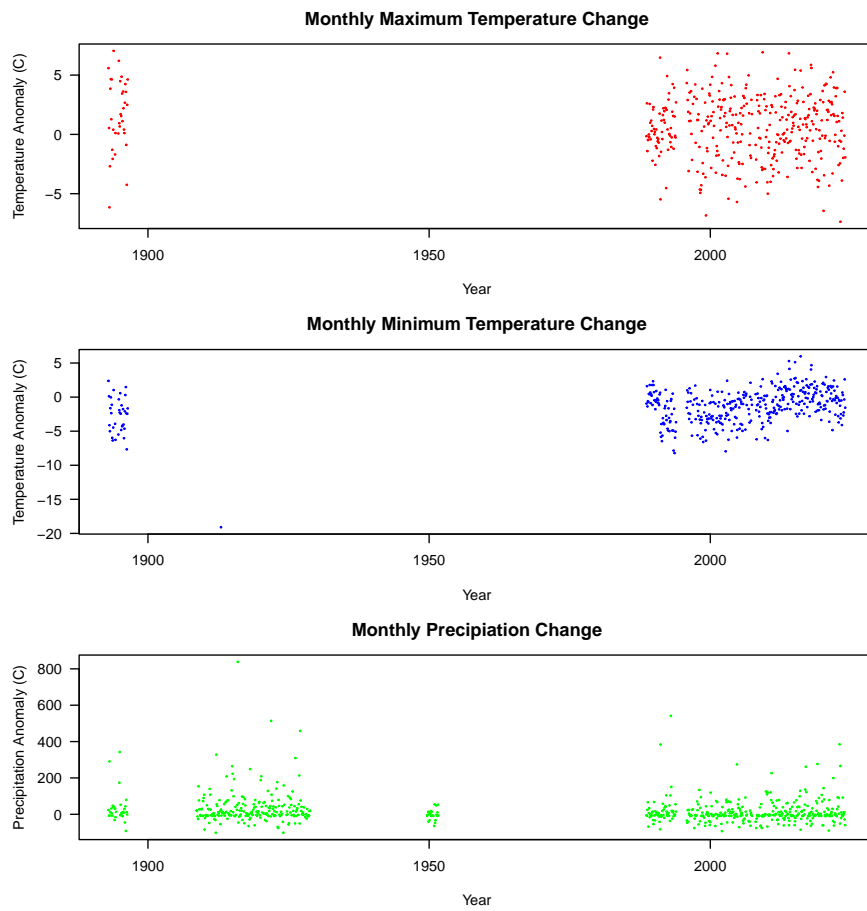
2.7 Clean Up R Environment

I tend to avoid having lots of objects in my R environment. I like to clean up after myself.

Also, I like to move the final products into csv files. Here's the function to do that:

```
CleanUp.fun(datafolder, USC00042294.anomalies, "USC00042294")
```

It's clunky, but not that imporant at this point, so I'll work on it later.



3 Explaining the Code, TBD!

3.1 QA/QC: Troubleshooting

I will be getting all the guides working before working on this! But if there are errors with the custom function, this is where workarounds will be described! Please Slack me and mentors if you have any problems!

3.2 Work Arounds

TBD!

Function is probably sensitive to missing values, need to work on that!

First, I tested each line on station1. I will then create a function to clean the data and apply it to each station.

```
# station1fVALUE = station1fVALUE/10 # Correct Values Units
# Fix Date format
station1$Ymd = as.Date(as.character(station1$DATE), format = "%Y%m%d")
str(station1)

station1$MONTH = as.numeric(format(station1$Ymd, "%m"))
station1$YEAR = as.numeric(format(station1$Ymd, "%Y"))
station1.monthly = aggregate(VALUE ~ MONTH + YEAR,
                             data = subset(station1, ELEMENT == "TMAX"), mean)

# create baseline (normals) dataset
station1.normals = subset(station1,
                          Ymd >= "1961-01-01" & Ymd <= "1990-12-31")
station1.normals.monthly = aggregate(VALUE ~ MONTH,
                                     data = subset(station1.normals, ELEMENT == "TMAX"), mean)
names(station1.normals.monthly) <- c("MONTH", "NORMALS")

station1.anomaly = merge(station1.monthly,
                         station1.normals.monthly, by = "MONTH")
station1.anomaly$ANOMALY =
  station1.anomaly$VALUE - station1.anomaly$NORMALS
```

```
x=station1
cleandataframe.fun <- function(x){
  #x$VALUE = x$VALUE/10
  x$Ymd = as.Date(as.character(x$DATE), format = "%Y%m%d")
  x$MONTH = as.numeric(format(x$Ymd, "%m"))
  x$YEAR = as.numeric(format(x$Ymd, "%Y"))

  x.TMAX.monthly = aggregate(VALUE ~ MONTH + YEAR,
```

```

      data = subset(x, ELEMENT == "TMAX"), mean)
names(x.TMAX.monthly) <- c("MONTH", "YEAR", "TMAX")
x.TMIN.monthly = aggregate(VALUE ~ MONTH + YEAR,
      data = subset(x, ELEMENT == "TMIN"), mean)
names(x.TMIN.monthly) <- c("MONTH", "YEAR", "TMIN")
x.PRCP.monthly = aggregate(VALUE ~ MONTH + YEAR,
      data = subset(x, ELEMENT == "PRCP"), sum)
names(x.PRCP.monthly) <- c("MONTH", "YEAR", "PRCP")

x.normals = subset(x, Ymd >= "1961-01-01" & Ymd <= "1990-12-31")
x.TMAX.normals.monthly = aggregate(VALUE ~ MONTH,
      data = subset(x.normals, ELEMENT == "TMAX"), mean)
names(x.TMAX.normals.monthly) <- c("MONTH", "NORMALS")
x.TMIN.normals.monthly = aggregate(VALUE ~ MONTH,
      data = subset(x.normals, ELEMENT == "TMIN"), mean)
names(x.TMIN.normals.monthly) <- c("MONTH", "NORMALS")
x.PRCP.normals.monthly = aggregate(VALUE ~ MONTH,
      data = subset(x.normals, ELEMENT == "PRCP"), sum)
names(x.PRCP.normals.monthly) <- c("MONTH", "NORMALS")

x.TMAX.anomaly = merge(x.TMAX.monthly, x.TMAX.normals.monthly, by = "MONTH")
x.TMAX.anomaly$TMAX.anomaly = x.TMAX.anomaly$TMAX - x.TMAX.anomaly$NORMALS

x.TMIN.anomaly = merge(x.TMIN.monthly, x.TMIN.normals.monthly, by = "MONTH")
x.TMIN.anomaly$TMIN.anomaly = x.TMIN.anomaly$TMIN - x.TMIN.anomaly$NORMALS

x.PRCP.anomaly = merge(x.PRCP.monthly, x.PRCP.normals.monthly, by = "MONTH")
x.PRCP.anomaly$PRCP.anomaly = x.PRCP.anomaly$PRCP - x.PRCP.anomaly$NORMALS

TEMP <- merge(x.TMAX.anomaly, x.TMIN.anomaly, by = c("MONTH", "YEAR") )
x.anomaly <- merge(TEMP, x.PRCP.anomaly, by = c("MONTH", "YEAR"))[,c(1:3, 5:6, 8:9, 11)]
library(lubridate)
#x.anomaly$Ym1 = as.Date(paste(x.anomaly$YEAR, x.anomaly$MONTH), format="%Y %m")
x.anomaly$Ym1 = lubridate::myd(paste(x.anomaly$MONTH, x.anomaly$YEAR, "1"))
str(x.anomaly)
return(x.anomaly)
}

```

3.3 Apply Function to All Stations

So far, I have only run function for 1 station, but I suspect you can figure out how to run it for each one!

```
station1.clean= cleandataframe.fun(station1)
```

3.4 Plot Anomaly

Graphic has lots of issues. more next time! But here's a start.

```
options(scipen=5)
par(mar=c(4,6,2,5))

plot(ANOMALY ~ YEAR, data = subset(station1.TMAX, MONTH == 1),
     las=1, pch=19, col = "blue", cex=.5, #xlab = "Year",
     ylab = "Maximum Temp Anomaly (C)",
     main="January Maximum Temp Anomaly")
mtext("Maximum Temp Anomaly (C)", side = 2, line = 3)
temp.lm = lm(ANOMALY ~ YEAR, data = subset(station1.TMAX, MONTH == 1))
abline(coef(temp.lm), col = "red")
```

4 QA/QC

4.1 Missing Data

TBD...

5 Next Steps

This is all we need to do so far. Next week, we'll look at different way to visualize the data!

I'll save all the station data into csv files, then use them in the next guide to clean, process, and visualize data.