## **Reproducible Research - Course Project 2**

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**Exploring the U.S. National Oceanic and Atmospheric Administration's (NOAA)** storm database - Health and Economic Impacts

## **Synopsis**

This is a second course project for Reproducible Research course which is part of the Coursera's Data Science Specialization.

Storms and other severe weather events can cause both public health and economic problems for communities and municipalities. Many severe events can result in fatalities, injuries, and property damage, and preventing such outcomes to the extent possible is a key concern.

This project involves exploring the U.S. National Oceanic and Atmospheric Administration's (NOAA) storm database. This database tracks characteristics of major storms and weather events in the United States, including when and where they occur, as well as estimates of any fatalities, injuries, and property damage.

The analysis of the data shows that tornadoes, by far, have the greatest health impact as measured by the number of injuries and fatalities. The analysis also shows that floods cause the greatest economic impact as measured by property damage and crop damage.

## **Data Processing**

## Load Libraries and prepare the R environment

#### Data

The data for this assignment come in the form of a comma-separated-value file compressed via the bzip2 algorithm to reduce its size. You can download the file from the course web site:

storm data[47Mb]

There is also some documentation of the database available. Here you will find how some of the variables are constructed/defined.

National Weather Service Storm Data Documentation

National Climatic Data Center Storm Events FAQ

The events in the database start in the year 1950 and end in November 2011. In the earlier years of the database there are generally fewer events recorded, most likely due to a lack of good records. More recent years should be considered more complete.

## **Assignment**

The basic goal of this assignment is to explore the NOAA Storm Database and answer the following basic questions about severe weather events.

Across the United States, which types of events (as indicated in the EVTYPE variable) are most harmful with respect to population health? Across the United States, which types of events have the greatest economic consequences?

## **Loading the data**

The data was downloaded from the link above and saved on local computer (in setwd command one can replace loacal file path with path of folder where the data was downloaded). Then it was loaded on the R using the read.csv command. If object strom.data is already loaded, use that cached object insted of loading it each time the Rmd file is knitted.

```
if(!exists("storm.data")) {
    storm.data <- read.csv(bzfile("repdata_data_StormData.csv.bz2"),header =
TRUE)
  }</pre>
```

#### **Examine the data set**

```
dim(storm.data)
## [1] 902297
                37
str(storm.data)
## 'data.frame':
                  902297 obs. of 37 variables:
## $ STATE : num 1 1 1 1 1 1 1 1 1 ...
## $ BGN DATE : chr
                     "4/18/1950 0:00:00" "4/18/1950 0:00:00" "2/20/1951
0:00:00" "6/8/1951 0:00:00"
## $ BGN TIME : chr
                     "0130" "0145" "1600" "0900" ...
                     "CST" "CST" "CST" ...
## $ TIME ZONE : chr
## $ COUNTY
            : num
                     97 3 57 89 43 77 9 123 125 57 ...
                     "MOBILE" "BALDWIN" "FAYETTE" "MADISON" ...
## $ COUNTYNAME: chr
                     "AL" "AL" "AL" "AL"
## $ STATE
            : chr
                     "TORNADO" "TORNADO" "TORNADO" ...
## $ EVTYPE
              : chr
## $ BGN RANGE : num
                     0000000000...
                     ... ... ... ...
## $ BGN AZI
              : chr
                     ... ... ... ...
## $ BGN LOCATI: chr
                     ## $ END DATE : chr
                     ... ... ... ...
## $ END TIME : chr
## $ COUNTY END: num
                     00000000000...
## $ COUNTYENDN: logi NA NA NA NA NA NA ...
```

```
## $ END RANGE : num
                    00000000000...
## $ END_AZI : chr
                    ... ... ... ...
## $ END LOCATI: chr
## $ LENGTH : num
                    14 2 0.1 0 0 1.5 1.5 0 3.3 2.3 ...
## $ WIDTH
              : num
                    100 150 123 100 150 177 33 33 100 100 ...
## $ F
                    3 2 2 2 2 2 2 1 3 3 ...
              : int
## $ MAG
             : num
                    00000000000...
## $ FATALITIES: num
                    000000010...
## $ INJURIES : num
                    15 0 2 2 2 6 1 0 14 0 ...
                    25 2.5 25 2.5 2.5 2.5 2.5 2.5 25 25 ...
## $ PROPDMG : num
                    "K" "K" "K" "K" ...
## $ PROPDMGEXP: chr
## $ CROPDMG : num
                    00000000000...
                    ## $ CROPDMGEXP: chr
                    ... ... ... ...
## $ WFO
          : chr
## $ STATEOFFIC: chr
## $ ZONENAMES : chr
## $ LATITUDE : num 3040 3042 3340 3458 3412 ...
## $ LONGITUDE : num
                    8812 8755 8742 8626 8642 ...
## $ LATITUDE E: num
                    3051 0 0 0 0 ...
## $ LONGITUDE_: num
                    8806 0 0 0 0 ...
                    ... ... ... ...
## $ REMARKS : chr
## $ REFNUM : num 1 2 3 4 5 6 7 8 9 10 ...
```

# Extracting variables of interest for analysis of weather impact on health and economy

From a list of variables in storm.data, these are columns of interest:

Health variables: \* FATALITIES: approx. number of deaths \* INJURIES: approx. number of injuries

#### Economic variables:

PROPDMG: approx. property damage PROPDMGEXP: the units for property damage value CROPDMG: approx. crop damages CROPDMGEXP: the units for crop damage value Events - target variable:

EVTYPE: weather event (Tornados, Wind, Snow, Flood, etc..) Extract variables of interest from original data set:

```
vars <- c( "EVTYPE", "FATALITIES", "INJURIES", "PROPDMG", "PROPDMGEXP",
"CROPDMG", "CROPDMGEXP")
mydata <- storm.data[, vars]

tail(mydata)

## EVTYPE FATALITIES INJURIES PROPDMG PROPDMGEXP CROPDMG
CROPDMGEXP
## 902292 WINTER WEATHER 0 0 0 K 0
K</pre>
```

## 902293 K	HIGH WIND	0	0	0	K	0	
## 902294 K	HIGH WIND	0	0	0	K	0	
## 902295 K	HIGH WIND	0	0	0	K	0	
## 902296 K	BLIZZARD	0	0	0	K	0	
## 902297 K	HEAVY SNOW	0	0	0	К	0	

## **Checking for missing values**

Check for missing values in health variables - there is no NA's in the data.

```
sum(is.na(mydata$FATALITIES))
## [1] 0
sum(is.na(mydata$INJURIES))
## [1] 0
```

Check for missing values in economic variables for "size" of damage - there is no NA's in the data

```
sum(is.na(mydata$PROPDMG))
## [1] 0
sum(is.na(mydata$CROPDMG))
## [1] 0
```

Check for missing values in economic variables for units damage - there is no NA's in the data.

```
sum(is.na(mydata$PROPDMGEXP))
## [1] 0
sum(is.na(mydata$CROPDMGEXP))
## [1] 0
```

## **Transforming extracted variables**

```
sort(table(mydata$EVTYPE), decreasing = TRUE)[1:10]
##
## HAIL TSTM WIND THUNDERSTORM WIND
TORNADO
## 288661 219940 82563
60652
```

```
##
          FLASH FLOOD
                                     FLOOD THUNDERSTORM WINDS
                                                                          HIGH
WIND
                 54277
##
                                     25326
                                                          20843
20212
##
             LIGHTNING
                                HEAVY SNOW
##
                                     15708
                 15754
# create a new variable EVENT to transform variable EVTYPE in groups
mydata$EVENT <- "OTHER"
# group by keyword in EVTYPE
mydata$EVENT[grep("HAIL", mydata$EVTYPE, ignore.case = TRUE)] <- "HAIL"</pre>
mydata$EVENT[grep("HEAT", mydata$EVTYPE, ignore.case = TRUE)] <- "HEAT"</pre>
mydata$EVENT[grep("FLOOD", mydata$EVTYPE, ignore.case = TRUE)] <- "FLOOD"</pre>
mydata$EVENT[grep("WIND", mydata$EVTYPE, ignore.case = TRUE)] <- "WIND"</pre>
mydata$EVENT[grep("STORM", mydata$EVTYPE, ignore.case = TRUE)] <- "STORM"</pre>
mydata$EVENT[grep("SNOW", mydata$EVTYPE, ignore.case = TRUE)] <- "SNOW"</pre>
mydata$EVENT[grep("TORNADO", mydata$EVTYPE, ignore.case = TRUE)] <- "TORNADO"</pre>
mydata$EVENT[grep("WINTER", mydata$EVTYPE, ignore.case = TRUE)] <- "WINTER"</pre>
mydata$EVENT[grep("RAIN", mydata$EVTYPE, ignore.case = TRUE)] <- "RAIN"</pre>
# listing the transformed event types
sort(table(mydata$EVENT), decreasing = TRUE)
##
##
                      STORM
                               FLOOD TORNADO
                                                OTHER
      HAIL
               WIND
                                                       WINTER
                                                                  SNOW
                                                                           RAIN
HEAT
## 289270 255362 113156
                               82686
                                       60700
                                                48970
                                                         19604
                                                                 17660
                                                                          12241
2648
sort(table(mydata$PROPDMGEXP), decreasing = TRUE)[1:10]
##
##
                                      В
                                              5
                                                             2
                                                                     ?
                Κ
                       Μ
                               0
                                                     1
                                                                            m
                                             28
                                                    25
                                                                    8
                                                                            7
## 465934 424665 11330
                             216
                                     40
                                                            13
sort(table(mydata$CROPDMGEXP), decreasing = TRUE)[1:10]
##
##
                Κ
                       Μ
                               k
                                      0
                                              В
                                                     ?
                                                             2
                                                                    m
                                                                         <NA>
## 618413 281832
                    1994
                              21
                                     19
                                              9
                                                     7
                                                             1
                                                                    1
mydata$PROPDMGEXP <- as.character(mydata$PROPDMGEXP)</pre>
mydata$PROPDMGEXP[is.na(mydata$PROPDMGEXP)] <- 0 # NA's considered as dollars
mydata$PROPDMGEXP[!grep1("K|M|B", mydata$PROPDMGEXP, ignore.case = TRUE)] <-</pre>
0 # everything exept K,M,B is dollar
mydata$PROPDMGEXP[grep("K", mydata$PROPDMGEXP, ignore.case = TRUE)] <- "3"</pre>
mydata$PROPDMGEXP[grep("M", mydata$PROPDMGEXP, ignore.case = TRUE)] <- "6"</pre>
mydata$PROPDMGEXP[grep("B", mydata$PROPDMGEXP, ignore.case = TRUE)] <- "9"</pre>
mydata$PROPDMGEXP <- as.numeric(as.character(mydata$PROPDMGEXP))</pre>
mydata$property.damage <- mydata$PROPDMG * 10^mydata$PROPDMGEXP</pre>
mydata$CROPDMGEXP <- as.character(mydata$CROPDMGEXP)</pre>
```

```
mydata$CROPDMGEXP[is.na(mydata$CROPDMGEXP)] <- 0 # NA's considered as dollars
mydata$CROPDMGEXP[!grep1("K|M|B", mydata$CROPDMGEXP, ignore.case = TRUE)] <-</pre>
0 # everything exept K,M,B is dollar
mydata$CROPDMGEXP[grep("K", mydata$CROPDMGEXP, ignore.case = TRUE)] <- "3"</pre>
mydata$CROPDMGEXP[grep("M", mydata$CROPDMGEXP, ignore.case = TRUE)] <- "6"</pre>
mydata$CROPDMGEXP[grep("B", mydata$CROPDMGEXP, ignore.case = TRUE)] <- "9"</pre>
mydata$CROPDMGEXP <- as.numeric(as.character(mydata$CROPDMGEXP))</pre>
mydata$crop.damage <- mydata$CROPDMG * 10^mydata$CROPDMGEXP</pre>
sort(table(mydata$property.damage), decreasing = TRUE)[1:10]
##
##
        0
            5000
                   10000
                           1000
                                   2000
                                         25000
                                                50000
                                                         3000
                                                                       15000
                                                               20000
                          17544
## 663123
          31731
                  21787
                                 17186
                                         17104
                                                13596
                                                        10364
                                                                9179
                                                                        8617
sort(table(mydata$crop.damage), decreasing = TRUE)[1:10]
##
##
        0
            5000
                   10000
                          50000
                                 1e+05
                                          1000
                                                 2000
                                                        25000
                                                               20000
                                                                       5e+05
## 880198
            4097
                    2349
                           1984
                                   1233
                                           956
                                                  951
                                                          830
                                                                  758
                                                                         721
```

### **Analysis**

### Aggregating events for public health variables

```
# aggregate FATALITIES and INJURIES by type of EVENT
agg.fatalites.and.injuries <- ddply(mydata, .(EVENT), summarize, Total =
sum(FATALITIES + INJURIES, na.rm = TRUE))
agg.fatalites.and.injuries$type <- "fatalities and injuries"</pre>
# aggregate FATALITIES by type of EVENT
agg.fatalities <- ddply(mydata, .(EVENT), summarize, Total = sum(FATALITIES,
na.rm = TRUE)
agg.fatalities$type <- "fatalities"</pre>
# aggregate INJURIES by type of EVENT
agg.injuries <- ddply(mydata, .(EVENT), summarize, Total = sum(INJURIES,
na.rm = TRUE)
agg.injuries$type <- "injuries"</pre>
# combine all
agg.health <- rbind(agg.fatalities, agg.injuries)</pre>
health.by.event <- join (agg.fatalities, agg.injuries, by="EVENT",
type="inner")
health.by.event
##
        EVENT Total
                          type Total
## 1
               1524 fatalities 8602 injuries
        FLOOD
## 2
         HAIL
                 15 fatalities
                                1371 injuries
## 3
         HEAT 3138 fatalities 9224 injuries
```

```
## 4
       OTHER 2626 fatalities 12224 injuries
## 5
        RAIN 114 fatalities 305 injuries
        SNOW
               164 fatalities 1164 injuries
## 6
## 7
       STORM
              416 fatalities 5339 injuries
## 8 TORNADO 5661 fatalities 91407 injuries
              1209 fatalities 9001 injuries
## 9
        WIND
## 10 WINTER
               278 fatalities 1891 injuries
```

### Aggregating events for economic variables

```
# aggregate PropDamage and CropDamage by type of EVENT
agg.propdmg.and.cropdmg <- ddply(mydata, .(EVENT), summarize, Total =
sum(property.damage + crop.damage, na.rm = TRUE))
agg.propdmg.and.cropdmg$type <- "property and crop damage"
# aggregate PropDamage by type of EVENT
agg.prop <- ddply(mydata, .(EVENT), summarize, Total = sum(property.damage,
na.rm = TRUE)
agg.prop$type <- "property"</pre>
# aggregate INJURIES by type of EVENT
agg.crop <- ddply(mydata, .(EVENT), summarize, Total = sum(crop.damage, na.rm
= TRUE))
agg.crop$type <- "crop"</pre>
# combine all
agg.economic <- rbind(agg.prop, agg.crop)</pre>
economic.by.event <- join (agg.prop, agg.crop, by="EVENT", type="inner")
economic.by.event
##
        EVENT
                     Total
                               type
                                          Total type
## 1
        FLOOD 167502193929 property 12266906100 crop
## 2
               15733043048 property 3046837473 crop
         HAIL
## 3
         HEAT
                  20325750 property
                                      904469280 crop
        OTHER 97246712337 property 23588880870 crop
## 4
## 5
         RAIN
               3270230192 property 919315800 crop
## 6
         SNOW
               1024169752 property 134683100 crop
               66304415393 property 6374474888 crop
        STORM
## 7
## 8
     TORNADO
               58593098029 property 417461520 crop
              10847166618 property 1403719150 crop
## 9
         WIND
## 10 WINTER 6777295251 property 47444000 crop
```

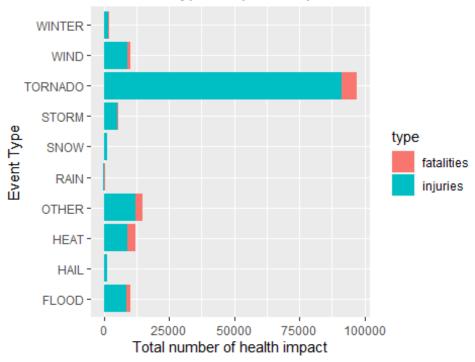
#### **Results**

# Across the United States, which types of events are most harmful with respect to population health?

```
# transform EVENT to factor variable for health variables
agg.health$EVENT <- as.factor(agg.health$EVENT)

# plot FATALITIES and INJURIES by EVENT
health.plot <- ggplot(agg.health, aes(x = EVENT, y = Total, fill = type)) +
geom_bar(stat = "identity") +
    coord_flip() +
    xlab("Event Type") +
    ylab("Total number of health impact") +
    ggtitle("Weather event types impact on public health") +
    theme(plot.title = element_text(hjust = 0.5))
print(health.plot)</pre>
```

### Weather event types impact on public health



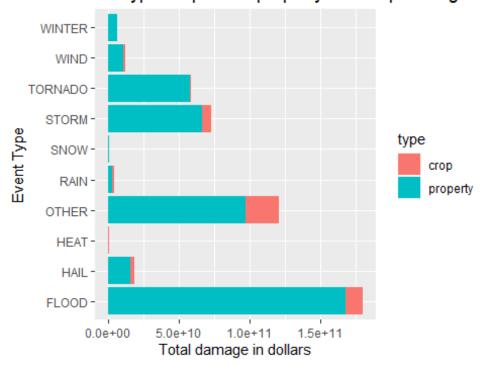
The most harmful weather event for health (in number of total fatalites and injuries) is, by far, a tornado.

# Across the United States, which types of events have the greatest economic consequences?

```
# # transform EVENT to factor variable for economic variables
agg.economic$EVENT <- as.factor(agg.economic$EVENT)</pre>
```

```
# plot PROPERTY damage and CROP damage by EVENT
economic.plot <- ggplot(agg.economic, aes(x = EVENT, y = Total, fill = type))
+ geom_bar(stat = "identity") +
    coord_flip() +
    xlab("Event Type") +
    ylab("Total damage in dollars") +
    ggtitle("Weather event types impact on property and crop damage") +
    theme(plot.title = element_text(hjust = 0.5))
print(economic.plot)</pre>
```

## Weather event types impact on property and crop damage



The most devastating weather event with the greatest economic cosequences (to property and crops) is a flood.