# Reproducible Research Assessment 2: Impact of severe weather events on US population health and economy

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# **Synopsis**

Aim: The overarching aim of this report is to understand the impact of severe weather events on the US population health and economy.

Data source: Findings from this report is based on the NOAA Storm Database (period: 1950 to 2011)

## **Settings**

```
#Make code visible, set working directory and read library
echo = TRUE
setwd("~/RepData_PeerAssessment2")
library(ggplot2)
library(plyr)
library(utils)
require(gridExtra)
```

## **Data exploration**

## Loading required package: grid

## Loading required package: gridExtra

```
data <- read.csv(file="data/StormData.csv", header=T, sep=",", quote="", as.is=TRUE)
summary(data)</pre>
```

```
##
    X.STATE__.
                      X.BGN_DATE.
                                         X.BGN_TIME.
   Length: 1773320
                      Length: 1773320
                                         Length: 1773320
##
   Class :character
                      Class :character
                                         Class : character
##
   Mode :character Mode :character
                                         Mode :character
   X.TIME ZONE.
##
                      X.COUNTY.
                                         X.COUNTYNAME.
##
   Length: 1773320
                     Length: 1773320
                                         Length: 1773320
   Class :character
##
                     Class :character
                                         Class : character
##
   Mode :character
                      Mode :character
                                         Mode :character
##
     X.STATE.
                       X.EVTYPE.
                                         X.BGN RANGE.
```

##	Length:1773320	Length:1773320	Length: 1773320
##	Class :character	Class :character	Class :character
##	Mode :character	Mode :character	Mode :character
##	X.BGN AZI.	X.BGN_LOCATI.	X.END DATE.
##	Length: 1773320	_ Length:1773320	Length:1773320
##	Class :character	-	Class :character
##	Mode :character	Mode :character	Mode :character
##	X.END TIME.	X.COUNTY END.	X.COUNTYENDN.
##	- Length:1773320	Length:1773320	Length:1773320
##	Class :character	Class :character	Class :character
##	Mode :character	Mode :character	Mode :character
##	X.END_RANGE.	X.END_AZI.	X.END_LOCATI.
##	Length: 1773320	Length:1773320	Length:1773320
##	Class :character	Class :character	Class :character
##	Mode :character	Mode :character	Mode :character
##	X.LENGTH.	X.WIDTH.	X.F.
##	Length:1773320	Length:1773320	Length: 1773320
##	Class :character	Class :character	Class :character
##	Mode :character	Mode :character	Mode :character
##	X.MAG.	X.FATALITIES.	X.INJURIES.
##	Length:1773320	Length:1773320	Length:1773320
##	Class :character	Class :character	Class :character
##	Mode :character	Mode :character	Mode :character
##	X.PROPDMG.	X.PROPDMGEXP.	X.CROPDMG.
##	X.PROPDMG. Length:1773320		
		Length:1773320	Length:1773320
##	Length: 1773320	Length:1773320	Length:1773320
##	Length:1773320 Class:character	Length:1773320 Class:character	Length:1773320 Class :character
## ## ##	Length:1773320 Class:character Mode:character	Length:1773320 Class:character Mode:character X.WFO.	Length:1773320 Class:character Mode:character X.STATEOFFIC.
## ## ## ##	Length:1773320 Class:character Mode:character X.CROPDMGEXP.	Length:1773320 Class:character Mode:character X.WFO. Length:1773320	Length:1773320 Class:character Mode:character X.STATEOFFIC. Length:1773320
## ## ## ##	Length:1773320 Class:character Mode:character X.CROPDMGEXP. Length:1773320	Length:1773320 Class:character Mode:character X.WFO. Length:1773320	Length:1773320 Class:character Mode:character X.STATEOFFIC. Length:1773320
## ## ## ## ##	Length:1773320 Class:character Mode:character X.CROPDMGEXP. Length:1773320 Class:character	Length:1773320 Class:character Mode:character X.WFO. Length:1773320 Class:character	Length:1773320 Class:character Mode:character X.STATEOFFIC. Length:1773320 Class:character
## ## ## ## ## ##	Length:1773320 Class:character Mode:character X.CROPDMGEXP. Length:1773320 Class:character Mode:character	Length:1773320 Class :character Mode :character X.WFO. Length:1773320 Class :character Mode :character X.LATITUDE.	Length:1773320 Class:character Mode:character X.STATEOFFIC. Length:1773320 Class:character Mode:character X.LONGITUDE.
## ## ## ## ## ##	Length:1773320 Class:character Mode:character X.CROPDMGEXP. Length:1773320 Class:character Mode:character X.ZONENAMES.	Length:1773320 Class :character Mode :character X.WFO. Length:1773320 Class :character Mode :character X.LATITUDE. Length:1773320	Length:1773320 Class:character Mode:character X.STATEOFFIC. Length:1773320 Class:character Mode:character X.LONGITUDE.
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## ## ## ## ## ## ##	Length:1773320 Class:character Mode:character X.CROPDMGEXP. Length:1773320 Class:character Mode:character X.ZONENAMES. Length:1773320 Class:character	Length:1773320 Class:character Mode:character X.WFO. Length:1773320 Class:character Mode:character X.LATITUDE. Length:1773320 Class:character	Length:1773320 Class:character Mode:character X.STATEOFFIC. Length:1773320 Class:character Mode:character X.LONGITUDE. Length:1773320 Class:character
## ## ## ## ## ## ##	Length:1773320 Class:character Mode:character X.CROPDMGEXP. Length:1773320 Class:character Mode:character X.ZONENAMES. Length:1773320 Class:character Mode:character	Length:1773320 Class:character Mode:character X.WFO. Length:1773320 Class:character Mode:character X.LATITUDE. Length:1773320 Class:character Mode:character	Length:1773320 Class:character Mode:character X.STATEOFFIC. Length:1773320 Class:character Mode:character X.LONGITUDE. Length:1773320 Class:character Mode:character
## ## ## ## ## ## ## ##	Length:1773320 Class:character Mode:character X.CROPDMGEXP. Length:1773320 Class:character Mode:character X.ZONENAMES. Length:1773320 Class:character Mode:character Mode:character	Length:1773320 Class:character Mode:character X.WFO. Length:1773320 Class:character Mode:character X.LATITUDE. Length:1773320 Class:character Mode:character Mode:character Length:1773320 Class:character Length:1773320	Length:1773320 Class:character Mode:character X.STATEOFFIC. Length:1773320 Class:character Mode:character X.LONGITUDE. Length:1773320 Class:character Mode:character Mode:character
## ## ## ## ## ## ## ## ##	Length:1773320 Class:character Mode:character X.CROPDMGEXP. Length:1773320 Class:character Mode:character X.ZONENAMES. Length:1773320 Class:character Mode:character Mode:character Length:1773320 Class:character Length:1773320	Length:1773320 Class:character Mode:character X.WFO. Length:1773320 Class:character Mode:character X.LATITUDE. Length:1773320 Class:character Mode:character Mode:character Length:1773320 Class:character Length:1773320	Length:1773320 Class:character Mode:character X.STATEOFFIC. Length:1773320 Class:character Mode:character X.LONGITUDE. Length:1773320 Class:character Mode:character X.REMARKS. Length:1773320
## ## ## ## ## ## ## ## ## ## ## ## ##	Length:1773320 Class:character Mode:character X.CROPDMGEXP. Length:1773320 Class:character Mode:character X.ZONENAMES. Length:1773320 Class:character Mode:character X.LATITUDE_E. Length:1773320 Class:character	Length:1773320 Class:character Mode:character X.WFO. Length:1773320 Class:character Mode:character X.LATITUDE. Length:1773320 Class:character Mode:character X.LONGITUDE Length:1773320 Class:character	Length:1773320 Class:character Mode:character X.STATEOFFIC. Length:1773320 Class:character Mode:character X.LONGITUDE. Length:1773320 Class:character Mode:character X.REMARKS. Length:1773320 Class:character
## ## ## ## ## ## ## ## ## ## ## ## ##	Length:1773320 Class:character Mode:character X.CROPDMGEXP. Length:1773320 Class:character Mode:character X.ZONENAMES. Length:1773320 Class:character Mode:character X.LATITUDE_E. Length:1773320 Class:character Mode:character X.LATITUDE_E. Length:1773320 Class:character Mode:character	Length:1773320 Class:character Mode:character X.WFO. Length:1773320 Class:character Mode:character X.LATITUDE. Length:1773320 Class:character Mode:character X.LONGITUDE Length:1773320 Class:character	Length:1773320 Class:character Mode:character X.STATEOFFIC. Length:1773320 Class:character Mode:character X.LONGITUDE. Length:1773320 Class:character Mode:character X.REMARKS. Length:1773320 Class:character
######################################	Length:1773320 Class:character Mode:character X.CROPDMGEXP. Length:1773320 Class:character Mode:character X.ZONENAMES. Length:1773320 Class:character Mode:character X.LATITUDE_E. Length:1773320 Class:character X.LATITUDE_E. Length:1773320 Class:character X.REFNUM.	Length:1773320 Class:character Mode:character X.WFO. Length:1773320 Class:character Mode:character X.LATITUDE. Length:1773320 Class:character Mode:character X.LONGITUDE Length:1773320 Class:character	Length:1773320 Class:character Mode:character X.STATEOFFIC. Length:1773320 Class:character Mode:character X.LONGITUDE. Length:1773320 Class:character Mode:character X.REMARKS. Length:1773320 Class:character

```
if (!"StormData" %in% ls()) {
    Data <- read.csv("data/StormData.csv", sep = ",")
}
dim(Data)</pre>
```

```
## [1] 902297 37
```

```
head(Data, n = 2)
```

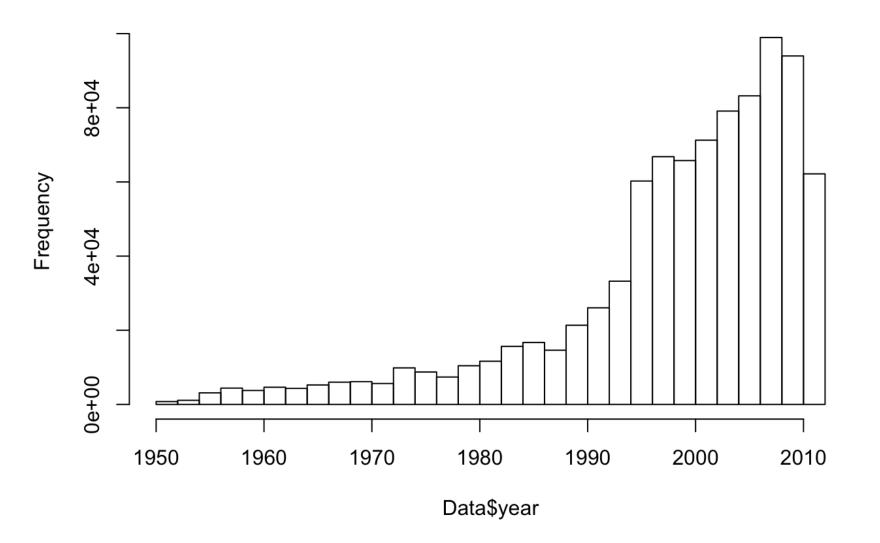
```
##
                       BGN DATE BGN TIME TIME ZONE COUNTY COUNTYNAME STATE
           1 4/18/1950 0:00:00
                                     0130
                                                         97
## 1
                                                 CST
                                                                 MOBILE
           1 4/18/1950 0:00:00
## 2
                                     0145
                                                 CST
                                                          3
                                                                BALDWIN
                                                                           AL
      EVTYPE BGN RANGE BGN AZI BGN LOCATI END DATE END TIME COUNTY END
## 1 TORNADO
                                                                         0
## 2 TORNADO
     COUNTYENDN END RANGE END AZI END LOCATI LENGTH WIDTH F MAG FATALITIES
                         0
             NA
                                                    14
                                                         100 3
                                                                  0
## 1
                                                                              0
                                                     2
                                                         150 2
## 2
             NA
                         0
                                                                  0
                                                                              0
     INJURIES PROPDMG PROPDMGEXP CROPDMG CROPDMGEXP WFO STATEOFFIC ZONENAMES
                  25.0
## 1
                                 K
## 2
                   2.5
                                         0
            0
                                 K
     LATITUDE LONGITUDE LATITUDE_E LONGITUDE_ REMARKS REFNUM
##
         3040
                                3051
                                           8806
## 1
                    8812
                                                               1
                                                               2
## 2
         3042
                    8755
                                   0
                                               0
```

The total number of rows and columns are 902297 and 37 respectively.

The events started from 1950 and end in 2011. There were few recorded events in the earlier years due to the lack of good records. While the records were more complete in the recent years.

```
if (dim(Data)[2] == 37) {
    Data$year <- as.numeric(format(as.Date(Data$BGN_DATE, format = "%m/%d/%Y %H:%M:%S"),
    "%Y"))
}
hist(Data$year, breaks = 30)</pre>
```

### **Histogram of Data\$year**



Based on the graph, the number of events tracked start to increase significantly from 1995. Hence, 1990 to 2011 will be use to make most of the data.

```
storm <- Data[Data$year >= 1995, ]
dim(storm)

## [1] 681500 38
```

With this, the total number of rows and column 681500 and 38 respectively.

#### **Impact on Population Health**

To identify the no. of **fatalities** and **injuries** that are caused by the severe weather events, we list the top 10 most severe types of weather events.

```
sortHelper <- function(fieldName, top = 10, dataset = Data) {
   index <- which(colnames(dataset) == fieldName)
   field <- aggregate(dataset[, index], by = list(dataset$EVTYPE), FUN = "sum")
   names(field) <- c("EVTYPE", fieldName)
   field <- arrange(field, field[, 2], decreasing = T)
   field <- head(field, n = top)
   field <- within(field, EVTYPE <- factor(x = EVTYPE, levels = field$EVTYPE))
   return(field)
}

fatalities <- sortHelper("FATALITIES", dataset = storm)
injuries <- sortHelper("INJURIES", dataset = storm)</pre>
```

#### Impact on Economy

We will convert the **property damage** and **crop damage** data into comparable numerical forms. Both PROPDMGEXP and CROPDMGEXP columns record a multiplier for each observation where we have Hundred (H), Thousand (K), Million (M) and Billion (B).

```
convertHelper <- function(dataset = storm, fieldName, newFieldName) {</pre>
    totalLen <- dim(dataset)[2]</pre>
    index <- which(colnames(dataset) == fieldName)</pre>
    dataset[, index] <- as.character(dataset[, index])</pre>
    logic <- !is.na(toupper(dataset[, index]))</pre>
    dataset[logic & toupper(dataset[, index]) == "B", index] <- "9"</pre>
    dataset[logic & toupper(dataset[, index]) == "M", index] <- "6"</pre>
    dataset[logic & toupper(dataset[, index]) == "K", index] <- "3"</pre>
    dataset[logic & toupper(dataset[, index]) == "H", index] <- "2"</pre>
    dataset[logic & toupper(dataset[, index]) == "", index] <- "0"</pre>
    dataset[, index] <- as.numeric(dataset[, index])</pre>
    dataset[is.na(dataset[, index]), index] <- 0</pre>
    dataset <- cbind(dataset, dataset[, index - 1] * 10^dataset[, index])</pre>
    names(dataset)[totalLen + 1] <- newFieldName</pre>
    return(dataset)
}
storm <- convertHelper(storm, "PROPDMGEXP", "propertyDamage")</pre>
```

```
## Warning in convertHelper(storm, "PROPDMGEXP", "propertyDamage"): NAs
## introduced by coercion
```

```
storm <- convertHelper(storm, "CROPDMGEXP", "cropDamage")</pre>
```

```
## Warning in convertHelper(storm, "CROPDMGEXP", "cropDamage"): NAs
## introduced by coercion
```

names(storm)

```
##
    [1] "STATE___"
                           "BGN DATE"
                                             "BGN_TIME"
                                                               "TIME_ZONE"
   [5] "COUNTY"
##
                           "COUNTYNAME"
                                             "STATE"
                                                               "EVTYPE"
##
   [9] "BGN_RANGE"
                           "BGN_AZI"
                                             "BGN_LOCATI"
                                                               "END_DATE"
## [13] "END TIME"
                           "COUNTY END"
                                             "COUNTYENDN"
                                                               "END RANGE"
                                                               "WIDTH"
## [17] "END AZI"
                           "END LOCATI"
                                             "LENGTH"
## [21] "F"
                           "MAG"
                                             "FATALITIES"
                                                               "INJURIES"
## [25] "PROPDMG"
                           "PROPDMGEXP"
                                             "CROPDMG"
                                                               "CROPDMGEXP"
## [29] "WFO"
                           "STATEOFFIC"
                                             "ZONENAMES"
                                                               "LATITUDE"
## [33] "LONGITUDE"
                           "LATITUDE_E"
                                             "LONGITUDE "
                                                               "REMARKS"
                           "year"
## [37] "REFNUM"
                                             "propertyDamage" "cropDamage"
```

```
options(scipen=999)
property <- sortHelper("propertyDamage", dataset = storm)
crop <- sortHelper("cropDamage", dataset = storm)</pre>
```

## **Findings**

As for the impact on public health, we have the lists of severe weather events by the no. of people badly injured.

```
fatalities
```

```
##
               EVTYPE FATALITIES
## 1
      EXCESSIVE HEAT
                             1903
## 2
              TORNADO
                             1545
## 3
         FLASH FLOOD
                              934
## 4
                 HEAT
                              924
## 5
           LIGHTNING
                              729
                FLOOD
                              423
## 6
## 7
         RIP CURRENT
                              360
## 8
            HIGH WIND
                              241
## 9
            TSTM WIND
                              241
## 10
            AVALANCHE
                              223
```

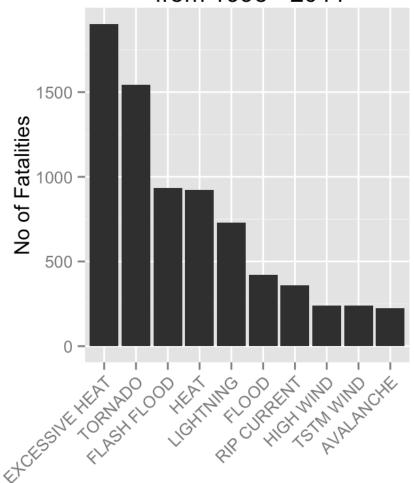
```
injuries
```

```
##
                 EVTYPE INJURIES
## 1
                TORNADO
                            21765
## 2
                  FLOOD
                             6769
## 3
         EXCESSIVE HEAT
                             6525
## 4
              LIGHTNING
                             4631
## 5
              TSTM WIND
                             3630
                             2030
## 6
                   HEAT
## 7
            FLASH FLOOD
                             1734
## 8
      THUNDERSTORM WIND
                             1426
## 9
           WINTER STORM
                             1298
## 10 HURRICANE/TYPHOON
                             1275
```

Below illustrates the total fatalities and injuries caused by the severe weather events.

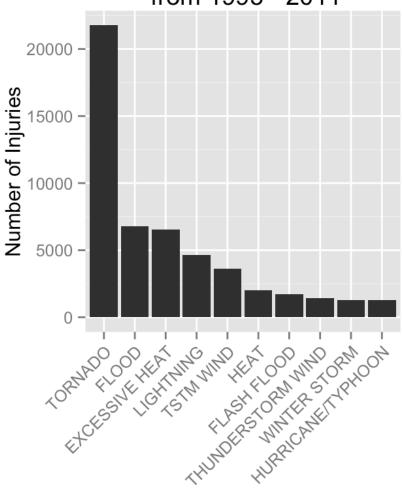
```
fatalitiesPlot <- qplot(EVTYPE, data = fatalities, weight = FATALITIES, geom = "bar", bi
nwidth = 1) +
    scale_y_continuous("No of Fatalities") +
    theme(axis.text.x = element_text(angle = 45,
    hjust = 1)) + xlab("Severe Weather Type") +
    ggtitle("Total Fatalities by Severe Weather\n Events in the U.S.\n from 1995 - 2011"
)
injuriesPlot <- qplot(EVTYPE, data = injuries, weight = INJURIES, geom = "bar", binwidth
= 1) +
    scale_y_continuous("Number of Injuries") +
    theme(axis.text.x = element_text(angle = 45,
    hjust = 1)) + xlab("Severe Weather Type") +
    ggtitle("Total Injuries by Severe Weather\n Events in the U.S.\n from 1995 - 2011")
grid.arrange(fatalitiesPlot, injuriesPlot, ncol = 2)</pre>
```

Total Fatalities by Severe Weather Events in the U.S. from 1995 - 2011



Severe Weather Type

Total Injuries by Severe Weather Events in the U.S. from 1995 - 2011



Severe Weather Type

**Excessive heat** and **tornado** caused the highest fatalities, whereas **tornado** caused the most injuries in the US from 1995 to 2011.

As for the impact on economy, we have got two sorted lists below by the amount of money cost by damages.

#### property

##		EVTYPE	propertyDamage
##	1	FLOOD	144022037057
##	2	HURRICANE/TYPHOON	69305840000
##	3	STORM SURGE	43193536000
##	4	TORNADO	24935939545
##	5	FLASH FLOOD	16047794571
##	6	HAIL	15048722103
##	7	HURRICANE	11812819010
##	8	TROPICAL STORM	7653335550
##	9	HIGH WIND	5259785375
##	10	WILDFIRE	4759064000

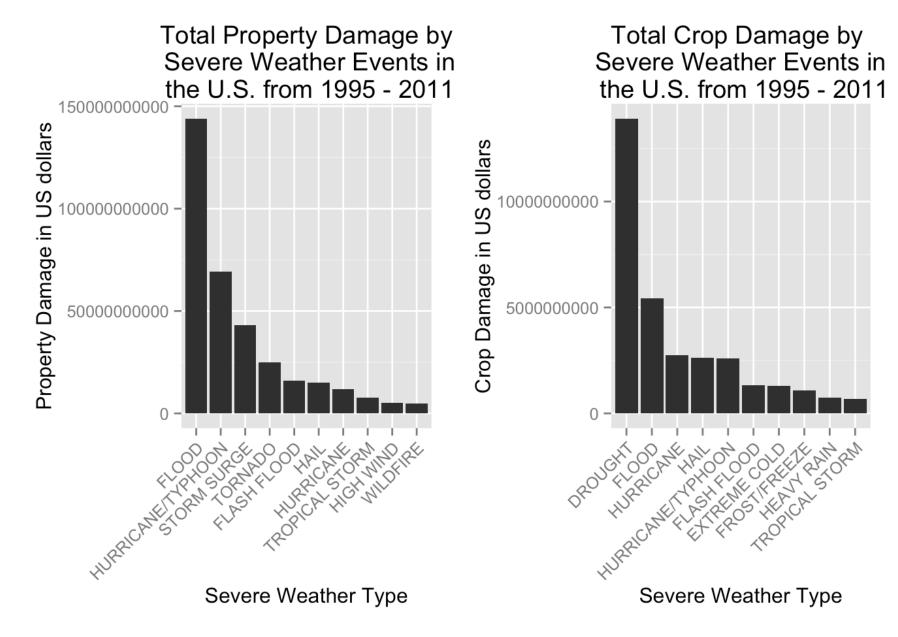
crop

```
##
                EVTYPE cropDamage
## 1
               DROUGHT 13922066000
## 2
                 FLOOD 5422810400
## 3
             HURRICANE 2741410000
                  HAIL 2614127070
## 5
     HURRICANE/TYPHOON 2607872800
           FLASH FLOOD 1343915000
## 6
## 7
          EXTREME COLD 1292473000
## 8
          FROST/FREEZE 1094086000
## 9
            HEAVY RAIN 728399800
        TROPICAL STORM
                         677836000
## 10
```

Below illustrates the total property and crop damage affected by the severe weather events.

```
propertyPlot <- qplot(EVTYPE, data = property, weight = propertyDamage, geom = "bar", bi
nwidth = 1) +
    theme(axis.text.x = element_text(angle = 45, hjust = 1)) + scale_y_continuous("Prope
rty Damage in US dollars")+
    xlab("Severe Weather Type") + ggtitle("Total Property Damage by\n Severe Weather Eve
nts in\n the U.S. from 1995 - 2011")

cropPlot<- qplot(EVTYPE, data = crop, weight = cropDamage, geom = "bar", binwidth = 1) +
    theme(axis.text.x = element_text(angle = 45, hjust = 1)) + scale_y_continuous("Crop
Damage in US dollars") +
    xlab("Severe Weather Type") + ggtitle("Total Crop Damage by \nSevere Weather Events
in\n the U.S. from 1995 - 2011")
grid.arrange(propertyPlot, cropPlot, ncol = 2)</pre>
```



Both **flood** and **hurricane/typhoon** caused the most property damage. While**drought** and **flood** caused the most crop damage from 1995 to 2011.

## Conclusion

Based on the findings, **excessive heat** and **tornado** had the greatest impact on the population health, whereas **flood**, **drought**, and **hurricane/typhoon** had the greatest economic impact.