Severe Weather Top Events Requiring the Greatest Government and Municipality Resource Needs

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Synopsis

The need for this review is to offer data-driven insights to assist the prioritization of government/municipal resources for different types of weather events. There are two questions posed:

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

Definitions:

- a. Population health was defined as the aggregation of fatalaties and injuries, with the variable labeled TotalBodilyInjury
- b. Economic consequences was defined as the aggregation of property damage and crop damage, with the variable labeled TotalPropertyDamage

Key Takeaways:

- 1. The US weather event most harmful to population health is tornados, followed by excessive heat, thunderstorm wind, flood, and lightning.
- 2. The US weather event causing the greatest economic consequence is flood, followed by hurricane/typhoon, tornado, storm surge, and hail to complete the top 5 events.

Note tornados and flood comprise the top 5 events in each view, health and property damage. These two weather events are worthy of a deeper look by governments and municipalities regarding resource deployment.

Data Processing Overall

Summary: Two datasets were created from the same source. One dataset for TotalBodilyInjury, one dataset for TotalPropertyDamage. The property damage dataset needed a conversion of the damage estimates to a first dollar basis. For example, the data contained values summarized as 2.5B or 100K, and in order to obtain a total these values needed to be converted into 2,500,000,000 and 100,000.

Data Source and imported dataset "StormDataUse":

```
library(R.utils)
##hide warnings and messages when Loading Library(package)
knitr::opts_chunk$set(warning=FALSE,message = FALSE)
Connection<-"https://d396qusza40orc.cloudfront.net/repdata%2Fdata%2FStormData.csv.bz2"
destfile<-"StormData.csv.bz2"
download.file(Connection,destfile)
StormDataUse<-read.csv("StormData.csv.bz2")</pre>
```

The data and columns of interest were explored for possible data scrubbing & cleaning. Note page 12 of the storm data preparation document states the PROPEXP and CROPEXP columns represent exponent for the values in the PROPDMG and CROPDMG fields, respectively.

```
library(dplyr)
#overalL data summaries
dim(StormDataUse)

## [1] 902297 37
```

```
names(StormDataUse)
```

```
## [1] "STATE__"
                     "BGN DATE"
                                  "BGN_TIME"
                                               "TIME ZONE"
                                                            "COUNTY"
## [6] "COUNTYNAME" "STATE"
                                  "EVTYPE"
                                               "BGN RANGE"
                                                            "BGN AZI"
## [11] "BGN_LOCATI" "END_DATE"
                                  "END_TIME"
                                               "COUNTY_END" "COUNTYENDN"
                                  "END_LOCATI" "LENGTH"
## [16] "END_RANGE" "END_AZI"
                                                            "WIDTH"
## [21] "F"
                     "MAG"
                                  "FATALITIES" "INJURIES"
                                                            "PROPDMG"
                                  "CROPDMGEXP" "WFO"
## [26] "PROPDMGEXP" "CROPDMG"
                                                            "STATEOFFIC"
## [31] "ZONENAMES"
                     "LATITUDE"
                                  "LONGITUDE" "LATITUDE_E" "LONGITUDE_"
## [36] "REMARKS"
                     "REFNUM"
```

```
str(StormDataUse)
```

```
## 'data.frame': 902297 obs. of 37 variables:
## $ STATE__ : num 1 1 1 1 1 1 1 1 1 ...
## $ BGN DATE : Factor w/ 16335 levels "1/1/1966 0:00:00",..: 6523 6523 4242 11116 2
224 2224 2260 383 3980 3980 ...
## $ BGN_TIME : Factor w/ 3608 levels "00:00:00 AM",..: 272 287 2705 1683 2584 3186
242 1683 3186 3186 ...
  $ TIME ZONE : Factor w/ 22 levels "ADT","AKS","AST",...: 7 7 7 7 7 7 7 7 7 7 ...
             : num 97 3 57 89 43 77 9 123 125 57 ...
## $ COUNTYNAME: Factor w/ 29601 levels "","5NM E OF MACKINAC BRIDGE TO PRESQUE ISLE
LT MI",..: 13513 1873 4598 10592 4372 10094 1973 23873 24418 4598 ...
             : Factor w/ 72 levels "AK", "AL", "AM", ...: 2 2 2 2 2 2 2 2 2 ...
## $ EVTYPE
               : Factor w/ 985 levels " HIGH SURF ADVISORY",..: 834 834 834 834 83
4 834 834 834 834 ...
## $ BGN RANGE : num 00000000000...
              : Factor w/ 35 levels ""," N"," NW",..: 1 1 1 1 1 1 1 1 1 1 ...
## $ BGN_LOCATI: Factor w/ 54429 levels "","- 1 N Albion",..: 1 1 1 1 1 1 1 1 1 1 ...
## $ END_DATE : Factor w/ 6663 levels "","1/1/1993 0:00:00",..: 1 1 1 1 1 1 1 1 1
## $ END TIME : Factor w/ 3647 levels ""," 0900CST",..: 1 1 1 1 1 1 1 1 1 1 ...
## $ COUNTY_END: num 0000000000...
## $ COUNTYENDN: logi NA NA NA NA NA NA ...
## $ END RANGE : num 0 0 0 0 0 0 0 0 0 ...
              : Factor w/ 24 levels "", "E", "ENE", "ESE", ...: 1 1 1 1 1 1 1 1 1 1 ...
## $ END AZI
## $ END_LOCATI: Factor w/ 34506 levels "","- .5 NNW",..: 1 1 1 1 1 1 1 1 1 1 ...
## $ 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
              : int 3 2 2 2 2 2 2 1 3 3 ...
## $ MAG
              : num 0000000000...
## $ FATALITIES: num 0 0 0 0 0 0 0 1 0 ...
## $ INJURIES : num 15 0 2 2 2 6 1 0 14 0 ...
## $ PROPDMG
              : num 25 2.5 25 2.5 2.5 2.5 2.5 2.5 25 25 ...
## $ PROPDMGEXP: Factor w/ 19 levels "","-","?","+",..: 17 17 17 17 17 17 17 17 17
7 ...
## $ CROPDMG
             : num 0000000000...
## $ CROPDMGEXP: Factor w/ 9 levels "","?","0","2",...: 1 1 1 1 1 1 1 1 1 1 1 ...
               : Factor w/ 542 levels ""," CI","$AC",..: 1 1 1 1 1 1 1 1 1 1 ...
## $ STATEOFFIC: Factor w/ 250 levels "","ALABAMA, Central",..: 1 1 1 1 1 1 1 1 1
## $ ZONENAMES : Factor w/ 25112 levels
                           "| __truncated__,..: 1 1 1 1 1 1 1 1 1 1 ...
## $ 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 : Factor w/ 436781 levels "","-2 at Deer Park\n",..: 1 1 1 1 1 1 1 1
1 1 ...
## $ REFNUM : num 1 2 3 4 5 6 7 8 9 10 ...
```

```
#head and tail were also reviewed, but not printed in the interest of report length
#head(StormDataUse,50)
#tail(StormDataUse,50)
#explore columns of interest
# Look for na's
sum(is.na(StormDataUse$FATALITIES))
## [1] 0
sum(is.na(StormDataUse$INJURIES))
## [1] 0
sum(is.na(StormDataUse$PROPDMG))
## [1] 0
sum(is.na(StormDataUse$CROPDMG))
## [1] 0
# obtain totals for numeric columns of interest
sum(StormDataUse$FATALITIES)
## [1] 15145
sum(StormDataUse$INJURIES)
## [1] 140528
# note the following are exploring the column for errors prior to conversion from summ
arized units (2.5 of 2.5B) to first dollar (2,500,000,000)
formatC(round(sum(StormDataUse$PROPDMG),0), format = "d", big.mark=",")
## [1] "10,884,500"
formatC(round(sum(StormDataUse$CROPDMG),0), format = "d", big.mark=",")
```

```
## [1] "1,377,827"
```

```
#unique category values for non-numeric cols of interest
uniqueSD<-distinct(select(StormDataUse, STATE, EVTYPE))
sum(is.na(uniqueSD$EVTYPE))</pre>
```

```
## [1] 0
```

```
uniqueUnitsPD<-distinct(select(StormDataUse,PROPDMGEXP))
uniqueUnitsCROP<-distinct(select(StormDataUse,CROPDMGEXP))</pre>
```

The data needed for analysis was found to be clean except for the exponent units need for property damage estimates.

The next step is to create the datasets for TotalBodilyInjury and TotalPropertyDamage.

Data Processing - DataSet for Bodily Injury (Fatalities and Injuries)

The "StormDataUse" data just needs to be filtered for the columns of interest and aggregated for counts.

```
#table(StormDataUse$Cols of Interest)
myvars <- c("EVTYPE", "FATALITIES", "INJURIES")
StormDataSet<-StormDataUse[myvars]
StormDataSet <- mutate(StormDataSet, TotalBodilyInjury=FATALITIES+INJURIES)
#Test BIData
summary(StormDataSet)</pre>
```

```
EVTYPE
##
                            FATALITIES
                                              INJURIES
## HAIL
                  :288661 Min. : 0.0000
                                           Min. : 0.0000
  TSTM WIND
                  :219940 1st Qu.: 0.0000
                                           1st Qu.:
                                                    0.0000
   THUNDERSTORM WIND: 82563 Median: 0.0000
##
                                           Median : 0.0000
## TORNADO
                 : 60652 Mean : 0.0168
                                           Mean : 0.1557
## FLASH FLOOD
                : 54277
                          3rd Qu.: 0.0000
                                           3rd Qu.:
                                                     0.0000
## FLOOD
                  : 25326
                          Max. :583.0000
                                           Max. :1700.0000
## (Other)
                 :170878
## TotalBodilyInjury
## Min. : 0.0000
## 1st Qu.: 0.0000
## Median : 0.0000
## Mean : 0.1725
##
  3rd Qu.: 0.0000
##
   Max. :1742.0000
##
```

```
##
                      EVTYPE
                                TOTFATALITIES
                                                   TOTINJURIES
##
       HIGH SURF ADVISORY: 1
                                Min. :
                                                  Min. :
                                                              0.0
                                           0.00
##
     COASTAL FLOOD
                                1st Qu.:
                                           0.00
                                                  1st Qu.:
                                                               0.0
##
     FLASH FLOOD
                            1
                                Median :
                                           0.00
                                                  Median :
                                                               0.0
                         :
                                                          : 142.7
##
     LIGHTNING
                         : 1
                                Mean : 15.38
                                                  Mean
    TSTM WIND
                         : 1
                                3rd Qu.:
                                           0.00
                                                               0.0
##
                                                  3rd Qu.:
##
    TSTM WIND (G45)
                            1
                                Max.
                                       :5633.00
                                                  Max.
                                                          :91346.0
    (Other)
                         :979
##
##
   TotalBodilyInjury
##
   Min.
##
   1st Qu.:
##
   Median :
##
             158
   Mean
##
   3rd Qu.:
           :96979
##
   Max.
##
```

Now that the data is summarized, sort to identify those events that comprise at least 80% (solid majority) of the total bodily injury count.

```
#arrange rows to get top n for question 1
StormDataSumBI<-arrange(StormDataSum, desc(TotalBodilyInjury))
#Top5 BI Events for charting
Q1Data<-data.frame(StormDataSumBI[1:5,])
#Portion Top N represent (shoot for >= 80%)
BIPortion<-formatC(100*(sum(Q1Data$TotalBodilyInjury)/sum(StormDataSumBI$TotalBodilyInjury)))</pre>
```

The top 5 events for Bodily Injury comprise 81.05% of the total fatalities and injuries.

Data Processing - DataSet for Property Damage

The exponent units need for property damage estimates contained some unidentifiable characters. Examples: blank, ?, -, and +. The following code shows the numeric mapping of each unique item in the *EXP columns.

```
#convert units into numeric form, where blank = 1 and default = 0 where code not ident
ified below (ex: ?, -, +)
Units=function(x){
        m=0;
        if(x=="") {m=1}
                else if(x=="0"){m=1}
                else if(x=="1"){m=10}
                else if(x=="2"){m=100}
                else if(x=="3"){m=1000}
                else if(x=="4"){m=10000}
                else if(x=="5"){m=100000}
                else if(x=="6"){m=1000000}
                else if(x=="7"){m=10000000}
                else if(x=="8"){m=100000000}
                else if(x=="B") {m=1000000000}
                else if(x=="h") {m=100}
                else if(x=="H") {m=100}
                else if(x=="k") {m=1000}
                else if(x=="K") {m=1000}
                else if(x=="M" | x=="m") {m=1000000}
                else if(x=="M" | x=="m") {m=1000000}
        m}
#validate the table
#convert to fixed from scientific
options("scipen"=100, "digits"=10)
#create lookup table for PD
uniqueUnitsPDf<-unique(factor(StormDataUse$PROPDMGEXP))</pre>
TestPD<-data.frame(uniqueUnitsPDf,sapply(uniqueUnitsPDf,Units))</pre>
#rename (new name = old name)
TestPD<-rename(TestPD, PROPDMGEXP = uniqueUnitsPDf,Units = sapply.uniqueUnitsPDf..Unit
s.)
print(TestPD)
```

```
##
      PROPDMGEXP
                        Units
## 1
                Κ
                         1000
## 2
                Μ
                      1000000
## 3
## 4
                B 1000000000
## 5
                      1000000
                m
##
  6
                +
                            0
## 7
                0
                            1
## 8
                5
                       100000
## 9
                6
                      1000000
                ?
## 10
                4
                        10000
## 11
## 12
                2
                          100
                3
## 13
                         1000
##
  14
                h
                          100
## 15
                7
                     10000000
## 16
                Н
                          100
## 17
                            0
## 18
                1
                           10
## 19
                8
                    100000000
```

```
#now crop (scipen above carries forward)
uniqueUnitsCROPf=unique(factor(StormDataUse$CROPDMGEXP))
#lookup table for crop
TestCrop<-data.frame(uniqueUnitsCROPf,sapply(uniqueUnitsCROPf,Units))
TestCrop<-rename(TestCrop, CROPDMGEXP = uniqueUnitsCROPf, Units = sapply.uniqueUnitsCR
OPf..Units.)
print(TestCrop)</pre>
```

```
##
     CROPDMGEXP
                       Units
## 1
                            1
                     1000000
## 2
               Μ
## 3
               Κ
                        1000
## 4
                     1000000
               m
## 5
               B 1000000000
               ?
                            0
## 6
## 7
               0
                            1
## 8
               k
                        1000
## 9
               2
                         100
```

All exponent codes have been identified in the "Units" function. The next step is to create columns in the property damage dataset to represent estimated costs as the multiplier in PROPDMG & CROPDMG to the appropriate unit value above.

##		EVTYPE	PROPDMG	PROPDMGEXP	PropCost	CROPDMG	CROPDMGEXP CropCost
##	1	TORNADO	25.0	K	25000	0	0
##	2	TORNADO	2.5	K	2500	0	0
##	3	TORNADO	25.0	K	25000	0	0
##	4	TORNADO	2.5	K	2500	0	0
##	5	TORNADO	2.5	K	2500	0	0
##	6	TORNADO	2.5	K	2500	0	0
##	7	TORNADO	2.5	K	2500	0	0
##	8	TORNADO	2.5	K	2500	0	0
##	9	TORNADO	25.0	K	25000	0	0
##	10	TORNADO	25.0	K	25000	0	0
##	11	TORNADO	2.5	М	2500000	0	0
##	12	TORNADO	2.5	М	2500000	0	0
##	13	TORNADO	250.0	K	250000	0	0
##	14	TORNADO	0.0	K	0	0	0
##	15	TORNADO	25.0	K	25000	0	0
##	16	TORNADO	25.0	K	25000	0	0
##	17	TORNADO	25.0	K	25000	0	0
##	18	TORNADO	25.0	K	25000	0	0
##	19	TORNADO	25.0	K	25000	0	0
##	20	TORNADO	25.0	K	25000	0	0
##	21	TORNADO	25.0	K	25000	0	0
##	22	TORNADO	2.5	K	2500	0	0
##	23	TORNADO	2.5	K	2500	0	0
##	24	TORNADO	25.0	K	25000	0	0
##	25	TORNADO	25.0	K	25000	0	0

```
#Tail was reviewed but not printed in the interest of report length
#tail(EconCostsDataSet, 25)
#find records to review with crop damages
head(filter(EconCostsDataSet, CROPDMG > 0))
```

```
##
                        EVTYPE PROPDMG PROPDMGEXP PropCost CROPDMG
## 1 HURRICANE OPAL/HIGH WINDS
                                   0.1
                                                B 100000000
                                                                 10
           THUNDERSTORM WINDS
                                   5.0
                                                    5000000
                                                                500
                                  25.0
## 3
               HURRICANE ERIN
                                                M 25000000
                                                                  1
               HURRICANE OPAL
                                  48.0
                                                M 48000000
                                                                  4
## 4
## 5
               HURRICANE OPAL
                                  20.0
                                                m 20000000
                                                                 10
                                  50.0
## 6
           THUNDERSTORM WINDS
                                                K
                                                      50000
                                                                 50
##
     CROPDMGEXP CropCost
## 1
             M 10000000
## 2
             Κ
                  500000
## 3
             M 1000000
## 4
             M 4000000
## 5
             m 10000000
## 6
                   50000
              Κ
```

The "EconCostsDataSet" data just needs a column to represent the sum of PropCost & CropCost and aggregated for total damages.

```
#table(StormDataUse$Cols of Interest)
EconCostsDataSet <- mutate(EconCostsDataSet, TotalPropertyDamage=PropCost+CropCost)
#Test new dataset
summary(EconCostsDataSet)</pre>
```

```
##
                   EVTYPE
                                    PROPDMG
                                                         PROPDMGEXP
##
   HAIL
                      :288661
                                 Min.
                                       :
                                             0.0000
                                                               :465934
##
   TSTM WIND
                      :219940
                                 1st Qu.:
                                             0.0000
                                                               :424665
##
    THUNDERSTORM WIND: 82563
                                 Median :
                                             0.0000
                                                       Μ
                                                              : 11330
##
    TORNADO
                      : 60652
                                 Mean
                                        : 12.0631
                                                       0
                                                                   216
##
    FLASH FLOOD
                      : 54277
                                 3rd Qu.:
                                             0.5000
                                                       В
                                                                    40
##
    FL00D
                      : 25326
                                 Max.
                                         :5000.0000
                                                       5
                                                                    28
##
    (Other)
                      :170878
                                                       (Other):
                                                                    84
##
       PropCost
                                CROPDMG
                                                      CROPDMGEXP
##
    Min.
                        0
                             Min.
                                     : 0.000000
                                                           :618413
##
    1st Qu.:
                             1st Qu.:
                                       0.000000
                                                    K
                                                           :281832
                                                           : 1994
    Median :
                             Median : 0.000000
##
                                                   Μ
##
    Mean
                   474594
                             Mean
                                     : 1.527022
                                                    k
                                                           :
                                                                21
                                                                19
##
    3rd Qu.:
                      500
                             3rd Qu.:
                                       0.000000
                                                    0
                                                                  9
##
           :1150000000000
                             Max.
                                     :990.000000
##
                                                    (Other):
                                                                  9
##
       CropCost
                           TotalPropertyDamage
##
    Min.
                          Min.
##
    1st Qu.:
                           1st Qu.:
                                               0
                      0
##
    Median :
                          Median :
                                               0
                      0
                                          529015
##
    Mean
                  54421
                          Mean
##
    3rd Qu.:
                           3rd Qu.:
                                            1000
##
            :5000000000
                                  :115032500000
    Max.
                           Max.
##
```

#head was also reviewed, but not printed in the interest of report length
#head(EconCostsDataSet,50)
head(filter(EconCostsDataSet, CROPDMG > 0))

```
##
                         EVTYPE PROPDMG PROPDMGEXP
                                                      PropCost CROPDMG
## 1 HURRICANE OPAL/HIGH WINDS
                                                   B 100000000
                                                                     10
                                     0.1
            THUNDERSTORM WINDS
## 2
                                     5.0
                                                   Μ
                                                       5000000
                                                                    500
                                    25.0
## 3
                 HURRICANE ERIN
                                                      25000000
                                                                      1
## 4
                HURRICANE OPAL
                                    48.0
                                                      48000000
                                                                      4
                                                   Μ
## 5
                 HURRICANE OPAL
                                    20.0
                                                      20000000
                                                   m
                                                                     10
            THUNDERSTORM WINDS
                                    50.0
                                                   Κ
## 6
                                                         50000
                                                                     50
##
     CROPDMGEXP CropCost TotalPropertyDamage
## 1
              M 10000000
                                     110000000
## 2
              Κ
                   500000
                                       5500000
## 3
                  1000000
                                      26000000
## 4
              Μ
                  4000000
                                      52000000
              m 10000000
                                      30000000
## 5
              Κ
                    50000
                                        100000
## 6
```

```
#aggregate by event for PD Injuries
Event2 <- group_by(EconCostsDataSet, EVTYPE)
EconDataSum<-summarize(Event2, TOTPROPDMG = sum(PropCost),TOTCROPDMG = sum(CropCost),T
otalPropertyDamage = sum(TotalPropertyDamage))
#Test aggregation
#head was also reviewed, but not printed in the interest of report length
#head(EconDataSum,50)
summary(EconDataSum)</pre>
```

```
##
                 EVTYPE
                        TOTPROPDMG
                                            TOTCROPDMG
##
     HIGH SURF ADVISORY: 1
                        Min. :
                                      0 Min. :
                                                         0
                : 1
                                      0 1st Qu.:
                                                         0
##
   COASTAL FLOOD
                        1st Qu.:
                        Median : 0 Median :
##
   FLASH FLOOD
                  : 1
                  : 1 Mean : 434746060 Mean : 49851972
##
   LIGHTNING
                  : 1 3rd Qu.: 51050 3rd Qu.:
##
   TSTM WIND
   TSTM WIND (G45) : 1
                        Max. :144657709807
                                          Max. :13972566000
##
##
   (Other)
                   :979
## TotalPropertyDamage
## Min.
## 1st Ou.:
## Median :
## Mean : 484598031
## 3rd Qu.: 85000
##
  Max. :150319678257
##
```

Now that the data is summarized, sort to identify those events that comprise at least 80% (solid majority) of the total property damage costs.

```
#arrange rows to get top n PD for question 2
EconDataSumPD<-arrange(EconDataSum, desc(TotalPropertyDamage))
#Top10 PD Events
Q2Data<-data.frame(EconDataSumPD[1:10,])
#Portion Top N represent (shoot for >= 80%)
PDPortion<-formatC(100*(sum(Q2Data$TotalPropertyDamage)/sum(EconDataSumPD$TotalPropertyDamage)))</pre>
```

The top 10 events for PropertyDamage comprise 85.62% of the total property damage and crop damage estimates.

Now that the datasets for each bodily injury and property damage are complete, let's take a look at the results.

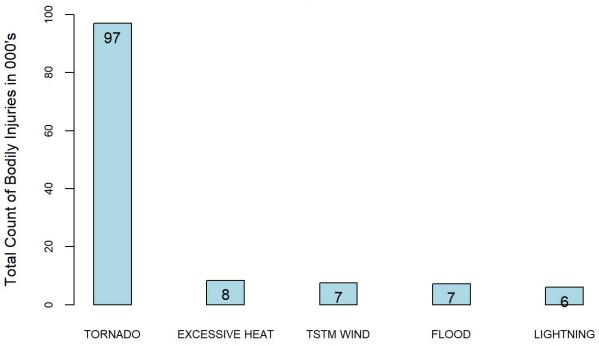
Results

The need is to prioritize government and municipal resources for different types of weather events.

Results - Question 1

Question 1) Across the United States, which types of events (as indicated by the EVTYPE variable) are most harmful with respect to population health? Health is defined as the summation of fatalities and injuries by weather event. The chart follows:





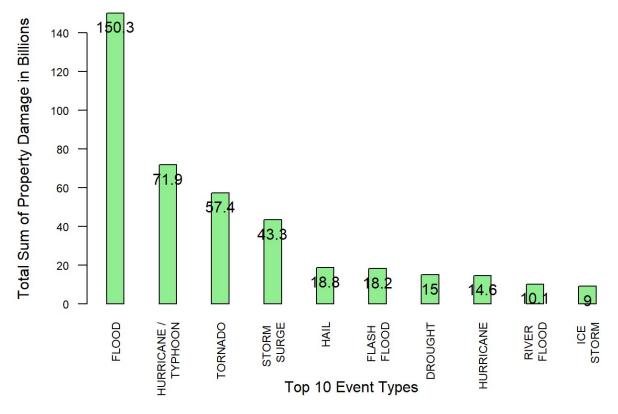
Top 5 Weather Event Types

The result is tornados are the most severe event, followed by excessive heat, thunderstorm wind, flood, and lightning. These 5 events comprise 81.05% of all fatalities and injuries combined.

Results - Question 2

Question 2) Across the United States, which types of events have the greatest economic consequences? Economic consequences is defined as the aggregation of property damage and crop damage by weather event. The chart follows:

Top 10 Events (Representing >80% All Damage Costs) for Total Property Damage in \$Billions (Including Crops)



The result is floods are the most severe event, followed by hurricane/typhoon, tornado, storm surge, hail, flash flood, drought, hurricane, river flood, and ice storm. These 10 events comprise 85.62% of all property and crop damages combined.

Results - Overall Observation

Note tornados and flood comprise the top 5 events in each view, health and property damage. These two weather events are worthy of a deeper look by government/municipalities regarding resource deployment.

Challenge Results

This analysis is based on the entire dataset from years 1950 through November 2011. Event frequency and severity may have changed over time. An analysis over time is recommended to view for possible trends.