

# Weather Data Analysis

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10/08/2021

## Analyzing harmful weather events

### Synopsis

The National Oceanic & Atmospheric Administration publishes data regarding weather-related events and their impacts on the health of the population and the economy. This project aims to analyze the data and identify which types of events pose the greatest threat to the USA. These events were then inspected more closely to provide a better description of how they may impact the lives and the economy of Americans.

### Loading and processing Raw Data

The data is available from the National Oceanic & Atmospheric Administration website. The data was compiled by the instructors from the Reproducible Research course from Coursera and made available in the following link. We unzip and read the data into the variable **noaa**.

```
noaa <- read.csv('repdata_data_StormData.csv.bz2')
```

Our analysis will focus on the health and economic effects of different types of weather events. Therefore, we keep only the columns that reference that information: *EVTYPE* (type of event), *Fatalities* and *Injuries* (effects over population health), *PROPDMG* and *PROPDMGEXP* (property damage estimates, including the order of magnitude) and *CROPDMG* and *CROPDMGEXP* (crop damage estimates, including magnitude).

```
noaa <- noaa[,c('EVTYPE', 'FATALITIES', 'INJURIES', 'PROPDMG', 'PROPDMGEXP', 'CROPDMG', 'CROPDMGEXP')]  
#Adding an index row  
index <- c(1:nrow(noaa))  
noaa$INDEX <- index
```

We can rectify the damage columns including the thousands, millions or billions orders of magnitude and delete those columns. The characters 'K', 'M' and 'B' represent thousands, millions or billions of dollars worth of property or crops. The entries with incorrect characters had the damage set to NA.

```
noaakp <- noaa[noaa$PROPDMGEXP=='K',]  
noaakp <- rbind(noaakp, noaa[noaa$PROPDMGEXP=='k',])  
noaakp$PROPDMG <- as.numeric(noaakp$PROPDMG) * 1000  
noaamp <- noaa[noaa$PROPDMGEXP=='M',]  
noaamp <- rbind(noaamp, noaa[noaa$PROPDMGEXP=='m',])  
noaamp$PROPDMG <- as.numeric(noaamp$PROPDMG) * 1000000  
noaabp <- noaa[noaa$PROPDMGEXP=='B',]  
noaabp <- rbind(noaabp, noaa[noaa$PROPDMGEXP=='b',])
```

```

noaabp$PROPDMG <- as.numeric(noaabp$PROPDMG) * 1000000000
noaaop <- noaa[!(noaa$PROPDMGEXP %in% c('K','k','M','m','B','b')),]
noaaop$PROPDMG <- NA
noaa1 <- rbind(noaakp,noaamp,noaabp,noaaop)

noaakp <- noaa[noaa1$CROPDMGEXP=='K',]
noaakp <- rbind(noaakp,noaa[noaa1$CROPDMGEXP=='k',])
noaakp$CROPDMG <- as.numeric(noaakp$CROPDMG) * 1000
noaamp <- noaa[noaa$CROPDMGEXP=='M',]
noaamp <- rbind(noaamp,noaa[noaa$CROPDMGEXP=='m',])
noaamp$CROPDMG <- as.numeric(noaamp$CROPDMG) * 1000000
noaabp <- noaa1[noaa$CROPDMGEXP=='B',]
noaabp <- rbind(noaabp,noaa[noaa$CROPDMGEXP=='b',])
noaabp$CROPDMG <- as.numeric(noaabp$CROPDMG) * 1000000000
noaaop <- noaa[!(noaa$CROPDMGEXP %in% c('K','k','M','m','B','b')),]
noaaop$PROPDMG <- NA
noaa2 <- rbind(noaakp,noaamp,noaabp,noaaop)

noaa <- merge(noa1,noaa2,by='INDEX')
noaa <- cbind(noaa$EVTYPE.x,noaa$FATALITIES.x,noaa$INJURIES.x,noaa$PROPDMG.x,noaa$CROPDMG.y)
colnames(noaa) <- c('EVTYPE','FATALITIES','INJURIES','PROPDMG','CROPDMG')
noaa <- data.frame(noaa)
noaa$EVTYPE <- toupper(noaa$EVTYPE)
noaa$FATALITIES <- as.numeric(noaa$FATALITIES)
noaa$INJURIES <- as.numeric(noaa$INJURIES)
noaa$PROPDMG <- as.numeric(noaa$PROPDMG)
noaa$CROPDMG <- as.numeric(noaa$CROPDMG)

```

Finally, we want to filter occurrences where we have at least 10 events under the same category. This will get rid of entries that are not very representative.

```

entries <- table(noaa$EVTYPE)
entries <- entries[entries>=10]
noaa <- noaa[noaa$EVTYPE %in% names(entries),]

```

## Results

### Identifying the most harmful events

The mean number of fatalities may be calculated from the table.

```

rank <- aggregate(noaa$FATALITIES,by=list(noaa$EVTYPE),mean,na.rm=TRUE)
colnames(rank) <- c('EVTYPE','Avg.Fatality')
rank <- rank[order(rank$Avg.Fatality,decreasing=TRUE),]
head(rank,10)

```

##	EVTYPE	Avg.Fatality
## 67	HEAT	7.1782178
## 30	EXTREME HEAT	4.3636364
## 68	HEAT WAVE	2.3129252
## 193	UNSEASONABLY WARM AND DRY	2.2307692
## 25	EXCESSIVE HEAT	1.7322503

```
## 91      HYPOTHERMIA/EXPOSURE    1.1666667
## 103      LOW TEMPERATURE        1.0000000
## 122      RAIN/SNOW              0.8000000
## 133      RIP CURRENT            0.7982833
## 88      HURRICANE ERIN          0.7692308
```

We can mean repeat this treatment with respect to injuries.

```
rank <- aggregate(noaa$INJURIES,by=list(noaa$EVTYPE),mean,na.rm=TRUE)
colnames(rank) <- c('EVTYPE','Avg.Injury')
rank <- rank[order(rank$Avg.Injury,decreasing=TRUE),]
head(rank,10)
```

```
##      EVTYPE Avg.Injury
## 90  HURRICANE/TYPHOON 15.407895
## 220 WINTER WEATHER MIX 13.300000
## 67      HEAT          9.123762
## 30      EXTREME HEAT  7.045455
## 25      EXCESSIVE HEAT 5.462094
## 207 WATERSPOUT/TORNADO 5.250000
## 68      HEAT WAVE     5.149660
## 56      GLAZE         5.023256
## 110     MIXED PRECIP   2.600000
## 92      ICE           2.264463
```

With regard to economic impacts, we can analyze the effect over property and crops.

```
rank <- aggregate(noaa$PROPDMG,by=list(noaa$EVTYPE),mean,na.rm=TRUE)
colnames(rank) <- c('EVTYPE','Avg.Property.Damage')
rank <- rank[order(rank$Avg.Property.Damage,decreasing=TRUE),]
head(rank,10)
```

```
##      EVTYPE Avg.Property.Damage
## 90  HURRICANE/TYPHOON    1065123793
## 89  HURRICANE OPAL       396605750
## 139 SEVERE THUNDERSTORM 200893333
## 161     STORM SURGE     164679117
## 87  HURRICANE           105556770
## 187     TYPHOON         91133077
## 88  HURRICANE ERIN       57244444
## 212     WILDFIRES       40100000
## 40      FLOOD           36223991
## 180     TROPICAL STORM   34276012
```

```
rank <- aggregate(noaa$CROPDMG,by=list(noaa$EVTYPE),mean,na.rm=TRUE)
colnames(rank) <- c('EVTYPE','Avg.Crop.Damage')
rank <- rank[order(rank$Avg.Crop.Damage,decreasing=TRUE),]
head(rank,10)
```

```
##      EVTYPE Avg.Crop.Damage
## 14      DAMAGING FREEZE    22809700
## 90  HURRICANE/TYPHOON    14396974
```

```
## 88          HURRICANE ERIN          10472769
## 87          HURRICANE                10048503
## 42          FLOOD/RAIN/WINDS         9409400
## 16          DROUGHT                  7195198
## 140 SEVERE THUNDERSTORM WINDS        2902900
## 52          FROST/FREEZE             2769891
## 1           AGRICULTURAL FREEZE       2404068
## 45          FREEZE                   2039534
```

We can conclude that the three most dangerous events for public health and the economy are: \* Hurricanes and typhoons, ranking consistently high on all types of damage; \* Extreme heat, droughts or wildfires, ranking high among casualties and injuries, and also causing losses to agriculture; \* Extreme cold, including freezes and snow, which are also top ranking among casualties and injuries, and crop damages.

### Summarizing the data for these events

We can gather the events that appeared on the tables below under the same category to simplify the analysis.

```
noaa[(noaa$EVTYPE=='HURRICANE ERIN'|noaa$EVTYPE=='HURRICANE OPAL'|noaa$EVTYPE=='HURRICANE'|noaa$EVTYPE=='TYPHOON')|
noaa[(noaa$EVTYPE=='EXTREME HEAT'|noaa$EVTYPE=='HEAT WAVE'|noaa$EVTYPE=='EXCESSIVE HEAT'|noaa$EVTYPE=='WILDFIRE')|
noaa[(noaa$EVTYPE=='HYPOTHERMIA/EXPOSURE'|noaa$EVTYPE=='LOW TEMPERATURE'|noaa$EVTYPE=='RAIN/SNOW'|noaa$EVTYPE=='DROUGHT')|
noaa[(noaa$EVTYPE=='DAMAGING FREEZE'|noaa$EVTYPE=='FROST/FREEZE'|noaa$EVTYPE=='AGRICULTURAL FREEZE'|noaa$EVTYPE=='SNOW')]
```

The 5-number summary (including the mean) for Hurricane/Typhoons is included below:

```
summary(noaa[noaa$EVTYPE=='HURRICANE/TYPHOON',2:5])
```

```
##      FATALITIES      INJURIES      PROPDMG      CROPDMG
##  Min.   : 0.0000  Min.   : 0.000  Min.   :5.000e+03  Min.   : 0
## 1st Qu.: 0.0000  1st Qu.: 0.000  1st Qu.:4.288e+05  1st Qu.: 0
## Median : 0.0000  Median : 0.000  Median :6.950e+06  Median : 0
## Mean   : 0.4433  Mean   : 3.144  Mean   :3.234e+08  Mean   : 10058945
## 3rd Qu.: 0.0000  3rd Qu.: 0.000  3rd Qu.:7.200e+07  3rd Qu.: 5000
## Max.   :13.0000  Max.   :780.000  Max.   :1.693e+10  Max.   :500000000
##                                     NA's   :123
```

This means most events do not cause casualties. However, there are cases where hundreds of injuries may occur. Additionally, these events almost always cause extensive economic damage, on the order of hundreds of millions of dollars. This is mostly hard to prevent due to the nature of Hurricanes.

Regarding excessive heat events:

```
summary(noaa[noaa$EVTYPE=='HEAT',2:5])
```

```
##      FATALITIES      INJURIES      PROPDMG      CROPDMG
##  Min.   : 0.000  Min.   : 0.000  Min.   : 0  Min.   : 0
## 1st Qu.: 0.000  1st Qu.: 0.000  1st Qu.: 0  1st Qu.: 0
## Median : 0.000  Median : 0.000  Median : 0  Median : 0
## Mean   : 2.364  Mean   : 5.761  Mean   : 135367  Mean   : 242310
## 3rd Qu.: 1.000  3rd Qu.: 0.000  3rd Qu.: 0  3rd Qu.: 0
## Max.   :583.000  Max.   :437.000  Max.   :3800000  Max.   :492400000
##                                     NA's   :1849
```

```
summary(noaa[noaa$EVTYPE=='WILDFIRES',2:5])
```

```
##      FATALITIES      INJURIES      PROPDMG      CROPDGMG
## Min.      :0      Min.      :0      Min.      : 500000      Min.      : 0
## 1st Qu.:0      1st Qu.:0      1st Qu.:50000000      1st Qu.: 0
## Median :0      Median :0      Median :50000000      Median : 0
## Mean      :0      Mean      :0      Mean      :40100000      Mean      : 33333
## 3rd Qu.:0      3rd Qu.:0      3rd Qu.:50000000      3rd Qu.: 0
## Max.      :0      Max.      :0      Max.      :50000000      Max.      :500000
##                                     NA's      :10
```

```
summary(noaa[noaa$EVTYPE=='DROUGHT',2:5])
```

```
##      FATALITIES      INJURIES      PROPDMG      CROPDGMG
## Min.      :0      Min.      :0.000000      Min.      : 0      Min.      : 0
## 1st Qu.:0      1st Qu.:0.000000      1st Qu.: 0      1st Qu.: 0
## Median :0      Median :0.000000      Median : 39500      Median : 0
## Mean      :0      Mean      :0.002309      Mean      :10965045      Mean      : 7195198
## 3rd Qu.:0      3rd Qu.:0.000000      3rd Qu.: 8000000      3rd Qu.: 0
## Max.      :0      Max.      :4.000000      Max.      :645150000      Max.      :578850000
##                                     NA's      :1620
```

These are apparently events that occur more frequently, and mostly causes no noticeable damage, with the exception of wildfires. Extreme versions of heat waves may be devastating, though. Hundreds of people may die and hundred million dollars may be lost from a single event.

Regarding excessive cold events:

```
summary(noaa[noaa$EVTYPE=='COLD',2:5])
```

```
##      FATALITIES      INJURIES      PROPDMG      CROPDGMG
## Min.      :0.0000      Min.      : 0.000      Min.      : 5000      Min.      :0
## 1st Qu.:0.0000      1st Qu.: 0.000      1st Qu.: 50000      1st Qu.:0
## Median :0.0000      Median : 0.000      Median : 500000      Median :0
## Mean      :0.3077      Mean      : 1.411      Mean      : 528360      Mean      :0
## 3rd Qu.:1.0000      3rd Qu.: 0.000      3rd Qu.: 500000      3rd Qu.:0
## Max.      :2.0000      Max.      :62.000      Max.      :5000000      Max.      :0
##                                     NA's      :249
```

```
summary(noaa[noaa$EVTYPE=='FROST/FREEZE',2:5])
```

```
##      FATALITIES      INJURIES      PROPDMG      CROPDGMG
## Min.      :0.000000      Min.      :0      Min.      : 0      Min.      : 0
## 1st Qu.:0.000000      1st Qu.:0      1st Qu.: 0      1st Qu.: 0
## Median :0.000000      Median :0      Median : 0      Median : 0
## Mean      :0.003677      Mean      :0      Mean      : 257215      Mean      : 3071550
## 3rd Qu.:0.000000      3rd Qu.:0      3rd Qu.: 0      3rd Qu.: 0
## Max.      :1.000000      Max.      :0      Max.      :8000000      Max.      :286000000
##                                     NA's      :465
```

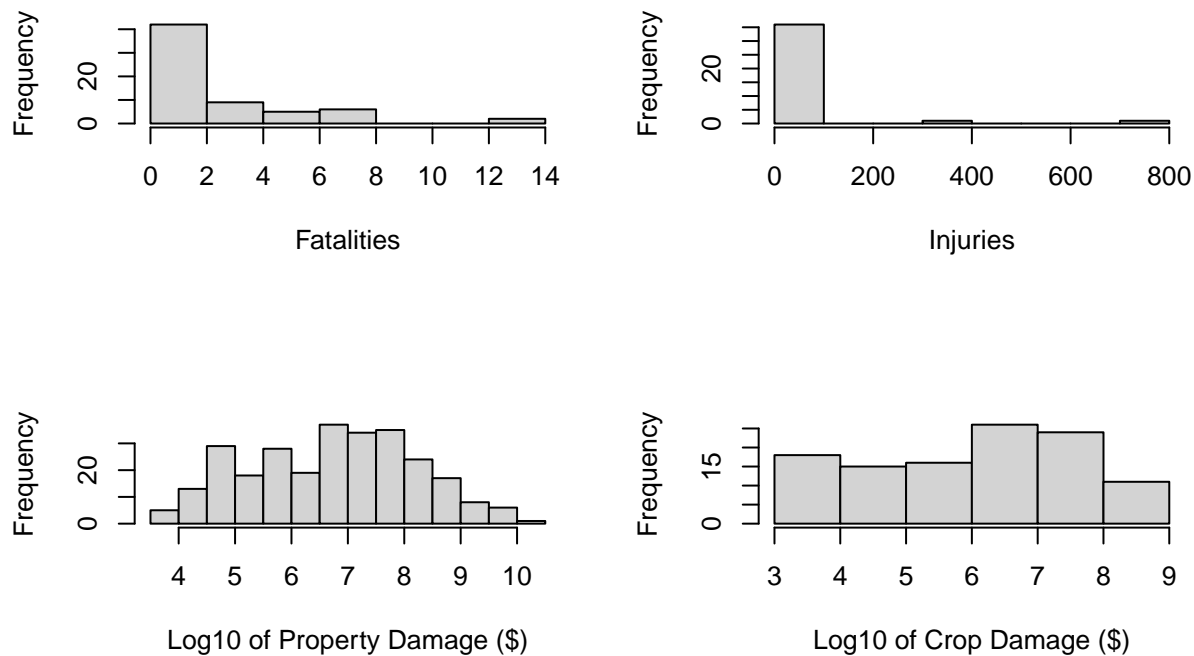
In comparison to the previous categories, these events seem less deadly, but they still pose great economic threats.

## Visualizing the data

Excluding the events where there was no damage, we can plot histograms to visualize the distribution of data.

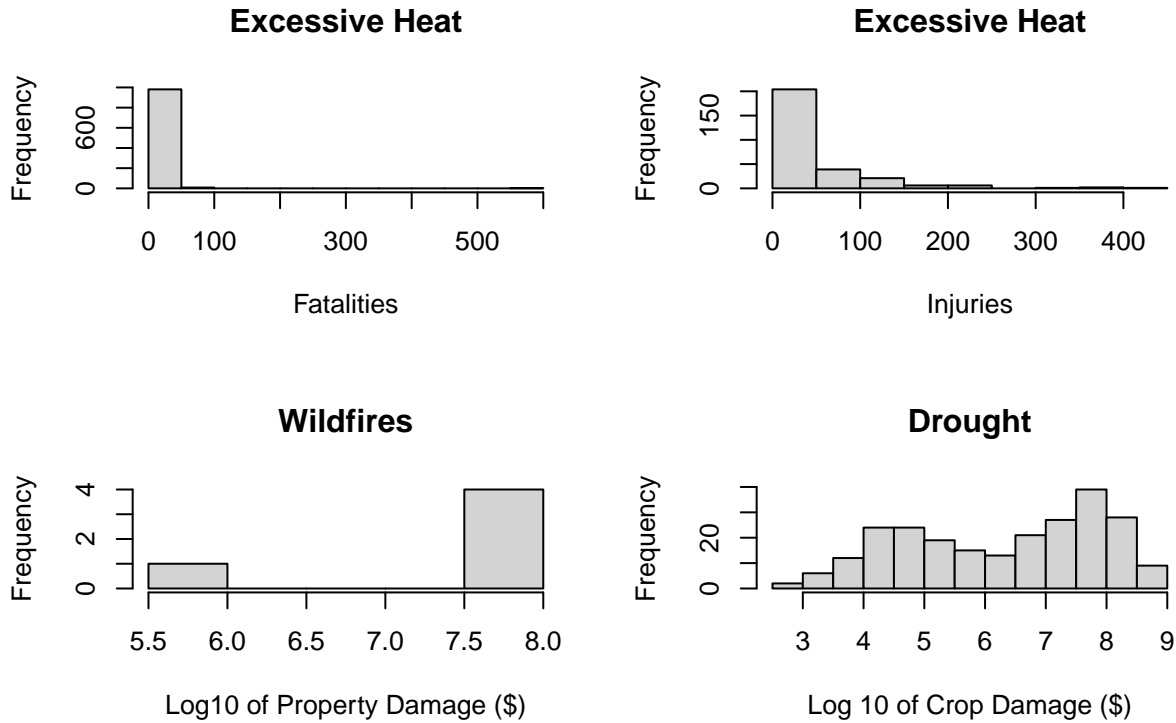
```
par(mfrow=c(2,2),oma=c(0,0,2,0))
hist(noaa[(noaa$EVTYPE=='HURRICANE/TYPHOON') & (noaa$FATALITIES!=0), 'FATALITIES'], main='', xlab='Fatalities')
hist(noaa[(noaa$EVTYPE=='HURRICANE/TYPHOON') & (noaa$INJURIES!=0), 'INJURIES'], main='', xlab='Injuries')
hist(log10(noaa[(noaa$EVTYPE=='HURRICANE/TYPHOON') & (noaa$PROPDGM!=0), 'PROPDGM']), main='', xlab='Log10 of Property Damage ($)')
hist(log10(noaa[(noaa$EVTYPE=='HURRICANE/TYPHOON') & (noaa$CROPDGM!=0), 'CROPDGM']), main='', xlab='Log10 of Crop Damage ($)')
mtext('Hurricane/Typhoon summary', outer=TRUE, cex=1.5)
```

## Hurricane/Typhoon summary



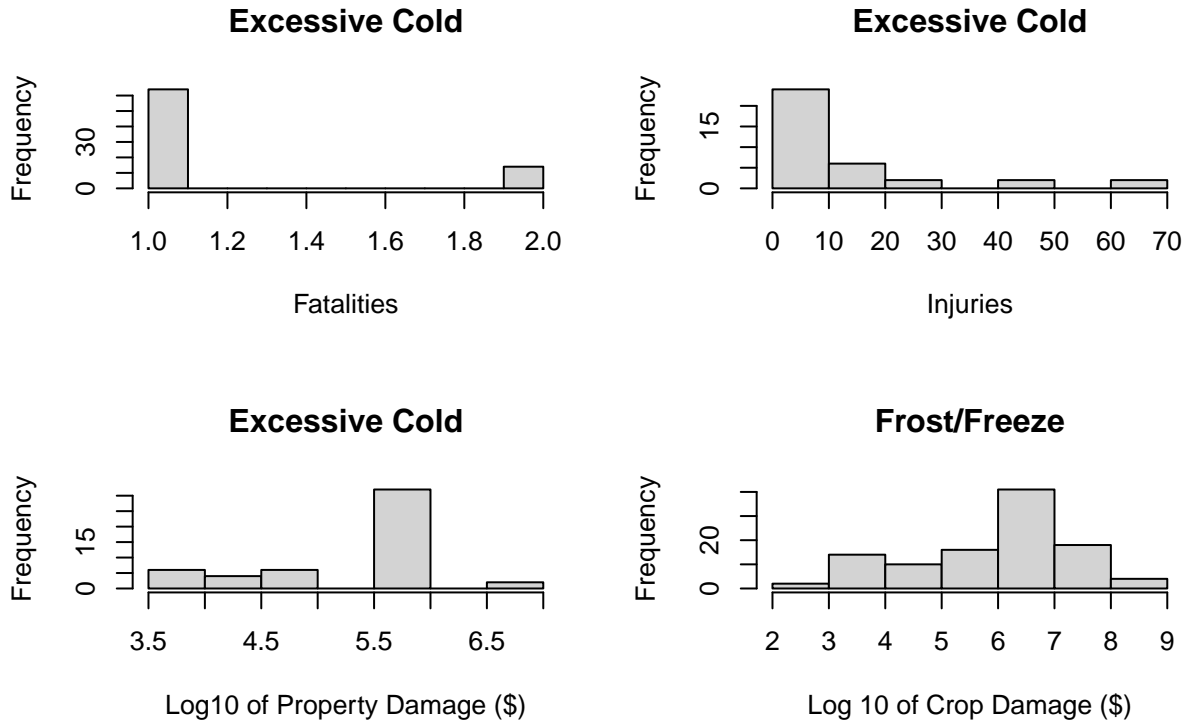
```
par(mfrow=c(2,2),oma=c(0,0,2,0))
hist(noaa[(noaa$EVTYPE=='HEAT') & (noaa$FATALITIES!=0), 'FATALITIES'], main='Excessive Heat', xlab='Fatalities')
hist(noaa[(noaa$EVTYPE=='HEAT') & (noaa$INJURIES!=0), 'INJURIES'], main='Excessive Heat', xlab='Injuries')
hist(log10(noaa[(noaa$EVTYPE=='WILDFIRES') & (noaa$PROPDGM!=0), 'PROPDGM']), main='Wildfires', xlab='Log10 of Property Damage ($)')
hist(log10(noaa[(noaa$EVTYPE=='DROUGHT') & (noaa$CROPDGM!=0), 'CROPDGM']), main='Drought', xlab='Log 10 of Crop Damage ($)')
mtext('Excessive heat events summary', outer=TRUE, cex=1.5)
```

# Excessive heat events summary



```
par(mfrow=c(2,2),oma=c(0,0,2,0))
hist(noaa[(noaa$EVTYPE=='COLD') & (noaa$FATALITIES!=0), 'FATALITIES'], main='Excessive Cold', xlab='Fatalities')
hist(noaa[(noaa$EVTYPE=='COLD') & (noaa$INJURIES!=0), 'INJURIES'], main='Excessive Cold', xlab='Injuries')
hist(log10(noaa[(noaa$EVTYPE=='COLD') & (noaa$PROPDMG!=0), 'PROPDMG']), main='Excessive Cold', xlab='Log10 of Property Damage ($)')
hist(log10(noaa[(noaa$EVTYPE=='FROST/FREEZE') & (noaa$CROPDMG!=0), 'CROPDMG']), main='Frost/Freeze', xlab='Log 10 of Crop Damage ($)')
mtext('Excessive cold events summary', outer=TRUE, cex=1.5)
```

# Excessive cold events summary



## Discussion

The data has informed us that hurricanes/typhoons cause extensive property damage, usually from hundred thousand dollars to a billion dollars, and not only must they be tracked and forecast, but also there must be governmental incentives to research focusing on damage reduction. Hurricanes are also even more malicious because they occur in areas with agricultural crops, causing even more economic danger and threatening food supply.

Extreme weather such as intensive heat or cold are also a threat. The data suggests most of these events cause no damage, but the more acute versions have devastating potential, as seen in 2021 in Canada with hundreds of deaths due to a heat wave, or the death of millions of sea animals in the Pacific coast of the USA. These events are becoming increasingly common due to global warming and is imperative that the countries unite to fight it.