

Analysis of Storm Affects on Population Health and Economy in USA

Introduction

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.

Data Processing

Analysis

Sum aggregates of damages will provide a meaningful measure for our analysis.

Population health (HEALTHDAMAGES) for each event is obtained after cumulative sum of reported injuries and fatalities for each year between 1950 - 2011. Economic affect (DMGCASH) for each event is obtained after cumulative sum of crop and property damage and after applying appropriate multiplier. The results are then sorted and top 25 events and their values are presented. Each storm data event is first grouped into a class and then the sums are obtained for each class.

Loading

There is also some documentation of the database available: https://d396qusza40orc.cloudfront.net/repdata%2Fpeer2_doc%2Fpd01016005curr.pdf https://d396qusza40orc.cloudfront.net/repdata%2Fpeer2_doc%2FNCDCC%20Storm%20Events-FAQ%20Page.pdf The data used for this analysis is available: <https://d396qusza40orc.cloudfront.net/repdata%2Fdata%2FStormData.csv.bz2>.

```
#repdata-data-StormData.csv.bz2 is obtained from https://d396qusza40orc.cloudfront.net/repdata%2Fdata%2FStormData.csv.bz2
data <- read.csv(bzfile("repdata-data-StormData.csv.bz2"))
```

Processing Health Affects

Get only health affects

```
library(ggplot2)
library(data.table)
library(xtable)
health <- data[data$FATALITIES > 0 | data$INJURIES > 0,
               c("EVTYPE", "INJURIES", "FATALITIES")]
health$EVTYPE2 <- as.factor(toupper(health$EVTYPE))
```

Calculate health affects (HEALTHDAMAGES)

```

health$HEALTHDAMAGES <- health$FATALITIES + health$INJURIES;
health.sum <- tapply(health$HEALTHDAMAGES, health$EVTYPE2, sum)
health.sum <- data.frame(EVTYPE2=names(health.sum),
                        HEALTHDAMAGES=health.sum, row.names=NULL)
health.sum <- health.sum[order(health.sum$HEALTHDAMAGES,
                              decreasing=TRUE), ]

xt <- xtable(health.sum)
print(xt, type="html", include.rownames=FALSE)

```

EVTYPE2	
HEALTHDAMAGES	
TORNADO	96979.00
EXCESSIVE HEAT	8428.00
TSTM WIND	7461.00
FLOOD	7259.00
LIGHTNING	6046.00
HEAT	3037.00
FLASH FLOOD	2755.00
ICE STORM	2064.00
THUNDERSTORM WIND	1621.00
WINTER STORM	1527.00
HIGH WIND	1385.00
HAIL	1376.00
HURRICANE/TYPHOON	1339.00
HEAVY SNOW	1148.00

WILDFIRE

986.00

THUNDERSTORM WINDS

972.00

BLIZZARD

906.00

FOG

796.00

RIP CURRENT

600.00

WILD/FOREST FIRE

557.00

HEAT WAVE

551.00

RIP CURRENTS

501.00

DUST STORM

462.00

WINTER WEATHER

431.00

TROPICAL STORM

398.00

AVALANCHE

394.00

EXTREME COLD

393.00

STRONG WIND

383.00

DENSE FOG

360.00

HEAVY RAIN

349.00

HIGH WINDS

337.00

HIGH SURF

260.00

EXTREME HEAT
251.00
GLAZE
223.00
TSUNAMI
162.00
WILD FIRES
153.00
EXTREME COLD/WIND CHILL
149.00
ICE
143.00
WIND
109.00
COLD/WIND CHILL
107.00
HURRICANE
107.00
URBAN/SML STREAM FLD
107.00
TSTM WIND/HAIL
100.00
WINTER WEATHER/MIX
100.00
HEAVY SURF/HIGH SURF
90.00
LANDSLIDE
90.00
COLD
86.00
WINTRY MIX
78.00
WINTER WEATHER MIX
68.00
RECORD HEAT
52.00

STORM SURGE

51.00

TROPICAL STORM GORDON

51.00

HEAVY SURF

48.00

DUST DEVIL

45.00

WATERSPOUT/TORNADO

45.00

SNOW SQUALL

37.00

ICY ROADS

36.00

MARINE STRONG WIND

36.00

MARINE THUNDERSTORM WIND

36.00

SNOW

36.00

SNOW/HIGH WINDS

36.00

FLOOD/FLASH FLOOD

32.00

WATERSPOUT

32.00

DRY MICROBURST

31.00

FREEZING RAIN

30.00

STRONG WINDS

29.00

UNSEASONABLY WARM AND DRY

29.00

MIXED PRECIP

28.00

UNSEASONABLY WARM	
28.00	
FLASH FLOODING	
27.00	
THUNDERSTORMW	
27.00	
WINTER STORMS	
27.00	
BLACK ICE	
25.00	
TORNADOES, TSTM WIND, HAIL	
25.00	
EXCESSIVE RAINFALL	
23.00	
HIGH WIND AND SEAS	
23.00	
EXTREME WINDCHILL	
22.00	
HEAT WAVE DROUGHT	
19.00	
FREEZING DRIZZLE	
17.00	
MARINE TSTM WIND	
17.00	
RECORD/EXCESSIVE HEAT	
17.00	
BLOWING SNOW	
16.00	
STORM SURGE/TIDE	
16.00	
TORNADO F2	
16.00	
WINTER STORM HIGH WINDS	
16.00	
GLAZE/ICE STORM	
15.00	

GUSTY WINDS
15.00
COLD AND SNOW
14.00
FLASH FLOOD/FLOOD
14.00
HIGH SEAS
13.00
ROUGH SEAS
13.00
THUNDERSTORM
13.00
MARINE MISHAP
12.00
HEAVY SNOW/ICE
10.00
SMALL HAIL
10.00
THUNDERSTORM WINDS
10.00
HIGH WINDS/SNOW
9.00
FLOODING
8.00
HURRICANE ERIN
7.00
HYPOTHERMIA/EXPOSURE
7.00
LOW TEMPERATURE
7.00
NON-SEVERE WIND DAMAGE
7.00
MUDSLIDE
6.00
RAIN/SNOW
6.00

COASTAL FLOOD

5.00

COASTAL FLOODING/EROSION

5.00

COASTAL STORM

5.00

COLD WEATHER

5.00

FLASH FLOODING/FLOOD

5.00

HEAT WAVES

5.00

RIP CURRENTS/HEAVY SURF

5.00

ROUGH SURF

5.00

SNOW AND ICE

5.00

TYPHOON

5.00

DROUGHT

4.00

FROST

4.00

HEAVY RAINS

4.00

HIGH WINDS/COLD

4.00

HIGH WIND/SEAS

4.00

OTHER

4.00

RIVER FLOOD

4.00

THUNDERSTORM WINDSS

4.00

TORRENTIAL RAINFALL	
4.00	
COASTAL FLOODING	
3.00	
COLD WAVE	
3.00	
FUNNEL CLOUD	
3.00	
HEAVY SEAS	
3.00	
HEAVY SURF AND WIND	
3.00	
HIGH WATER	
3.00	
LIGHT SNOW	
3.00	
MARINE ACCIDENT	
3.00	
RIVER FLOODING	
3.00	
TSTM WIND (G45)	
3.00	
BRUSH FIRE	
2.00	
COLD TEMPERATURE	
2.00	
DROUGHT/EXCESSIVE HEAT	
2.00	
EXCESSIVE SNOW	
2.00	
FALLING SNOW/ICE	
2.00	
FLASH FLOODS	
2.00	
FOG AND COLD TEMPERATURES	
2.00	

GUSTY WIND

2.00

HEAVY SNOW AND HIGH WINDS

2.00

HEAVY SNOW SHOWER

2.00

HURRICANE EDOUARD

2.00

HURRICANE-GENERATED SWELLS

2.00

HURRICANE OPAL

2.00

HURRICANE OPAL/HIGH WINDS

2.00

ICE STORM/FLASH FLOOD

2.00

LANDSLIDES

2.00

MARINE HIGH WIND

2.00

ROGUE WAVE

2.00

SLEET

2.00

THUNDERSNOW

2.00

TORNADO F3

2.00

UNSEASONABLY COLD

2.00

WARM WEATHER

2.00

WINDS

2.00

AVALANCE

1.00

COASTALSTORM

1.00

COLD/WINDS

1.00

DROWNING

1.00

DRY MIRCOCURST WINDS

1.00

EXTENDED COLD

1.00

FLOOD & HEAVY RAIN

1.00

FLOOD/RIVER FLOOD

1.00

FREEZE

1.00

FREEZING RAIN/SNOW

1.00

FREEZING SPRAY

1.00

HAZARDOUS SURF

1.00

HEAVY SNOW/BLIZZARD/AVALANCHE

1.00

HIGH

1.00

HIGH SWELLS

1.00

HIGH WAVES

1.00

HIGH WIND 48

1.00

HIGH WIND/HEAVY SNOW

1.00

HURRICANE EMILY

1.00

HURRICANE FELIX

1.00

HYPERTHERMIA/EXPOSURE

1.00

HYPOTHERMIA

1.00

ICE ON ROAD

1.00

ICE ROADS

1.00

LIGHTNING.

1.00

LIGHTNING AND THUNDERSTORM WIN

1.00

LIGHTNING INJURY

1.00

MINOR FLOODING

1.00

MUDSLIDES

1.00

NON TSTM WIND

1.00

RAIN/WIND

1.00

RAPIDLY RISING WATER

1.00

RECORD COLD

1.00

SNOW/ BITTER COLD

1.00

SNOW SQUALLS

1.00

THUNDERSTORMS WINDS

1.00

THUNDERSTORM WIND (G40)

1.00

THUNDERSTORM WIND G52

1.00

THUNDERSTORM WINDS 13

1.00

THUNDERSTORM WINDS/HAIL

1.00

THUNDERTORM WINDS

1.00

TIDAL FLOODING

1.00

TSTM WIND (G35)

1.00

TSTM WIND (G40)

1.00

URBAN AND SMALL STREAM FLOODIN

1.00

WATERSPOUT TORNADO

1.00

WHIRLWIND

1.00

WIND STORM

1.00

Processing Economic Affects

Extract economic affects

```
economic <- data[data$PROPDMG > 0 | data$CROPDMG > 0,  
                 c("EVTYPE", "PROPDMG", "PROPDMGEXP", "CROPDMG", "CROPDMGEXP")]  
economic$EVTYPE2 <- as.factor(toupper(economic$EVTYPE))
```

Calculate economic damages (DMGCASH).

The numeric values and its multiple are present in different columns. The multiplier can be either character (e.g “H”, “K”, “M” or “B” for hunderds, thousands, millions or billions) or exponent values. We assume the multiplier == 1 when it does not fall into either of the above two classes.

```
economic$PROPDMGEXP <- as.factor(toupper(as.character(economic$PROPDMGEXP)))  
economic$CROPDMGEXP <- as.factor(toupper(as.character(economic$CROPDMGEXP)))  
  
dvals <- unique(union(economic$PROPDMGEXP, economic$CROPDMGEXP))  
DMGEXP <- numeric(18)  
names(DMGEXP) <- dvals
```

```

DMGEXP[names(DMGEXP) %in% c("", "+", "-", "?")] <- 0
DMGEXP["H"] <- 2
DMGEXP["K"] <- 3
DMGEXP["M"] <- 6
DMGEXP["B"] <- 9

economic$PROPDMG CASH <- economic$PROPDMG * (10 ^ DMGEXP[economic$PROPDMGEXP])
economic$CROPDMG CASH <- economic$CROPDMG * (10 ^ DMGEXP[economic$CROPDMGEXP])
economic$DMG CASH <- economic$CROPDMG CASH + economic$PROPDMG CASH
#sum(is.na(economic$DMG CASH))
economic.sum <- tapply(economic$DMG CASH, economic$EVTYPE2, sum)
economic.sum <- data.frame(EVTYPE2=names(economic.sum),
                           DMG CASH=economic.sum, row.names=NULL)
economic.sum <- economic.sum[order(economic.sum$DMG CASH, decreasing=TRUE), ]

```

Processing Event Class Affects

Make groups by events.

```

groups <- function (sd) {
  heat <- grep("HEAT|HYPER THERMIA", sd$EVTYPE2, ignore.case=TRUE)
  fire <- grep("FIRE", sd$EVTYPE2, ignore.case=TRUE)
  drought <- grep("DROUGHT", sd$EVTYPE2, ignore.case=TRUE)
  coastal <- grep("CURRENT|SURF|SEAS|WAVE|MARINE", sd$EVTYPE2, ignore.case=TRUE)
  lightning <- grep("LIGHTNING", sd$EVTYPE2, ignore.case=TRUE)
  rain <- grep("RAIN|LANDSLIDE|MUDSLIDE|AVALANCH?E", sd$EVTYPE2, ignore.case=TRUE)
  flood <- grep("FLOOD|TSUNAMI|WATER|FLD", sd$EVTYPE2, ignore.case=TRUE)
  fog <- grep("FOG", sd$EVTYPE2, ignore.case=TRUE)
  snow.cold <- grep("SNOW|COLD|HYPOTHERMIA|WINTER|HAIL|BLIZZARD|ICE|ICY|FREEZ|FROST|GLAZE|WINT",
                    sd$EVTYPE2, ignore.case=TRUE)
  blizzard <- grep("BLIZZARD", sd$EVTYPE2, ignore.case=TRUE)
  tornado <- grep("TORNADO", sd$EVTYPE2, ignore.case=TRUE)
  thunderstorm <- grep("THUNDERSTORM|TSTM", sd$EVTYPE2, ignore.case=TRUE)
  hurricane <- setdiff(grep("HURRICANE|TYPHOON", sd$EVTYPE2,
                           ignore.case=TRUE), thunderstorm)
  storm <- setdiff(grep("STORM", sd$EVTYPE2, ignore.case=TRUE),
                   union(thunderstorm, c(blizzard, hurricane)))
  wind <- setdiff(grep("WIND", sd$EVTYPE2, ignore.case=TRUE), thunderstorm)
  accounted <- unique(c(tornado, heat, snow.cold, drought, flood, lightning, fire, rain, fog, coastal,
                       thunderstorm, wind, hurricane, blizzard, storm))
  others <- setdiff(1:nrow(sd), accounted)

  groups <- data.frame()
  groups <- rbind(groups, data.frame(group="TORNADO", EVTYPE2=unique(sd[tornado, c("EVTYPE2")]))))
  groups <- rbind(groups, data.frame(group="HEAT", EVTYPE2=unique(sd[heat, c("EVTYPE2")]))))
  groups <- rbind(groups, data.frame(group="SNOW/COLD", EVTYPE2=unique(sd[snow.cold, c("EVTYPE2")]))))
  groups <- rbind(groups, data.frame(group="DROUGHT", EVTYPE2=unique(sd[drought, c("EVTYPE2")]))))
  groups <- rbind(groups, data.frame(group="FLOOD", EVTYPE2=unique(sd[flood, c("EVTYPE2")]))))
  groups <- rbind(groups, data.frame(group="LIGHTNING", EVTYPE2=unique(sd[lightning, c("EVTYPE2")]))))
  groups <- rbind(groups, data.frame(group="FIRE", EVTYPE2=unique(sd[fire, c("EVTYPE2")]))))
  groups <- rbind(groups, data.frame(group="RAIN", EVTYPE2=unique(sd[rain, c("EVTYPE2")]))))
  groups <- rbind(groups, data.frame(group="FOG", EVTYPE2=unique(sd[fog, c("EVTYPE2")]))))

```

```

groups <- rbind(groups, data.frame(group="COASTAL", EVTYPE2=unique(sd[coastal, c("EVTYPE2")]))))
groups <- rbind(groups, data.frame(group="THUNDERSTORM",
                                   EVTYPE2=unique(sd[thunderstorm, c("EVTYPE2")]))))
groups <- rbind(groups, data.frame(group="WIND", EVTYPE2=unique(sd[wind, c("EVTYPE2")]))))
groups <- rbind(groups, data.frame(group="HURRICANE", EVTYPE2=unique(sd[hurricane, c("EVTYPE2")]))))
groups <- rbind(groups, data.frame(group="BLIZZARD", EVTYPE2=unique(sd[blizzard, c("EVTYPE2")]))))
groups <- rbind(groups, data.frame(group="OTHER STORMS", EVTYPE2=unique(sd[storm, c("EVTYPE2")]))))
groups <- rbind(groups, data.frame(group="OTHER", EVTYPE2=unique(sd[others, c("EVTYPE2")]))))
groups
}

```

Calculate health affects by storm event classes

```

health.grp <- groups(health)
health.mrg <- merge(health.sum, health.grp,
                   by.x="EVTYPE2", by.y="EVTYPE2",
                   all.x=TRUE, all.y=FALSE)

health.mrg.sum <- tapply(health.mrg$HEALTHDAMAGES, health.mrg$group, sum)
health.mrg.sum <- data.frame(GROUP=names(health.mrg.sum),
                             HEALTHDAMAGES=health.mrg.sum, row.names=NULL)
xt <- xtable(health.mrg.sum)
print(xt, type="html", include.rownames=FALSE)

```

GROUP

HEALTHDAMAGES

TORNADO

97068.00

HEAT

12363.00

SNOW/COLD

9327.00

DROUGHT

25.00

FLOOD

10480.00

LIGHTNING

6049.00

FIRE

1698.00

RAIN

914.00

FOG

1158.00

COASTAL
2315.00
THUNDERSTORM
10298.00
WIND
2692.00
HURRICANE
1468.00
BLIZZARD
907.00
OTHER STORMS
4636.00
OTHER
125.00

Calculate economic affects by storm event classes

```
economic.grp <- groups(economic)
economic.mrg <- merge(economic.sum, economic.grp,
                      by.x="EVTYPE2", by.y="EVTYPE2",
                      all.x=TRUE, all.y=FALSE)

economic.mrg.sum <- tapply(economic.mrg$DMGCASH, economic.mrg$group, sum)
economic.mrg.sum <- data.frame(GROUP=names(economic.mrg.sum),
                              DMGCASH=economic.mrg.sum, row.names=NULL)
xt <- xtable(economic.mrg.sum)
print(xt, type="html", include.rownames=FALSE)
```

GROUP
DMGCASH
TORNADO
220003318555.78
HEAT
4706.04
SNOW/COLD
20001828422.38
DROUGHT
38253.45
FLOOD
22003072590.57
LIGHTNING

610292.89
FIRE
134789.03
RAIN
2000093457.15
FOG
17259.26
COASTAL
12972.51
THUNDERSTORM
80003113210.84
WIND
35015487311.30
HURRICANE
36824.44
BLIZZARD
26195.48
OTHER STORMS
296656.54
OTHER
12707.58

Results

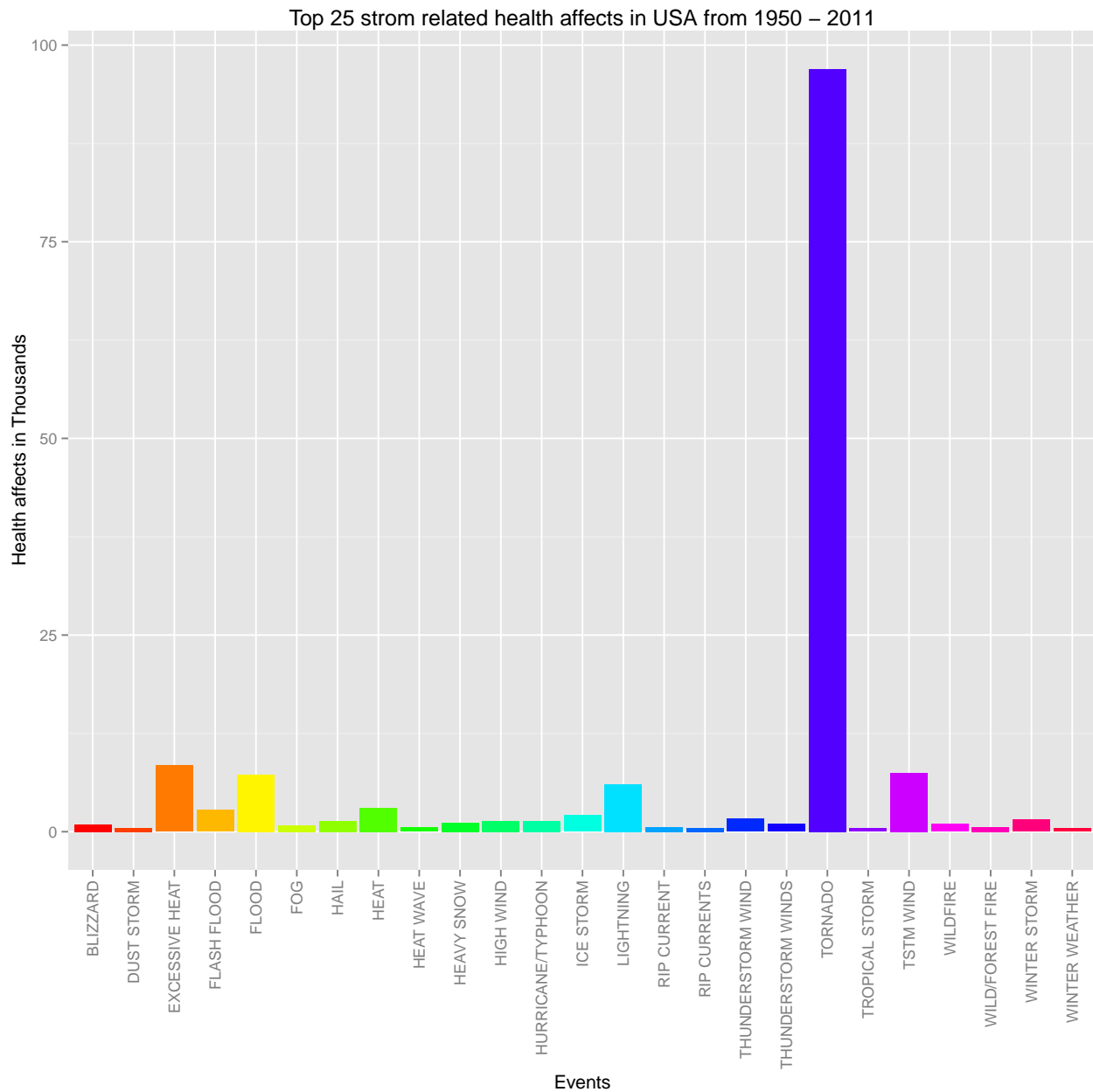
Health Affects

Show top health affects

```
health.sum.top <- head(health.sum, n=25)
health.sum.top$HEALTHDAMAGES <- health.sum.top$HEALTHDAMAGES / 1000

sdh.gp <- ggplot(health.sum.top, aes(x=EVTTYPE2, y=HEALTHDAMAGES)) +
  xlab("Events") +
  ylab("Health affects in Thousands") +
  ggtitle(paste("Top", nrow(health.sum.top),
                "storm related health affects in USA from 1950 - 2011")) +
  geom_bar(stat="identity", fill=rainbow(n=length(health.sum.top$EVTTYPE2))) +
  theme(axis.text.x = element_text(angle = 90, hjust = 1, vjust=0.5))

sdh.gp
```



Economic Affects

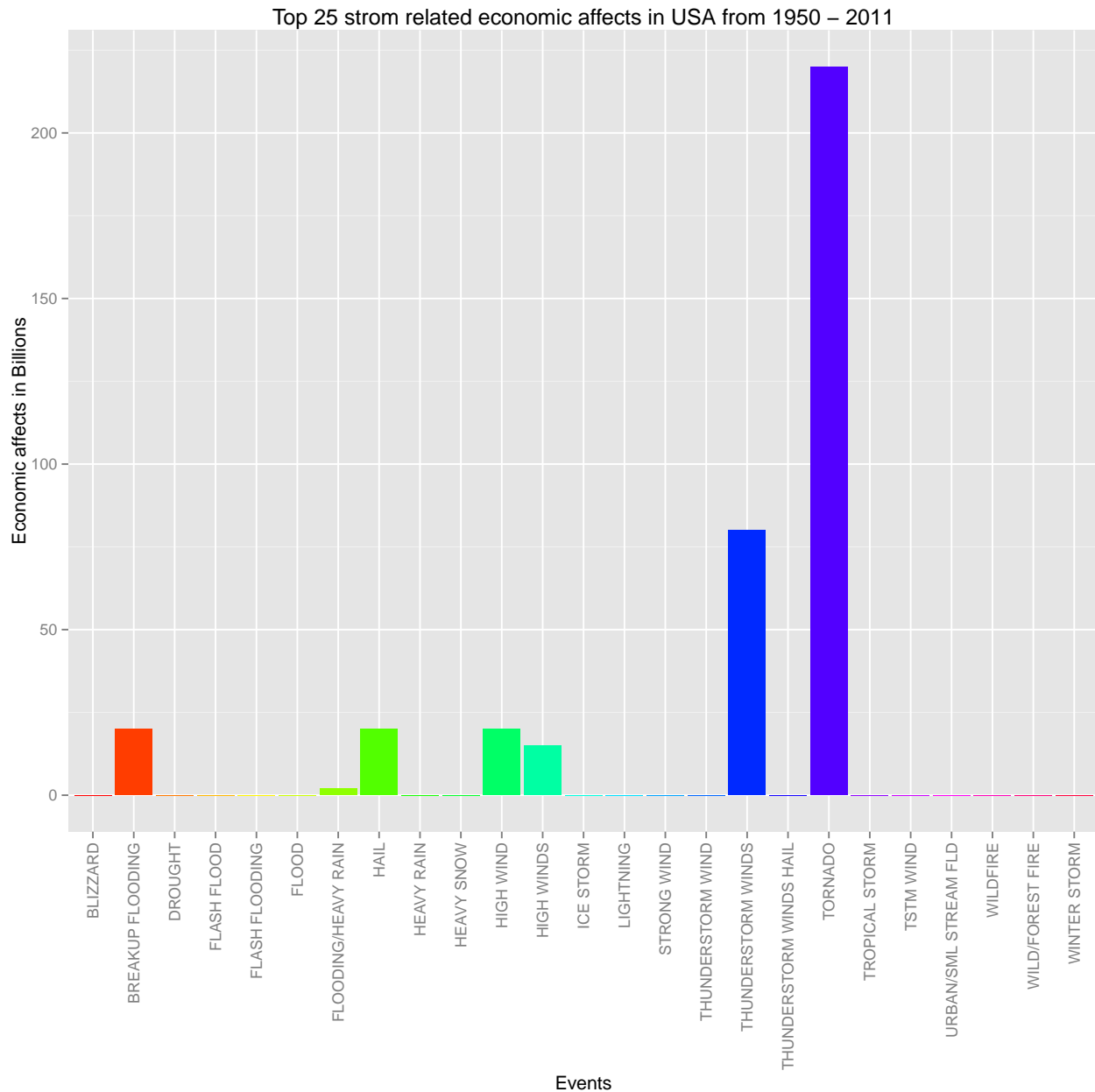
Show top economic affects

```
economic.sum.top <- head(economic.sum, n=25)
economic.sum.top$DMGCASH <- economic.sum.top$DMGCASH / (10^9)

sde.gp <- ggplot(economic.sum.top, aes(x=EVTYPE2, y=DMGCASH)) +
  xlab("Events") +
  ylab("Economic affects in Billions") +
  ggtitle(paste("Top", nrow(economic.sum.top),
    "storm related economic affects in USA from 1950 - 2011")) +
  geom_bar(stat="identity", fill=rainbow(n=length(economic.sum.top$EVTYPE2))) +
```

```
theme(axis.text.x = element_text(angle = 90, hjust = 1, vjust=0.5))
```

sde.gp



Event Class Affects

We use multiplot function, which is obtained from [http://www.cookbook-r.com/Graphs/Multiple_graphs_on_one_page_\(ggplot2\)/](http://www.cookbook-r.com/Graphs/Multiple_graphs_on_one_page_(ggplot2)/)

Show health and economic affects by storm event classes

```
health.mrg.sum$HEALTHDAMAGES <- health.mrg.sum$HEALTHDAMAGES / 1000
economic.mrg.sum$DMGCASH <- economic.mrg.sum$DMGCASH / (10^9)
```

```

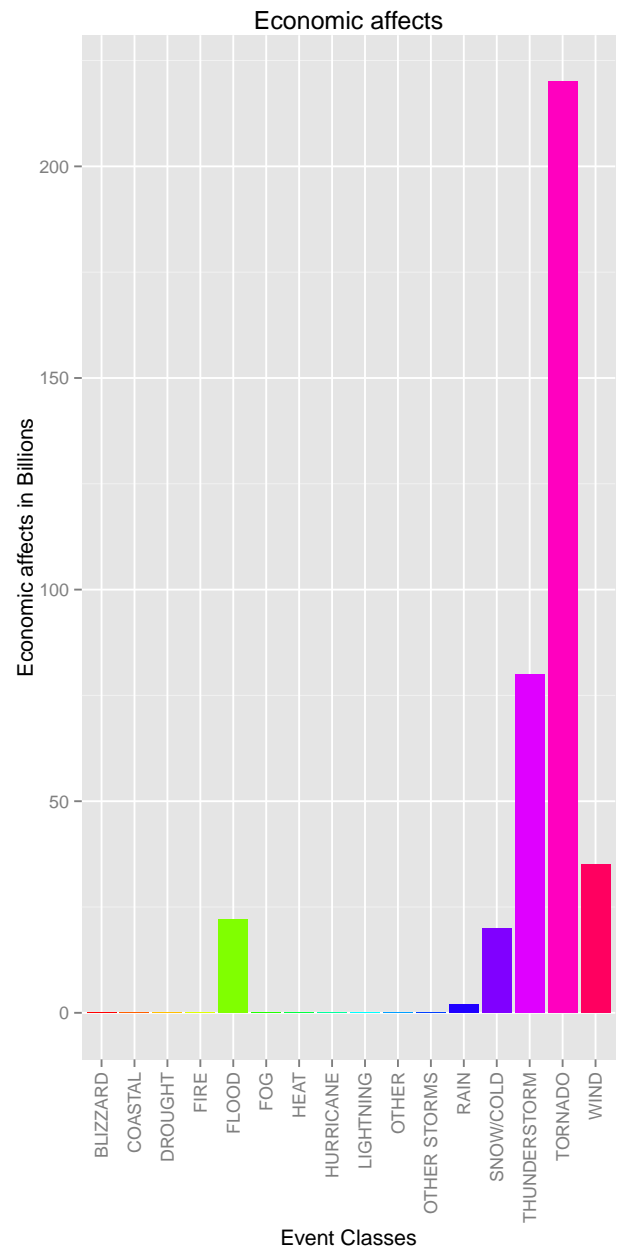
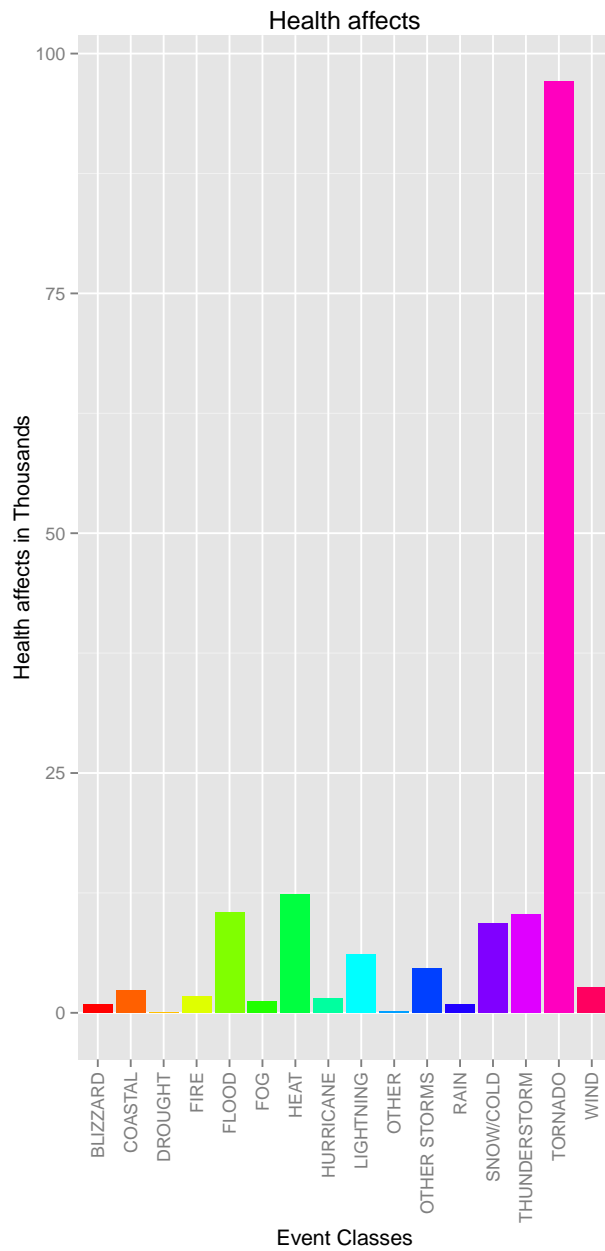
sdh.grp.gp <- ggplot(health.mrg.sum, aes(x=GROUP, y=HEALTHDAMAGES)) +
  xlab("Event Classes") +
  ylab("Health affects in Thousands") +
  ggtitle("Health affects") +
  geom_bar(stat="identity", fill=rainbow(n=length(health.mrg.sum$GROUP))) +
  theme(axis.text.x = element_text(angle = 90, hjust = 1, vjust=0.5))

sde.grp.gp <- ggplot(economic.mrg.sum, aes(x=GROUP, y=DMGCASH)) +
  xlab("Event Classes") +
  ylab("Economic affects in Billions") +
  ggtitle("Economic affects") +
  geom_bar(stat="identity", fill=rainbow(n=length(economic.mrg.sum$GROUP))) +
  theme(axis.text.x = element_text(angle = 90, hjust = 1, vjust=0.5))

multiplot(sdh.grp.gp, sde.grp.gp, cols=2)

```

```
## Loading required package: grid
```



Conclusion

This paper presents the types of storm related events that are responsible for most negative affects in USA from 1950 to 2011