

# NOAA Storm Database - worst cases

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*2017 maio, 20*

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# 1 Introduction

In this study we have analysed the NOAA Storm Database in order to determine what are the worst natural catastrophic events, both in terms of public health and in economic impact.

The U.S. National Oceanic and Atmospheric Administration's (NOAA) storm 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 database currently contains data from January 1950 to January 2017, as entered by NOAA's National Weather Service (NWS).

The database can be found on:

<https://www.ncdc.noaa.gov/stormevents/ftp.jsp>

RPubs version: <http://rpubs.com/erickfis/noaa>

GitHub version, with code included and pdf version: <https://github.com/erickfis/NOAA-Storm-Database>

## 2 Objective

The goal of this study is to answer the questions:

1. Across the United States, which types of events were the most harmful with respect to population health ever recorded in a single occurrence?
2. Which types of events caused most harm to population health along all those years?
3. Which types of events had the greatest economic consequences in a single occurrence?
4. Which types of events had the greatest economic consequences along all those years?
5. Which were the places that were subject to the greatest losses, both in terms of human health and economic losses.

## 3 Methods

To answer each one of those questions, we did a very simple **descriptive analysis** of data.

We used R tools to filter, sort and combine data, so we could get the total sum of fatalities, injuries and economic losses.

## 4 Data Processing

### 4.1 Software and instructions for reproducibility

This study was conducted under the following software:

- R version 3.4.0 (2017-04-21)
- Platform x86\_64-pc-linux-gnu
- OS: Linux Mint 18.1 Serena

Using the same versions under the same OS should guaranty reproducibility.

This script downloads the relevant raw data from NOAA repository, under `ftp://ftp.ncdc.noaa.gov/pub/data/swdi/stormevents/csvfiles/`, and process it.

It is not necessary to keep the files downloaded after running this script because it writes the processed data to the file “data/harm.rds”

Then everytime it is runned, it checks for new data on the ftp server. If there is new data, it will download the files missing and raw process everything again.

## 4.2 Raw data processing

In order to answer our questions, the original database needed to be treated from its raw form to a more useful format.

The necessary transformations were:

- sanitized var names
- evaluated duration of events, however they are not useful
- evaluated damages values according to multipliers provided
- sanitized and grouped similar events: strong snow, heavy snow and light snow all became just “snow”
- sanitized county names

This database has 1423556 observations. Each observation corresponds to an event occurrence.

To determine the most harmful events to human health, we checked the variables related to human health, which are “fatalities” and “injuries”.

To determine the most harmful events to economy, we checked the variables related to economic measures, from “propdmg” through “cropldmgexp”.

Also, in order to analyse various occurrences of the same event, we measured the duration of the event, its magnitude and where the event occurred (state and county name).

This is a really big database whose data has been being registered by a lot of different people since 1950. Thus, as expected, there are variations on how people registered events.

For example, the string “snow” was used to register a lot of events. They are the same type of event, but count as different:

This is why we decided to filter those events: we grouped them by its common strings.

## 5 Human health: the most harmful events

We have determined what events did more harm to human health.

There were occurrences that caused zero fatalities but a lot of injuries. The inverse is also true, so we did a separate analysis to fatal and non-fatal events.

### 5.1 Fatal Occurrences

#### 5.1.1 Most fatal in a single occurrence

Most fatal in a single occurrence

In order to determine what were the most fatal events in a single occurrence, we need to see how fatalities are distributed along the occurrences.

Looking at this distribution, we can infer that the vast majority of those occurrences were not fatal at all: **99.2% occurrences didn't caused any fatalities.**

On the other hand, fatal occurrences had to have at least 1 fatality.

Now, among the fatal occurrences, we are interested in the ones whose fatalities are beyond the confidence interval, ie. above 99% of the most common values.

Looking at this distribution, we can infer that **99.8% of the fatal occurrences caused up to 57.023 fatalities.**

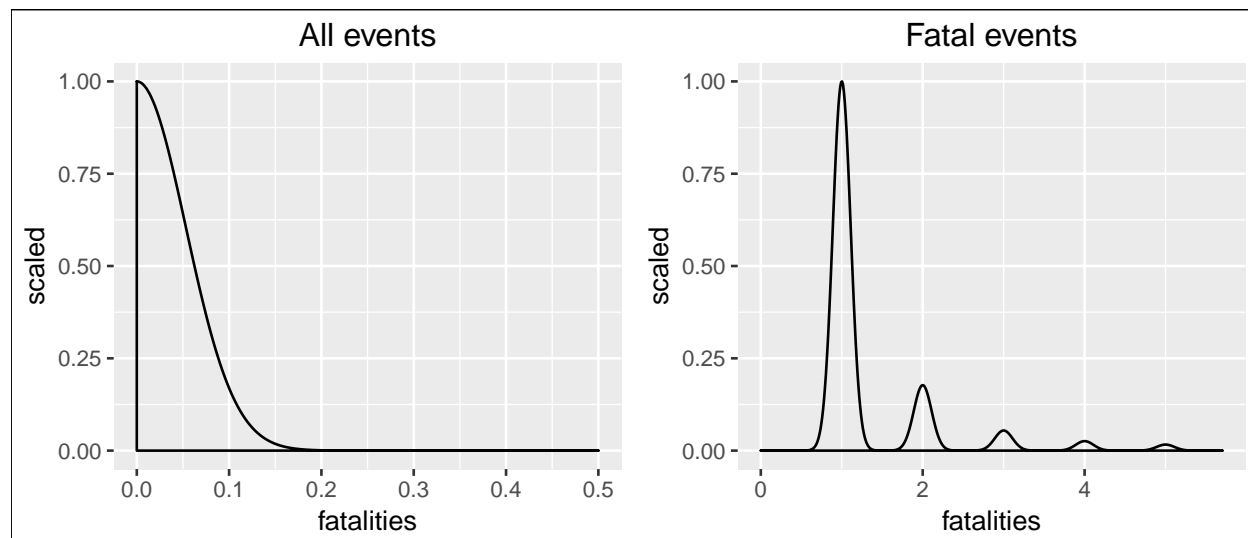


Figure 1: Population distribution for fatalities / occurrences

In this study, we looked on the 1% deadliest occurrences.

Table 1: Worst fatal occurrences, mean = 1.9 and median = 1

rank	event	day	state	county	fatalities
1	hurricane	2005-08-28	louisiana	orleans	638
2	tornado	2011-05-22	missouri	jasper	161
3	hurricane	2005-08-28	louisiana	lower.st.bernard	140
4	tornado	1953-06-08	michigan	genesee	116
5	tornado	1953-05-11	texas	mclennan	114
6	hurricane	2005-08-28	mississippi	harrison	97
7	heat	1999-07-28	illinois	cook	93
8	tornado	1953-06-09	massachusetts	worcester	90
9	tornado	1955-05-25	kansas	cowley	75
10	heat	1999-07-04	pennsylvania	philadelphia	58

The single most fatal event was a **hurricane, that occurred in louisiana, orleans, on 2005-08-28, killing 638 people.**

However, if we compare this single awful event to the mean of fatalities caused, we see that this is very unlikely to happen.

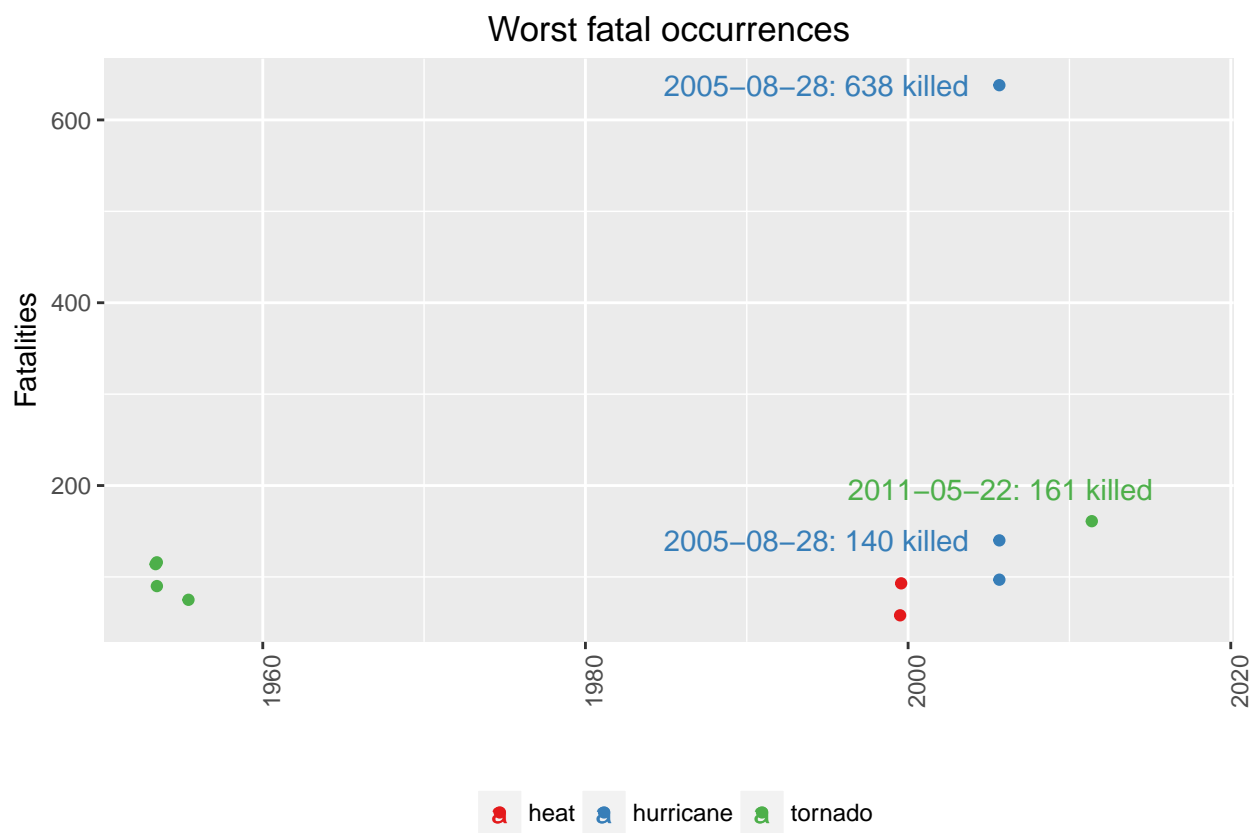


Figure 2: Worst fatal occurrences

### 5.1.2 Most fatal in all time

Most fatal in all time

Notice that are several occurrences of the same type of event along the time.

Therefore, in order to know which is the worst type of event along all the years, we summed up the fatalities caused by each one of occurrences of this events.

Notice that we are interested only in the worst of them, ie, the ones which are above the mean.

Table 2: Total fatalities by event, mean = 678.21 and median = 184

rank	event	total
1	tornado	5878
2	heat	2854
3	wind	2308
4	flood	1948
5	winter	1200
6	hurricane	1128
7	lightning	832
8	rip current	798

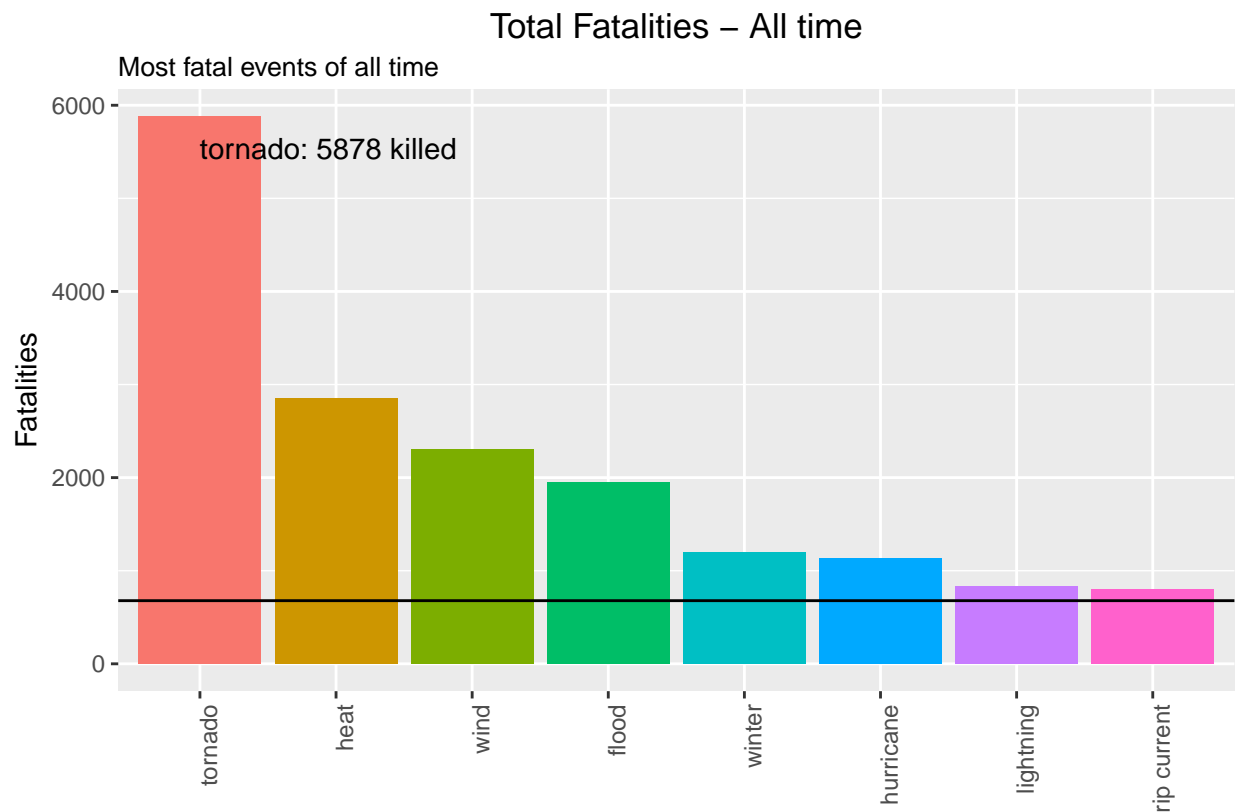


Figure 3: Total fatalities by event

The most fatal event along the time is the **tornado**. It has killed **5878** people until now.

### 5.1.3 Least fatal events

Just for curiosity, these are the less fatal among the fatal events:

Table 3: Least fatal events

rank	event	total
28	tropical depression	1
27	dense smoke	2
26	sleet	2
25	waterspout	2
24	cold	4
23	dust devil	4
22	slide	4
21	sneakerwave	14
20	hail	20
19	tide	22

## 5.2 Injuring Occurrences

### 5.2.1 Most injuring in a single occurrence

Most injuring in a single occurrence

In order to determine what were the most injuring events in a single occurrence, we need to see how injuries are distributed along the occurrences.

Looking at this distribution, we can infer that the vast majority of those occurrences were not injuring at all: **98.5% occurrences didn't caused any injuries**

On the other hand, injuring occurrences had to have at least 1 injury.

Now, among the injuring occurrences, we are interested in the ones whose harm is beyond the confidence interval, ie. above 99% of the most common values.

Looking at this distribution, we can infer that **99.8% of the injuring occurrences caused up to 500 injuries**.

In this study, we looked on the 1% most injuring occurrences.

Table 4: Worst injuring occurrences, mean = 7.57 and median = 2

rank	event	day	state	county	injuries
1	hurricane	2008-09-12	texas	harris	2400
2	tornado	1979-04-10	texas	wichita	1700
3	tornado	1953-06-09	massachusetts	worcester	1228
4	tornado	1974-04-03	ohio	greene	1150
5	tornado	2011-05-22	missouri	jasper	1150
6	flood	1998-10-17	texas	comal	800
7	tornado	2011-04-27	alabama	tuscaloosa	800
8	tornado	1953-06-08	michigan	genesee	785
9	hurricane	2004-08-13	florida	charlotte	700
10	tornado	2011-04-27	alabama	jefferson	700
11	flood	1998-10-17	texas	bexar	600
12	tornado	1953-05-11	texas	mclennan	597

rank	event	day	state	county	injuries
13	tornado	1965-04-11	indiana	howard	560
14	heat	2007-08-04	missouri	st.louis	519
15	tornado	1966-03-03	mississippi	hinds	504

The single most injuring event was a **hurricane, that occurred in texas, harris, on 2008-09-12, injuring 2400 people.**

However, if we compare this single awful event to the mean of injuries caused, we see that this is very unlikely to happen.

### 5.2.2 Most injuring in all time

Notice that are several occurrences of the same type of event along the time.

Therefore, in order to know which is the worst type of event along all the years, we summed up the injuries caused by each one of occurrences of this events.

Notice that we are interested only in the worst of them, ie, the ones which are above the mean.

Table 5: Total injuries by event, mean = 5204.68 and median = 317

rank	event	total
1	tornado	94704
2	heat	15436
3	wind	13445
4	flood	8809
5	winter	8240

The most injuring event along the time is the **tornado. It has injured 94704 people until now.**

### 5.2.3 Least injuring events

Just for curiosity, lets show now what are the less injuring among the injuring events:

Table 6: Least injuring events

rank	event	total
31	funnel	3
30	tropical depression	3
29	waterspout	3
28	other	4
27	drought	8
26	sleet	10
25	sneakerwave	11
24	slide	13
23	cold	15
22	dense smoke	17



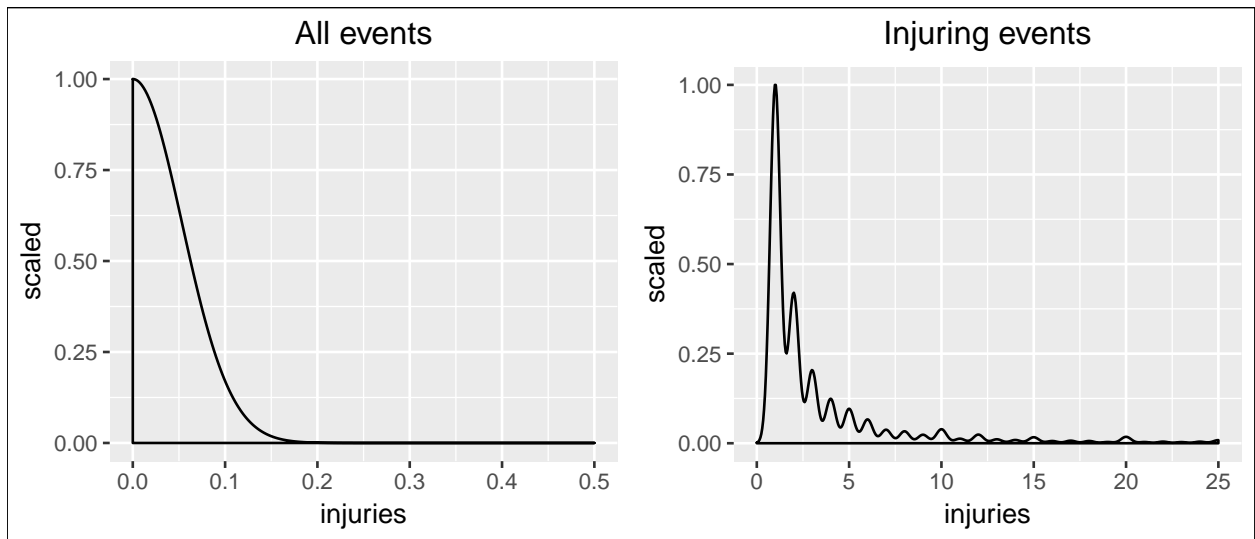


Figure 4: Population distribution for Injuries / occurrences

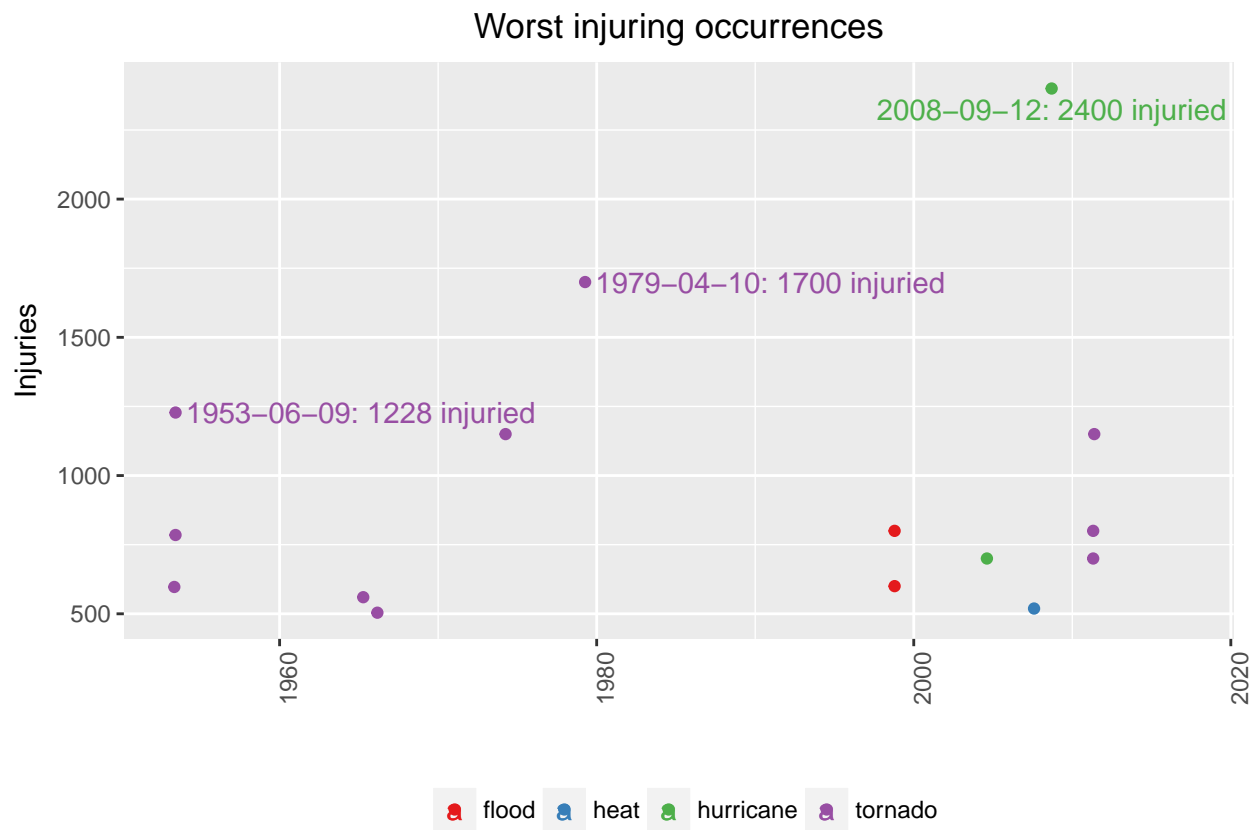


Figure 5: Worst injuring occurrences

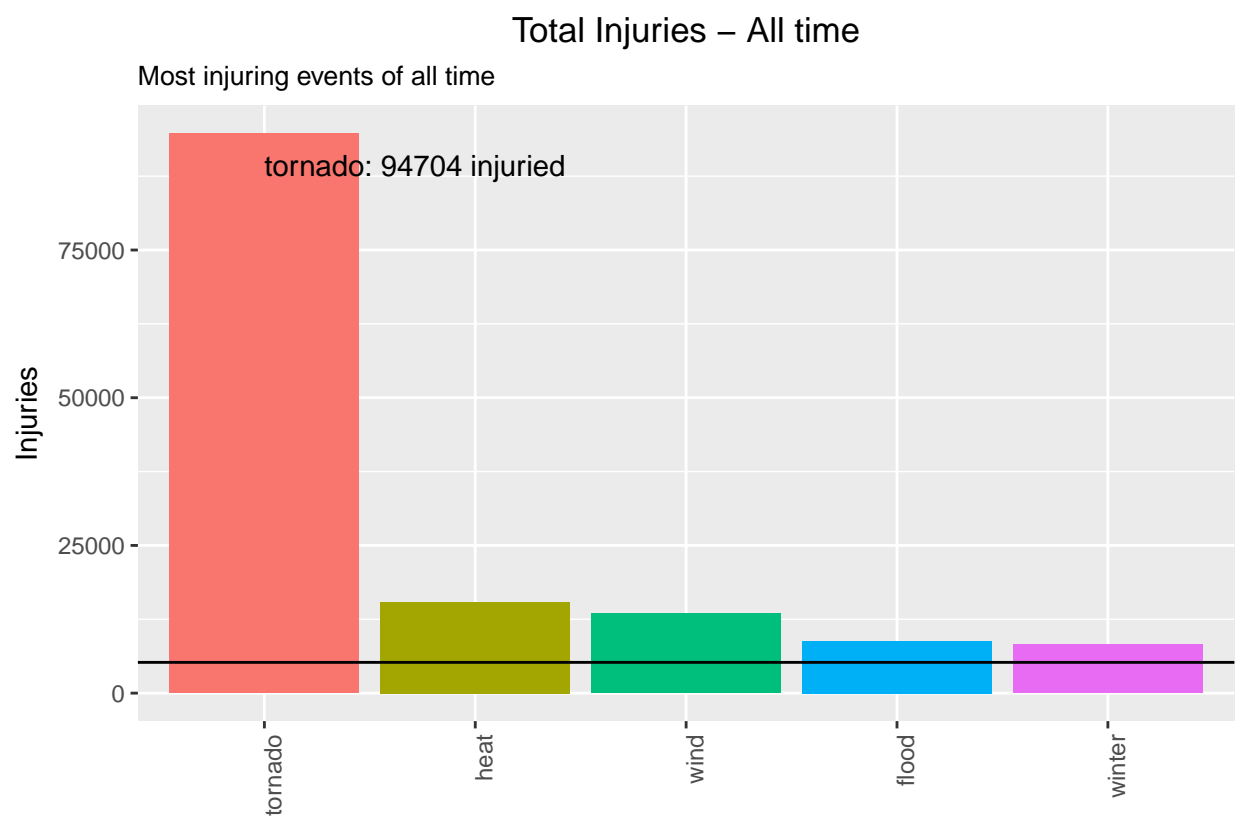


Figure 6: Total Injuries by event

## 6 Economy: the the most harmfull events

We have determined what events did more harm to economy, both in terms of property and crops damage.

There were events that causes zero property damage but a lot of crop damage. The inverse is also true, so we did a separate analysis to property VS crop damaging events.

### 6.1 Property losses

#### 6.1.1 Most Property Damaging event in a single occurrence

In order to determine what were the most property damaging events in a single occurrence, we need to see how damages are distributed along the occurrences.

Looking at this distribution, we can infer that 99.8% of the occurrences caused less than **\$40,000,000 in losses**.

On the other hand, damaging occurrences had to have damages above zero.

Now, among the damaging occurrences, we are interested in the ones whose damages are above 99.8% of the most common values.

Looking at this distribution, we can infer that **99.8% of the damaging occurrences caused up to \$129,355,000 in losses**.

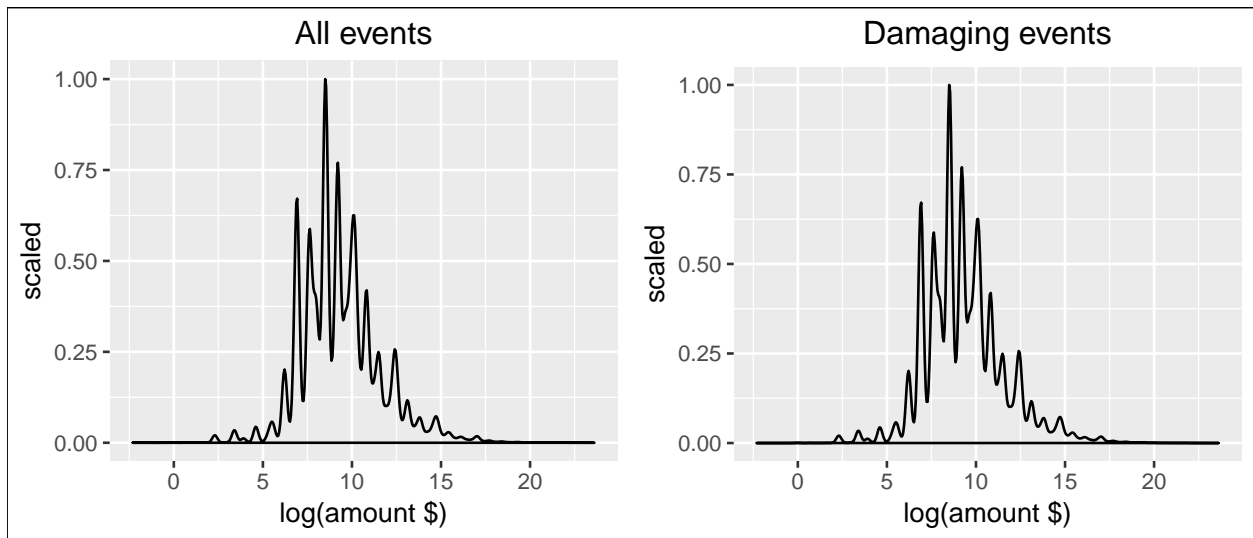


Figure 7: Population distribution for losses / occurrences

In this study, we looked on the 1% most harmful occurrences.

Table 7: Worst property damaging occurrences, mean = \$1,138,223 and median = \$10,000

rank	event	day	state	county	value
1	tide	2005-08-29	louisiana	orleans	\$17,900,000,000
2	hurricane	2005-10-24	florida	.palm.beach	\$10,000,000,000
3	flood	2012-10-29	new.jersey	eastern.ocean	\$7,500,000,000
4	tide	2005-08-29	mississippi	harrison	\$5,630,000,000

rank	event	day	state	county	value
5	storm	2001-06-05	texas	harris	\$5,030,000,000
6	flood	2012-10-28	new.jersey	eastern.monmouth	\$5,000,000,000
7	flood	2012-10-28	new.jersey	western.monmouth	\$5,000,000,000
8	hurricane	2004-09-13	florida	.escambia	\$4,000,000,000
9	tide	2008-09-12	texas	galveston	\$4,000,000,000
10	hurricane	2005-08-28	louisiana	orleans	\$3,560,000,000
11	tide	2005-08-29	mississippi	hancock	\$3,380,000,000
12	tide	2005-08-29	louisiana	st.tammany	\$3,030,000,000
13	tide	2005-08-29	louisiana	lower.plaquemines	\$3,030,000,000
14	tide	2005-08-29	louisiana	lower.st.bernard	\$3,020,000,000
15	tide	2005-08-29	louisiana	upper.st.bernard	\$3,020,000,000
16	flood	1997-04-18	north.dakota	grand.forks	\$3,000,000,000
17	hurricane	1999-09-15	north.carolina	alamance	\$3,000,000,000
18	hurricane	2004-08-13	florida	charlotte	\$3,000,000,000
19	tide	2008-09-12	texas	harris	\$3,000,000,000
20	hurricane	2005-08-28	mississippi	harrison	\$2,940,000,000

The single most economic damaging event to properties was a **tide, that occurred in louisiana, orleans, on 2005-08-29, causing U\$ \$17,900,000,000 in losses.**

### 6.1.2 Most Property Damaging event in all time

Notice that are several occurrences of the same type of event along the time.

Therefore, in order to know which is the worst type of event along all the years, we summed up the losses caused by each one of occurrences of this events.

Notice that we are interested only in the worst of them, ie, the ones which are above the mean.

Table 8: Total property losses by event, mean = \$11,760,898,222  
and median = \$233,483,800

rank	event	total
1	hurricane	\$87,005,170,310
2	flood	\$83,547,720,380
3	tornado	\$63,677,320,192
4	tide	\$54,155,102,600
5	hail	\$25,381,536,404
6	wind	\$24,890,912,278
7	storm	\$16,754,390,360

The most property damaging event along the time is the **hurricane. It has caused \$87,005,170,310 in losses.**

### 6.1.3 Least property damaging events

Just for curiosity, these are the less damaging events:

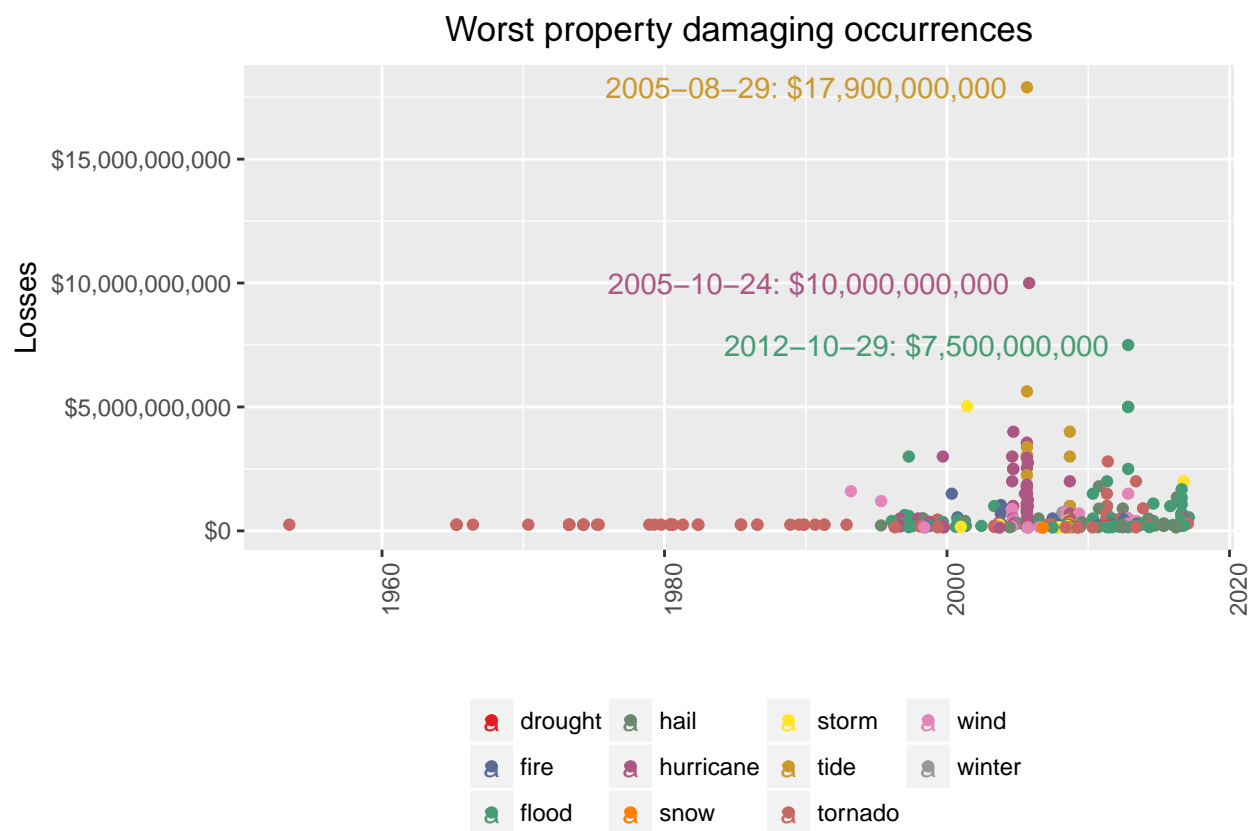


Figure 8: Worst property damaging occurrences

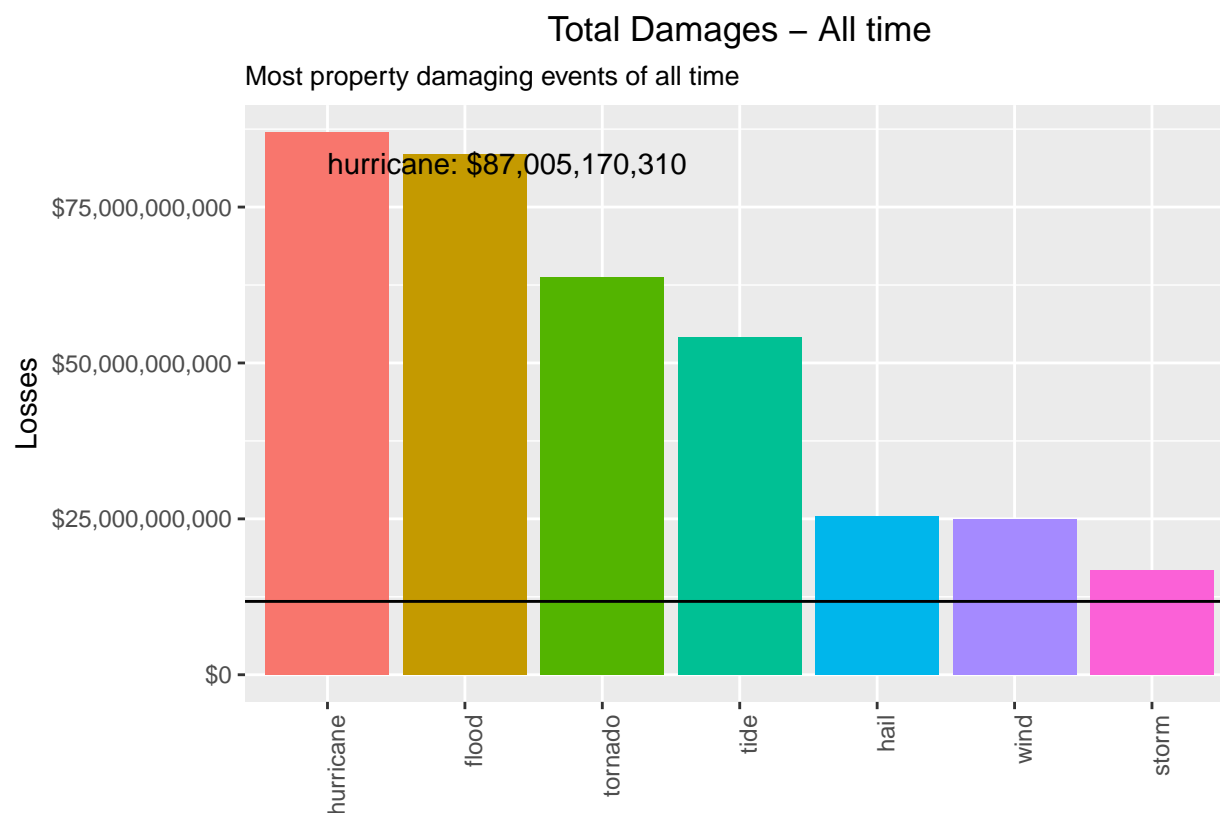


Figure 9: Total Property Damages by event

Table 9: Least property damaging events

rank	event	total
32	other	\$1,000
31	funnel	\$123,100
30	dense smoke	\$130,000
29	rip current	\$163,000
28	volcanic ash	\$500,000
27	dust devil	\$1,147,430
26	seiche	\$1,402,000
25	sleet	\$3,084,000
24	avalanche	\$4,060,050
23	waterspout	\$5,748,200

## 6.2 Crop losses

### 6.2.1 Most Crop Damaging event in a single occurrence

In order to determine what were the most crop damaging events in a single occurrence, we need to see how damages are distributed along the occurrences.

On the other hand, damaging occurrences had to have damages above zero.

Now, among the damaging occurrences, we are interested in the ones whose damages are above 99% of the most common values.

Looking at this distribution, we can infer that **99.8% of the damaging occurrences caused up to \$197,330,000 in losses.**

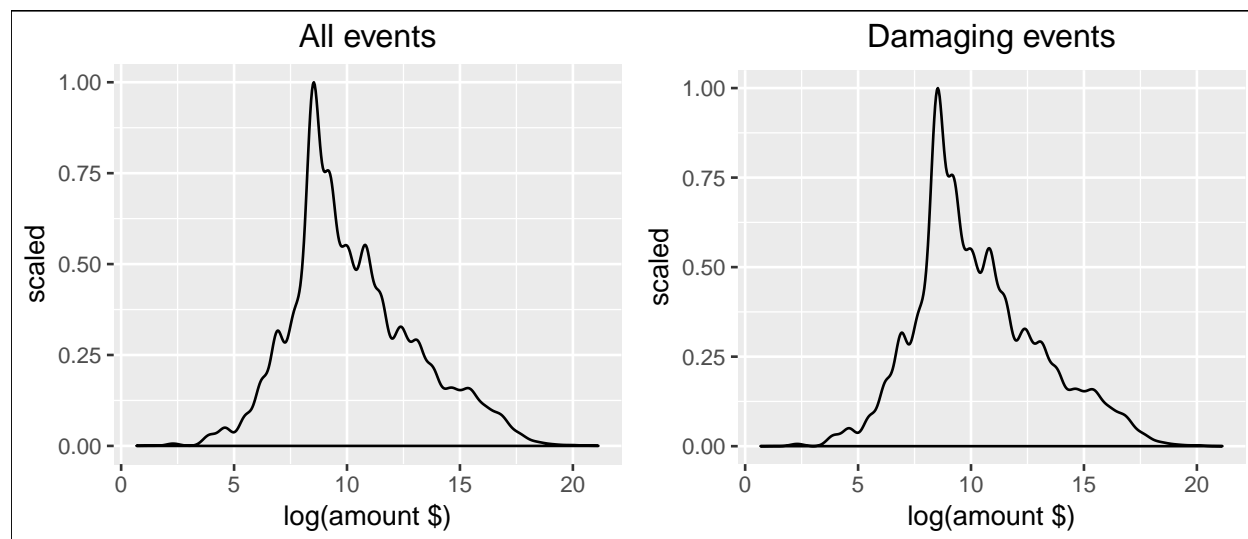


Figure 10: Population distribution for losses / occurrences

In this study, we looked on the 1% most harmful occurrences.

Table 10: Worst crops damaging occurrences, mean = \$1,781,966 and median = \$20,000

rank	event	day	state	county	value
1	drought	2014-12-01	california	northensanjoaquin	\$1,500,000,000
2	drought	2011-06-01	texas	lubbock	\$1,050,000,000
3	drought	2006-01-01	texas	montague	\$1,000,000,000
4	drought	2007-06-01	mississippi	warren	\$700,000,000
5	cold	2007-01-11	california	sesj	\$568,600,000
6	drought	2000-11-01	texas	parmer	\$515,000,000
7	drought	1998-07-06	oklahoma	choctaw	\$500,000,000
8	drought	1999-07-01	pennsylvania	potter	\$500,000,000
9	hurricane	1999-09-15	north.carolina	alamance	\$500,000,000
10	flood	2000-10-03	florida	.dade	\$500,000,000
11	flood	2007-07-01	missouri	henry	\$500,000,000
12	wind	1998-12-20	california	southernsanjoaquin	\$490,500,000
13	drought	1998-12-01	texas	yoakum	\$450,000,000
14	hurricane	2005-08-25	florida	.dade	\$423,000,000

rank	event	day	state	county	value
15	drought	2001-12-01	texas	parmer	\$420,000,000
16	drought	2007-09-01	georgia	baldwin	\$344,000,000
17	drought	2006-02-01	texas	fannin	\$300,000,000
18	cold	2010-01-10	florida	inlandcollier	\$300,000,000
19	cold	2010-01-10	florida	inland.miami.dade	\$286,000,000
20	drought	1998-12-01	texas	andrews	\$250,000,000

The single most economic damaging event to crops was a **drought, that occurred in california, north-ernsanjoaquin, on 2014-12-01, causing U\$ \$1,500,000,000 in losses.**

### 6.2.2 Most Crop Damaging event in all time

Notice that are several occurrences of the same type of event along the time.

Therefore, in order to know which is the worst type of event along all the years, we summed up the losses caused by each one of occurrences of this events.

Notice that we are interested only in the worst of them, ie, the ones which are above the mean.

Table 11: Total crops losses by event, mean = \$2,957,594,612 and median = \$450,448,110

rank	event	total
1	drought	\$27,454,862,620
2	flood	\$7,750,262,370
3	hurricane	\$5,341,874,800
4	cold	\$4,919,893,200
5	wind	\$3,679,632,230
6	hail	\$3,657,650,173

The most crop damaging event along the time is the **drought. It has caused \$27,454,862,620 in losses.**

### 6.2.3 Least crops damaging events

Just for curiosity, lets show now what are the less damaging among the events:

Table 12: Least crops damaging events

rank	event	total
19	slide	\$17,000
18	tsunami	\$20,000
17	tide	\$955,000
16	blizzard	\$7,060,000
15	lightning	\$7,422,670
14	debris flow	\$20,006,500
13	winter	\$46,924,000
12	snow	\$91,145,900
11	fire	\$447,668,860
10	tornado	\$450,448,110



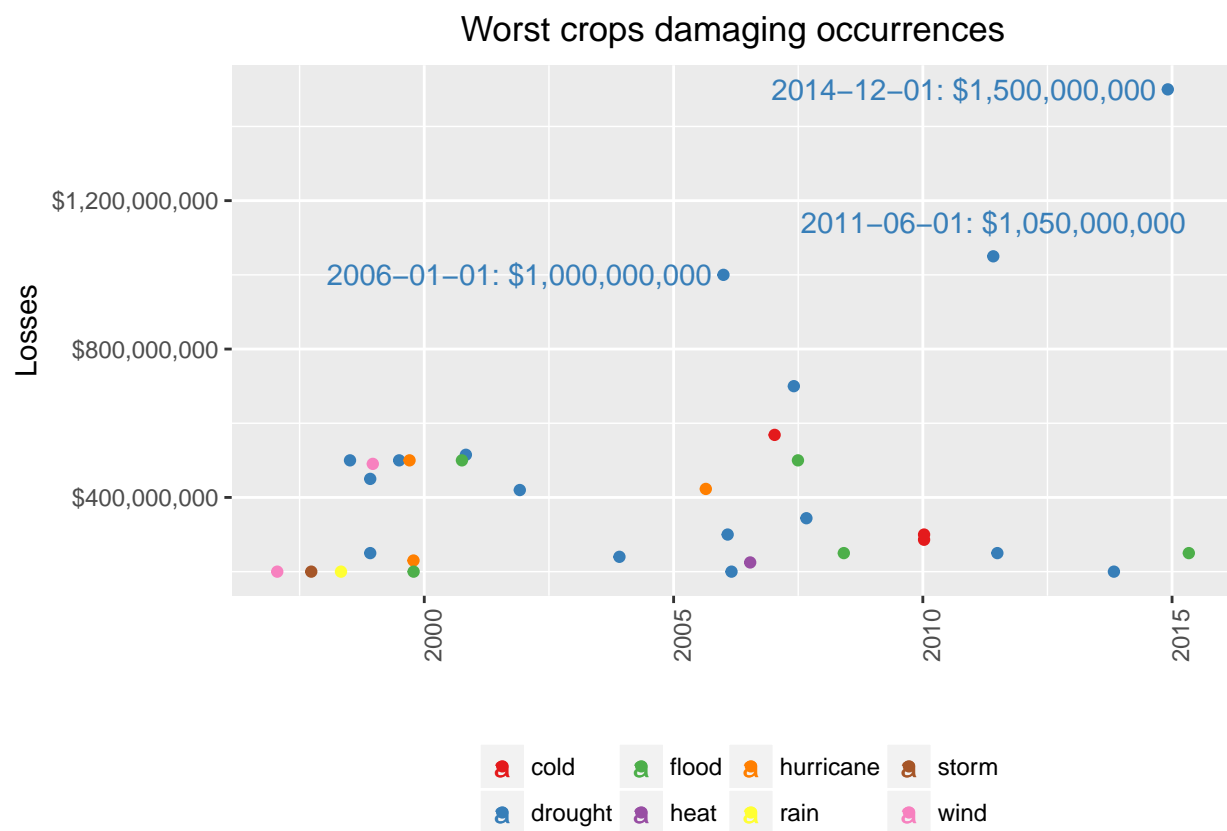


Figure 11: Worst crops damaging occurrences

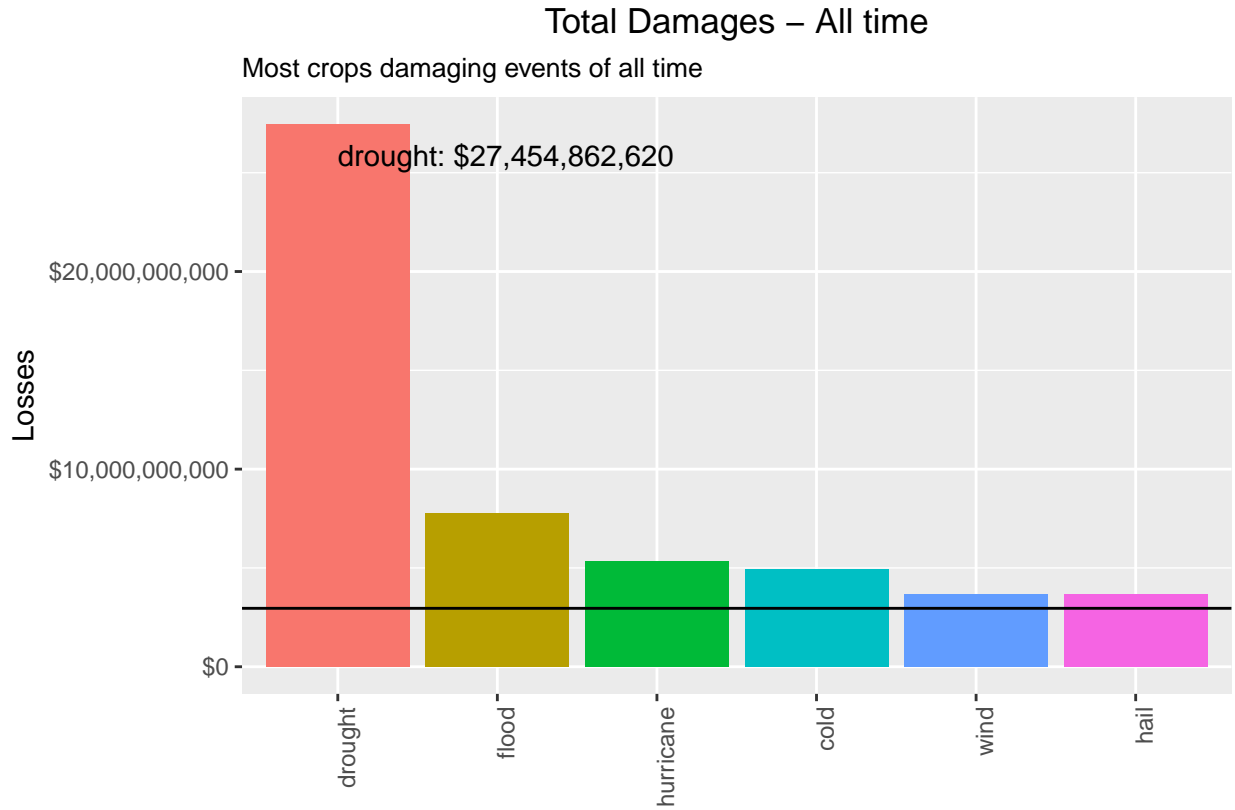


Figure 12: Total Crop Damages by event

## 7 Most afflicted locations

We have determined what locations had the worst outcome from those events, both in terms of human health and economic losses.

Unfortunately, these has been the worst counties for living in:

### 7.1 Worst fatality count

Table 13: Total fatalities by county

rank	state	county	fatalities	injuries	prop.dmg	crop.dmg
1	louisiana	orleans	649	132	\$21,614,049,550	\$0
2	illinois	cook	565	912	\$670,237,350	\$0
3	pennsylvania	philadelphia	387	455	\$52,680,980	\$0
4	nevada	lasvegas	263	601	\$13,162,000	\$0
5	texas	harris	216	2825	\$10,890,441,870	\$7,442,000
6	missouri	jasper	178	1273	\$2,864,021,330	\$46,475,500
7	texas	dallas	149	1757	\$1,946,192,730	\$1,405,000
8	louisiana	lower.st.bernard	140	0	\$4,845,022,000	\$0
9	texas	mclennan	127	657	\$65,138,600	\$1,710,500
10	michigan	genesee	123	962	\$107,151,750	\$6,300,000

The county with the biggest fatality count is **orleans, in louisiana, with 649 people killed.**

## 7.2 Worst injuries count

Table 14: Total injuries by county

rank	state	county	fatalities	injuries	prop.dmg	crop.dmg
1	missouri	st.louis	65	3144	\$1,461,882,880	\$10,500
2	texas	harris	216	2825	\$10,890,441,870	\$7,442,000
3	missouri	st.louis.	118	2701	\$79,552,000	\$5,000
4	texas	wichita	55	1853	\$310,822,880	\$0
5	texas	dallas	149	1757	\$1,946,192,730	\$1,405,000
6	alabama	jefferson	117	1699	\$2,037,082,100	\$3,355,000
7	massachusetts	worcester	96	1292	\$286,072,530	\$0
8	ohio	greene	40	1278	\$289,967,757	\$540,000
9	missouri	jasper	178	1273	\$2,864,021,330	\$46,475,500
10	oklahoma	oklahoma	79	1253	\$1,356,088,290	\$8,330,000

The county with the biggest injuries count is **st.louis, in missouri, with 3144 people injured.**

## 7.3 Worst property losses

Table 15: Total property losses by county

rank	state	county	fatalities	injuries	prop.dmg	crop.dmg
1	louisiana	orleans	649	132	\$21,614,049,550	\$0
2	texas	harris	216	2825	\$10,890,441,870	\$7,442,000
3	florida	.palm.beach	5	7	\$10,828,630,000	\$75,000,000
4	mississippi	harrison	110	90	\$8,870,659,460	\$0
5	new.jersey	eastern.ocean	16	112	\$8,116,441,690	\$10
6	new.jersey	eastern.monmouth	13	397	\$6,527,278,550	\$0
7	louisiana	st.tammany	8	89	\$5,677,642,950	\$0
8	florida	.escambia	14	0	\$5,632,695,000	\$25,300,000
9	texas	galveston	43	259	\$5,358,929,770	\$109,602,000
10	new.jersey	western.monmouth	6	84	\$5,267,488,450	\$0

The county with the biggest property losses is **orleans, in louisiana, with \$21,614,049,550 in losses.**

## 7.4 Worst crops losses

Table 16: Total crops losses by county

rank	state	county	fatalities	injuries	prop.dmg	crop.dmg
1	texas	hubbock	37	679	\$2,007,426,360	\$2,439,945,000
2	texas	montague	5	42	\$118,971,700	\$1,963,106,500
3	california	northersanjoaquin	14	25	\$6,058,500	\$1,520,000,000
4	texas	parmer	1	23	\$44,654,090	\$1,181,360,000
5	florida	.dade	10	1	\$693,020,000	\$1,168,000,000
6	california	sesj	28	64	\$6,167,300	\$992,223,000

rank	state	county	fatalities	injuries	prop.dmg	crop.dmg
7	mississippi	warren	43	341	\$312,674,880	\$728,657,000
8	california	ecentralsj	43	123	\$7,506,800	\$578,212,000
9	california	southernsanjoaquin	1	22	\$18,657,000	\$517,800,000
10	north.carolina	alamance	2	8	\$3,005,157,200	\$503,166,000

The county with the biggest crop property losses is **lubbock, in texas, with \$2,439,945,000 in losses.**

## 8 Results

### 8.1 Population Health

The single most fatal event was a **hurricane, that occurred in louisiana, orleans, on 2005-08-28, killing 638 people.**

The most fatal event along the time is the **tornado. It has killed 5878 people until now.**

The single most injuring event was a **hurricane, that occurred in texas, harris, on 2008-09-12, injuring 2400 people.**

The most injuring event along the time is the **tornado. It has injured 94704 people until now.**

### 8.2 Economic Damages

The single most economic damaging event to properties was a **tide, that occurred in louisiana, orleans, on 2005-08-29, causing U\$ \$17,900,000,000 in losses.**

The most property damaging event along the time is the **hurricane. It has caused \$87,005,170,310 in losses.**

The single most economic damaging event to crops was a **drought, that occurred in california, northern-sanjoaquin, on 2014-12-01, causing U\$ \$1,500,000,000 in losses.**

The most crop damaging event along the time is the **drought. It has caused \$27,454,862,620 in losses.**

### 8.3 Most afflicted locations

The county with the biggest fatality count is **orleans, in louisiana, with 649 people killed.**

The county with the biggest injuries count is **st.louis, in missouri, with 3144 people injured.**

The county with the biggest property losses is **orleans, in louisiana, with \$21,614,049,550 in losses.**

The county with the biggest crop property losses is **lubbock, in texas, with \$2,439,945,000 in losses.**

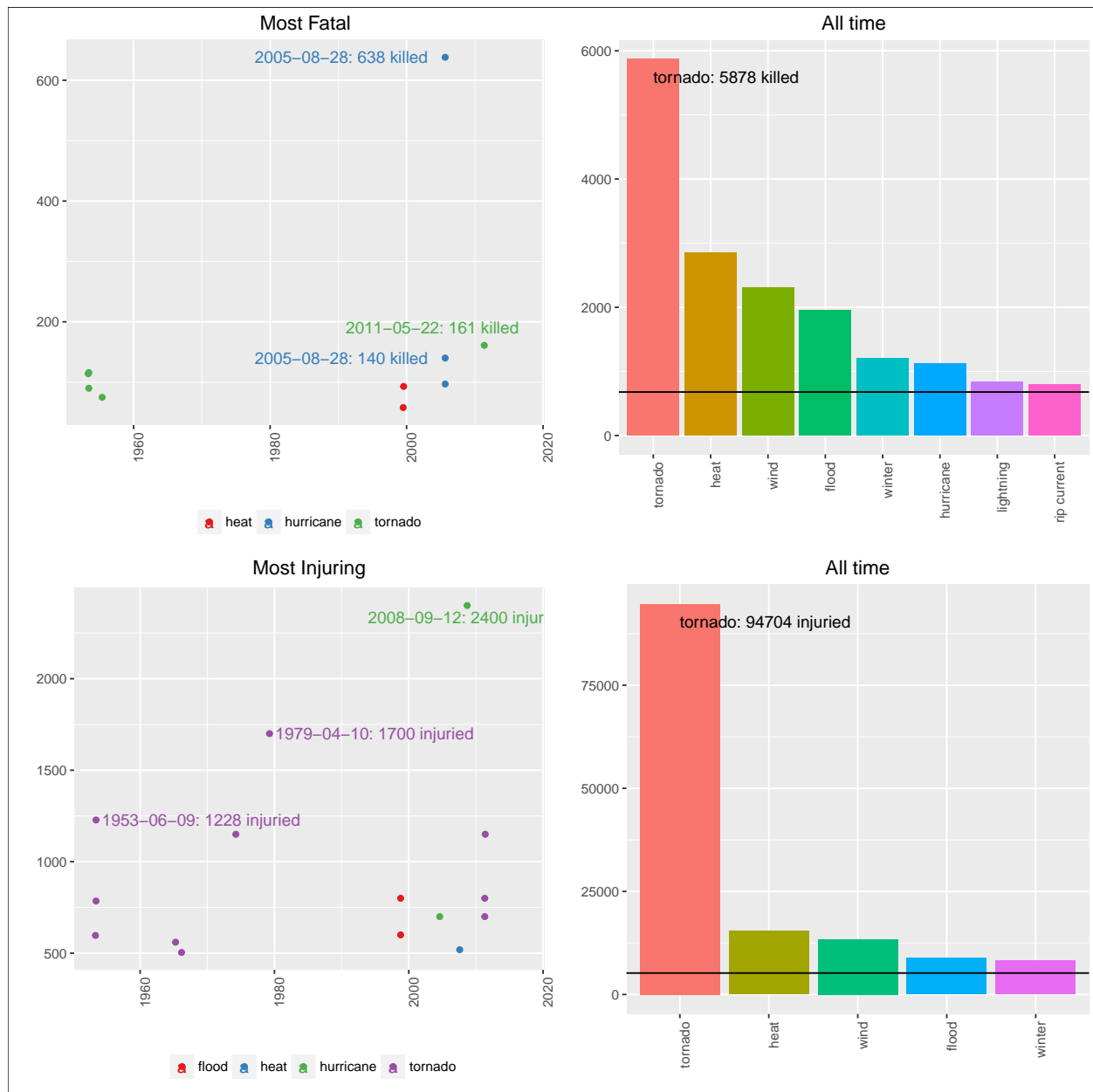


Figure 13: Population Health: fatalities and injuries

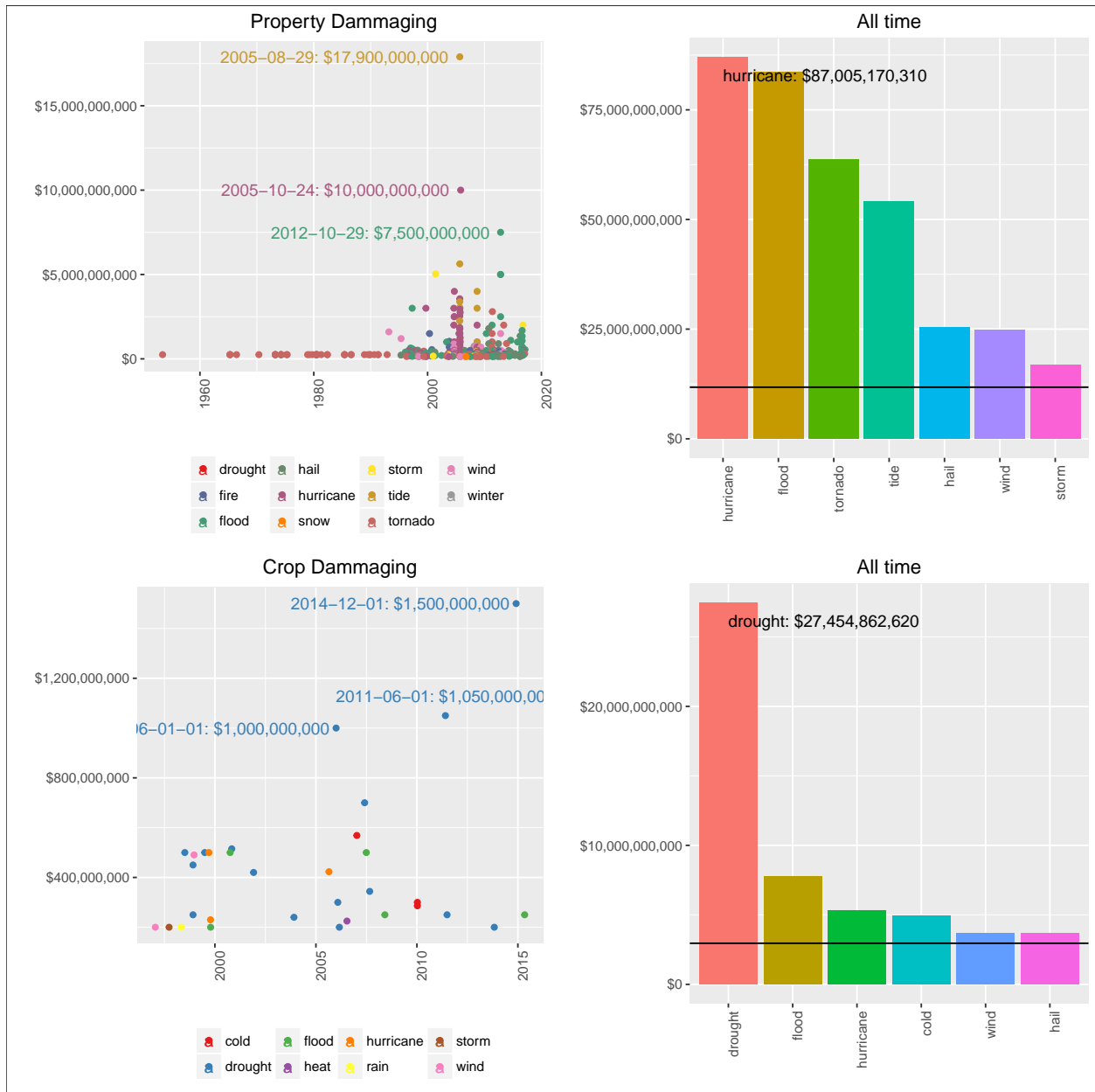


Figure 14: Economic Damages: property and crops

## 8.4 Distribution of data

