

# Summarizing data

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# Why summarize?

- Data are often too big to look at the whole thing
- The first step in an analysis is to find problems
- When you do these summaries you should be looking for
  - Missing values
  - Values outside of expected ranges
  - Values that seem to be in the wrong units
  - Mislabeled variables/columns
  - Variables that are the wrong class

# Earthquake data

The screenshot shows the Data.gov website interface. The browser address bar displays the URL: <https://explore.data.gov/Geography-and-Environment/Worldwide-M1-Earthquakes-Past-7-Days/7tag-iwnu>. The page header includes the Data.gov logo and navigation links: HOME, ABOUT, DATA, METRICS, OPEN GOVERNMENT, BLOGS, and COMMUNITIES. The main content area features the dataset title 'Worldwide M1+ Earthquakes, Past 7 Days' with a subtitle 'Real-time, worldwide earthquake list for the past 7 days'. Below the title, there are buttons for 'Download' and 'External Link' (CSV 103KB, KML 12.2KB). A 'Description' section contains the text 'Real-time, worldwide earthquake list for the past 7 days'. An 'Activity' section displays a table with community and user ratings, and a list of statistics: Raters (12), Visits (179823), Downloads (182476), Comments (7), and Contributors (0). A sidebar on the right shows the 'Data.gov Program Management Office' logo and creation/update dates.

| Activity         | Value  |
|------------------|--------|
| Community Rating | ★★★★★  |
| Your Rating      | ★★★★★  |
| Raters           | 12     |
| Visits           | 179823 |
| Downloads        | 182476 |
| Comments         | 7      |
| Contributors     | 0      |

<https://explore.data.gov/Geography-and-Environment/Worldwide-M1-Earthquakes-Past-7-Days/7tag-iwnu>

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# Earthquake data

```
fileUrl <- "http://earthquake.usgs.gov/earthquakes/catalogs/eqs7day-M1.txt"
download.file(fileUrl, destfile = "./data/earthquakeData.csv", method = "curl")
dateDownloaded <- date()
dateDownloaded
```

```
[1] "Sun Jan 27 00:23:22 2013"
```

```
eData <- read.csv("./data/earthquakeData.csv")
```

# Looking at data - the whole thing

eData

|    | Src | Eqid     | Version | Datetime                              |
|----|-----|----------|---------|---------------------------------------|
| 1  | nc  | 71929481 | 1       | Sunday, January 27, 2013 05:03:01 UTC |
| 2  | ci  | 15278017 | 0       | Sunday, January 27, 2013 04:59:04 UTC |
| 3  | ak  | 10645573 | 1       | Sunday, January 27, 2013 04:55:09 UTC |
| 4  | nc  | 71929476 | 0       | Sunday, January 27, 2013 04:51:48 UTC |
| 5  | nn  | 00401016 | 9       | Sunday, January 27, 2013 04:45:19 UTC |
| 6  | ak  | 10645564 | 1       | Sunday, January 27, 2013 04:16:45 UTC |
| 7  | hv  | 60459531 | 2       | Sunday, January 27, 2013 04:15:57 UTC |
| 8  | ak  | 10645555 | 1       | Sunday, January 27, 2013 04:14:35 UTC |
| 9  | ci  | 15278009 | 0       | Sunday, January 27, 2013 04:07:44 UTC |
| 10 | us  | c000ewb3 | 7       | Sunday, January 27, 2013 04:05:42 UTC |
| 11 | ci  | 15278001 | 0       | Sunday, January 27, 2013 03:54:27 UTC |
| 12 | hv  | 60459521 | 1       | Sunday, January 27, 2013 03:50:13 UTC |
| 13 | hv  | 60459516 | 2       | Sunday, January 27, 2013 03:43:56 UTC |
| 14 | ak  | 10645533 | 1       | Sunday, January 27, 2013 03:25:17 UTC |
| 15 | ak  | 10645528 | 1       | Sunday, January 27, 2013 03:18:17 UTC |
| 16 | us  | c000ewax | 6       | Sunday, January 27, 2013 03:17:57 UTC |
| 17 | ci  | 15277993 | 0       | Sunday, January 27, 2013 02:47:04 UTC |

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# Looking at data - dim(),names(),nrow(),ncol()

```
dim(eData)
```

```
[1] 1057  10
```

```
names(eData)
```

```
[1] "Src"      "Eqid"      "Version"    "Datetime"   "Lat"
[6] "Lon"      "Magnitude" "Depth"      "NST"        "Region"
```

```
nrow(eData)
```

```
[1] 1057
```

# Looking at the data - quantile(),summary()

```
quantile(eData$Lat)
```

```

      0%      25%      50%      75%     100%
-61.30  35.56  38.77  52.58  67.66

```

```
summary(eData)
```

```

      Src      Eqid      Version
ak      :330    00400150:    1    2      :379
nc      :247    00400153:    1    0      :195
ci      :145    00400155:    1    1      :168
nn      : 92    00400156:    1    9      : 97
us      : 89    00400157:    1    3      : 82
pr      : 40    00400159:    1    4      : 43
(Other):114    (Other) :1051  (Other): 93

      Datetime      Lat
Monday, January 21, 2013 11:00:00 UTC:    2    Min.      : -61.3
Friday, January 25, 2013 00:06:25 UTC:    1    1st Qu.: 35.6

```

# Looking at data - class()

```
class(eData)
```

```
[1] "data.frame"
```

```
sapply(eData[, ], class)
```

|           |           |          |          |           |           |           |
|-----------|-----------|----------|----------|-----------|-----------|-----------|
| Src       | Eqid      | Version  | Datetime | Lat       | Lon       | Magnitude |
| "factor"  | "factor"  | "factor" | "factor" | "numeric" | "numeric" | "numeric" |
| Depth     | NST       | Region   |          |           |           |           |
| "numeric" | "integer" | "factor" |          |           |           |           |



# Looking at data - unique(),length(),table()

```
unique(eData$Src)
```

```
[1] nc ci ak nn hv us pr uw nm mb uu  
Levels: ak ci hv mb nc nm nn pr us uu uw
```

```
length(unique(eData$Src))
```

```
[1] 11
```

```
table(eData$Src)
```

```
   ak   ci   hv   mb   nc   nm   nn   pr   us   uu   uw  
330 145   29   10 247    2  92   40   89   40   33
```

# Looking at data - table()

```
table(eData$Src,eData$Version)
```

|    | 0  | 1  | 2   | 3  | 4  | 5  | 6  | 7  | 8  | 9  | A | B | D | E |
|----|----|----|-----|----|----|----|----|----|----|----|---|---|---|---|
| ak | 0  | 93 | 211 | 26 | 0  | 0  | 0  | 0  | 0  | 0  | 0 | 0 | 0 | 0 |
| ci | 64 | 0  | 67  | 7  | 3  | 3  | 1  | 0  | 0  | 0  | 0 | 0 | 0 | 0 |
| hv | 0  | 14 | 11  | 0  | 2  | 2  | 0  | 0  | 0  | 0  | 0 | 0 | 0 | 0 |
| mb | 0  | 0  | 10  | 0  | 0  | 0  | 0  | 0  | 0  | 0  | 0 | 0 | 0 | 0 |
| nc | 91 | 46 | 51  | 37 | 10 | 4  | 3  | 1  | 1  | 1  | 1 | 1 | 0 | 0 |
| nm | 0  | 0  | 0   | 0  | 0  | 0  | 0  | 0  | 0  | 0  | 2 | 0 | 0 | 0 |
| nn | 0  | 0  | 0   | 0  | 0  | 0  | 0  | 0  | 0  | 92 | 0 | 0 | 0 | 0 |
| pr | 40 | 0  | 0   | 0  | 0  | 0  | 0  | 0  | 0  | 0  | 0 | 0 | 0 | 0 |
| us | 0  | 0  | 2   | 0  | 14 | 13 | 24 | 13 | 11 | 4  | 4 | 2 | 1 | 1 |
| uu | 0  | 0  | 15  | 6  | 14 | 3  | 2  | 0  | 0  | 0  | 0 | 0 | 0 | 0 |
| uw | 0  | 15 | 12  | 6  | 0  | 0  | 0  | 0  | 0  | 0  | 0 | 0 | 0 | 0 |

# Looking at data - any(), all()

```
eData$Lat[1:10]
```

```
[1] 38.83 36.04 65.23 39.56 37.26 62.10 19.41 63.51 32.91 -5.17
```

```
eData$Lat[1:10] > 40
```

```
[1] FALSE FALSE  TRUE FALSE FALSE  TRUE FALSE  TRUE FALSE FALSE
```

```
any(eData$Lat[1:10] > 40)
```

```
[1] TRUE
```

# Looking at data - all()

```
eData$Lat[1:10] > 40
```

```
[1] FALSE FALSE  TRUE FALSE FALSE  TRUE FALSE  TRUE FALSE FALSE
```

```
all(eData$Lat[1:10] > 40)
```

```
[1] FALSE
```

# Looking at subsets - &

```
eData[eData$Lat > 0 & eData$Lon > 0, c("Lat", "Lon")]
```

|     | Lat    | Lon    |
|-----|--------|--------|
| 51  | 5.486  | 127.05 |
| 56  | 39.749 | 77.30  |
| 58  | 38.295 | 46.81  |
| 110 | 34.571 | 24.10  |
| 129 | 51.130 | 179.35 |
| 134 | 9.438  | 126.10 |
| 146 | 38.426 | 73.36  |
| 153 | 49.728 | 155.69 |
| 155 | 43.337 | 18.77  |
| 160 | 29.379 | 132.20 |
| 175 | 44.280 | 10.53  |
| 193 | 31.763 | 50.95  |
| 239 | 4.998  | 95.96  |
| 325 | 53.564 | 142.75 |
| 348 | 38.608 | 73.49  |
| 359 | 27.771 | 56.41  |
| 385 | 49.825 | 87.60  |

# Looking at subsets - |

```
eData[eData$Lat > 0 | eData$Lon > 0, c("Lat", "Lon")]
```

|    | Lat     | Lon     |
|----|---------|---------|
| 1  | 38.8292 | -122.81 |
| 2  | 36.0403 | -117.35 |
| 3  | 65.2271 | -149.51 |
| 4  | 39.5573 | -121.99 |
| 5  | 37.2587 | -114.07 |
| 6  | 62.1046 | -150.70 |
| 7  | 19.4065 | -155.26 |
| 8  | 63.5132 | -150.83 |
| 9  | 32.9112 | -116.25 |
| 10 | -5.1704 | 102.94  |
| 11 | 35.5633 | -118.53 |
| 12 | 19.2960 | -155.38 |
| 13 | 19.9262 | -155.54 |
| 14 | 62.1638 | -149.58 |
| 15 | 63.2917 | -149.24 |
| 16 | 34.2925 | -106.71 |
| 17 | 33.6293 | -116.69 |

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# Peer review experiment data

- Data on submissions/reviews in an experiment



<http://www.plosone.org/article/info:doi/10.1371/journal.pone.0026895>

# Peer review data

```

fileUrl1 <- "https://dl.dropbox.com/u/7710864/data/reviews-apr29.csv"
fileUrl2 <- "https://dl.dropbox.com/u/7710864/data/solutions-apr29.csv"
download.file(fileUrl1,destfile="./data/reviews.csv",method="curl")
download.file(fileUrl2,destfile="./data/solutions.csv",method="curl")
reviews <- read.csv("./data/reviews.csv"); solutions <- read.csv("./data/solutions.csv")
head(reviews,2)

```

|   | id | solution_id | reviewer_id | start      | stop       | time_left | accept |
|---|----|-------------|-------------|------------|------------|-----------|--------|
| 1 | 1  | 3           | 27          | 1304095698 | 1304095758 | 1754      | 1      |
| 2 | 2  | 4           | 22          | 1304095188 | 1304095206 | 2306      | 1      |

```
head(solutions,2)
```

|   | id | problem_id | subject_id | start      | stop       | time_left | answer |
|---|----|------------|------------|------------|------------|-----------|--------|
| 1 | 1  | 156        | 29         | 1304095119 | 1304095169 | 2343      | B      |
| 2 | 2  | 269        | 25         | 1304095119 | 1304095183 | 2329      | C      |



# Find if there are missing values - is.na()

```
is.na(reviews$time_left[1:10])
```

```
[1] FALSE FALSE FALSE FALSE FALSE FALSE FALSE TRUE FALSE FALSE
```

```
sum(is.na(reviews$time_left))
```

```
[1] 84
```

```
table(is.na(reviews$time_left))
```

```
FALSE  TRUE  
  115    84
```

# Important table()/NA issue

```
table(c(0,1,2,3,NA,3,3,2,2,3))
```

```
0 1 2 3  
1 1 3 4
```

```
table(c(0,1,2,3,NA,3,3,2,2,3),useNA="ifany")
```

```
0    1    2    3 <NA>  
1    1    3    4    1
```

# Summarizing columns/rows - `rowSums()`, `rowMeans()`, `colSums()`, `colMeans()`

- Important parameters: *x*, *na.rm*

```
colSums(reviews)
```

| id        | solution_id | reviewer_id | start | stop |
|-----------|-------------|-------------|-------|------|
| 19900     | 19929       | 5064        | NA    | NA   |
| time_left | accept      |             |       |      |
| NA        | NA          |             |       |      |

# Summarizing columns/rows - rowSums(),rowMeans(),colSums(),colMeans()

```
colMeans(reviews,na.rm=TRUE)
```

```
      id solution_id reviewer_id      start      stop
1.000e+02  1.001e+02  2.545e+01  1.304e+09  1.304e+09
time_left      accept
1.114e+03  6.435e-01
```

```
rowMeans(reviews,na.rm=TRUE)
```

```
[1] 3.726e+08 3.726e+08 3.726e+08 3.726e+08 3.726e+08 3.726e+08
[7] 3.726e+08 1.300e+01 3.726e+08 3.726e+08 3.726e+08 3.726e+08
[13] 3.726e+08 3.726e+08 3.726e+08 3.726e+08 1.967e+01 3.726e+08
[19] 3.726e+08 1.933e+01 3.726e+08 3.726e+08 3.726e+08 2.433e+01
[25] 2.367e+01 2.367e+01 3.726e+08 3.726e+08 3.726e+08 3.726e+08
[31] 3.726e+08 3.726e+08 3.726e+08 3.726e+08 3.133e+01 3.726e+08
[37] 3.267e+01 3.726e+08 3.400e+01 3.726e+08 3.200e+01 3.726e+08
```

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