

Datacamp_Cleaning Data in R_Putting it all together

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Get a feel for the data

```
# Data
weather <- readRDS("data/weather.rds")
```

```
# Verify that weather is a data.frame
class(weather)
```

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

```
# Check the dimensions
dim(weather)
```

```
## [1] 286 35
```

```
# View the column names
names(weather)
```

```
## [1] "X"      "year"   "month"  "measure" "X1"      "X2"      "X3"
## [8] "X4"      "X5"      "X6"      "X7"      "X8"      "X9"      "X10"
## [15] "X11"     "X12"     "X13"     "X14"     "X15"     "X16"     "X17"
## [22] "X18"     "X19"     "X20"     "X21"     "X22"     "X23"     "X24"
## [29] "X25"     "X26"     "X27"     "X28"     "X29"     "X30"     "X31"
```

Summarize the data

```
# View the structure of the data
str(weather)
```

```
## 'data.frame': 286 obs. of 35 variables:
## $ X : int 1 2 3 4 5 6 7 8 9 10 ...
## $ year : int 2014 2014 2014 2014 2014 2014 2014 2014 2014 2014 ...
## $ month : int 12 12 12 12 12 12 12 12 12 12 ...
## $ measure: chr "Max.TemperatureF" "Mean.TemperatureF" "Min.TemperatureF" "Max.Dew.PointF" ...
## $ X1 : chr "64" "52" "39" "46" ...
## $ X2 : chr "42" "38" "33" "40" ...
## $ X3 : chr "51" "44" "37" "49" ...
## $ X4 : chr "43" "37" "30" "24" ...
## $ X5 : chr "42" "34" "26" "37" ...
## $ X6 : chr "45" "42" "38" "45" ...
## $ X7 : chr "38" "30" "21" "36" ...
## $ X8 : chr "29" "24" "18" "28" ...
## $ X9 : chr "49" "39" "29" "49" ...
## $ X10 : chr "48" "43" "38" "45" ...
## $ X11 : chr "39" "36" "32" "37" ...
```

```
## $ X12 : chr "39" "35" "31" "28" ...
## $ X13 : chr "42" "37" "32" "28" ...
## $ X14 : chr "45" "39" "33" "29" ...
## $ X15 : chr "42" "37" "32" "33" ...
## $ X16 : chr "44" "40" "35" "42" ...
## $ X17 : chr "49" "45" "41" "46" ...
## $ X18 : chr "44" "40" "36" "34" ...
## $ X19 : chr "37" "33" "29" "25" ...
## $ X20 : chr "36" "32" "27" "30" ...
## $ X21 : chr "36" "33" "30" "30" ...
## $ X22 : chr "44" "39" "33" "39" ...
## $ X23 : chr "47" "45" "42" "45" ...
## $ X24 : chr "46" "44" "41" "46" ...
## $ X25 : chr "59" "52" "44" "58" ...
## $ X26 : chr "50" "44" "37" "31" ...
## $ X27 : chr "52" "45" "38" "34" ...
## $ X28 : chr "52" "46" "40" "42" ...
## $ X29 : chr "41" "36" "30" "26" ...
## $ X30 : chr "30" "26" "22" "10" ...
## $ X31 : chr "30" "25" "20" "8" ...
```

```
# Load dplyr package
library(dplyr)
```

```
##
## Attaching package: 'dplyr'

## The following objects are masked from 'package:stats':
##
## filter, lag

## The following objects are masked from 'package:base':
##
## intersect, setdiff, setequal, union
```

```
# Look at the structure using dplyr's glimpse()
glimpse(weather)
```

```
## Observations: 286
## Variables: 35
## $ X      <int> 1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12, 13, 14, 15, 16, ...
## $ year   <int> 2014, 2014, 2014, 2014, 2014, 2014, 2014, 2014, 2014, ...
## $ month  <int> 12, 12, 12, 12, 12, 12, 12, 12, 12, 12, 12, 12, 12, 12, ...
## $ measure <chr> "Max.TemperatureF", "Mean.TemperatureF", "Min.Temperat...
## $ X1     <chr> "64", "52", "39", "46", "40", "26", "74", "63", "52", ...
## $ X2     <chr> "42", "38", "33", "40", "27", "17", "92", "72", "51", ...
## $ X3     <chr> "51", "44", "37", "49", "42", "24", "100", "79", "57", ...
## $ X4     <chr> "43", "37", "30", "24", "21", "13", "69", "54", "39", ...
## $ X5     <chr> "42", "34", "26", "37", "25", "12", "85", "66", "47", ...
## $ X6     <chr> "45", "42", "38", "45", "40", "36", "100", "93", "85", ...
## $ X7     <chr> "38", "30", "21", "36", "20", "-3", "92", "61", "29", ...
## $ X8     <chr> "29", "24", "18", "28", "16", "3", "92", "70", "47", "..."
```

```
## $ X9      <chr> "49", "39", "29", "49", "41", "28", "100", "93", "86", ...
## $ X10     <chr> "48", "43", "38", "45", "39", "37", "100", "95", "89", ...
## $ X11     <chr> "39", "36", "32", "37", "31", "27", "92", "87", "82", ...
## $ X12     <chr> "39", "35", "31", "28", "27", "25", "85", "75", "64", ...
## $ X13     <chr> "42", "37", "32", "28", "26", "24", "75", "65", "55", ...
## $ X14     <chr> "45", "39", "33", "29", "27", "25", "82", "68", "53", ...
## $ X15     <chr> "42", "37", "32", "33", "29", "27", "89", "75", "60", ...
## $ X16     <chr> "44", "40", "35", "42", "36", "30", "96", "85", "73", ...
## $ X17     <chr> "49", "45", "41", "46", "41", "32", "100", "85", "70", ...
## $ X18     <chr> "44", "40", "36", "34", "30", "26", "89", "73", "57", ...
## $ X19     <chr> "37", "33", "29", "25", "22", "20", "69", "63", "56", ...
## $ X20     <chr> "36", "32", "27", "30", "24", "20", "89", "79", "69", ...
## $ X21     <chr> "36", "33", "30", "30", "27", "25", "85", "77", "69", ...
## $ X22     <chr> "44", "39", "33", "39", "34", "25", "89", "79", "69", ...
## $ X23     <chr> "47", "45", "42", "45", "42", "37", "100", "91", "82", ...
## $ X24     <chr> "46", "44", "41", "46", "44", "41", "100", "98", "96", ...
## $ X25     <chr> "59", "52", "44", "58", "43", "29", "100", "75", "49", ...
## $ X26     <chr> "50", "44", "37", "31", "29", "28", "70", "60", "49", ...
## $ X27     <chr> "52", "45", "38", "34", "31", "29", "70", "60", "50", ...
## $ X28     <chr> "52", "46", "40", "42", "35", "27", "76", "65", "53", ...
## $ X29     <chr> "41", "36", "30", "26", "20", "10", "64", "51", "37", ...
## $ X30     <chr> "30", "26", "22", "10", "4", "-6", "50", "38", "26", ...
## $ X31     <chr> "30", "25", "20", "8", "5", "1", "57", "44", "31", "30..."
```

```
# View a summary of the data
summary(weather)
```

```
##           X              year      month      measure
## Min.      : 1.00    Min.    :2014    Min.     : 1.000    Length:286
## 1st Qu.: 72.25    1st Qu.:2015    1st Qu.: 4.000    Class :character
## Median :143.50    Median :2015    Median : 7.000    Mode  :character
## Mean    :143.50    Mean     :2015    Mean    : 6.923
## 3rd Qu.:214.75    3rd Qu.:2015    3rd Qu.:10.000
## Max.    :286.00    Max.     :2015    Max.    :12.000
##           X1              X2              X3
## Length:286      Length:286      Length:286
## Class :character Class :character Class :character
## Mode  :character Mode  :character Mode  :character
##
##
##           X4              X5              X6
## Length:286      Length:286      Length:286
## Class :character Class :character Class :character
## Mode  :character Mode  :character Mode  :character
##
##
##           X7              X8              X9
## Length:286      Length:286      Length:286
## Class :character Class :character Class :character
## Mode  :character Mode  :character Mode  :character
##
##
```

```

##
##      X10          X11          X12
## Length:286      Length:286      Length:286
## Class :character Class :character Class :character
## Mode  :character Mode  :character Mode  :character
##
##
##
##      X13          X14          X15
## Length:286      Length:286      Length:286
## Class :character Class :character Class :character
## Mode  :character Mode  :character Mode  :character
##
##
##
##      X16          X17          X18
## Length:286      Length:286      Length:286
## Class :character Class :character Class :character
## Mode  :character Mode  :character Mode  :character
##
##
##
##      X19          X20          X21
## Length:286      Length:286      Length:286
## Class :character Class :character Class :character
## Mode  :character Mode  :character Mode  :character
##
##
##
##      X22          X23          X24
## Length:286      Length:286      Length:286
## Class :character Class :character Class :character
## Mode  :character Mode  :character Mode  :character
##
##
##
##      X25          X26          X27
## Length:286      Length:286      Length:286
## Class :character Class :character Class :character
## Mode  :character Mode  :character Mode  :character
##
##
##
##      X28          X29          X30
## Length:286      Length:286      Length:286
## Class :character Class :character Class :character
## Mode  :character Mode  :character Mode  :character
##
##
##
##      X31
## Length:286
## Class :character
## Mode  :character

```

```
##
##
##
```

Take a closer look

```
# View first 6 rows
head(weather, n = 6)
```

```
##      X year month      measure X1 X2 X3 X4 X5 X6 X7 X8 X9 X10 X11 X12
## 1 1 2014      12 Max.TemperatureF 64 42 51 43 42 45 38 29 49 48 39 39
## 2 2 2014      12 Mean.TemperatureF 52 38 44 37 34 42 30 24 39 43 36 35
## 3 3 2014      12 Min.TemperatureF 39 33 37 30 26 38 21 18 29 38 32 31
## 4 4 2014      12 Max.Dew.PointF 46 40 49 24 37 45 36 28 49 45 37 28
## 5 5 2014      12 MeanDew.PointF 40 27 42 21 25 40 20 16 41 39 31 27
## 6 6 2014      12 Min.DewpointF 26 17 24 13 12 36 -3 3 28 37 27 25
##      X13 X14 X15 X16 X17 X18 X19 X20 X21 X22 X23 X24 X25 X26 X27 X28 X29 X30
## 1 42 45 42 44 49 44 37 36 36 44 47 46 59 50 52 52 41 30
## 2 37 39 37 40 45 40 33 32 33 39 45 44 52 44 45 46 36 26
## 3 32 33 32 35 41 36 29 27 30 33 42 41 44 37 38 40 30 22
## 4 28 29 33 42 46 34 25 30 30 39 45 46 58 31 34 42 26 10
## 5 26 27 29 36 41 30 22 24 27 34 42 44 43 29 31 35 20 4
## 6 24 25 27 30 32 26 20 20 25 25 37 41 29 28 29 27 10 -6
##      X31
## 1 30
## 2 25
## 3 20
## 4 8
## 5 5
## 6 1
```

```
# View first 15 rows
head(weather, n = 15)
```

```
##      X year month      measure      X1      X2      X3      X4      X5
## 1 1 2014      12 Max.TemperatureF 64 42 51 43 42
## 2 2 2014      12 Mean.TemperatureF 52 38 44 37 34
## 3 3 2014      12 Min.TemperatureF 39 33 37 30 26
## 4 4 2014      12 Max.Dew.PointF 46 40 49 24 37
## 5 5 2014      12 MeanDew.PointF 40 27 42 21 25
## 6 6 2014      12 Min.DewpointF 26 17 24 13 12
## 7 7 2014      12 Max.Humidity 74 92 100 69 85
## 8 8 2014      12 Mean.Humidity 63 72 79 54 66
## 9 9 2014      12 Min.Humidity 52 51 57 39 47
## 10 10 2014      12 Max.Sea.Level.PressureIn 30.45 30.71 30.4 30.56 30.68
## 11 11 2014      12 Mean.Sea.Level.PressureIn 30.13 30.59 30.07 30.33 30.59
## 12 12 2014      12 Min.Sea.Level.PressureIn 30.01 30.4 29.87 30.09 30.45
## 13 13 2014      12 Max.VisibilityMiles 10 10 10 10 10
## 14 14 2014      12 Mean.VisibilityMiles 10 8 5 10 10
## 15 15 2014      12 Min.VisibilityMiles 10 2 1 10 5
##      X6      X7      X8      X9      X10      X11      X12      X13      X14      X15      X16      X17
## 1 45 38 29 49 48 39 39 42 45 42 44 49
## 2 42 30 24 39 43 36 35 37 39 37 40 45
```

```

## 3      38      21      18      29      38      32      31      32      33      32      35      41
## 4      45      36      28      49      45      37      28      28      29      33      42      46
## 5      40      20      16      41      39      31      27      26      27      29      36      41
## 6      36      -3       3      28      37      27      25      24      25      27      30      32
## 7     100      92      92     100     100      92      85      75      82      89      96     100
## 8      93      61      70      93      95      87      75      65      68      75      85      85
## 9      85      29      47      86      89      82      64      55      53      60      73      70
## 10  30.42  30.69  30.77  30.51  29.58  29.81  29.88  29.86  29.91  30.15  30.17  29.91
## 11  30.24  30.46  30.67  30.04  29.5  29.61  29.85  29.82  29.83  30.05  30.09  29.75
## 12  30.16  30.24  30.51  29.49  29.43  29.44  29.81  29.78  29.78  29.91  29.92  29.69
## 13      10      10      10      10      10      10      10      10      10      10      10      10
## 14       4      10       8       2       3       7      10      10      10      10       9       6
## 15       0       5       2       1       1       1       7      10      10      10       5       1
##      X18      X19      X20      X21      X22      X23      X24      X25      X26      X27      X28      X29
## 1      44      37      36      36      44      47      46      59      50      52      52      41
## 2      40      33      32      33      39      45      44      52      44      45      46      36
## 3      36      29      27      30      33      42      41      44      37      38      40      30
## 4      34      25      30      30      39      45      46      58      31      34      42      26
## 5      30      22      24      27      34      42      44      43      29      31      35      20
## 6      26      20      20      25      25      37      41      29      28      29      27      10
## 7      89      69      89      85      89     100     100     100      70      70      76      64
## 8      73      63      79      77      79      91      98      75      60      60      65      51
## 9      57      56      69      69      69      82      96      49      49      50      53      37
## 10  29.87  30.15  30.31  30.37  30.4  30.31  30.13  29.96  30.16  30.22  29.99  30.22
## 11  29.78  29.98  30.26  30.32  30.35  30.23  29.9  29.63  30.11  30.14  29.87  30.12
## 12  29.71  29.86  30.17  30.28  30.3  30.16  29.55  29.47  29.99  30.03  29.77      30
## 13      10      10      10      10      10      10      2      10      10      10      10      10
## 14      10      10      10       9      10       5       1       8      10      10      10      10
## 15      10      10       7       6       4       1       0       1      10      10      10      10
##      X30      X31
## 1      30      30
## 2      26      25
## 3      22      20
## 4      10       8
## 5       4       5
## 6      -6       1
## 7      50      57
## 8      38      44
## 9      26      31
## 10  30.36  30.32
## 11  30.32  30.25
## 12  30.23  30.13
## 13      10      10
## 14      10      10
## 15      10      10

```

```

# View the last 6 rows
tail(weather, n=6)

```

```

##      X year month      measure  X1  X2  X3  X4  X5  X6  X7
## 281 281 2015     12 Mean.Wind.SpeedMPH    6 <NA> <NA> <NA> <NA> <NA> <NA>
## 282 282 2015     12 Max.Gust.SpeedMPH   17 <NA> <NA> <NA> <NA> <NA> <NA>
## 283 283 2015     12 PrecipitationIn 0.14 <NA> <NA> <NA> <NA> <NA> <NA>
## 284 284 2015     12 CloudCover       7 <NA> <NA> <NA> <NA> <NA> <NA>

```

```
# View the last 10 rows
tail(weather, n=10)
```

7

Column names are values

```
# Load the tidyr package
library(tidyr)

# Gather the columns
weather2 <- gather(weather, day, value, X1:X31, na.rm = TRUE)

# View the head
head(weather2)
```

```
##   X year month      measure day value
## 1 1 2014     12 Max.TemperatureF X1    64
## 2 2 2014     12 Mean.TemperatureF X1    52
## 3 3 2014     12 Min.TemperatureF  X1    39
## 4 4 2014     12 Max.Dew.PointF    X1    46
## 5 5 2014     12 MeanDew.PointF    X1    40
## 6 6 2014     12 Min.DewpointF    X1    26
```

Values are variable names

```
# First remove column of row names
without_x <- weather2[, -1]

# Spread the data
weather3 <- spread(without_x, measure, value)

# View the head
head(weather3)
```

```
##   year month day CloudCover   Events Max.Dew.PointF Max.Gust.SpeedMPH
## 1 2014     12  X1          6    Rain             46                 29
## 2 2014     12 X10          8    Rain             45                 29
## 3 2014     12 X11          8 Rain-Snow           37                 28
## 4 2014     12 X12          7    Snow             28                 21
## 5 2014     12 X13          5                28                 23
## 6 2014     12 X14          4                29                 20
##   Max.Humidity Max.Sea.Level.PressureIn Max.TemperatureF
## 1             74                30.45             64
## 2             100                29.58             48
## 3             92                29.81             39
## 4             85                29.88             39
## 5             75                29.86             42
## 6             82                29.91             45
##   Max.VisibilityMiles Max.Wind.SpeedMPH Mean.Humidity
## 1                   10                 22             63
## 2                   10                 23             95
## 3                   10                 21             87
## 4                   10                 16             75
## 5                   10                 17             65
## 6                   10                 15             68
##   Mean.Sea.Level.PressureIn Mean.TemperatureF Mean.VisibilityMiles
## 1                   30.13                 52                 10
```



```
## 2          29.5          43          3
## 3          29.61         36          7
## 4          29.85         35         10
## 5          29.82         37         10
## 6          29.83         39         10
##   Mean.Wind.SpeedMPH MeanDew.PointF Min.DewpointF Min.Humidity
## 1          13          40          26          52
## 2          13          39          37          89
## 3          13          31          27          82
## 4          11          27          25          64
## 5          12          26          24          55
## 6          10          27          25          53
##   Min.Sea.Level.PressureIn Min.TemperatureF Min.VisibilityMiles
## 1          30.01          39          10
## 2          29.43          38           1
## 3          29.44          32           1
## 4          29.81          31           7
## 5          29.78          32          10
## 6          29.78          33          10
##   PrecipitationIn WindDirDegrees
## 1          0.01          268
## 2          0.28          357
## 3          0.02          230
## 4           T          286
## 5           T          298
## 6          0.00          306
```

Clean up dates

```
# Load the stringr and lubridate packages
```

```
library(stringr)
```

```
library(lubridate)
```

```
##
```

```
## Attaching package: 'lubridate'
```

```
## The following object is masked from 'package:base':
```

```
##
```

```
##   date
```

```
# Remove X's from day column
```

```
weather3$day <- str_replace(weather3$day, "X", "")
```

```
# Unite the year, month, and day columns
```

```
weather4 <- unite(weather3, date, year, month, day, sep = "-")
```

```
# Convert date column to proper date format using lubridates's ymd()
```

```
weather4$date <- ymd(weather4$date)
```

```
# Rearrange columns using dplyr's select()
```

```
weather5 <- select(weather4, date, Events, CloudCover:WindDirDegrees)
```

```
# View the head of weather5
```

```
head(weather5)
```

##	date	Events	CloudCover	Max.Dew.PointF	Max.Gust.SpeedMPH
## 1	2014-12-01	Rain	6	46	29
## 2	2014-12-10	Rain	8	45	29
## 3	2014-12-11	Rain-Snow	8	37	28
## 4	2014-12-12	Snow	7	28	21
## 5	2014-12-13		5	28	23
## 6	2014-12-14		4	29	20
##	Max.Humidity	Max.Sea.Level.PressureIn	Max.TemperatureF		
## 1	74		30.45	64	
## 2	100		29.58	48	
## 3	92		29.81	39	
## 4	85		29.88	39	
## 5	75		29.86	42	
## 6	82		29.91	45	
##	Max.VisibilityMiles	Max.Wind.SpeedMPH	Mean.Humidity		
## 1	10	22	63		
## 2	10	23	95		
## 3	10	21	87		
## 4	10	16	75		
## 5	10	17	65		
## 6	10	15	68		
##	Mean.Sea.Level.PressureIn	Mean.TemperatureF	Mean.VisibilityMiles		
## 1	30.13	52	10		
## 2	29.5	43	3		
## 3	29.61	36	7		
## 4	29.85	35	10		
## 5	29.82	37	10		
## 6	29.83	39	10		
##	Mean.Wind.SpeedMPH	MeanDew.PointF	Min.DewpointF	Min.Humidity	
## 1	13	40	26	52	
## 2	13	39	37	89	
## 3	13	31	27	82	
## 4	11	27	25	64	
## 5	12	26	24	55	
## 6	10	27	25	53	
##	Min.Sea.Level.PressureIn	Min.TemperatureF	Min.VisibilityMiles		
## 1	30.01	39	10		
## 2	29.43	38	1		
## 3	29.44	32	1		
## 4	29.81	31	7		
## 5	29.78	32	10		
## 6	29.78	33	10		
##	PrecipitationIn	WindDirDegrees			
## 1	0.01	268			
## 2	0.28	357			
## 3	0.02	230			
## 4	T	286			
## 5	T	298			
## 6	0.00	306			

A closer look at column types

```
# View the structure of weather5
str(weather5)
```

```
## 'data.frame':   366 obs. of  23 variables:
## $ date          : Date, format: "2014-12-01" "2014-12-10" ...
## $ Events        : chr  "Rain" "Rain" "Rain-Snow" "Snow" ...
## $ CloudCover     : chr  "6" "8" "8" "7" ...
## $ Max.Dew.PointF : chr  "46" "45" "37" "28" ...
## $ Max.Gust.SpeedMPH : chr  "29" "29" "28" "21" ...
## $ Max.Humidity   : chr  "74" "100" "92" "85" ...
## $ Max.Sea.Level.PressureIn : chr  "30.45" "29.58" "29.81" "29.88" ...
## $ Max.TemperatureF : chr  "64" "48" "39" "39" ...
## $ Max.VisibilityMiles : chr  "10" "10" "10" "10" ...
## $ Max.Wind.SpeedMPH : chr  "22" "23" "21" "16" ...
## $ Mean.Humidity  : chr  "63" "95" "87" "75" ...
## $ Mean.Sea.Level.PressureIn : chr  "30.13" "29.5" "29.61" "29.85" ...
## $ Mean.TemperatureF : chr  "52" "43" "36" "35" ...
## $ Mean.VisibilityMiles : chr  "10" "3" "7" "10" ...
## $ Mean.Wind.SpeedMPH : chr  "13" "13" "13" "11" ...
## $ MeanDew.PointF : chr  "40" "39" "31" "27" ...
## $ Min.DewpointF  : chr  "26" "37" "27" "25" ...
## $ Min.Humidity   : chr  "52" "89" "82" "64" ...
## $ Min.Sea.Level.PressureIn : chr  "30.01" "29.43" "29.44" "29.81" ...
## $ Min.TemperatureF : chr  "39" "38" "32" "31" ...
## $ Min.VisibilityMiles : chr  "10" "1" "1" "7" ...
## $ PrecipitationIn : chr  "0.01" "0.28" "0.02" "T" ...
## $ WindDirDegrees : chr  "268" "357" "230" "286" ...
```

```
# Examine the first 8 rows of weather5. Are most of the characters numeric?
head(weather5,n=8)
```

```
##      date      Events CloudCover Max.Dew.PointF Max.Gust.SpeedMPH
## 1 2014-12-01      Rain          6             46             29
## 2 2014-12-10      Rain          8             45             29
## 3 2014-12-11 Rain-Snow          8             37             28
## 4 2014-12-12      Snow          7             28             21
## 5 2014-12-13              5             28             23
## 6 2014-12-14              4             29             20
## 7 2014-12-15              2             33             21
## 8 2014-12-16      Rain          8             42             10
##      Max.Humidity Max.Sea.Level.PressureIn Max.TemperatureF
## 1              74              30.45              64
## 2             100              29.58              48
## 3              92              29.81              39
## 4              85              29.88              39
## 5              75              29.86              42
## 6              82              29.91              45
## 7              89              30.15              42
## 8              96              30.17              44
##      Max.VisibilityMiles Max.Wind.SpeedMPH Mean.Humidity
## 1              10              22              63
## 2              10              23              95
## 3              10              21              87
```

```
## 4      10      16      75
## 5      10      17      65
## 6      10      15      68
## 7      10      15      75
## 8      10       8      85
##   Mean.Sea.Level.PressureIn Mean.TemperatureF Mean.VisibilityMiles
## 1      30.13      52      10
## 2      29.5      43       3
## 3      29.61      36       7
## 4      29.85      35      10
## 5      29.82      37      10
## 6      29.83      39      10
## 7      30.05      37      10
## 8      30.09      40       9
##   Mean.Wind.SpeedMPH MeanDew.PointF Min.DewpointF Min.Humidity
## 1      13      40      26      52
## 2      13      39      37      89
## 3      13      31      27      82
## 4      11      27      25      64
## 5      12      26      24      55
## 6      10      27      25      53
## 7       6      29      27      60
## 8       4      36      30      73
##   Min.Sea.Level.PressureIn Min.TemperatureF Min.VisibilityMiles
## 1      30.01      39      10
## 2      29.43      38       1
## 3      29.44      32       1
## 4      29.81      31       7
## 5      29.78      32      10
## 6      29.78      33      10
## 7      29.91      32      10
## 8      29.92      35       5
##   PrecipitationIn WindDirDegrees
## 1      0.01      268
## 2      0.28      357
## 3      0.02      230
## 4      T      286
## 5      T      298
## 6      0.00      306
## 7      0.00      324
## 8      T      79
```

```
# See what happens if we try to convert PrecipitationIn to numeric.
# as.numeric(weather5$PrecipitationIn)
```

Column type conversions

```
# Replace "T" with "0" (T = trace)
weather5$PrecipitationIn <-str_replace(weather5$PrecipitationIn, "T","0")

# Convert characters to numerics
weather6 <- mutate_at(weather5, vars(CloudCover:WindDirDegrees), funs(as.numeric))
```

```
## Warning: funs() is soft deprecated as of dplyr 0.8.0
```

```
## Please use a list of either functions or lambdas:
##
##   # Simple named list:
##   list(mean = mean, median = median)
##
##   # Auto named with `tibble::lst()`
##   tibble::lst(mean, median)
##
##   # Using lambdas
##   list(~ mean(., trim = .2), ~ median(., na.rm = TRUE))
## This warning is displayed once per session.
```

```
# Look at result
str(weather6)
```

```
## 'data.frame':   366 obs. of  23 variables:
## $ date          : Date, format: "2014-12-01" "2014-12-10" ...
## $ Events        : chr  "Rain" "Rain" "Rain-Snow" "Snow" ...
## $ CloudCover    : num  6 8 8 7 5 4 2 8 8 7 ...
## $ Max.Dew.PointF : num  46 45 37 28 28 29 33 42 46 34 ...
## $ Max.Gust.SpeedMPH : num  29 29 28 21 23 20 21 10 26 30 ...
## $ Max.Humidity   : num  74 100 92 85 75 82 89 96 100 89 ...
## $ Max.Sea.Level.PressureIn : num  30.4 29.6 29.8 29.9 29.9 ...
## $ Max.TemperatureF : num  64 48 39 39 42 45 42 44 49 44 ...
## $ Max.VisibilityMiles : num  10 10 10 10 10 10 10 10 10 10 ...
## $ Max.Wind.SpeedMPH : num  22 23 21 16 17 15 15 8 20 23 ...
## $ Mean.Humidity   : num  63 95 87 75 65 68 75 85 85 73 ...
## $ Mean.Sea.Level.PressureIn: num  30.1 29.5 29.6 29.9 29.8 ...
## $ Mean.TemperatureF : num  52 43 36 35 37 39 37 40 45 40 ...
## $ Mean.VisibilityMiles : num  10 3 7 10 10 10 10 9 6 10 ...
## $ Mean.Wind.SpeedMPH : num  13 13 13 11 12 10 6 4 11 14 ...
## $ MeanDew.PointF   : num  40 39 31 27 26 27 29 36 41 30 ...
## $ Min.DewpointF    : num  26 37 27 25 24 25 27 30 32 26 ...
## $ Min.Humidity     : num  52 89 82 64 55 53 60 73 70 57 ...
## $ Min.Sea.Level.PressureIn : num  30 29.4 29.4 29.8 29.8 ...
## $ Min.TemperatureF : num  39 38 32 31 32 33 32 35 41 36 ...
## $ Min.VisibilityMiles : num  10 1 1 7 10 10 10 5 1 10 ...
## $ PrecipitationIn  : num  0.01 0.28 0.02 0 0 0 0 0 0.43 0.01 ...
## $ WindDirDegrees   : num  268 357 230 286 298 306 324 79 311 281 ...
```

Find missing values

```
# Count missing values
sum(is.na(weather6))
```

```
## [1] 6
```

```
# Find missing values
summary(weather6)
```

```
##      date          Events          CloudCover    Max.Dew.PointF
## Min.   :2014-12-01  Length:366      Min.    :0.000      Min.    :-6.00
```

```

## 1st Qu.:2015-03-02   Class :character   1st Qu.:3.000   1st Qu.:32.00
## Median :2015-06-01   Mode  :character   Median :5.000   Median :47.50
## Mean   :2015-06-01                                     Mean  :4.708   Mean   :45.48
## 3rd Qu.:2015-08-31                                     3rd Qu.:7.000   3rd Qu.:61.00
## Max.   :2015-12-01                                     Max.   :8.000   Max.   :75.00
##
## Max.Gust.SpeedMPH  Max.Humidity      Max.Sea.Level.PressureIn
## Min.   : 0.00      Min.   : 39.00      Min.   :29.58
## 1st Qu.:21.00      1st Qu.: 73.25      1st Qu.:30.00
## Median :25.50      Median : 86.00      Median :30.14
## Mean   :26.99      Mean   : 85.69      Mean   :30.16
## 3rd Qu.:31.25      3rd Qu.: 93.00      3rd Qu.:30.31
## Max.   :94.00      Max.   :1000.00      Max.   :30.88
## NA's   :6
## Max.TemperatureF  Max.VisibilityMiles  Max.Wind.SpeedMPH  Mean.Humidity
## Min.   :18.00      Min.   : 2.000      Min.   : 8.00      Min.   :28.00
## 1st Qu.:42.00      1st Qu.:10.000      1st Qu.:16.00      1st Qu.:56.00
## Median :60.00      Median :10.000      Median :20.00      Median :66.00
## Mean   :58.93      Mean   : 9.907      Mean   :20.62      Mean   :66.02
## 3rd Qu.:76.00      3rd Qu.:10.000      3rd Qu.:24.00      3rd Qu.:76.75
## Max.   :96.00      Max.   :10.000      Max.   :38.00      Max.   :98.00
##
## Mean.Sea.Level.PressureIn  Mean.TemperatureF  Mean.VisibilityMiles
## Min.   :29.49              Min.   : 8.00      Min.   : -1.000
## 1st Qu.:29.87              1st Qu.:36.25      1st Qu.: 8.000
## Median :30.03              Median :53.50      Median :10.000
## Mean   :30.04              Mean   :51.40      Mean   : 8.861
## 3rd Qu.:30.19              3rd Qu.:68.00      3rd Qu.:10.000
## Max.   :30.77              Max.   :84.00      Max.   :10.000
##
## Mean.Wind.SpeedMPH  MeanDew.PointF      Min.DewpointF      Min.Humidity
## Min.   : 4.00      Min.   : -11.00      Min.   : -18.00      Min.   :16.00
## 1st Qu.: 8.00      1st Qu.: 24.00      1st Qu.: 16.25      1st Qu.:35.00
## Median :10.00      Median : 41.00      Median : 35.00      Median :46.00
## Mean   :10.68      Mean   : 38.96      Mean   : 32.25      Mean   :48.31
## 3rd Qu.:13.00      3rd Qu.: 56.00      3rd Qu.: 51.00      3rd Qu.:60.00
## Max.   :22.00      Max.   : 71.00      Max.   : 68.00      Max.   :96.00
##
## Min.Sea.Level.PressureIn  Min.TemperatureF  Min.VisibilityMiles
## Min.   :29.16              Min.   : -3.00      Min.   : 0.000
## 1st Qu.:29.76              1st Qu.:30.00      1st Qu.: 2.000
## Median :29.94              Median :46.00      Median :10.000
## Mean   :29.93              Mean   :43.33      Mean   : 6.716
## 3rd Qu.:30.09              3rd Qu.:60.00      3rd Qu.:10.000
## Max.   :30.64              Max.   :74.00      Max.   :10.000
##
## PrecipitationIn  WindDirDegrees
## Min.   :0.0000      Min.   : 1.0
## 1st Qu.:0.0000      1st Qu.:113.0
## Median :0.0000      Median :222.0
## Mean   :0.1016      Mean   :200.1
## 3rd Qu.:0.0400      3rd Qu.:275.0
## Max.   :2.9000      Max.   :360.0
##

```

```
# Find indices of NAs in Max.Gust.SpeedMPH
ind <- which(is.na(weather6$Max.Gust.SpeedMPH))

# Look at the full rows for records missing Max.Gust.SpeedMPH
weather6[ind, ]
```

```
##           date Events CloudCover Max.Dew.PointF Max.Gust.SpeedMPH
## 161 2015-05-18   Fog           6           52           NA
## 205 2015-06-03           7           48           NA
## 273 2015-08-08           4           61           NA
## 275 2015-09-01           1           63           NA
## 308 2015-10-12           0           56           NA
## 358 2015-11-03           1           44           NA
##           Max.Humidity Max.Sea.Level.PressureIn Max.TemperatureF
## 161           100           30.30           58
## 205           93           30.31           56
## 273           87           30.02           76
## 275           78           30.06           79
## 308           89           29.86           76
## 358           82           30.25           73
##           Max.VisibilityMiles Max.Wind.SpeedMPH Mean.Humidity
## 161           10           16           79
## 205           10           14           82
## 273           10           14           68
## 275           10           15           65
## 308           10           15           65
## 358           10           16           57
##           Mean.Sea.Level.PressureIn Mean.TemperatureF Mean.VisibilityMiles
## 161           30.23           54           8
## 205           30.24           52          10
## 273           29.99           69          10
## 275           30.02           74          10
## 308           29.80           64          10
## 358           30.13           60          10
##           Mean.Wind.SpeedMPH MeanDew.PointF Min.DewpointF Min.Humidity
## 161           10           48           43           57
## 205           7           45           43           71
## 273           6           57           54           49
## 275           9           62           59           52
## 308           8           51           48           41
## 358           8           42           40           31
##           Min.Sea.Level.PressureIn Min.TemperatureF Min.VisibilityMiles
## 161           30.12           49           0
## 205           30.19           47          10
## 273           29.95           61          10
## 275           29.96           69          10
## 308           29.74           51          10
## 358           30.06           47          10
##           PrecipitationIn WindDirDegrees
## 161           0           72
## 205           0           90
## 273           0           45
## 275           0           54
```

```
## 308          0          199
## 358          0          281
```

An obvious error

```
# Review distributions for all variables
summary(weather6)
```

```
##      date      Events      CloudCover      Max.Dew.PointF
## Min.   :2014-12-01  Length:366      Min.    :0.000      Min.    :-6.00
## 1st Qu.:2015-03-02  Class :character  1st Qu.:3.000      1st Qu.:32.00
## Median :2015-06-01  Mode  :character  Median :5.000      Median :47.50
## Mean   :2015-06-01      Mean   :4.708      Mean   :45.48
## 3rd Qu.:2015-08-31      3rd Qu.:7.000      3rd Qu.:61.00
## Max.   :2015-12-01      Max.    :8.000      Max.    :75.00
##
## Max.Gust.SpeedMPH  Max.Humidity      Max.Sea.Level.PressureIn
## Min.    : 0.00      Min.    : 39.00      Min.    :29.58
## 1st Qu.:21.00      1st Qu.: 73.25      1st Qu.:30.00
## Median :25.50      Median : 86.00      Median :30.14
## Mean   :26.99      Mean   : 85.69      Mean   :30.16
## 3rd Qu.:31.25      3rd Qu.: 93.00      3rd Qu.:30.31
## Max.   :94.00      Max.   :1000.00      Max.   :30.88
## NA's    :6
## Max.TemperatureF  Max.VisibilityMiles  Max.Wind.SpeedMPH  Mean.Humidity
## Min.    :18.00      Min.    : 2.000      Min.    : 8.00      Min.    :28.00
## 1st Qu.:42.00      1st Qu.:10.000      1st Qu.:16.00      1st Qu.:56.00
## Median :60.00      Median :10.000      Median :20.00      Median :66.00
## Mean   :58.93      Mean   : 9.907      Mean   :20.62      Mean   :66.02
## 3rd Qu.:76.00      3rd Qu.:10.000      3rd Qu.:24.00      3rd Qu.:76.75
## Max.   :96.00      Max.   :10.000      Max.   :38.00      Max.   :98.00
##
## Mean.Sea.Level.PressureIn  Mean.TemperatureF  Mean.VisibilityMiles
## Min.    :29.49      Min.    : 8.00      Min.    : -1.000
## 1st Qu.:29.87      1st Qu.:36.25      1st Qu.: 8.000
## Median :30.03      Median :53.50      Median :10.000
## Mean   :30.04      Mean   :51.40      Mean   : 8.861
## 3rd Qu.:30.19      3rd Qu.:68.00      3rd Qu.:10.000
## Max.   :30.77      Max.   :84.00      Max.   :10.000
##
## Mean.Wind.SpeedMPH  MeanDew.PointF      Min.DewpointF      Min.Humidity
## Min.    : 4.00      Min.    : -11.00      Min.    : -18.00      Min.    :16.00
## 1st Qu.: 8.00      1st Qu.: 24.00      1st Qu.: 16.25      1st Qu.:35.00
## Median :10.00      Median : 41.00      Median : 35.00      Median :46.00
## Mean   :10.68      Mean   : 38.96      Mean   : 32.25      Mean   :48.31
## 3rd Qu.:13.00      3rd Qu.: 56.00      3rd Qu.: 51.00      3rd Qu.:60.00
## Max.   :22.00      Max.    : 71.00      Max.    : 68.00      Max.    :96.00
##
## Min.Sea.Level.PressureIn  Min.TemperatureF  Min.VisibilityMiles
## Min.    :29.16      Min.    : -3.00      Min.    : 0.000
## 1st Qu.:29.76      1st Qu.:30.00      1st Qu.: 2.000
## Median :29.94      Median :46.00      Median :10.000
## Mean   :29.93      Mean   :43.33      Mean   : 6.716
```



```
## 3rd Qu.:30.09      3rd Qu.:60.00      3rd Qu.:10.000
## Max. :30.64      Max. :74.00      Max. :10.000
##
## PrecipitationIn WindDirDegrees
## Min. :0.0000 Min. : 1.0
## 1st Qu.:0.0000 1st Qu.:113.0
## Median :0.0000 Median :222.0
## Mean :0.1016 Mean :200.1
## 3rd Qu.:0.0400 3rd Qu.:275.0
## Max. :2.9000 Max. :360.0
##
```

```
# Find row with Max.Humidity of 1000
ind <- which(weather6$Max.Humidity == 1000)

# Look at the data for that day
weather6[ind, ]
```

```
##      date      Events CloudCover Max.Dew.PointF
## 135 2015-04-21 Fog-Rain-Thunderstorm      6      57
##      Max.Gust.SpeedMPH Max.Humidity Max.Sea.Level.PressureIn
## 135      94      1000      29.75
##      Max.TemperatureF Max.VisibilityMiles Max.Wind.SpeedMPH Mean.Humidity
## 135      65      10      20      71
##      Mean.Sea.Level.PressureIn Mean.TemperatureF Mean.VisibilityMiles
## 135      29.6      56      5
##      Mean.Wind.SpeedMPH MeanDew.PointF Min.DewpointF Min.Humidity
## 135      10      49      36      42
##      Min.Sea.Level.PressureIn Min.TemperatureF Min.VisibilityMiles
## 135      29.53      46      0
##      PrecipitationIn WindDirDegrees
## 135      0.54      184
```

```
# Change 1000 to 100
weather6$Max.Humidity[ind] <- 100
```

Another obvious error

```
# Look at summary of Mean.VisibilityMiles
summary(weather6$Mean.VisibilityMiles)
```

```
##      Min. 1st Qu.  Median      Mean 3rd Qu.      Max.
## -1.000   8.000  10.000   8.861  10.000  10.000
```

```
# Get index of row with -1 value
ind <- which(weather6$Mean.VisibilityMiles == -1)

# Look at full row
weather6[ind,]
```

```
##      date Events CloudCover Max.Dew.PointF Max.Gust.SpeedMPH
## 192 2015-06-18      5      54      23
```

```
##      Max.Humidity Max.Sea.Level.PressureIn Max.TemperatureF
## 192          72          30.14          76
##      Max.VisibilityMiles Max.Wind.SpeedMPH Mean.Humidity
## 192          10          17          59
##      Mean.Sea.Level.PressureIn Mean.TemperatureF Mean.VisibilityMiles
## 192          30.04          67          -1
##      Mean.Wind.SpeedMPH MeanDew.PointF Min.DewpointF Min.Humidity
## 192          10          49          45          46
##      Min.Sea.Level.PressureIn Min.TemperatureF Min.VisibilityMiles
## 192          29.93          57          10
##      PrecipitationIn WindDirDegrees
## 192          0          189
```

```
# Set Mean.VisibilityMiles to the appropriate value
weather6$Mean.VisibilityMiles[ind] <- 10
```

Check other extreme values

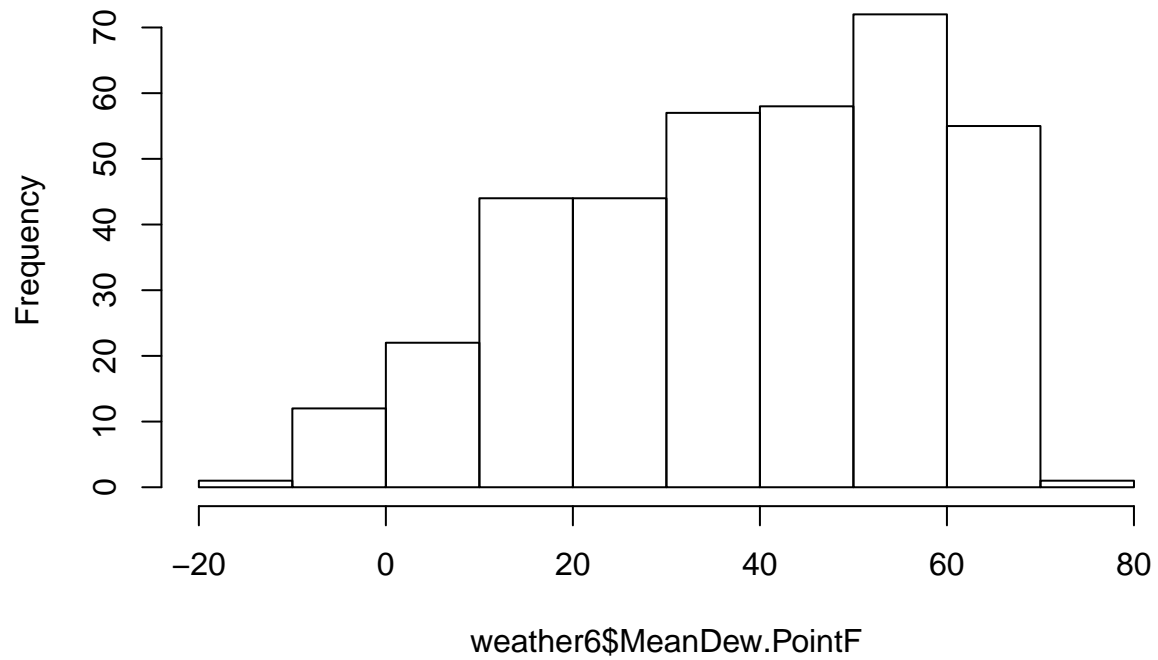
```
# Review summary of full data once more
summary(weather6)
```

```
##      date          Events          CloudCover      Max.Dew.PointF
## Min.   :2014-12-01  Length:366      Min.    :0.000  Min.    :-6.00
## 1st Qu.:2015-03-02  Class :character 1st Qu.:3.000  1st Qu.:32.00
## Median :2015-06-01  Mode  :character  Median :5.000  Median :47.50
## Mean   :2015-06-01          Mean   :4.708  Mean   :45.48
## 3rd Qu.:2015-08-31          3rd Qu.:7.000  3rd Qu.:61.00
## Max.   :2015-12-01          Max.    :8.000  Max.    :75.00
##
## Max.Gust.SpeedMPH Max.Humidity Max.Sea.Level.PressureIn
## Min.   : 0.00      Min.    : 39.00  Min.    :29.58
## 1st Qu.:21.00      1st Qu.: 73.25  1st Qu.:30.00
## Median :25.50      Median : 86.00  Median :30.14
## Mean   :26.99      Mean   : 83.23  Mean   :30.16
## 3rd Qu.:31.25      3rd Qu.: 93.00  3rd Qu.:30.31
## Max.   :94.00      Max.    :100.00  Max.    :30.88
## NA's    :6
## Max.TemperatureF Max.VisibilityMiles Max.Wind.SpeedMPH Mean.Humidity
## Min.   :18.00      Min.    : 2.000  Min.    : 8.00  Min.    :28.00
## 1st Qu.:42.00      1st Qu.:10.000  1st Qu.:16.00  1st Qu.:56.00
## Median :60.00      Median :10.000  Median :20.00  Median :66.00
## Mean   :58.93      Mean   : 9.907  Mean   :20.62  Mean   :66.02
## 3rd Qu.:76.00      3rd Qu.:10.000  3rd Qu.:24.00  3rd Qu.:76.75
## Max.   :96.00      Max.    :10.000  Max.    :38.00  Max.    :98.00
##
## Mean.Sea.Level.PressureIn Mean.TemperatureF Mean.VisibilityMiles
## Min.   :29.49          Min.    : 8.00  Min.    : 1.000
## 1st Qu.:29.87          1st Qu.:36.25  1st Qu.: 8.000
## Median :30.03          Median :53.50  Median :10.000
## Mean   :30.04          Mean   :51.40  Mean   : 8.891
## 3rd Qu.:30.19          3rd Qu.:68.00  3rd Qu.:10.000
## Max.   :30.77          Max.    :84.00  Max.    :10.000
##
```

```
## Mean.Wind.SpeedMPH MeanDew.PointF Min.DewpointF Min.Humidity
## Min. : 4.00 Min. : -11.00 Min. : -18.00 Min. : 16.00
## 1st Qu.: 8.00 1st Qu.: 24.00 1st Qu.: 16.25 1st Qu.: 35.00
## Median :10.00 Median : 41.00 Median : 35.00 Median : 46.00
## Mean :10.68 Mean : 38.96 Mean : 32.25 Mean : 48.31
## 3rd Qu.:13.00 3rd Qu.: 56.00 3rd Qu.: 51.00 3rd Qu.: 60.00
## Max. :22.00 Max. : 71.00 Max. : 68.00 Max. : 96.00
##
## Min.Sea.Level.PressureIn Min.TemperatureF Min.VisibilityMiles
## Min. :29.16 Min. : -3.00 Min. : 0.000
## 1st Qu.:29.76 1st Qu.:30.00 1st Qu.: 2.000
## Median :29.94 Median :46.00 Median :10.000
## Mean :29.93 Mean :43.33 Mean : 6.716
## 3rd Qu.:30.09 3rd Qu.:60.00 3rd Qu.:10.000
## Max. :30.64 Max. :74.00 Max. :10.000
##
## PrecipitationIn WindDirDegrees
## Min. :0.0000 Min. : 1.0
## 1st Qu.:0.0000 1st Qu.:113.0
## Median :0.0000 Median :222.0
## Mean :0.1016 Mean :200.1
## 3rd Qu.:0.0400 3rd Qu.:275.0
## Max. :2.9000 Max. :360.0
##
```

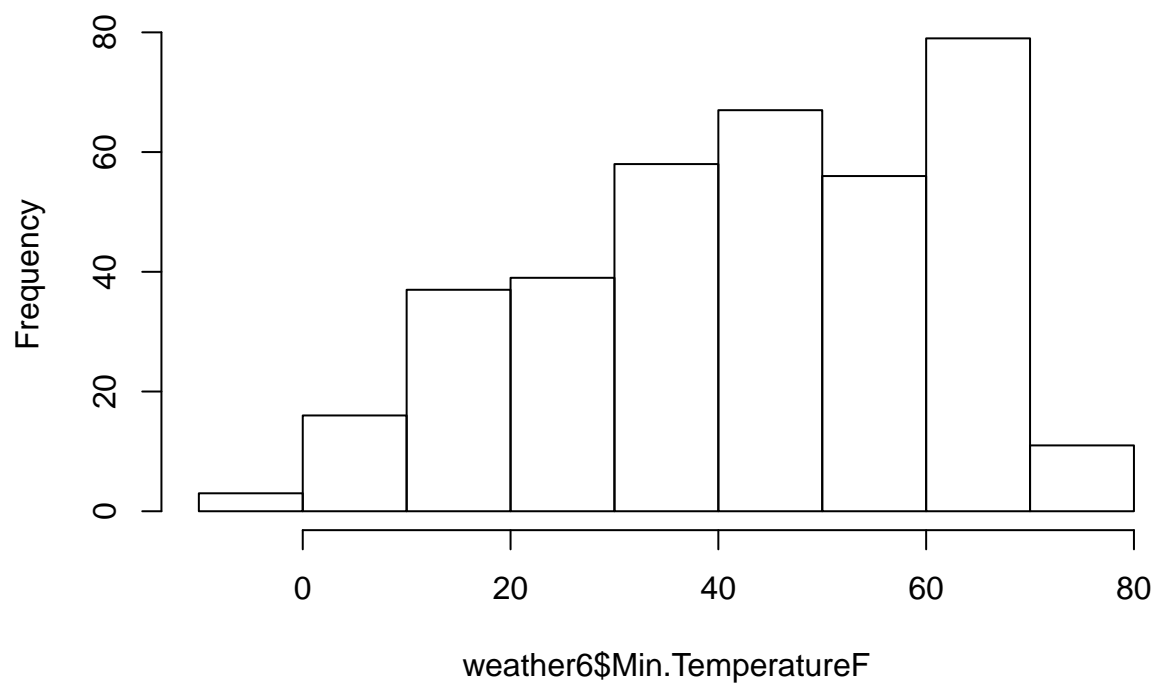
```
# Look at histogram for MeanDew.PointF
hist(weather6$MeanDew.PointF)
```

Histogram of weather6\$MeanDew.PointF



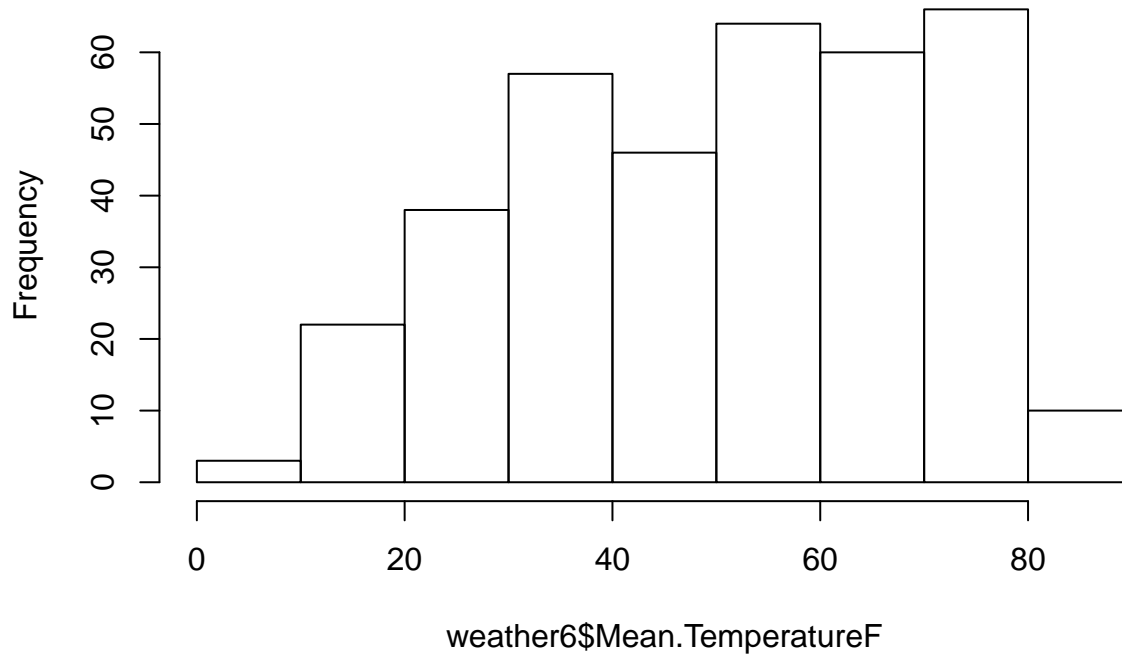
```
# Look at histogram for Min.TemperatureF  
hist(weather6$Min.TemperatureF)
```

Histogram of weather6\$Min.TemperatureF



```
# Compare to histogram for Mean.TemperatureF  
hist(weather6$Mean.TemperatureF)
```

Histogram of weather6\$Mean.TemperatureF



Finishing touches

```
# Clean up column names
new_colnames <- tolower(colnames(weather6))
names(weather6) <- new_colnames

# Replace empty cells in events column
weather6$events[weather6$events == ""] <- "None"

# Print the first 6 rows of weather6
head(weather6, n = 6)
```

```
##      date      events cloudcover max.dew.pointf max.gust.speedmph
## 1 2014-12-01      Rain          6           46             29
## 2 2014-12-10      Rain          8           45             29
## 3 2014-12-11 Rain-Snow          8           37             28
## 4 2014-12-12      Snow          7           28             21
## 5 2014-12-13      None          5           28             23
## 6 2014-12-14      None          4           29             20
## max.humidity max.sea.level.pressurein max.temperaturef
## 1           74                30.45             64
## 2          100                29.58             48
## 3           92                29.81             39
## 4           85                29.88             39
## 5           75                29.86             42
## 6           82                29.91             45
```

##	max.visibilitymiles	max.wind.speedmph	mean.humidity
## 1	10	22	63
## 2	10	23	95
## 3	10	21	87
## 4	10	16	75
## 5	10	17	65
## 6	10	15	68

##	mean.sea.level.pressurein	mean.temperaturef	mean.visibilitymiles
## 1	30.13	52	10
## 2	29.50	43	3
## 3	29.61	36	7
## 4	29.85	35	10
## 5	29.82	37	10
## 6	29.83	39	10

##	mean.wind.speedmph	meandew.pointf	min.dewpointf	min.humidity
## 1	13	40	26	52
## 2	13	39	37	89
## 3	13	31	27	82
## 4	11	27	25	64
## 5	12	26	24	55
## 6	10	27	25	53

##	min.sea.level.pressurein	min.temperaturef	min.visibilitymiles
## 1	30.01	39	10
## 2	29.43	38	1
## 3	29.44	32	1
## 4	29.81	31	7
## 5	29.78	32	10
## 6	29.78	33	10

##	precipitationin	winddirdegrees
## 1	0.01	268
## 2	0.28	357
## 3	0.02	230
## 4	0.00	286
## 5	0.00	298
## 6	0.00	306