Weather Extraction

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Data from weather API

We have used the WeatherData Package to pull all the weather related information from wunderground.com.The weatherData package takes a date range and Location as an input.

We first calculated the minium and max date for our observed dataset

```
mindate <- min(aggData.long$Date)
maxdate <- max(aggData.long$Date)</pre>
```

Converted the date range in to a desired format

```
mindate <- as.Date(mindate, "%m/%d/%Y")
maxdate <- as.Date(maxdate, "%m/%d/%Y")</pre>
```

We got the station code for Boston

```
getStationCode("Boston")
## [[1]]
      Station State airportCode
##
## 656 Boston
                 MΑ
                            KBOS
##
## [[2]]
## [1] "USA MA BOSTON
                                KBOS BOS
                                            72509 42 22N 071 01W
                                                                      6
                                                                          Χ
          0 US"
U
## [2] "USA MA BOSTON/TAUNTON
                                KBOX BOX
                                                   41 57N 071 08W
                                                                     36
            F 8 US"
## [3] "USA MA BOSTON/RFC
                                                   41 57N 071 08W
                                KTAR TAR
                                                                     36
R 8 US"
```

The station id for Boston is "KBOS"

- getWeatherForDate(): Getting data for a range of dates, it has certain parameters
- station_id: is a valid 3- or 4-letter Airport code or a valid Weather Station ID (example: "KBOS" for Boston).
- start date: string representing a date in the past ("YYYY-MM-DD", all numeric)
- end_date: If an interval is to be specified,end_date is a strin grepresenting a date in the past ("YYYY-MM-DD", all numeric) and greater than the start date

- opt_detailed:indicates if detailed records for the station are desired. (default FALSE). By default only one records per date is returned.
- opt_custom_columns: to indicate if only a user-specified set of columns are to be returned. (default FALSE) If TRUE, then the desired columns must be specified via custom columns
- custom_columns: Vector of integers specified by the user to indicate which columns to fetch. The Date column is always returned as the first column.

Once we fetched the respective inputs for the WeatherData .We tried to extract the weather information witht the applied inputs.

```
WeatherData <- getWeatherForDate("KBOS", start_date=mindate,</pre>
                                  end date = maxdate,
                                  opt_detailed=T,opt_custom_columns=T,
                                  custom columns=c(2:13))
    [1] "TimeEST"
                                "TemperatureF"
                                                        "Dew PointF"
##
    [4]
       "Humidity"
                                "Sea_Level_PressureIn" "VisibilityMPH"
                                "Wind_SpeedMPH"
                                                        "Gust SpeedMPH"
  [7] "Wind Direction"
                                "Events"
## [10] "PrecipitationIn"
                                                        "Conditions"
## [13] "WindDirDegrees"
                                "DateUTC"
## [1]
        "TimeEST"
                                "TemperatureF"
                                                        "Dew PointF"
                                "Sea Level PressureIn"
                                                        "VisibilityMPH"
##
  [4] "Humidity"
##
  [7] "Wind Direction"
                                "Wind SpeedMPH"
                                                        "Gust SpeedMPH"
## [10] "PrecipitationIn"
                                                        "Conditions"
                                "Events"
## [13] "WindDirDegrees"
                                "DateUTC"
## [1] "Time"
                                "TemperatureF"
                                                        "Dew PointF"
## [4] "Humidity"
                                "Sea Level PressureIn"
                                                        "VisibilityMPH"
## [7] "Wind Direction"
                                "Wind SpeedMPH"
                                                        "Gust SpeedMPH"
## [10] "PrecipitationIn"
                                "Events"
                                                        "Conditions"
## [13] "WindDirDegrees"
head(WeatherData)
                    Time TemperatureF Dew PointF Humidity
##
## 1 2014-01-01 00:54:00
                                  23.0
                                               5.0
                                                         46
                                                         46
## 2 2014-01-01 01:54:00
                                  21.9
                                               3.9
## 3 2014-01-01 02:54:00
                                  21.9
                                               3.9
                                                         46
## 4 2014-01-01 03:54:00
                                  21.9
                                               3.0
                                                         44
## 5 2014-01-01 04:54:00
                                  21.0
                                               3.0
                                                         46
## 6 2014-01-01 05:54:00
                                  21.0
                                               3.0
                                                         46
     Sea_Level_PressureIn VisibilityMPH Wind_Direction Wind_SpeedMPH
##
## 1
                     30.20
                                      10
                                                     WNW
                                                                   8.1
                                                     WNW
## 2
                     30.23
                                      10
                                                                  11.5
## 3
                    30.25
                                      10
                                                     WSW
                                                                  12.7
## 4
                                                                  11.5
                     30.27
                                      10
                                                     WSW
                    30.29
## 5
                                                                   9.2
                                      10
                                                    West
## 6
                    30.30
                                      10
                                                    West
                                                                  11.5
     Gust SpeedMPH PrecipitationIn Events
##
                                              Conditions WindDirDegrees
## 1
                                N/A
                                      <NA>
                                                    Clear
```

## 2	-	N/A	<na></na>	Partly Cloudy	290	
## 3	-	N/A	<na></na>	Clear	240	
## 4	19.6	N/A	<na></na>	Clear	250	
## 5	-	N/A	<na></na>	Clear	260	
## 6	20.7	N/A	<na></na>	Clear	270	

We calculated the date and hour using the "Lubricate" package we have used.

```
WeatherData$date = date(WeatherData$Time)
WeatherData$hour = hour(WeatherData$Time)
```

After looking in to the information pulled by the WeatherData package, we got a picture that data is spread on hourly interval. We tried to confirm with the following function.

```
head(table(WeatherData$date))
##
## 2014-01-01 2014-01-02 2014-01-03 2014-01-04 2014-01-05 2014-01-06
## 24 54 31 24 36 46
```

After looking at the tabular values, we deduced that although most of the days had 24 observations, some of them have more than 24.

The details revealed that in some instances observations were taken more than once for each hour, as illustrated in the following case:

```
View(WeatherData[which(WeatherData$date == "2014-06-05"),])
```

Detail Observation:

- we got -999999 value in columns TempratureF, DewPointF, Sea_Level_PressureIn, Visibility MPH
- We converted the data to the respective data types
- WindSpeed "Calm" which mean 0: Converting to character as it is in factor

```
WeatherData$date <- as.Date(WeatherData$date, "%m/%d/%Y")
WeatherData$TemperatureF <- as.numeric(WeatherData$TemperatureF)
WeatherData$Dew_PointF <- as.numeric(WeatherData$Dew_PointF)
WeatherData$Sea_Level_PressureIn <-
as.numeric(WeatherData$Sea_Level_PressureIn)
WeatherData$VisibilityMPH <- as.numeric(WeatherData$VisibilityMPH)
WeatherData$WindDirDegrees <- as.numeric(WeatherData$WindDirDegrees)
WeatherData$Humidity <- as.numeric(WeatherData$Humidity)</pre>
WeatherData$Wind_SpeedMPH[WeatherData$Wind_SpeedMPH == "Calm"] <- 0
WeatherData$Wind_SpeedMPH <- as.numeric(WeatherData$Wind_SpeedMPH)
```

We need our data to fall in normal range to remove outliers

Handling Outliers

- We used the approach of substituting the previous or the next value of the observation. For example, if the record 8999 has Temperature as -9999 we used the record of 8998 so that this is still acceptable.
- We tried to handle the outliers with the following function

```
remove_out <- function(param,index,min_v,max_v)
{
   val = NULL
   val = param[index]

   if(val < min_v | val > max_v | is.na(val)){
      if(index-1 >= 1){
       val = param[index-1]
      } else if (index-1 <= 0){
       val = param[index+1]
      }
      return(val)
} else{
   print("Nothing changed")
      return(val) #Normal Value return
}
</pre>
```

With the above function removed the outliers for Temperature. We found out the records where Temperature is falling out of the range defined in the table

Temperature

```
index <- which(WeatherData$TemperatureF < 0 | WeatherData$TemperatureF > 100
| is.na(WeatherData$Dew_PointF))
print(index)
## [1] 8206
```

We had an insight in to the data records WeatherData[8206,]

We found that it was indeed an outlier, could be a machine input error. We tried to remove this implementing the function and checked the record again after the function

```
## 8206
                                  N/A
                                         <NA> Mostly Cloudy
                                                                       220
##
              date hour
## 8206 2014-10-17 4
We were successful in getting in to shape. We implemented the same thing for the other
features:
Dew Point
index <- which(WeatherData$Dew PointF < -20 | WeatherData$Dew PointF > 80 |
is.na(WeatherData$Dew PointF))
for (i in index){
  WeatherData$Dew PointF[i] = remove out(WeatherData$Dew PointF,i,-20,80)
}
Humidity
index <- which(WeatherData$Humidity < 10 | WeatherData$Humidity > 100 |
is.na(WeatherData$Humidity))
for (i in index){
  WeatherData$Humidity[i] = remove_out(WeatherData$Humidity,i,10,100)
}
Wind_SpeedMPH
index <- which(WeatherData$Wind SpeedMPH < 0 | WeatherData$Wind SpeedMPH > 50
is.na(WeatherData$Wind SpeedMPH))
for (i in index){
  WeatherData$Wind SpeedMPH[i] = remove out(WeatherData$Wind SpeedMPH,i,0,50)
}
Sea Level Pressure
index <- which(WeatherData$Sea Level PressureIn < 28 |</pre>
WeatherData$Sea Level PressureIn > 32
is.na(WeatherData$Sea_Level_PressureIn))
for (i in index){
  WeatherData$Sea_Level_PressureIn[i] =
remove_out(WeatherData$Sea_Level_PressureIn,i,28,32)
VisibilityMPH
index <- which(WeatherData$VisibilityMPH < 0 | WeatherData$VisibilityMPH > 10
is.na(WeatherData$VisibilityMPH))
for (i in index){
  WeatherData$VisibilityMPH[i] = remove out(WeatherData$VisibilityMPH,i,0,10)
}
WindDirDegree
index <- which(WeatherData$WindDirDegrees < 0 | WeatherData$WindDirDegrees >
360 | is.na(WeatherData$WindDirDegrees))
```

```
for (i in index){
   WeatherData$WindDirDegrees[i] =
   remove_out(WeatherData$WindDirDegrees,i,0,360)
}
```

The data was clean and consistent. We aggregated the dataset as done in part 1, so that we get records for each hour and we can take average values for numeric values and frequency count for character values. We followed the below steps: 1) Remove non essential features like Time, Gust_speedMH,P,E 2) Group the data by Date and hour 3) summarise base on mean and frequency count

```
WeatherData.Agg <- WeatherData %>%
  select(-c(Time,Gust SpeedMPH,
            PrecipitationIn,Events)) %>%
  group by(date,hour) %>%
  summarise(TemperatureF = mean(TemperatureF),
                                    Dew PointF = mean(Dew PointF),
                                    Humidity = mean(Humidity),
                                    Sea Level PressureIn =
mean(Sea_Level_PressureIn),
                                    VisibilityMPH = mean (VisibilityMPH),
                                    Wind SpeedMPH = mean(Wind SpeedMPH),
                                    WindDirDegrees = mean(WindDirDegrees),
            Conditions =
names(table(Conditions))[which.max(table(Conditions))],
            Wind Direction =
names(table(Wind_Direction))[which.max(table(Wind_Direction))])
head(WeatherData.Agg)
## Source: local data frame [6 x 11]
## Groups: date [1]
##
##
           date hour TemperatureF Dew PointF Humidity Sea Level PressureIn
##
         <date> <int>
                             <dbl>
                                        <dbl>
                                                  <dbl>
                                                                       <dbl>
## 1 2014-01-01
                              23.0
                                          5.0
                                                                       30.20
                    0
                                                     46
## 2 2014-01-01
                    1
                              21.9
                                          3.9
                                                     46
                                                                       30.23
## 3 2014-01-01
                    2
                              21.9
                                          3.9
                                                     46
                                                                       30.25
## 4 2014-01-01
                    3
                              21.9
                                          3.0
                                                     44
                                                                       30.27
## 5 2014-01-01
                    4
                              21.0
                                          3.0
                                                     46
                                                                       30.29
## 6 2014-01-01
                    5
                              21.0
                                                                       30.30
                                          3.0
                                                     46
## # ... with 5 more variables: VisibilityMPH <dbl>, Wind SpeedMPH <dbl>,
       WindDirDegrees <dbl>, Conditions <chr>, Wind Direction <chr>
```

Once We had both the dataset wit in the desired format We merged the data with part 1 of the energy usage data by Date and hour

Final Output Data

```
mergeData <- merge(aggData.long, WeatherData.Agg, by.x = c("Date", "hour"), by.y</pre>
= c("date","hour"))
head(mergeData)
##
                                             Channel Units month day year
           Date hour
                           Account
                    0 26908650026 MILDRED SCHOOL 1
                                                        kWh
                                                                 1
                                                                     1 2014
## 1 2014-01-01
                                                                 1
## 2 2014-01-01
                    1 26908650026 MILDRED SCHOOL 1
                                                        kWh
                                                                     1 2014
## 3 2014-01-01
                   10 26908650026 MILDRED SCHOOL 1
                                                        kWh
                                                                 1
                                                                     1 2014
                                                                 1
## 4 2014-01-01
                   11 26908650026 MILDRED SCHOOL 1
                                                        kWh
                                                                     1 2014
## 5 2014-01-01
                   12 26908650026 MILDRED SCHOOL 1
                                                        kWh
                                                                 1
                                                                     1 2014
## 6 2014-01-01
                   13 26908650026 MILDRED SCHOOL 1
                                                        kWh
                                                                 1
                                                                     1 2014
     Day of Week weekday
                              Kwh PeakHour TemperatureF Dew PointF Humidity
## 1
                4
                         1 132.37
                                          0
                                                     23.0
                                                                  5.0
                                                                             46
## 2
                4
                        1 132.72
                                          0
                                                     21.9
                                                                  3.9
                                                                             46
## 3
                4
                         1 129.11
                                          1
                                                     26.1
                                                                  5.0
                                                                             41
## 4
                4
                                          1
                                                     26.1
                                                                  5.0
                                                                             41
                         1 125.83
## 5
                4
                        1 120.91
                                          1
                                                     27.0
                                                                  5.0
                                                                             39
## 6
                         1 125.20
                                          1
                                                     28.0
                                                                  3.9
                                                                             36
##
     Sea_Level_PressureIn VisibilityMPH Wind_SpeedMPH WindDirDegrees
## 1
                     30.20
                                        10
                                                      8.1
                                                                      290
## 2
                     30.23
                                        10
                                                     11.5
                                                                      290
## 3
                     30.35
                                        10
                                                     12.7
                                                                      280
## 4
                                        10
                                                                      260
                     30.34
                                                     13.8
## 5
                     30.33
                                        10
                                                     13.8
                                                                      280
## 6
                     30.33
                                        10
                                                      8.1
                                                                      300
##
           Conditions Wind Direction
## 1
                 Clear
                                   WNW
## 2
        Partly Cloudy
                                   WNW
        Partly Cloudy
## 3
                                  West
## 4
        Mostly Cloudy
                                  West
## 5 Scattered Clouds
                                  West
                                   WNW
        Mostly Cloudy
```

Arranging the data by Date and hour

```
mergeData<- arrange(mergeData,Date,hour)</pre>
head(mergeData)
##
           Date hour
                                             Channel Units month day year
                          Account
## 1 2014-01-01
                    0 26908650026 MILDRED SCHOOL 1
                                                       kWh
                                                                1
                                                                    1 2014
## 2 2014-01-01
                    1 26908650026 MILDRED SCHOOL 1
                                                       kWh
                                                                1
                                                                    1 2014
## 3 2014-01-01
                    2 26908650026 MILDRED SCHOOL 1
                                                       kWh
                                                                1
                                                                    1 2014
## 4 2014-01-01
                    3 26908650026 MILDRED SCHOOL 1
                                                       kWh
                                                                1
                                                                    1 2014
## 5 2014-01-01
                    4 26908650026 MILDRED SCHOOL 1
                                                       kWh
                                                                1
                                                                    1 2014
                                                       kWh
                                                                1
## 6 2014-01-01
                    5 26908650026 MILDRED SCHOOL 1
                                                                    1 2014
##
     Day of Week weekday
                             Kwh PeakHour TemperatureF Dew_PointF Humidity
## 1
               4
                        1 132.37
                                         0
                                                    23.0
                                                                 5.0
                                                                            46
## 2
                4
                        1 132.72
                                         0
                                                    21.9
                                                                 3.9
                                                                            46
## 3
                4
                        1 129.03
                                         0
                                                    21.9
                                                                 3.9
                                                                            46
```

```
## 4
                                                                            44
                        1 125.76
                                         0
                                                    21.9
                                                                 3.0
                4
## 5
                        1 129.39
                                         0
                                                    21.0
                                                                 3.0
                                                                            46
## 6
                4
                        1 132.51
                                         0
                                                    21.0
                                                                 3.0
                                                                            46
##
     Sea_Level_PressureIn VisibilityMPH Wind_SpeedMPH WindDirDegrees
## 1
                     30.20
                                       10
                                                     8.1
                                                                     290
## 2
                     30.23
                                       10
                                                    11.5
                                                                     290
                                                    12.7
## 3
                     30.25
                                       10
                                                                     240
## 4
                     30.27
                                       10
                                                    11.5
                                                                     250
## 5
                     30.29
                                                     9.2
                                       10
                                                                     260
## 6
                     30.30
                                       10
                                                    11.5
                                                                     270
        Conditions Wind_Direction
##
             Clear
## 1
## 2 Partly Cloudy
                                WNW
## 3
             Clear
                                WSW
## 4
             Clear
                                WSW
## 5
             Clear
                               West
## 6
             Clear
                               West
```

We write this output to csv file

```
write.csv(mergeData,"MergedData.csv")
```

Now we have the clean data to start with our model