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 - Total Usage by Time of Day, and Submeter
 - Total Usage by Weekday

Install and Load Libraries

Hide

Code ▼

#install packages
install.packages("RMySQL")

```
Error in install.packages : Updating loaded packages
                                                                                   Hide
library(RMySQL)
#If there's trouble with installing RMySQL, try this:
#Install.packages('RMySQL', dependencies=TRUE, repos='http://cran.rstudio.com/')
#chooseCRANmirror() I tried chooseCRANmirror() with selection 65. It somehow works.
                                                                                   Hide
install.packages("dplyr ")
Warning in install.packages:
 package 'dplyr ' is not available (for R version 3.6.1)
                                                                                   Hide
install.packages("RMySQL")
trying URL 'https://cran.rstudio.com/bin/macosx/el-capitan/contrib/3.6/RMySQL_0.10.19.tg
z'
Content type 'application/x-gzip' length 1760084 bytes (1.7 MB)
_____
downloaded 1.7 MB
The downloaded binary packages are in
   /var/folders/hm/2md7sccd0479bw81zsh0yyq80000gn/T//Rtmp2fWG7D/downloaded packages
                                                                                   Hide
install.packages("ggplot2")
Error in install.packages : Updating loaded packages
                                                                                   Hide
install.packages("tidyr")
Error in install.packages : Updating loaded packages
                                                                                   Hide
install.packages("lubridate")
```

```
trying URL 'https://cran.rstudio.com/bin/macosx/el-capitan/contrib/3.6/lubridate_1.7.4.t
gz'
Content type 'application/x-gzip' length 1512972 bytes (1.4 MB)
downloaded 1.4 MB
The downloaded binary packages are in
   /var/folders/hm/2md7sccd0479bw81zsh0yyq80000gn/T//Rtmp2fWG7D/downloaded packages
                                                                                Hide
install.packages("ggplot2")
trying URL 'https://cran.rstudio.com/bin/macosx/el-capitan/contrib/3.6/ggplot2_3.2.1.tg
z'
Content type 'application/x-gzip' length 3973186 bytes (3.8 MB)
_____
downloaded 3.8 MB
The downloaded binary packages are in
   /var/folders/hm/2md7sccd0479bw81zsh0yyq80000gn/T//Rtmp2fWG7D/downloaded packages
                                                                                Hide
install.packages("plotly")
Error in install.packages : Updating loaded packages
                                                                                Hide
install.packages("RcppArmadillo")
trying URL 'https://cran.rstudio.com/bin/macosx/el-capitan/contrib/3.6/RcppArmadillo 0.
9.850.1.0.tgz'
Content type 'application/x-gzip' length 1776828 bytes (1.7 MB)
_____
downloaded 1.7 MB
The downloaded binary packages are in
   /var/folders/hm/2md7sccd0479bw81zsh0yyq80000gn/T//Rtmp2fWG7D/downloaded packages
                                                                                Hide
install.packages("tidyr")
```

```
trying URL 'https://cran.rstudio.com/bin/macosx/el-capitan/contrib/3.6/tidyr_1.0.2.tgz'
Content type 'application/x-gzip' length 1020461 bytes (996 KB)
_____
downloaded 996 KB
The downloaded binary packages are in
   /var/folders/hm/2md7sccd0479bw81zsh0yyq80000gn/T//Rtmp2fWG7D/downloaded_packages
                                                                            Hide
install.packages("plotly")
Error in install.packages : Updating loaded packages
                                                                            Hide
install.packages("forecast", dependency = TRUE)
Error in install.packages : Updating loaded packages
                                                                            Hide
install.packages("imputeTS")
trying URL 'https://cran.rstudio.com/bin/macosx/el-capitan/contrib/3.6/imputeTS 3.0.tgz'
Content type 'application/x-gzip' length 2409150 bytes (2.3 MB)
______
downloaded 2.3 MB
The downloaded binary packages are in
   /var/folders/hm/2md7sccd0479bw81zsh0yyq80000gn/T//Rtmp2fWG7D/downloaded packages
                                                                            Hide
install.packages("plotly")
trying URL 'https://cran.rstudio.com/bin/macosx/el-capitan/contrib/3.6/plotly 4.9.2.tgz'
Content type 'application/x-gzip' length 2987045 bytes (2.8 MB)
downloaded 2.8 MB
```

/var/folders/hm/2md7sccd0479bw81zsh0yyq80000gn/T//Rtmp2fWG7D/downloaded_packages

The downloaded binary packages are in

```
Hide
install.packages("forecast", dependency = TRUE)
trying URL 'https://cran.rstudio.com/bin/macosx/el-capitan/contrib/3.6/forecast_8.11.tg
z'
Content type 'application/x-gzip' length 2483677 bytes (2.4 MB)
_____
downloaded 2.4 MB
The downloaded binary packages are in
   /var/folders/hm/2md7sccd0479bw81zsh0yyq80000gn/T//Rtmp2fWG7D/downloaded_packages
                                                                                   Hide
install.packages("ggfortify")
trying URL 'https://cran.rstudio.com/bin/macosx/el-capitan/contrib/3.6/ggfortify_0.4.8.t
gz'
Content type 'application/x-gzip' length 2364813 bytes (2.3 MB)
downloaded 2.3 MB
The downloaded binary packages are in
   /var/folders/hm/2md7sccd0479bw81zsh0yyq80000gn/T//Rtmp2fWG7D/downloaded packages
                                                                                   Hide
# load libraries
library(dplyr)
library(ggplot2)
library(ggfortify)
library(tidyr)
library(lubridate)
library(scales)
library(plotly)
library(forecast)
library(imputeTS)
```

Set specific options of for libraries
Only use scientific notation for values greather than set amount
options(scipen=10000000)

```
#confirm libraries
(.packages())
```

```
[1] "imputeTS" "forecast" "scales" "lubridate" "tidyr" "ggfortify" "dplyr"
[8] "plotly" "ggplot2" "RMySQL" "DBI" "stats" "graphics" "grDevices"
[15] "utils" "datasets" "methods" "base"
```

Obtain Data

Connect to Database

Hide

```
# Create a database connection
con = dbConnect(MySQL(), user='deepAnalytics', password='Sqltask1234!', dbname='dataanal
ytics2018', host='data-analytics-2018.cbrosir2cswx.us-east-1.rds.amazonaws.com')
```

Hide

```
#summary of connection
summary(con)
```

```
<MySQLConnection:0,0>
  User: deepAnalytics
  Host: data-analytics-2018.cbrosir2cswx.us-east-1.rds.amazonaws.com
  Dbname: dataanalytics2018
  Connection type: data-analytics-2018.cbrosir2cswx.us-east-1.rds.amazonaws.com via TCP/
IP
Results:
```

```
dbGetInfo(con)
```

```
$host
[1] "data-analytics-2018.cbrosir2cswx.us-east-1.rds.amazonaws.com"
[1] "deepAnalytics"
$dbname
[1] "dataanalytics2018"
$conType
[1] "data-analytics-2018.cbrosir2cswx.us-east-1.rds.amazonaws.com via TCP/IP"
$serverVersion
[1] "5.6.10"
$protocolVersion
[1] 10
$threadId
[1] 185355
$rsId
list()
```

Obtain Dataset

Hide

```
# List the tables contained in the database.
my_tables <- dbListTables(con)</pre>
my tables
```

```
"yr_2006" "yr_2007" "yr_2008" "yr_2009" "yr_2010"
[1] "iris"
```

Hide

```
"yr 2006" "yr 2007" "yr 2008" "yr 2009" "yr 2010"
# there are 6 tables: "iris"
```

```
# Lists attributes contained in a table
list_db_fields_custom_function<- function (x) {dbListFields(con,x)}</pre>
lapply(my_tables,list_db_fields_custom_function)
```

```
[[1]]
[1] "id"
                     "SepalLengthCm" "SepalWidthCm"
                                                      "PetalLengthCm" "PetalWidthCm"
[6] "Species"
[[2]]
 [1] "id"
                              "Date"
                                                       "Time"
                              "Global_reactive_power" "Global_intensity"
 [4] "Global_active_power"
 [7] "Voltage"
                              "Sub_metering_1"
                                                       "Sub_metering_2"
[10] "Sub_metering_3"
[[3]]
[1] "id"
                              "Date"
                                                       "Time"
 [4] "Global_active_power"
                              "Global reactive power" "Global intensity"
[7] "Voltage"
                              "Sub_metering_1"
                                                       "Sub_metering_2"
[10] "Sub_metering_3"
[[4]]
[1] "id"
                              "Date"
                                                       "Time"
                              "Global_reactive_power" "Global_intensity"
 [4] "Global_active_power"
 [7] "Voltage"
                              "Sub_metering_1"
                                                       "Sub_metering_2"
[10] "Sub_metering_3"
[[5]]
[1] "id"
                              "Date"
                                                       "Time"
 [4] "Global_active_power"
                              "Global_reactive_power" "Global_intensity"
 [7] "Voltage"
                              "Sub metering 1"
                                                       "Sub metering 2"
[10] "Sub metering 3"
[[6]]
[1] "id"
                              "Date"
                                                       "Time"
 [4] "Global active power"
                              "Global reactive power" "Global intensity"
 [7] "Voltage"
                              "Sub metering 1"
                                                       "Sub metering 2"
[10] "Sub_metering_3"
```

tables for the years 2006 -2010 have the same attributes. Column names are the same.

```
# We are only using Date, Time and Submeters for our analysis.

yr_2006SELECT <- dbGetQuery(con, "SELECT Date, Time, Sub_metering_1, Sub_metering_2, Sub_metering_3 FROM yr_2006")
yr_2007SELECT <- dbGetQuery(con, "SELECT Date, Time, Sub_metering_1, Sub_metering_2, Sub_metering_3 FROM yr_2007")
yr_2008SELECT <- dbGetQuery(con, "SELECT Date, Time, Sub_metering_1, Sub_metering_2, Sub_metering_3 FROM yr_2008")
yr_2009SELECT <- dbGetQuery(con, "SELECT Date, Time, Sub_metering_1, Sub_metering_2, Sub_metering_3 FROM yr_2009")
yr_2010SELECT <- dbGetQuery(con, "SELECT Date, Time, Sub_metering_1, Sub_metering_2, Sub_metering_3 FROM yr_2010")</pre>
```

Explore and prepare data

Note: MySQL tables are read into R as data.frames, but without coercing character or logical data into factors. Similarly while exporting data.frames, factors are exported as character vectors. Integer columns are usually imported as R integer vectors, except for cases such as BIGINT or UNSIGNED INTEGER which are coerced to R's double precision vectors to avoid truncation (currently R's integers are signed 32-bit quantities). Time variables are imported/exported as character data, so you need to convert these to your favorite date/time representation.

Investigate Data

Hide

```
# Function to explore tables. Prints out structure, summary, head and tail of data for e
very table.
investigateDF <- function(df) {list(str(df), summary(df),head(df),tail(df))}</pre>
```

```
# Investigates tables from 2006 to 2010
investigateDF(yr_2006SELECT)
```

```
'data.frame': 21992 obs. of 5 variables:
               : chr "2006-12-16" "2006-12-16" "2006-12-16" "2006-12-16" ...
$ Date
                : chr "17:24:00" "17:25:00" "17:26:00" "17:27:00" ...
$ Time
$ Sub_metering_1: num 0 0 0 0 0 0 0 0 0 ...
$ Sub metering 2: num 1 1 2 1 1 2 1 1 1 2 ...
$ Sub metering 3: num 17 16 17 17 17 17 17 17 16 ...
[[1]]
NULL
[[2]]
    Date
                       Time
                                     Sub metering 1
                                                     Sub metering 2
                                                                      Sub metering 3
Length:21992
                  Length:21992
                                     Min. : 0.000
                                                     Min. : 0.000
                                                                      Min. : 0.00
                                     1st Qu.: 0.000
                                                     1st Qu.: 0.000
                                                                      1st Qu.: 0.00
Class :character
                  Class :character
Mode :character
                  Mode :character
                                     Median : 0.000
                                                     Median : 0.000
                                                                      Median: 0.00
                                     Mean : 1.249
                                                     Mean : 2.215
                                                                     Mean : 7.41
                                     3rd Qu.: 0.000
                                                     3rd Qu.: 1.000
                                                                      3rd Qu.:17.00
                                     Max. :77.000
                                                     Max. :74.000
                                                                      Max. :20.00
[[3]]
```

Date <chr></chr>	Time <chr></chr>	Sub_metering_1 <dbl></dbl>	Sub_metering_2 <dbl></dbl>	Sub_metering_3 <dbl></dbl>
1 2006-12-16	17:24:00	0	1	17
2 2006-12-16	17:25:00	0	1	16
3 2006-12-16	17:26:00	0	2	17

Date <chr></chr>	Time <chr></chr>	Sub_metering_1 <dbl></dbl>	Sub_metering_2 <dbl></dbl>	Sub_metering_3 <dbl></dbl>
4 2006-12-16	17:27:00	0	1	17
5 2006-12-16	17:28:00	0	1	17
6 2006-12-16	17:29:00	0	2	17
6 rows				

	Date <chr></chr>	Time <chr></chr>	Sub_metering_1 <dbl></dbl>	Sub_metering_2 <dbl></dbl>	Sub_metering_3 <dbl></dbl>
21987	2006-12-31	23:54:00	0	0	0
21988	2006-12-31	23:55:00	0	0	0
21989	2006-12-31	23:56:00	0	0	0
21990	2006-12-31	23:57:00	0	0	0
21991	2006-12-31	23:58:00	0	0	0
21992	2006-12-31	23:59:00	0	0	0
6 rows					

```
investigateDF(yr_2007SELECT)
```

```
'data.frame':
               521669 obs. of 5 variables:
                     "2007-01-01" "2007-01-01" "2007-01-01" "2007-01-01" ...
$ Date
                : chr
                : chr "00:00:00" "00:01:00" "00:02:00" "00:03:00" ...
$ Time
$ Sub metering 1: num 0 0 0 0 0 0 0 0 0 ...
$ Sub metering 2: num 0 0 0 0 0 0 0 0 0 ...
$ Sub_metering_3: num 0 0 0 0 0 0 0 0 0 ...
[[1]]
NULL
[[2]]
    Date
                       Time
                                     Sub_metering_1
                                                      Sub_metering_2
                                                                      Sub_metering_3
                                                                      Min. : 0.000
Length:521669
                   Length: 521669
                                     Min. : 0.000
                                                      Min. : 0.000
Class :character
                   Class :character
                                     1st Qu.: 0.000
                                                      1st Qu.: 0.000
                                                                      1st Qu.: 0.000
Mode :character
                   Mode :character
                                     Median : 0.000
                                                      Median : 0.000
                                                                      Median : 0.000
                                     Mean
                                           : 1.232
                                                      Mean : 1.638
                                                                      Mean : 5.795
                                                      3rd Qu.: 1.000
                                     3rd Qu.: 0.000
                                                                      3rd Qu.:17.000
                                     Max. :78.000
                                                      Max. :78.000
                                                                      Max. :20.000
[[3]]
```

Date <chr></chr>	Time <chr></chr>	Sub_metering_1 <dbl></dbl>	Sub_metering_2 <dbl></dbl>	Sub_metering_3 <dbl></dbl>
1 2007-01-01	00:00:00	0	0	0
2 2007-01-01	00:01:00	0	0	0
3 2007-01-01	00:02:00	0	0	0
4 2007-01-01	00:03:00	0	0	0
5 2007-01-01	00:04:00	0	0	0
6 2007-01-01	00:05:00	0	0	0
6 rows				

	Date <chr></chr>	Time <chr></chr>	Sub_metering_1 <dbl></dbl>	Sub_metering_2 <dbl></dbl>	Sub_metering_3 <dbl></dbl>
521664	2007-12-31	23:54:00	0	0	18
521665	2007-12-31	23:55:00	0	0	18
521666	2007-12-31	23:56:00	0	0	18
521667	2007-12-31	23:57:00	0	0	18
521668	2007-12-31	23:58:00	0	0	18
521669	2007-12-31	23:59:00	0	0	18
6 rows					

Hide

investigateDF(yr_2008SELECT)

```
'data.frame': 526905 obs. of 5 variables:
   $ Date
                                                       : chr "2008-01-01" "2008-01-01" "2008-01-01" "2008-01-01" ...
                                                          : chr "00:00:00" "00:01:00" "00:02:00" "00:03:00" ...
   $ Time
   $ Sub metering 1: num 0 0 0 0 0 0 0 0 0 ...
   $ Sub_metering_2: num 0 0 0 0 0 0 0 0 0 ...
   $ Sub_metering_3: num    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18    18   
[[1]]
NULL
[[2]]
                                                                                                                                       Sub_metering_1 Sub_metering_2
                                                                                                                                                                                                                                                        Sub_metering_3
                                                                                  Time
                Date
  Length: 526905
                                                                   Length:526905
                                                                                                                                      Min. : 0.00
                                                                                                                                                                                             Min. : 0.000
                                                                                                                                                                                                                                                        Min. : 0.000
                                                                                                                                                                                             1st Qu.: 0.000
                                                                                                                                                                                                                                                         1st Qu.: 0.000
   Class :character
                                                                    Class :character
                                                                                                                                       1st Qu.: 0.00
   Mode :character
                                                                    Mode :character
                                                                                                                                                                                             Median : 0.000
                                                                                                                                       Median: 0.00
                                                                                                                                                                                                                                                        Median : 1.000
                                                                                                                                       Mean : 1.11
                                                                                                                                                                                             Mean : 1.256
                                                                                                                                                                                                                                                        Mean : 6.034
                                                                                                                                       3rd Qu.: 0.00 3rd Qu.: 1.000
                                                                                                                                                                                                                                                         3rd Qu.:17.000
                                                                                                                                       Max. :80.00
                                                                                                                                                                                             Max. :76.000
                                                                                                                                                                                                                                                        Max. :31.000
[[3]]
```

Date <chr></chr>	Time <chr></chr>	Sub_metering_1 <dbl></dbl>	Sub_metering_2 <dbl></dbl>	Sub_metering_3 <dbl></dbl>
1 2008-01-01	00:00:00	0	0	18
2 2008-01-01	00:01:00	0	0	18
3 2008-01-01	00:02:00	0	0	18
4 2008-01-01	00:03:00	0	0	18
5 2008-01-01	00:04:00	0	0	18
6 2008-01-01	00:05:00	0	0	17
6 rows	30.00.00	-	-	

	Date <chr></chr>	Time <chr></chr>	Sub_metering_1 <dbl></dbl>	Sub_metering_2 <dbl></dbl>	Sub_metering_3 <dbl></dbl>
526900	2008-12-31	23:54:00	0	0	0
526901	2008-12-31	23:55:00	0	0	0
526902	2008-12-31	23:56:00	0	0	0
526903	2008-12-31	23:57:00	0	0	0
526904	2008-12-31	23:58:00	0	0	0
526905	2008-12-31	23:59:00	0	0	0

6 rows

Hide

```
investigateDF(yr_2009SELECT)
```

```
'data.frame': 521320 obs. of 5 variables:
               : chr "2009-01-01" "2009-01-01" "2009-01-01" "2009-01-01" ...
$ Date
                : chr "00:00:00" "00:01:00" "00:02:00" "00:03:00" ...
$ Time
$ Sub metering 1: num 0 0 0 0 0 0 0 0 0 ...
$ Sub_metering_2: num 0 0 0 0 0 0 0 0 0 ...
$ Sub_metering_3: num 0 0 0 0 0 0 0 0 0 ...
[[1]]
NULL
[[2]]
                                     Sub metering 1
                                                     Sub metering 2
                                                                      Sub metering 3
    Date
                      Time
                                     Min. : 0.000
                                                     Min. : 0.000
                                                                      Min.
                                                                           : 0.000
Length:521320
                  Length:521320
Class :character
                   Class :character
                                     1st Qu.: 0.000
                                                     1st Qu.: 0.000
                                                                      1st Qu.: 0.000
Mode :character
                   Mode :character
                                     Median : 0.000
                                                     Median : 0.000
                                                                      Median : 1.000
                                     Mean : 1.137
                                                     Mean : 1.136
                                                                      Mean : 6.823
                                     3rd Qu.: 0.000
                                                     3rd Qu.: 1.000
                                                                      3rd Ou.:18.000
                                     Max. :82.000
                                                     Max. :77.000
                                                                      Max.
                                                                            :31.000
[[3]]
```

Date <chr></chr>	Time <chr></chr>	Sub_metering_1 <dbl></dbl>	Sub_metering_2 <dbl></dbl>	Sub_metering_3 <dbl></dbl>
1 2009-01-01	00:00:00	0	0	0
2 2009-01-01	00:01:00	0	0	0
3 2009-01-01	00:02:00	0	0	0
4 2009-01-01	00:03:00	0	0	0
5 2009-01-01	00:04:00	0	0	0
6 2009-01-01	00:05:00	0	0	0
6 rows				

[[4]]

	Date <chr></chr>	Time <chr></chr>	Sub_metering_1 <dbl></dbl>	Sub_metering_2 <dbl></dbl>	Sub_metering_3 <dbl></dbl>
521315	2009-12-31	23:54:00	0	0	18
521316	2009-12-31	23:55:00	0	0	18

	Date <chr></chr>	Time <chr></chr>	Sub_metering_1 <dbl></dbl>	Sub_metering_2 <dbl></dbl>	Sub_metering_3 <dbl></dbl>
521317	2009-12-31	23:56:00	0	0	19
521318	2009-12-31	23:57:00	0	0	18
521319	2009-12-31	23:58:00	0	0	18
521320	2009-12-31	23:59:00	0	0	19
6 rows					

investigateDF(yr_2010SELECT)

```
'data.frame': 457394 obs. of 5 variables:
                : chr "2010-01-01" "2010-01-01" "2010-01-01" "2010-01-01" ...
 $ Date
$ Time
                : chr "00:00:00" "00:01:00" "00:02:00" "00:03:00" ...
 $ Sub_metering_1: num 0 0 0 0 0 0 0 0 0 0 ...
 $ Sub metering 2: num 0 0 0 0 0 0 0 0 0 ...
 $ Sub_metering_3: num    18 18 19 18 18 19 18 18 19 18 ...
[[1]]
NULL
[[2]]
                       Time
                                      Sub metering 1
                                                       Sub metering 2
                                                                        Sub metering 3
    Date
                   Length: 457394
                                      Min. : 0.0000
                                                       Min. : 0.000
                                                                        Min. : 0.000
Length: 457394
                                      1st Qu.: 0.0000
                                                       1st Qu.: 0.000
                                                                        1st Qu.: 1.000
Class :character
                   Class :character
Mode :character
                   Mode :character
                                      Median : 0.0000
                                                       Median : 0.000
                                                                        Median : 1.000
                                      Mean : 0.9875
                                                       Mean : 1.102
                                                                        Mean : 7.244
                                      3rd Qu.: 0.0000
                                                       3rd Qu.: 1.000
                                                                        3rd Qu.:18.000
                                                       Max.
                                      Max.
                                            :88.0000
                                                              :80.000
                                                                        Max. :31.000
```

[[3]]

Date <chr></chr>	Time <chr></chr>	Sub_metering_1 <dbl></dbl>	Sub_metering_2 <dbl></dbl>	Sub_metering_3 <dbl></dbl>
1 2010-01-01	00:00:00	0	0	18
2 2010-01-01	00:01:00	0	0	18
3 2010-01-01	00:02:00	0	0	19
4 2010-01-01	00:03:00	0	0	18
5 2010-01-01	00:04:00	0	0	18
6 2010-01-01	00:05:00	0	0	19
6 rows				

	Date <chr></chr>	Time <chr></chr>	Sub_metering_1 <dbl></dbl>	Sub_metering_2 <dbl></dbl>	Sub_metering_3 <dbl></dbl>
457389	2010-11-26	20:57:00	0	0	0
457390	2010-11-26	20:58:00	0	0	0
457391	2010-11-26	20:59:00	0	0	0
457392	2010-11-26	21:00:00	0	0	0
457393	2010-11-26	21:01:00	0	0	0
457394	2010-11-26	21:02:00	0	0	0
6 rows					

NA

```
#Combine tables into one dataframe (using dplyr)
df2006_2010 <- bind_rows(yr_2006SELECT,yr_2007SELECT,yr_2008SELECT,yr_2009SELECT,yr_2010
SELECT)
investigateDF(df2006_2010)</pre>
```

```
'data.frame':
               2049280 obs. of 5 variables:
$ Date
                : chr "2006-12-16" "2006-12-16" "2006-12-16" "2006-12-16" ...
                : chr "17:24:00" "17:25:00" "17:26:00" "17:27:00" ...
$ Time
$ Sub metering 1: num 0 0 0 0 0 0 0 0 0 ...
$ Sub metering 2: num 1 1 2 1 1 2 1 1 1 2 ...
$ Sub metering 3: num 17 16 17 17 17 17 17 17 16 ...
[[1]]
NULL
[[2]]
    Date
                       Time
                                     Sub metering 1
                                                      Sub metering 2
                                                                      Sub metering 3
Length:2049280
                   Length:2049280
                                     Min. : 0.000
                                                      Min. : 0.000
                                                                      Min. : 0.000
Class :character
                   Class :character
                                     1st Qu.: 0.000
                                                      1st Qu.: 0.000
                                                                      1st Qu.: 0.000
Mode :character
                  Mode :character
                                     Median : 0.000
                                                      Median : 0.000
                                                                      Median : 1.000
                                     Mean : 1.122
                                                      Mean
                                                           : 1.299
                                                                      Mean : 6.458
                                     3rd Qu.: 0.000
                                                      3rd Qu.: 1.000
                                                                      3rd Qu.:17.000
                                     Max. :88.000
                                                      Max.
                                                            :80.000
                                                                      Max.
                                                                             :31.000
[[3]]
```

Date	Time	Sub_metering_1	Sub_metering_2	Sub_metering_3
<chr></chr>	<chr></chr>	<dbl></dbl>	<dbl></dbl>	<dbl></dbl>

Date <chr></chr>	Time <chr></chr>	Sub_metering_1 <dbl></dbl>	Sub_metering_2 <dbl></dbl>	Sub_metering_3 <dbl></dbl>
1 2006-12-16	17:24:00	0	1	17
2 2006-12-16	17:25:00	0	1	16
3 2006-12-16	17:26:00	0	2	17
4 2006-12-16	17:27:00	0	1	17
5 2006-12-16	17:28:00	0	1	17
6 2006-12-16	17:29:00	0	2	17
6 rows				

	Date <chr></chr>	Time <chr></chr>	Sub_metering_1 <dbl></dbl>	Sub_metering_2 <dbl></dbl>	Sub_metering_3 <dbl></dbl>
2049275	2010-11-26	20:57:00	0	0	0
2049276	2010-11-26	20:58:00	0	0	0
2049277	2010-11-26	20:59:00	0	0	0
2049278	2010-11-26	21:00:00	0	0	0
2049279	2010-11-26	21:01:00	0	0	0
2049280	2010-11-26	21:02:00	0	0	0
6 rows					

NA

Create DateTime Objects

Hide

Combine Date and Time attribute values in a new attribute column
df2006_2010 <-cbind(df2006_2010,paste(df2006_2010\$Date,df2006_2010\$Time), stringsAsFacto
rs=FALSE)
head(df2006_2010)</pre>

Date <chr></chr>	Time <chr></chr>	Sub_metering_1 <dbl></dbl>	Sub_metering_2 <dbl></dbl>	Sub_metering_3 <dbl></dbl>
1 2006-12-16	17:24:00	0	1	17
2 2006-12-16	17:25:00	0	1	16

Date <chr></chr>	Time <chr></chr>	Sub_metering_1 <dbl></dbl>	Sub_metering_2 <dbl></dbl>	Sub_metering_3 <dbl></dbl>	
3 2006-12-16	17:26:00	0	2	17	
4 2006-12-16	17:27:00	0	1	17	
5 2006-12-16	17:28:00	0	1	17	
6 2006-12-16	17:29:00	0	2	17	
6 rows 1-6 of 6 columns					

Remove Date and Time columns
#drop date and time, which are not time zone adjusted, and rename dateT
df2006_2010 <- df2006_2010[, !(names(df2006_2010) %in% c("Date","Time"))]
head(df2006_2010)</pre>

	Sub_metering_1 <dbl></dbl>	Sub_metering_2 <dbl></dbl>	Sub_metering_3 <dbl></dbl>	paste(df2006_2010\$Date, df2006_2010\$Time) <chr></chr>
1	0	1	17	2006-12-16 17:24:00
2	0	1	16	2006-12-16 17:25:00
3	0	2	17	2006-12-16 17:26:00
4	0	1	17	2006-12-16 17:27:00
5	0	1	17	2006-12-16 17:28:00
6	0	2	17	2006-12-16 17:29:00
6 r	ows			

Hide

Give the new attribute in the 6th column a header name colnames(df2006_2010)[4] <-"DateTime" head(df2006_2010)

	Sub_metering_1 <dbl></dbl>	Sub_metering_2 <dbl></dbl>	Sub_metering_3 <dbl></dbl>	
1	0	1	17	2006-12-16 17:24:00
2	0	1	16	2006-12-16 17:25:00
3	0	2	17	2006-12-16 17:26:00
4	0	1	17	2006-12-16 17:27:00
5	0	1	17	2006-12-16 17:28:00
6	0	2	17	2006-12-16 17:29:00

```
# Move the DateTime attribute within the dataset
df2006_2010 <- df2006_2010[,c(ncol(df2006_2010), 1:(ncol(df2006_2010)-1))]
head(df2006_2010)</pre>
```

DateTime <chr></chr>	Sub_metering_1 <dbl></dbl>	Sub_metering_2 <dbl></dbl>	Sub_metering_3 <dbl></dbl>
1 2006-12-16 17:24:00	0	1	17
2 2006-12-16 17:25:00	0	1	16
3 2006-12-16 17:26:00	0	2	17
4 2006-12-16 17:27:00	0	1	17
5 2006-12-16 17:28:00	0	1	17
6 2006-12-16 17:29:00	0	2	17
6 rows			

Hide

```
# Convert DateTime from character to POSIXct
df2006_2010$DateTime <- as.POSIXct(df2006_2010$DateTime, "%Y/%m/%d %H:%M:%S")</pre>
```

unknown timezone '%Y/%m/%d %H:%M:%S'unknown timezone '%Y/%m/%d %H:%M:%S'unknown timezone '%Y/%m/%d %H:%M:%S'unknown timezone '%Y/%m/%d %H:%M:%S'

Hide

```
attr(df2006_2010$DateTime, "tzone") <- "Europe/Paris"

#Verify
str(df2006_2010)</pre>
```

```
'data.frame': 2049280 obs. of 4 variables:

$ DateTime : POSIXct, format: "2006-12-16 18:24:00" "2006-12-16 18:25:00" "2006-12
-16 18:26:00" ...

$ Sub_metering_1: num  0 0 0 0 0 0 0 0 ...

$ Sub_metering_2: num  1 1 2 1 1 2 1 1 2 ...

$ Sub_metering_3: num  17 16 17 17 17 17 17 16 ...
```

```
head(df2006_2010)
```

	DateTime <s3: posixct=""></s3:>	Sub_metering_1 <dbl></dbl>	Sub_metering_2 <dbl></dbl>	Sub_metering_3 <dbl></dbl>
1	2006-12-16 18:24:00	0	1	17
2	2006-12-16 18:25:00	0	1	16
3	2006-12-16 18:26:00	0	2	17
4	2006-12-16 18:27:00	0	1	17
5	2006-12-16 18:28:00	0	1	17
6	2006-12-16 18:29:00	0	2	17
6 rows				

Create "year, quarter, month, week, weekday, day, dateTZ(different than original date
[chr string] with time zone applied], hour, and minute attributes

df2006_2010\$year <- year(df2006_2010\$DateTime)</pre>

df2006_2010\$quarter <- quarter(df2006_2010\$DateTime)</pre>

df2006_2010\$month <- month(df2006_2010\$DateTime)</pre>

df2006_2010\$week <- week(df2006_2010\$DateTime)</pre>

df2006_2010\$weekday <- weekdays(df2006_2010\$DateTime)</pre>

df2006_2010\$day <- day(df2006_2010\$DateTime)</pre>

df2006_2010\$date <- date(df2006_2010\$DateTime)</pre>

df2006_2010\$hour <- hour(df2006_2010\$DateTime)</pre>

df2006_2010\$minute <- minute(df2006_2010\$DateTime)</pre>

Hide

verify new attributes
head(df2006_2010)

	DateTime <s3: posixct=""></s3:>	Sub_metering_1 <dbl></dbl>	Sub_metering_2 <dbl></dbl>	Sub_metering_3 <dbl></dbl>	_	-	m <dbl></dbl>
1	2006-12-16 18:24:00	0	1	17	2006	4	12
2	2006-12-16 18:25:00	0	1	16	2006	4	12
3	2006-12-16 18:26:00	0	2	17	2006	4	12
4	2006-12-16 18:27:00	0	1	17	2006	4	12
5	2006-12-16 18:28:00	0	1	17	2006	4	12
6	2006-12-16 18:29:00	0	2	17	2006	4	12
6 rov	vs 1-9 of 13 columns						

Hide

tail(df2006 2010)

	DateTime <s3: posixct=""></s3:>	Sub_metering_1 <dbl></dbl>	Sub_metering_2 <dbl></dbl>	Sub_metering_3 <dbl></dbl>	_	-
2049275	2010-11-26 21:57:00	0	0	0	2010	2
2049276	2010-11-26 21:58:00	0	0	0	2010	2
2049277	2010-11-26 21:59:00	0	0	0	2010	2
2049278	2010-11-26 22:00:00	0	0	0	2010	2
2049279	2010-11-26 22:01:00	0	0	0	2010	2
2049280	2010-11-26 22:02:00	0	0	0	2010	2
6 rows 1-9	of 13 columns					

Any NAs?

Hide

sum(is.na(df2006_2010))

[1] 0

Hide

no missing values

Data Documentation

Source: http://archive.ics.uci.edu/ml/datasets/Individual+household+electric+power+consumption# (http://archive.ics.uci.edu/ml/datasets/Individual+household+electric+power+consumption#)

Abstract: Measurements of electric power consumption in one household with a one-minute sampling rate over a period of almost 4 years. Different electrical quantities and some sub-metering values are available.

Attribute Information:

sub_metering_1: energy sub-metering No. 1 (in). It corresponds to the kitchen, containing mainly a dishwasher, an oven and a microwave (hot plates are not electric but gas powered).

sub_metering_2: energy sub-metering No. 2 (in watt-hour of active energy). It corresponds to the laundry room, containing a washing-machine, a tumble-drier, a refrigerator and a light.

sub_metering_3: energy sub-metering No. 3 (in watt-hour of active energy). It corresponds to an electric water-heater and an air-conditioner.

Dataframes, Functions, and Objects

This section is a list of dataframes. I intend to keep most dataframes in one section and call on the object as needed. This way, I can keep my analysis more concise and can easily keep tracks of what objects have already been created.

```
# We do not have data for a full year of 2006 and 2010. We will use years 2007-2009 for
time series analysis that either require complete time intervals or would benefit from
the simplicity of complete intervals.
df2007_2009 <- df2006_2010 %>%
filter( year > 2006 & year < 2010)</pre>
```

Visualizations

Total Energy Consumption for Each Submeter

Bar and Pie chart

Hide

```
# Create a data frame of the sum of energy consumption for each submeter
sum_of_submeters <- data.frame(Kitchen = sum(df2006_2010$Sub_metering_1), LaundryRoom =
sum(df2006_2010$Sub_metering_2), WaterHeater_AC = sum(df2006_2010$Sub_metering_3))
# Transpose data frame so that submeters and total energy use are each in a column
sum_of_submeters_long = gather(sum_of_submeters, key = "Submeters") %>%
    group_by(Submeters) %>%
    summarize(Total_Energy_Usage = sum(value, na.rm = TRUE))
```

Energy consumption on Mondays at 8:00pm

Hide

```
## Subset 2008, January 9, every 10 minutes
houseDay20080109_10min <- filter(df2006_2010, year == 2008 & month == 1 & day == 9 & (mi
nute == 0 | minute == 10 | minute == 20 | minute == 30 | minute == 40 | minute == 50))</pre>
```

Energy consumption, Christmas Week 2008

Hide

```
## Subset of Week 52 in 2008, every 4 hours
week52_2018_4hours <- filter(df2006_2010, year == 2008 & week==52 & (hour == 0 | hour ==
4 | hour == 8 | hour == 12 | hour == 16 | hour == 20 ))</pre>
```

Energy consumption by weekdays

```
#Mondays
mondays <- weekdaysAllYears %>%
    filter(weekday == "Monday")
tuesdays <- weekdaysAllYears %>%
    filter(weekday == "Tuesday")
wednesdays <- weekdaysAllYears %>%
    filter(weekday == "Wednesday")
thursdays <- weekdaysAllYears %>%
    filter(weekday == "Thursday")
fridays <- weekdaysAllYears %>%
    filter(weekday == "Friday")
saturdays <- weekdaysAllYears %>%
    filter(weekday == "Saturday")
sundays <- weekdaysAllYears %>%
    filter(weekday == "Saturday")
```

Weekdays in 2008

Hide

Hide

Hide

```
thursdays08 <- thursdays %>%
  filter(year == 2008)
sundays08 <- sundays %>%
  filter(year == 2008)
```

Time of Day

Paris Sun Times https://www.timeanddate.com/sun/france/paris?month=1&year=2020 (https://www.timeanddate.com/sun/france/paris?month=1&year=2020)

I will break time into four intervals: morning, afternoon, evening, night

I would look at historical weather trends to get an idea about what particular times represent our time intervals but historical weather data costs money and is out of the scope of this analysis. Instead, I browsed travel sites to get an idea of what time of the day the Frech typically start and end.

I decided to set morning from 6:00am - 11:59pm (in our dataset, it's from hours 6 to 11). I read on TripAdvisor that bakeries typically at 7am, and it's ideal to get a croissant with coffeee. Therefore, I will start morning (with a wakeup time starting) at 6:00am. I may alter this time interval as I learn more about the dataset and see if I can find a distinct pattern between night and morning for this particular family.

Afternoon is from 12:00pm - 4:59pm (hours 12 to 16). Evening follows from 5:00pm - 11:59pm (hours 17 to 23). It is set this late because I read on TripAdvisor that most restaurants are open until midnight and that Paris has a very active nightlife. Night time is the remaining time between 12:00am to 5:59am (hours 0 to 5).

create new column with time of day in it
allYearsTimeofDay <- df2006_2010 %>%
 mutate(timeOfDay = case_when(
 hour %in% c(6,7,8,9,10,11) ~ "1. morning",
 hour %in% c(12,13,14,15,16) ~ "2. afternoon",
 hour %in% c(17,18,19,20,21,22,23,24) ~ "3. evening",
 hour %in% c(0,1,2,3,4,5) ~ "4. night"))

Piechart for total use for all years by time of Day

Total Power, grouped by various time intervals, for each submeter and combined submeters

Submeters by Minute
submetersByMinute <- df2006_2010 %>%
 mutate(TotalEnergy_perMinute= (Sub_metering_1+Sub_metering_2+Sub_metering_3))
submetersByMinute\$minute_index <- seq.int(nrow(submetersByMinute))</pre>

Hide

Hide

Hide

Hide

Hide

Zero Power Days

Hide

Hide

Hide

```
zeroPowerDays_Kitchen <- df2007_2009 %>%
    group_by(year, month, weekday, date) %>%
    summarize(Kitchen = sum(Sub_metering_1), LaundryRoom = sum(Sub_metering_2), WaterHea
ter_AC = sum(Sub_metering_3)) %>%
    filter(Kitchen == 0) %>%
    select(-LaundryRoom, -WaterHeater_AC)
```

Hide

```
zeroPowerDays_Kitchen_Frequency_Weekdays <- zeroPowerDays_Kitchen %>%
  group_by(year, weekday) %>%
  summarize(Total = n())
```

```
zeroPowerDays_Laundry <- df2007_2009 %>%
    group_by(year, month, weekday, date) %>%
    summarize(Kitchen = sum(Sub_metering_1), LaundryRoom = sum(Sub_metering_2), WaterHea
ter_AC = sum(Sub_metering_3)) %>%
    filter(LaundryRoom == 0) %>%
    select(-Kitchen, -WaterHeater_AC)
```

```
zeroPowerDays_WaterHeater_AC <- df2006_2010 %>%
   group_by(year, month, weekday, date) %>%
   summarize(Kitchen = sum(Sub_metering_1), LaundryRoom = sum(Sub_metering_2), WaterHeater_AC = sum(Sub_metering_3)) %>%
   filter(WaterHeater_AC == 0) %>%
   select(-Kitchen, -LaundryRoom)
```

Hide

```
#Create time objects of submeter_1:
kitchenHourly_ts <- ts(submetersByHour[,4], start = c(2006, 12), frequency = 8760)
kitchenHourlyMeanMonthly_ts <- ts(submetersByHour24wMonth_Average[,4], start = c(2007, 1), frequency = 12*24)

#submeterlWeekly_ts <- ts(submetersByWeek[,3], start = c(2007, 1), frequency = 52)
#submeterlMonthly_ts <- ts(submetersByMonth[,3], start = c(2007, 1), frequency = 12)
#submeterlQuarterly_ts <- ts(submetersByQuarter[,3], start = c(2007, 1), frequency = 4)</pre>
```

Hide

```
#Create time objects of submeter_2
laundryRoomHourly_ts <- ts(submetersByHour[,4], start = c(2006, 12), frequency = 8760)
#submeter2Weekly_ts <- ts(submetersByWeek[,4], start = c(2007, 1), frequency = 52)
#submeter2Monthly_ts <- ts(submetersByMonth[,4], start = c(2007, 1), frequency = 12)
#submeter2Quarterly_ts <- ts(submetersByQuarter[,4], start = c(2007, 1), frequency = 4)</pre>
```

Hide

```
#Create time objects of submeter_3
waterHeater_AC_ts <- ts(submetersByHour[,5], start = c(2007, 1), frequency = 8760)
#submeter3Weekly_ts <- ts(submetersByWeek[,5], start = c(2007, 1), frequency = 52)
#submeter3Monthly_ts <- ts(submetersByMonth[,5], start = c(2007, 1), frequency = 12)
#submeter3Quarterly_ts <- ts(submetersByQuarter[,5], start = c(2007, 1), frequency = 4)</pre>
```

dataframes for forecasting

```
# Every monday at 8:00pm
house070809weekly <- filter(df2007_2009, weekday == "Monday" & hour == 20 & minute == 1)
tsSM1_070809weekly <- ts(house070809weekly$Sub_metering_1, frequency=52, start=c(2007,1))
tsSM2_070809weekly <- ts(house070809weekly$Sub_metering_2, frequency=52, start=c(2007,1))
tsSM3_070809weekly <- ts(house070809weekly$Sub_metering_3, frequency=52, start=c(2007,1))</pre>
```

dataframes for decomposing

submeter 1, mornings, 2007,2008,2009 only (full time periods only)

 $sub1ByMorning070809 <- df2006_2010_timeofDay \%>\% filter(year != 2006 \& year != 2010 , TimeOfDay == "1. morning") \\ sub1ByMorning0809 <- df2006_2010_timeofDay \%>\% filter(year != 2006 \& year != 2007 \& year != 2010, TimeOfDay == "1. morning")$

convert to time series

sub1ByMorning070809_ts <- ts(sub1ByMorning070809 $Kitchen, frequency = 366, start = c(2007, 1))sub1ByMorning0809_ts < -ts(sub1ByMorning0809 Kitchen, frequency=363, start=c(2008,1))$

Mornings, by week, instead of day

subsByWeek070809 <- df2006_2010_timeofDay %>% filter(year != 2006 & year != 2010, TimeOfDay == "1. morning") %>% group_by(year,week) %>% summarize(Kitchen = sum(Kitchen), LaundryRoom = sum(LaundryRoom), WaterHeaterAC =sum(WaterHeaterAC))

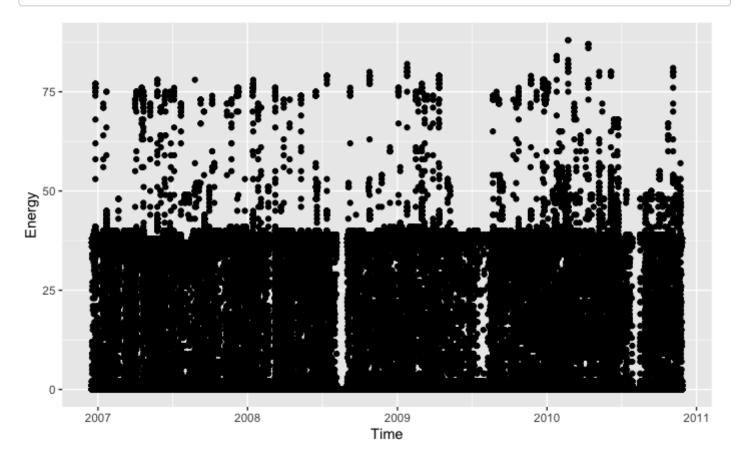
Mornings, by week, as time series

 $sub1ByWeek070809_ts <- ts(subsByWeek070809\\ Kitchen, frequency = 52, start = c(2007, 1))sub2ByWeek070809_ts <- ts(subsByWeek070809$LaundryRoom, frequency=52, start=c(2007,1)) sub3ByWeek070809_ts <- ts(subsByWeek070809$WaterHeaterAC, frequency=52, start=c(2007,1))$

Energy over Time for each Submeter (and Frequency)

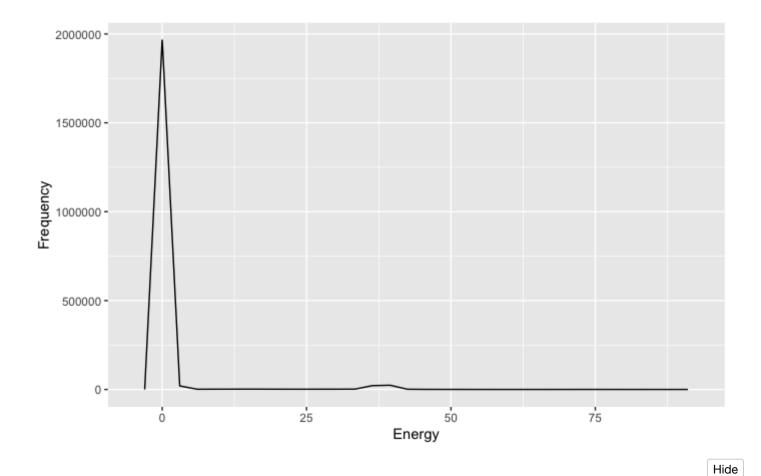
Submeter 1

```
# Submeter 1 Over Time
ggplot(data=df2006_2010, aes(x=DateTime, y=Sub_metering_1)) + geom_point()+ylab("Energy"
)+ xlab("Time")
```



Most observations are between 0 and 40, with occassional high usage. There are two primary breaks in the data, where there is minimum usage. Perhaps, this is vacation time.

```
# Frequency Plot
ggplot(data=df2006_2010, aes(x=Sub_metering_1)) + geom_freqpoly()+ylab("Frequency")+ xla
b("Energy")
```



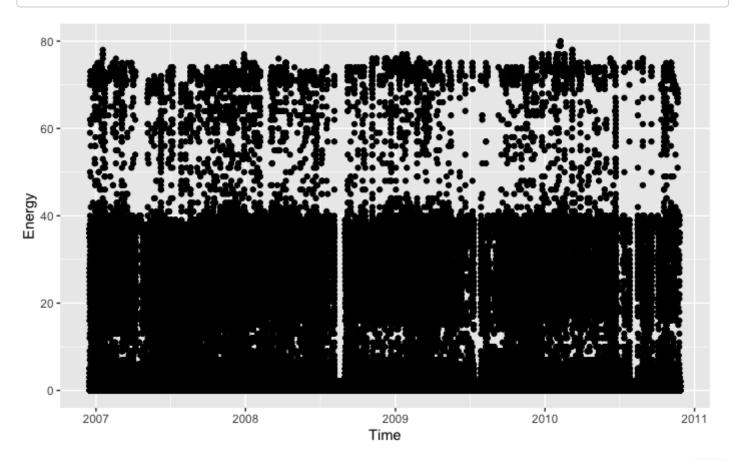
Frequency Table for Submeter 1
frequency_submeter1 <- data.frame(table(df2006_2010\$Sub_metering_1))
names(frequency_submeter1)[names(frequency_submeter1) == "Var1"] <- "Energy"
names(frequency_submeter1)[names(frequency_submeter1) == "Freq"] <- "Frequency"
arrange(frequency_submeter1, -frequency_submeter1\$Frequency)</pre>

Energy <fctr></fctr>	Frequency <int></int>
0	1880175
1	84936
2	19017
38	16119
37	14892
39	6503
36	5270
35	1359
40	1159
32	802
1-10 of 88 rows	Previous 1 2 3 4 5 6 9 Next

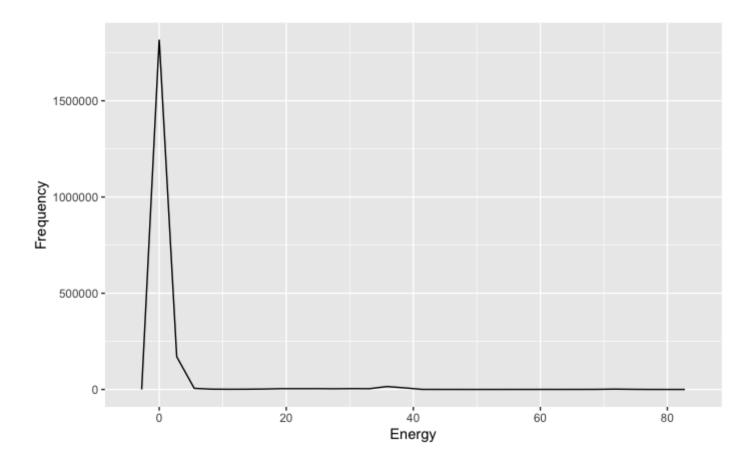
Submeter 2

Hide

```
# Submeter 2 Over Time
ggplot(data=df2006_2010, aes(x=DateTime, y=Sub_metering_2)) + geom_point()+ylab("Energy"
)+ xlab("Time")
```



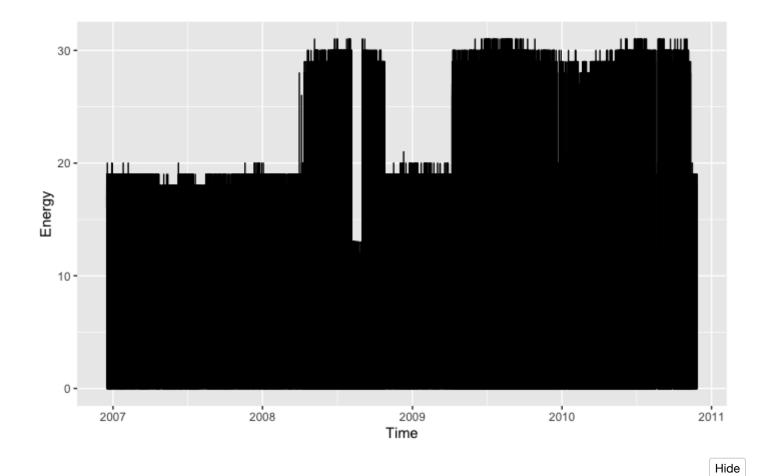
```
# Frequency
ggplot(data=df2006_2010, aes(x=Sub_metering_2)) + geom_freqpoly()+ylab("Frequency")+ xla
b("Energy")
```



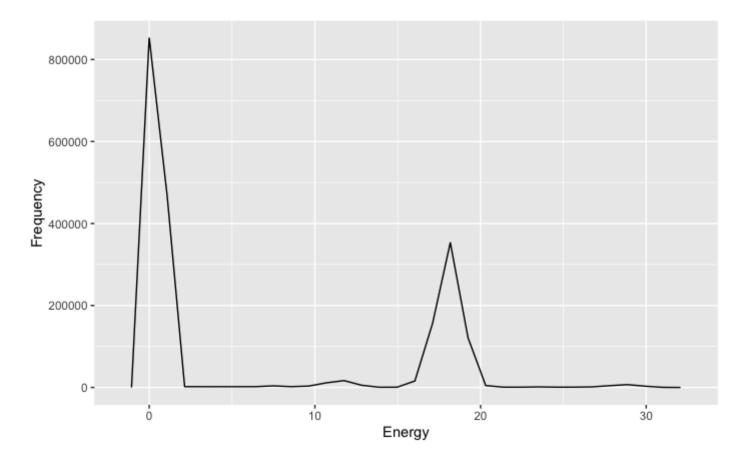
Submeter 3

```
Hide
```

```
# Submeter 2 Over Time
ggplot(data=df2006_2010, aes(x=DateTime, y=Sub_metering_3)) + geom_line()+ylab("Energy")
+ xlab("Time")
```

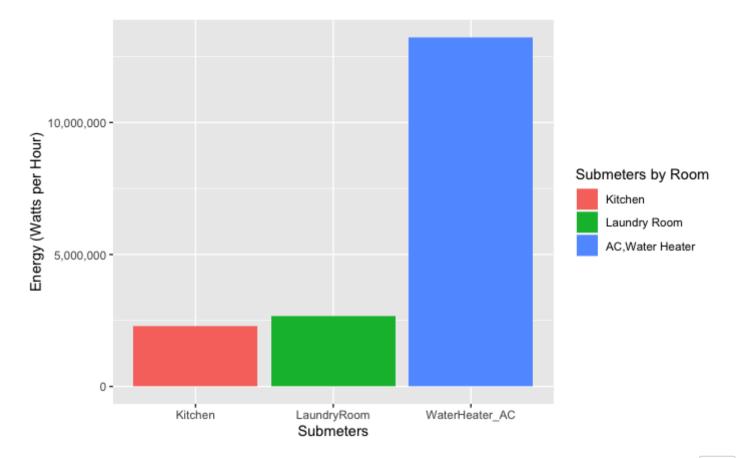


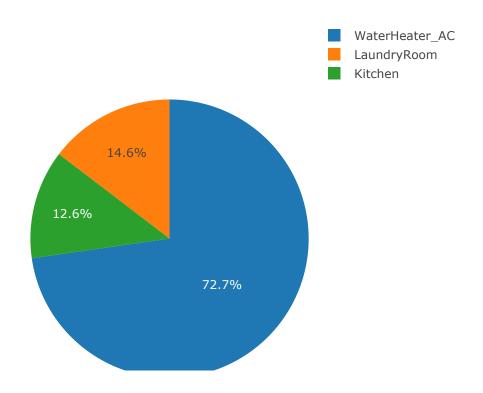
Frequency
ggplot(data=df2006_2010, aes(x=Sub_metering_3)) + geom_freqpoly()+ylab("Frequency")+ xla
b("Energy")



Total Energy Consumption for Each Submeter

```
# Plot
ggplot(data = sum_of_submeters_long, aes(x = Submeters, y = Total_Energy_Usage, fill = S
ubmeters)) +
    geom_col()+
    scale_y_continuous(label=comma)+
    ylab("Energy (Watts per Hour)")+
    scale_fill_discrete(name = "Submeters by Room", labels = c("Kitchen", "Laundry Room",
"AC,Water Heater"))
```



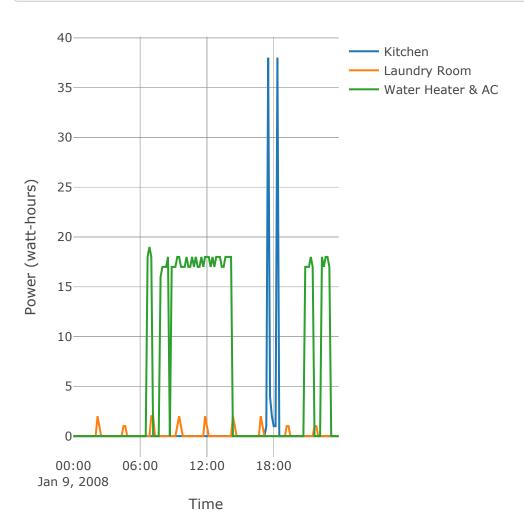


Exploring Different Intervals in 2008

Which time interval is best for addressing granularity?

Day of January 9, 2008

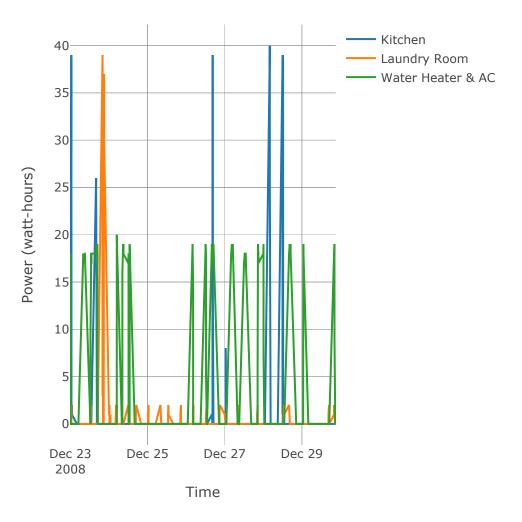
```
## Plot 2008/01/08- Submeters, 10-minute Frequencies
plot_ly(houseDay20080109_10min, x = ~houseDay20080109_10min$DateTime, y = ~houseDay20080
109_10min$Sub_metering_1, name = 'Kitchen', type = 'scatter', mode = 'lines') %>%
  add_trace(y = ~houseDay20080109_10min$Sub_metering_2, name = 'Laundry Room', mode = 'lines') %>%
  add_trace(y = ~houseDay20080109_10min$Sub_metering_3, name = 'Water Heater & AC', mode = 'lines') %>%
  layout(xaxis = list(title = "Time"), yaxis = list (title = "Power (watt-hours)"))
```



Christmas Week, 2008

Hide

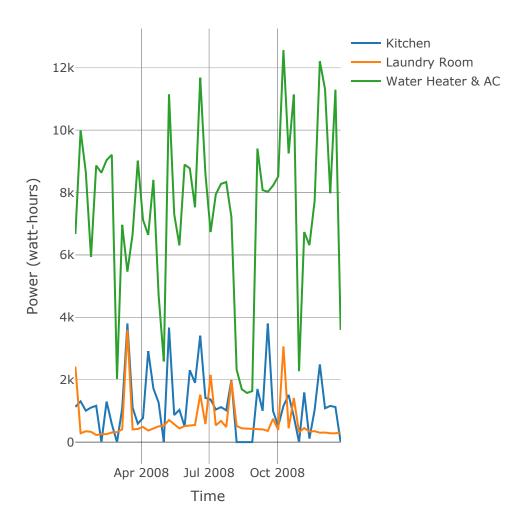
```
#Plot Week 52 in 2008, every 4 hours
plot_ly(week52_2018_4hours, x = week52_2018_4hours$DateTime, y = ~week52_2018_4hours$Sub
_metering_1, name = 'Kitchen', type = 'scatter', mode = 'lines') %>%
  add_trace(y = ~week52_2018_4hours$Sub_metering_2, name = 'Laundry Room', mode = 'lines') %>%
  add_trace(y = ~week52_2018_4hours$Sub_metering_3, name = 'Water Heater & AC', mode = 'lines') %>%
  layout( xaxis = list(title = "Time"), yaxis = list (title = "Power (watt-hours)"))
```



Weekdays in 2008

Thursdays

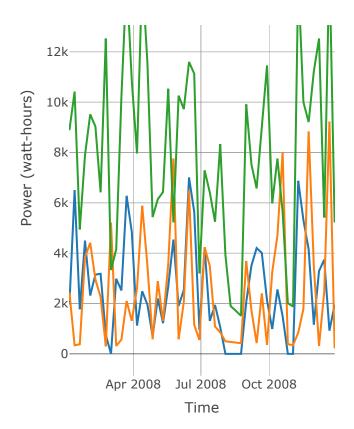
```
#Plot Thursdays in 2008
plot_ly(thursdays08, x = thursdays08$date, y = ~thursdays08$Kitchen, name = 'Kitchen', t
ype = 'scatter', mode = 'lines') %>%
  add_trace(y = ~thursdays08$LaundryRoom, name = 'Laundry Room', mode = 'lines') %>%
  add_trace(y = ~thursdays08$WaterHeaterAC, name = 'Water Heater & AC', mode = 'lines') %
>%
  layout(xaxis = list(title = "Time"), yaxis = list (title = "Power (watt-hours)"))
```



sundays

```
#Plot sundays in 2008
plot_ly(sundays08, x = sundays08$date, y = ~sundays08$Kitchen, name = 'Kitchen', type =
'scatter', mode = 'lines') %>%
add_trace(y = ~sundays08$LaundryRoom, name = 'Laundry Room', mode = 'lines') %>%
add_trace(y = ~sundays08$WaterHeaterAC, name = 'Water Heater & AC', mode = 'lines') %>%
layout( xaxis = list(title = "Time"), yaxis = list (title = "Power (watt-hours)"))
```





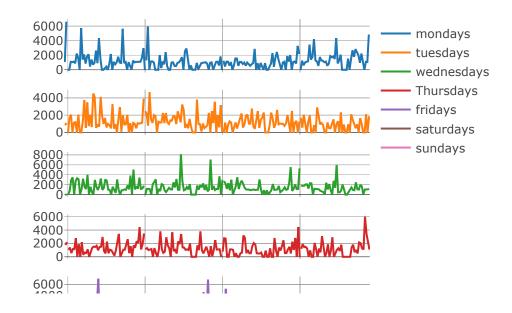
Weekdays All Years

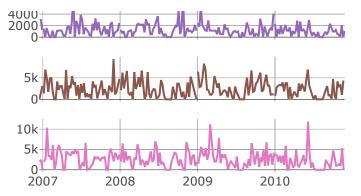
Submeter 1

```
#make individual weekday plots for Submeter 1
mondays1 plot <- plot_ly(mondays, x = mondays$date, y = ~mondays$Kitchen, name = 'monday</pre>
s', type = 'scatter', mode = 'lines') %>%
layout(xaxis = list(title = "Time"), yaxis = list (title = "Power (watt-hours)"))
tuesdays1_plot <- plot_ly(tuesdays, x = tuesdays$date, y = ~tuesdays$Kitchen, name = 'tu</pre>
esdays', type = 'scatter', mode = 'lines') %>%
layout(xaxis = list(title = "Time"), yaxis = list (title = "Power (watt-hours)"))
wednesdays1_plot <- plot_ly(wednesdays, x = wednesdays$date, y = ~wednesdays$Kitchen, na
me = 'wednesdays', type = 'scatter', mode = 'lines') %>%
 layout(xaxis = list(title = "Time"),yaxis = list (title = "Power (watt-hours)"))
thursdays1_plot <- plot_ly(thursdays, x = thursdays$date, y = ~thursdays$Kitchen, name =
'Thursdays', type = 'scatter', mode = 'lines') %>%
layout(xaxis = list(title = "Time"),yaxis = list (title = "Power (watt-hours)"))
fridays1_plot <- plot_ly(fridays, x = fridays$date, y = ~fridays$Kitchen, name = 'friday</pre>
s', type = 'scatter', mode = 'lines') %>%
layout(xaxis = list(title = "Time"),yaxis = list (title = "Power (watt-hours)"))
saturdays1 plot <- plot ly(saturdays, x = saturdays$date, y = ~saturdays$Kitchen, name =</pre>
'saturdays', type = 'scatter', mode = 'lines') %>%
layout(xaxis = list(title = "Time"), yaxis = list (title = "Power (watt-hours)"))
sundays1 plot <- plot ly(sundays, x = sundays$date, y = ~sundays$Kitchen, name = 'sunday</pre>
s', type = 'scatter', mode = 'lines') %>%
layout(xaxis = list(title = "Time"),yaxis = list (title = "Power (watt-hours)"))
```

weekdays_plot_kitchen <- subplot(mondays1_plot, tuesdays1_plot, wednesdays1_plot, thursd
ays1_plot, fridays1_plot, saturdays1_plot, sundays1_plot, nrows =7, shareX = TRUE, share
Y = TRUE, titleY = FALSE, titleX = FALSE)</pre>

weekdays plot kitchen



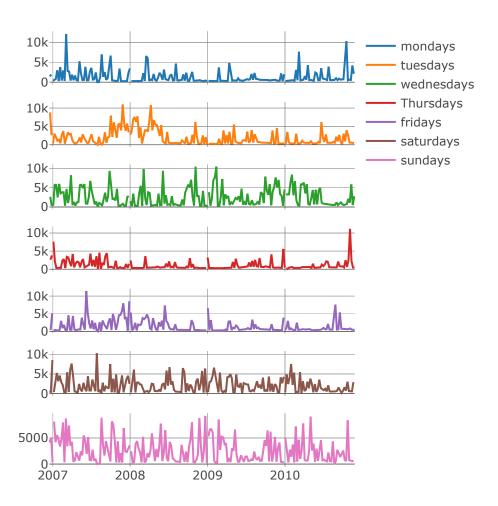


Submeter 2

Hide

```
#make individual weekday plots for Submeter 2
mondays2_plot <- plot_ly(mondays, x = mondays$date, y = ~mondays$LaundryRoom, name = 'mo
ndays', type = 'scatter', mode = 'lines') %>%
layout(xaxis = list(title = "Time"), yaxis = list (title = "Power (watt-hours)"))
tuesdays2_plot <- plot_ly(tuesdays, x = tuesdays$date, y = ~tuesdays$LaundryRoom, name =
'tuesdays', type = 'scatter', mode = 'lines') %>%
layout(xaxis = list(title = "Time"), yaxis = list (title = "Power (watt-hours)"))
wednesdays2 plot <- plot ly(wednesdays, x = wednesdays$date, y = ~wednesdays$LaundryRoo</pre>
m, name = 'wednesdays', type = 'scatter', mode = 'lines') %>%
  layout(xaxis = list(title = "Time"),yaxis = list (title = "Power (watt-hours)"))
thursdays2 plot <- plot ly(thursdays, x = thursdays$date, y = ~thursdays$LaundryRoom, na
me = 'Thursdays', type = 'scatter', mode = 'lines') %>%
layout(xaxis = list(title = "Time"),yaxis = list (title = "Power (watt-hours)"))
fridays2 plot <- plot ly(fridays, x = fridays$date, y = ~fridays$LaundryRoom, name = 'fr
idays', type = 'scatter', mode = 'lines') %>%
layout(xaxis = list(title = "Time"),yaxis = list (title = "Power (watt-hours)"))
saturdays2_plot <- plot_ly(saturdays, x = saturdays$date, y = ~saturdays$LaundryRoom, na
me = 'saturdays', type = 'scatter', mode = 'lines') %>%
layout(xaxis = list(title = "Time"), yaxis = list (title = "Power (watt-hours)"))
sundays2 plot <- plot ly(sundays, x = sundays$date, y = ~sundays$LaundryRoom, name = 'su</pre>
ndays', type = 'scatter', mode = 'lines') %>%
 layout(xaxis = list(title = "Time"),yaxis = list (title = "Power (watt-hours)"))
```

```
weekdays_plot_LaundryRoom <- subplot(mondays2_plot, tuesdays2_plot, wednesdays2_plot, th
ursdays2_plot, fridays2_plot, saturdays2_plot, sundays2_plot, nrows =7, shareX = TRUE, s
hareY = TRUE, titleY = FALSE, titleX = FALSE)</pre>
weekdays plot LaundryRoom
```

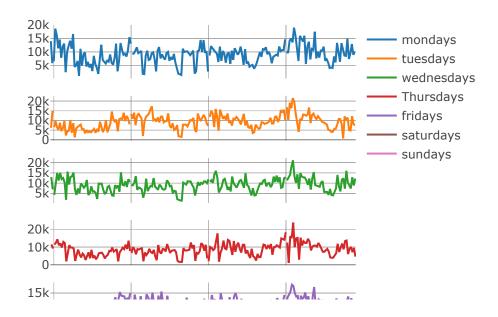


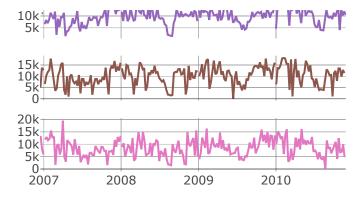
Submeter 3

```
#make individual weekday plots for Submeter 3
mondays3 plot <- plot_ly(mondays, x = mondays$date, y = ~mondays$WaterHeaterAC, name =</pre>
'mondays', type = 'scatter', mode = 'lines') %>%
layout(xaxis = list(title = "Time"), yaxis = list (title = "Power (watt-hours)"))
tuesdays3_plot <- plot_ly(tuesdays, x = tuesdays$date, y = ~tuesdays$WaterHeaterAC, name
= 'tuesdays', type = 'scatter', mode = 'lines') %>%
layout(xaxis = list(title = "Time"), yaxis = list (title = "Power (watt-hours)"))
wednesdays3_plot <- plot_ly(wednesdays, x = wednesdays$date, y = ~wednesdays$WaterHeater</pre>
AC, name = 'wednesdays', type = 'scatter', mode = 'lines') %>%
  layout(xaxis = list(title = "Time"),yaxis = list (title = "Power (watt-hours)"))
thursdays3_plot <- plot_ly(thursdays, x = thursdays$date, y = ~thursdays$WaterHeaterAC,
name = 'Thursdays', type = 'scatter', mode = 'lines') %>%
layout(xaxis = list(title = "Time"),yaxis = list (title = "Power (watt-hours)"))
fridays3_plot <- plot_ly(fridays, x = fridays$date, y = ~fridays$WaterHeaterAC, name =</pre>
'fridays', type = 'scatter', mode = 'lines') %>%
layout(xaxis = list(title = "Time"),yaxis = list (title = "Power (watt-hours)"))
saturdays3 plot <- plot ly(saturdays, x = saturdays$date, y = ~saturdays$WaterHeaterAC,
name = 'saturdays', type = 'scatter', mode = 'lines') %>%
 layout(xaxis = list(title = "Time"), yaxis = list (title = "Power (watt-hours)"))
sundays3 plot <- plot ly(sundays, x = sundays$date, y = ~sundays$WaterHeaterAC, name =</pre>
'sundays', type = 'scatter', mode = 'lines') %>%
 layout(xaxis = list(title = "Time"),yaxis = list (title = "Power (watt-hours)"))
```

weekdays_plot_WaterHeaterAC <- subplot(mondays3_plot, tuesdays3_plot, wednesdays3_plot,
thursdays3_plot, fridays3_plot, saturdays3_plot, sundays3_plot, nrows =7, shareX = TRUE,
shareY = TRUE, titleY = FALSE, titleX = FALSE)</pre>

weekdays plot WaterHeaterAC

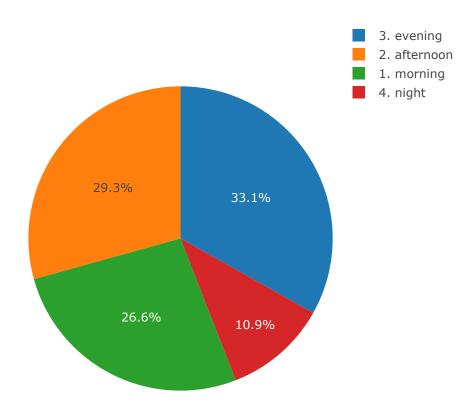




Time of Day Visualizations

Total Usage by Time of Day

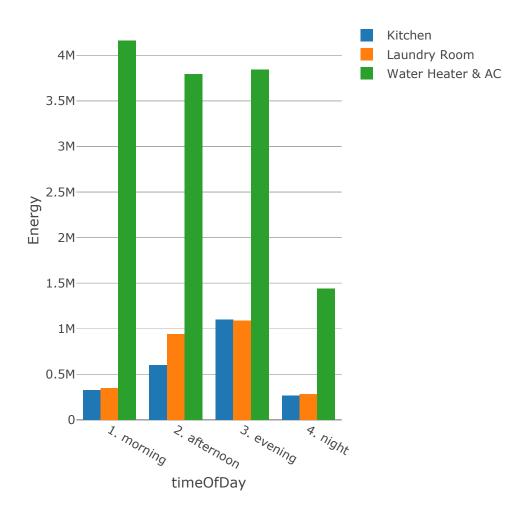
```
Hide
```



Total Usage by Time of Day, and Submeter

Hide

```
# bar chart for Time of Day, Total Usage, by each submeter
plot_ly(allYearsTimeofDayTotals, x = ~timeOfDay, y = ~Kitchen, type = 'bar', name = 'Kit
chen') %>%
  add_trace(y = ~LaundryRoom, name = 'Laundry Room') %>%
  add_trace(y = ~WaterHeaterAC, name = 'Water Heater & AC') %>%
  layout(yaxis = list(title = 'Energy'), barmode = 'group')
```



Total Usage by Weekday

Hide

View dataframe for weekday, 2006-2010, Sum of All Usage weekdaysAllYearsTotals

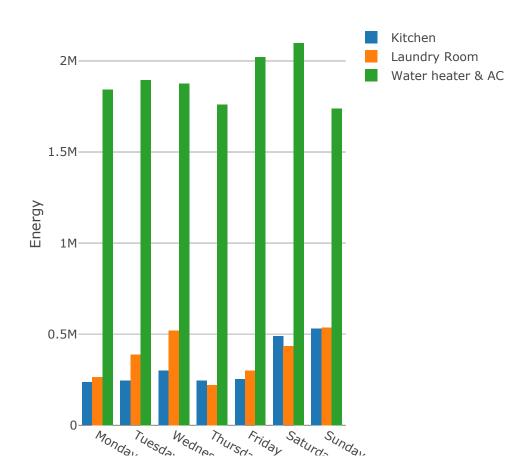
weekday <chr></chr>	Kitchen <dbl></dbl>	LaundryRoom <dbl></dbl>	WaterHeaterAC <dbl></dbl>	totalEnergy <dbl></dbl>
Friday	254548	299050	2021938	2575536
Monday	235899	265556	1842356	2343811

weekday <chr></chr>	Kitchen <dbl></dbl>	LaundryRoom <dbl></dbl>	WaterHeaterAC <dbl></dbl>	totalEnergy <dbl></dbl>
Saturday	490027	433751	2098915	3022693
Sunday	530394	536137	1739338	2805869
Thursday	244990	220302	1760543	2225835
Tuesday	243890	386935	1896362	2527187
Wednesday	299387	519300	1875715	2694402
7 rows				

Reorder Weekday column
weekdaysAllYearsTotals\$weekday <- factor(weekdaysAllYearsTotals\$weekday, levels = c("Mon
day", "Tuesday", "Wednesday", "Thursday", "Friday", "Saturday", "Sunday"))</pre>

Hide

```
# plot bar graph grouped by time of day, stratified with the 3 submeters
plot_ly(weekdaysAllYearsTotals, x = ~weekday, y = ~Kitchen, type = 'bar', name = 'Kitche
n') %>%
  add_trace(y = ~LaundryRoom, name = 'Laundry Room') %>%
  add_trace(y = ~WaterHeaterAC, name = 'Water heater & AC') %>%
  layout(yaxis = list(title = 'Energy'), barmode = 'group')
```



weekday