controller_usage_demonstration

May 13, 2017

This Jupyter Notebook demonstrates how to enable the GridBallast controller for a load (a water heater or a zip load) in GridLAB-D by feeding the simulator a stored grid frequency time series contained in an external file.

To run this notebook, please make sure you are in a UNIX based environment and have all the necessary python packages installed (plotly, matplotlib, numpy, pandas).

```
In [1]: !ls
```

```
controller_usage_demonstration.ipynb smSingle.glm
controller_usage_demonstration.pdf
                                     smSingle_base.glm
                                     smSingle_lenient_freq.glm
correct_path.sh
fan1.csv
                                     smSingle_strict_freq.glm
fan2_base.csv
                                     smSingle_strict_freq_jitter300.glm
fan2_lenient_freq.csv
                                     smSingle_strict_freq_jitter60.glm
                                     smSingle_strict_freq_jitter600.glm
fan2_strict_freq.csv
fan2_strict_freq_jitter300.csv
                                     wh1_base.csv
fan2_strict_freq_jitter60.csv
                                     wh1_lenient_freq.csv
fan2_strict_freq_jitter600.csv
                                     wh1_strict_freq.csv
frequency.PLAYER
                                     wh1_strict_freq_jitter300.csv
                                     wh1_strict_freq_jitter60.csv
hot_water_demand.glm
local_gd
                                     wh1_strict_freq_jitter600.csv
```

The gridlab-d binary file is stored within **local_gd** directory along with libraries. We need to re-configure the path for GridLAB-D such that the binary can locate the path of the library. If you are using macOS, please make sure you have installed the GNU version of sed, e.g.,

```
brew install gnu-sed
```

Or you can run ./correct_path.sh script to correct the path.

```
In [3]: !local_gd/bin/gridlabd --version
```

The above listed **local_gd/bin/gridlabd** is the binary version of the gridlab-d software with controlling functionality. In addition to that, we have **.glm** files and generated **.csv** files. We also have a **frequency.PLAYER** containing the 1-second resolution frequency information.

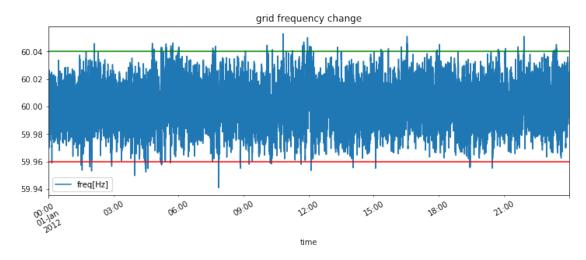
The version of the gridlab-d binary file and the content of the frequency.PLAYER can be seen below.

If the version of the gridlab-d does not work, we can disable the comments below and run the command to compile the source and install the gridlab-d to the machine.

```
In [4]: # %%bash
        # cd ~
        # git clone -b feature/730 https://github.com/jingkungao/gridlab-d.git
        # cd gridlab-d
        # cd third_party
        # chmod +x install_xercesc
        # . install_xercesc
        # tar -xvf cppunit-1.12.0.tar.qz
        # cd cppunit-1.12.0
        # ./configure LDFLAGS="-ldl"
        # make
        # sudo make install
        # cd ../..
        # autoreconf -isf
        # ./configure
        # make
        # sudo make install
In [5]: !head -5 frequency.PLAYER
2012-01-01 00:00:00 EST,59.9769
2012-01-01 00:00:01 EST,59.9763
2012-01-01 00:00:02 EST,59.9715
2012-01-01 00:00:03 EST,59.9714
2012-01-01 00:00:04 EST,59.972
```

We can further plot the frequency data to get a better sense of it.

Out[7]: <matplotlib.lines.Line2D at 0x1067fa5c0>



Next, we will run **local_gd/bin/gridlabd** on different **.glm** files and plot the outputs showing the difference with and without controllers.

We start with running **smSingle_base.glm**, which is almost same as the original **smSingle.glm** provided by NRECA to us with the main difference being that we changed the simulation clock and added a recoreder for waterheater1 at the end.

1 Base case

We begin with the same circuit provided by NRECA (smSingle.glm), and modify it slightly as follows:

- We change the simulation time to match the time of **frequency.PLAYER** and add a recorder to record the waterheater measurements and the ZIP load measurements (in this case, a fan). Note that we record data for waterheater1 as an example but it could be used for any waterheater.
- We also set the timestep to 1 second instead of 60 seconds.
- For a more realistic water draw schedule, we include a **hot_water_demand.glm** which exhibits typical the weekday and weekend water demand usage patterns.

Below we illustrate some of those changes made to the glm file:

```
In [8]: # from 2012-01-01 to 2012-01-02
        !head -9 smSingle_base.glm
clock {
        timezone PST+8PDT;
        starttime '2012-01-01 00:00:00';
        stoptime '2012-01-02 00:00:00';
};
#include "hot_water_demand.glm";
#set minimum_timestep=1;
In [9]: # record data for waterheater1 and fan2(zipload) at 1s resolution
        !tail -14 smSingle_base.glm
object recorder {
        interval 1;
        property base_power;
        file fan2_base.csv;
        parent fan2;
};
object recorder {
        interval 1;
        property measured_frequency,temperature,actual_load,is_waterheater_on,water_demand;
                // current_tank_status, waterheater_model, heatgain, power_state;
        file wh1_base.csv;
        parent waterheater1;
};
   We are now ready to run a simulation with the base case (no control).
In [10]: # run the gridlabd.bin to start the simulation
         !local_gd/bin/gridlabd smSingle_base.glm
WARNING [INIT]: waterheater::init(): height and diameter were not specified, defaulting to 3.
```

Core profiler results

Total objects	25 objects
Total objects	35 objects
Parallelism	1 thread
Total time	26.0 seconds
Core time	3.4 seconds (13.2%)
Compiler	1.3 seconds (5.1%)
Instances	0.0 seconds (0.0%)
Random variables	0.0 seconds (0.0%)
Schedules	0.0 seconds (0.0%)
Loadshapes	0.1 seconds (0.2%)
Enduses	0.0 seconds (0.1%)
Transforms	0.3 seconds (1.0%)
Model time	22.6 seconds/thread (86.8%)
Simulation time	1 days
Simulation speed	32 object.hours/second
Passes completed	86401 passes
Time steps completed	86401 timesteps
Convergence efficiency	1.00 passes/timestep
Read lock contention	0.0%
Write lock contention	0.0%
Average timestep	1 seconds/timestep
Simulation rate	3323 x realtime

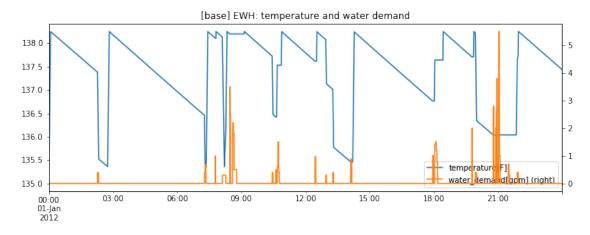
Model profiler results

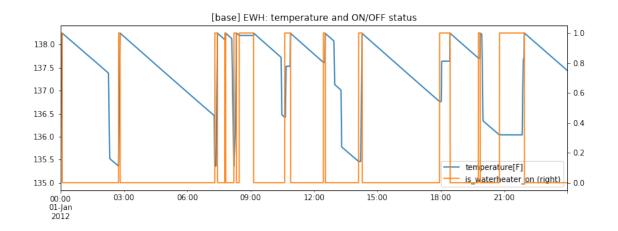
Class	Time (s)	Time (%)	msec/obj
node	13.608	60.3%	6804.0
triplex_meter	1.402	6.2%	467.3
recorder	1.393	6.2%	464.3
house	1.150	5.1%	575.0
ZIPload	1.101	4.9%	137.6
transformer	0.872	3.9%	436.0
waterheater	0.851	3.8%	425.5
triplex_line	0.828	3.7%	414.0
regulator	0.500	2.2%	500.0
triplex_node	0.448	2.0%	448.0
auction	0.264	1.2%	264.0
climate	0.140	0.6%	140.0
===========	=======	======	=======
Total	22.557	100.0%	644.5

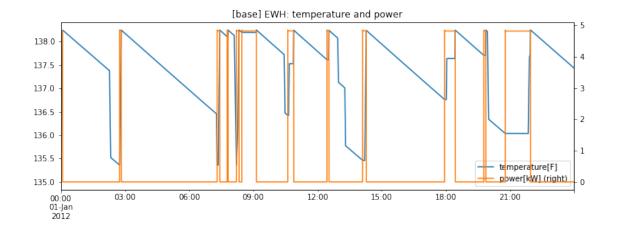
WARNING [2012-01-02 00:00:00 PST] : last warning message was repeated 1 times

Now, we plot the generated waterheater data stored in **wh1_base.csv** and **fan2_base.csv** from the simulation.

Out[11]: <matplotlib.axes._subplots.AxesSubplot at 0x10a70b240>

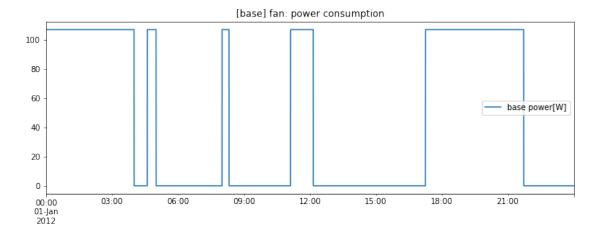






```
In [12]: # We can also plot the interactive version of the plot
         # during certain period
         def plotly_plotdf(df,title='Interactive plot of column variables'):
             if len(df)>20000:
                 print('Too many points, please reduce number of points!')
                 return
             data = []
             for i in df.columns:
                 trace = go.Scatter(
                     name = i,
                     x = df.index,
                     y = df[i]
                 )
                 data.append(trace)
             fig = go.Figure(
                 data = data,
                 layout = go.Layout(showlegend=True,
                                   title=title)
             iplot(fig)
In [13]: # we can toggle the variable to visualize each of them
         # uncomment when you are running IPython notebook
         # plotly_plotdf(df_base.resample('1min').mean())
In [14]: df_base_fan = pd.read_csv('fan2_base.csv',sep=',',header=8,
                          index_col=0,parse_dates=True,
                          infer_datetime_format=True,
                          names=['base power[W]'])
```

Out[14]: <matplotlib.axes._subplots.AxesSubplot at 0x107252fd0>



2 Lenient Frequency Control

To configure the GridBallast controller, we set specific properties of the waterheater object in the glm file. The properties corresponding to the controller include:

- enable_freq_control [boolean]
- freq_lowlimit [float]
- freq_uplimit [float]
- enable_jitter [boolean]
- average_delay_time [integer]

For this test we modify waterheater 1 and fan 2 to enable the frequency control and set a wide frequency dead-band (59.9Hz - 60.1Hz). We expect the GridBallast controller to be rarely triggered.

```
In [15]: !head -611 smSingle_lenient_freq.glm|tail -21
object waterheater {
    schedule_skew -810;
    water_demand weekday_hotwater*1;
    name waterheater1;
    parent house1;
    heating_element_capacity 4.8 kW;
    thermostat_deadband 2.9;
    location INSIDE;
    tank_volume 50;
```

```
tank_setpoint 136.8;
       tank_UA 2.4;
       temperature 135;
       object player {
               file frequency.PLAYER;
               property measured_frequency;
   };
       enable_freq_control true;
       freq_lowlimit 59.9;
       freq_uplimit 60.1;
       heat_mode ELECTRIC;
};
In [16]: !head -756 smSingle_lenient_freq.glm|tail -19
object ZIPload {
       name fan2;
       parent house2;
       power_fraction 0.013500;
       current_fraction 0.253400;
       base_power fan1*0.106899;
       impedance_pf 0.970000;
       current_pf 0.950000;
       power_pf -1.000000;
        impedance_fraction 0.733200;
       object player {
               file frequency.PLAYER;
               property measured_frequency;
       };
       enable_freq_control true;
       freq_lowlimit 59.9;
       freq_uplimit 60.1;
       groupid fan;
};
In [17]: # run the gridlabd.bin to start the simulation
         !local_gd/bin/gridlabd smSingle_lenient_freq.glm
WARNING [INIT]: waterheater::init(): height and diameter were not specified, defaulting to 3.
Core profiler results
Total objects
                             37 objects
Parallelism
                               1 thread
Total time
                           30.0 seconds
 Core time
                            3.4 seconds (11.3%)
```

Compiler 1.3 seconds (4.5%)Instances 0.0 seconds (0.0%)0.0 seconds (0.0%) Random variables Schedules 0.0 seconds (0.0%) 0.1 seconds (0.2%) Loadshapes Enduses 0.0 seconds (0.1%)0.3 seconds (1.0%) Transforms 26.6 seconds/thread (88.7%) Model time Simulation time 1 days Simulation speed 30 object.hours/second Passes completed 86401 passes Time steps completed 86401 timesteps Convergence efficiency 1.00 passes/timestep Read lock contention 0.0% Write lock contention 0.0% Average timestep 1 seconds/timestep Simulation rate 2880 x realtime

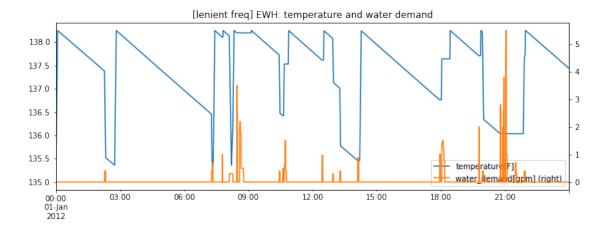
Model profiler results

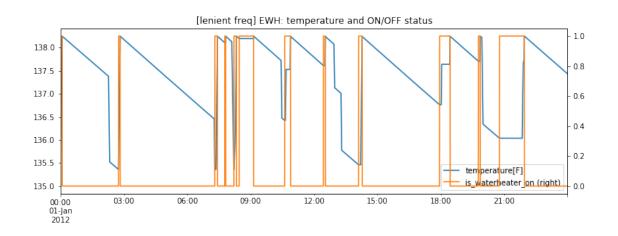
Class	Time	(s)	Time	(%)	msec/obj
node	15.907		59.8%		7953.5
recorder	1.616		6.1%		538.7
triplex_meter	1.517		5.7%		505.7
player	1.226		4	1.6%	613.0
house	1.195		4	1.5%	597.5
ZIPload	1.111		4	1.2%	138.9
waterheater	0.9	960	3	3.6%	480.0
triplex_line	0.8	386	3	3.3%	443.0
transformer	0.8	364	3	3.2%	432.0
regulator	0.5	525	2	2.0%	525.0
triplex_node	0.4	122	1	6%	422.0
auction	0.2	264	1	0%	264.0
climate	0.1	l22	(.5%	122.0
	=====		=====	===	
Total	26.6	315	100	0.0%	719.3

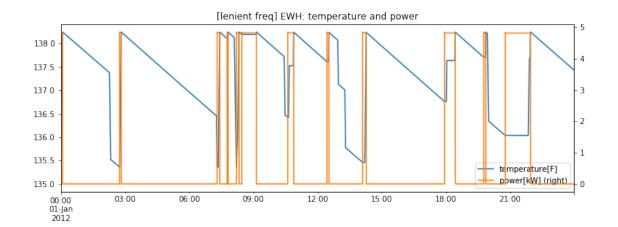
WARNING [2012-01-02 00:00:00 EST] : last warning message was repeated 1 times

Now, we plot the generated waterheater data stored in **wh1_lenient_freq.csv** and **fan2_lenient_freq.csv** from the simulation.

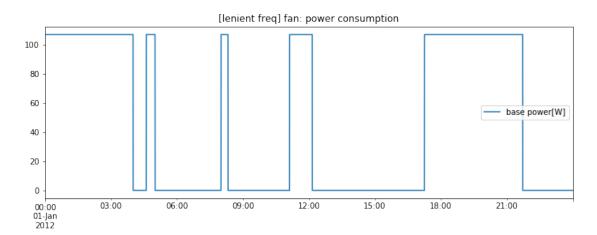
Out[18]: <matplotlib.axes._subplots.AxesSubplot at 0x10e625b70>







Out[19]: <matplotlib.axes._subplots.AxesSubplot at 0x10ec42160>



3 Strict Frequency Control

We modify waterheater 1 and fan 2 to enable the frequency control, but we impose a tighter frequency deadband (59.97Hz - 60.03Hz). In other words, the gridballast controller should be triggered very often.

```
In [20]: !head -611 smSingle_strict_freq.glm|tail -21
object waterheater {
        schedule_skew -810;
        water_demand weekday_hotwater*1;
        name waterheater1;
        parent house1;
        heating_element_capacity 4.8 kW;
        thermostat_deadband 2.9;
        location INSIDE;
        tank_volume 50;
        tank_setpoint 136.8;
        tank_UA 2.4;
        temperature 135;
        object player {
                file frequency.PLAYER;
                property measured_frequency;
        };
        enable_freq_control true;
        freq_lowlimit 59.97;
        freq_uplimit 60.03;
        heat_mode ELECTRIC;
};
In [21]: !head -756 smSingle_strict_freq.glm|tail -19
object ZIPload {
        name fan2;
        parent house2;
        power_fraction 0.013500;
        current_fraction 0.253400;
        base_power fan1*0.106899;
        impedance_pf 0.970000;
        current_pf 0.950000;
        power_pf -1.000000;
        impedance_fraction 0.733200;
        object player {
                file frequency.PLAYER;
                property measured_frequency;
        };
        enable_freq_control true;
        freq_lowlimit 59.97;
```

```
freq_uplimit 60.03;
       groupid fan;
};
In [22]: # run the gridlabd.bin to start the simulation
         !local_gd/bin/gridlabd smSingle_strict_freq.glm
WARNING [INIT]: waterheater::init(): height and diameter were not specified, defaulting to 3.
Core profiler results
                             37 objects
Total objects
Parallelism
                             1 thread
Total time
                           25.0 seconds
 Core time
                          2.9 seconds (11.8%)
   Compiler
                           1.3 seconds (5.3%)
                           0.0 seconds (0.0%)
   Instances
   Random variables
                          0.0 seconds (0.0%)
   Schedules
                           0.0 seconds (0.0%)
                           0.0 seconds (0.2%)
   Loadshapes
   Enduses
                           0.0 seconds (0.1%)
   Transforms
                           0.2 seconds (0.9%)
                           22.1 seconds/thread (88.2%)
 Model time
Simulation time
                              1 days
                             36 object.hours/second
Simulation speed
Passes completed
                          86401 passes
Time steps completed
                          86401 timesteps
Convergence efficiency
                           1.00 passes/timestep
Read lock contention
                           0.0%
                           0.0%
Write lock contention
Average timestep
                             1 seconds/timestep
Simulation rate
                          3456 x realtime
Model profiler results
```

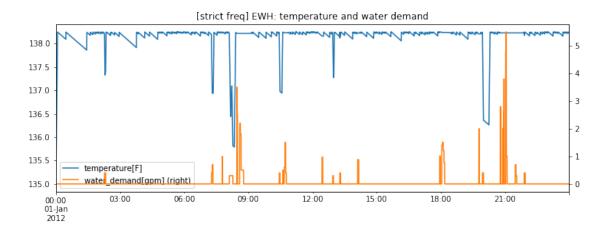
Class	Time (s)	Time (%)	msec/obj
node	12.741	57.8%	6370.5
triplex_meter	1.364	6.2%	454.7
recorder	1.298	5.9%	432.7
player	1.020	4.6%	510.0
ZIPload	1.008	4.6%	126.0
house	1.006	4.6%	503.0
waterheater	0.872	4.0%	436.0

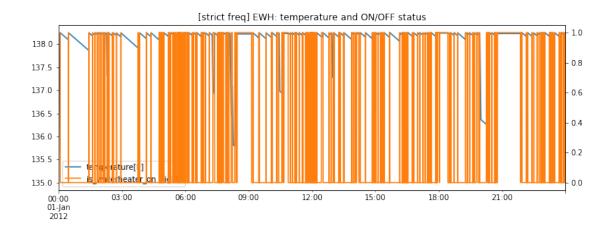
triplex_line	0.792	3.6%	396.0
transformer	0.716	3.2%	358.0
regulator	0.523	2.4%	523.0
triplex_node	0.373	1.7%	373.0
auction	0.213	1.0%	213.0
climate	0.126	0.6%	126.0
Total	22.052	100.0%	596.0

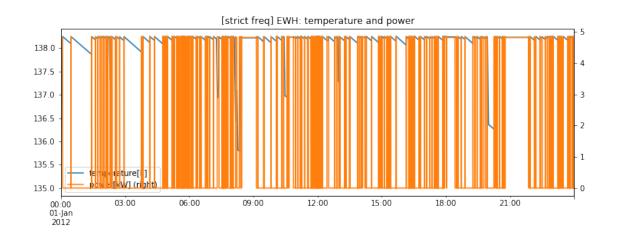
WARNING [2012-01-02 00:00:00 EST] : last warning message was repeated 1 times

Now, we plot the generated waterheater data stored in **wh1_strict_freq.csv** and **fan2_strict_freq.csv** from the simulation.

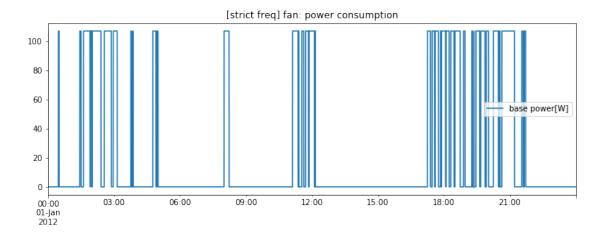
Out[23]: <matplotlib.axes._subplots.AxesSubplot at 0x10b41acc0>

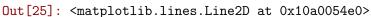


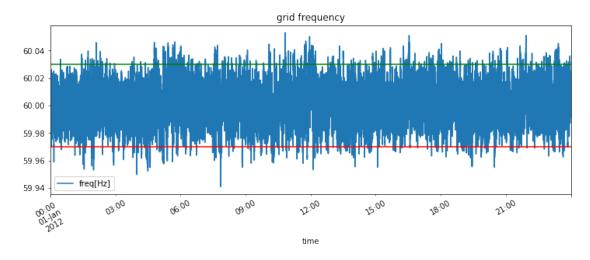




Out[24]: <matplotlib.axes._subplots.AxesSubplot at 0x113610e10>







4 Strict Frequency Control with Jitter (1 min)

We now modify the previous case (with a tight frequency deadband) and add a jitter to the response of the waterheater and fan, such that the start of GridBallast event will delay randomly

with an expected value of 60 seconds (1 min). Internally, the controller delay follows a uniform distribution over the interval [1,2*average_delay_time].

We use 60 seconds to clearly illustrate the difference in the power consumption patterns of the water heater previously illustrated and this one with jitter control enabled. Needless to say, users can set these values differently depending on how many water heaters are connected to the network or other considerations.

```
In [26]: !head -613 smSingle_strict_freq_jitter60.glm|tail -23
object waterheater {
        schedule_skew -810;
        water_demand weekday_hotwater*1;
        name waterheater1;
        parent house1;
        heating_element_capacity 4.8 kW;
        thermostat_deadband 2.9;
        location INSIDE;
        tank_volume 50;
        tank_setpoint 136.8;
        tank_UA 2.4;
        temperature 135;
        object player {
                file frequency.PLAYER;
                property measured_frequency;
        };
        enable_freq_control true;
        freq_lowlimit 59.97;
        freq_uplimit 60.03;
        heat_mode ELECTRIC;
        enable_jitter true;
        average_delay_time 60;
};
In [27]: !head -760 smSingle_strict_freq_jitter60.glm|tail -21
object ZIPload {
        name fan2;
        parent house2;
        power_fraction 0.013500;
        current_fraction 0.253400;
        base_power fan1*0.106899;
        impedance_pf 0.970000;
        current_pf 0.950000;
        power_pf -1.000000;
        impedance_fraction 0.733200;
        object player {
                file frequency.PLAYER;
                property measured_frequency;
```

```
};
       enable_freq_control true;
       freq_lowlimit 59.97;
       freq_uplimit 60.03;
       enable_jitter true;
       average_delay_time 60;
       groupid fan;
};
In [28]: # run the gridlabd.bin to start the simulation
        !local_gd/bin/gridlabd smSingle_strict_freq_jitter60.glm
WARNING [INIT]: waterheater::init(): height and diameter were not specified, defaulting to 3.
Core profiler results
_____
Total objects
                            37 objects
Parallelism
                             1 thread
Total time
                          28.0 seconds
 Core time
                          2.7 seconds (9.7%)
                          1.4 seconds (5.0%)
   Compiler
                          0.0 seconds (0.0%)
   Instances
   Random variables
                          0.0 seconds (0.0%)
   Schedules
                          0.0 \text{ seconds } (0.0\%)
   Loadshapes
                          0.0 seconds (0.1%)
   Enduses
                          0.0 seconds (0.1%)
   Transforms
                          0.2 seconds (0.9%)
 Model time
                           25.3 seconds/thread (90.3%)
Simulation time
                             1 days
Simulation speed
                             32 object.hours/second
Passes completed
                          86401 passes
Time steps completed
                          86401 timesteps
Convergence efficiency
                           1.00 passes/timestep
Read lock contention
                           0.0%
                           0.0%
Write lock contention
Average timestep
                             1 seconds/timestep
                          3086 x realtime
Simulation rate
Model profiler results
_____
              Time (s) Time (%) msec/obj
                14.709
                            58.2% 7354.5
```

triplex_meter 1.533

19

511.0

6.1%

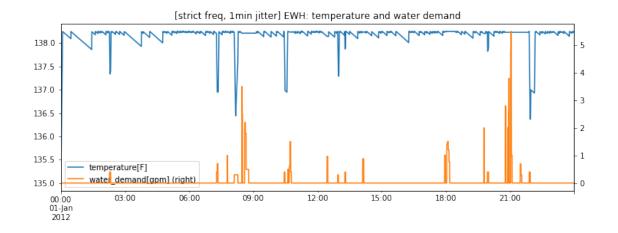
```
4.6%
                                    578.5
player
                  1.157
                             4.5%
house
                  1.149
                                    574.5
ZIPload
                             4.2%
                                    133.5
                  1.068
                             4.2%
                                    532.5
waterheater
                  1.065
transformer
                  0.919
                             3.6%
                                    459.5
triplex_line
                  0.822
                             3.3%
                                    411.0
                             2.1%
regulator
                  0.532
                                    532.0
triplex_node
                             1.8%
                                    456.0
                  0.456
auction
                  0.252
                             1.0%
                                    252.0
                             0.6%
climate
                  0.151
                                     151.0
Total
                 25.271
                           100.0%
                                     683.0
WARNING [2012-01-02 00:00:00 EST] : last warning message was repeated 1 times
In [29]: # We save data to wh1_strict_freq_jitter60.csv and plot the results
        df_wh_jitter60 = pd.read_csv('wh1_strict_freq_jitter60.csv',sep=',',
                          header=8,index_col=0,parse_dates=True,
                          infer_datetime_format=True,
                          names=['freq[Hz]','temperature[F]','power[kW]',
                                'is_waterheater_on','water_demand[gpm]'])
        df_wh_jitter60[['temperature[F]','water_demand[gpm]']].\
                plot(figsize=(12,4),secondary_y='water_demand[gpm]',
                    title='[strict freq, 1min jitter] EWH: temperature and water demand')
        df_wh_jitter60[['temperature[F]','is_waterheater_on']].\
                plot(figsize=(12,4),secondary_y='is_waterheater_on',
                    title='[strict freq, 1min jitter] EWH: temperature and ON/OFF status')
        df_wh_jitter60[['temperature[F]','power[kW]']].\
                plot(figsize=(12,4),secondary_y='power[kW]',
                    title='[strict freq, 1min jitter] EWH: temperature and power')
Out[29]: <matplotlib.axes._subplots.AxesSubplot at 0x114e9f5c0>
```

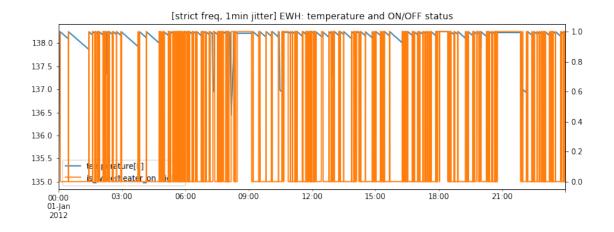
recorder

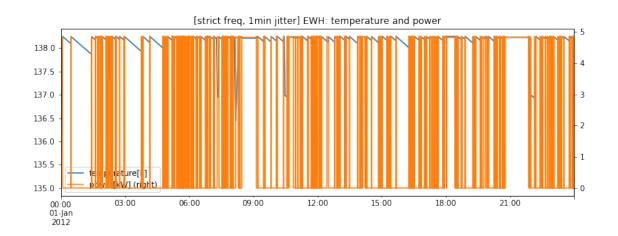
1.458

5.8%

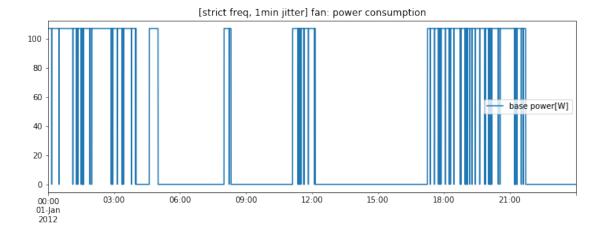
486.0



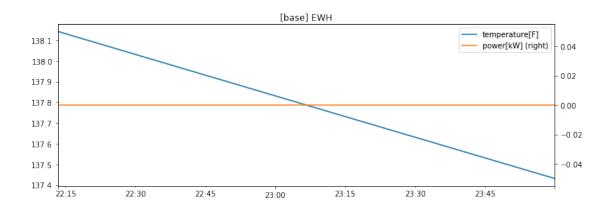


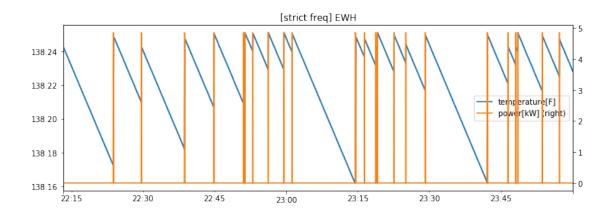


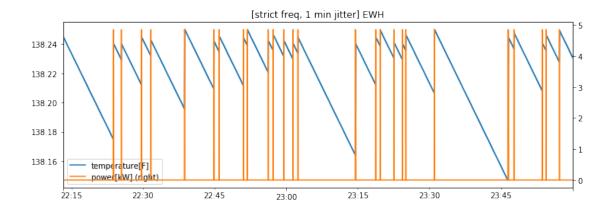
Out[30]: <matplotlib.axes._subplots.AxesSubplot at 0x1151f4518>



As we can see, after applying the jitter, the water heater should be engaged less often. However, since the jitter time is too short, we can barely see the difference unless we zoom in.





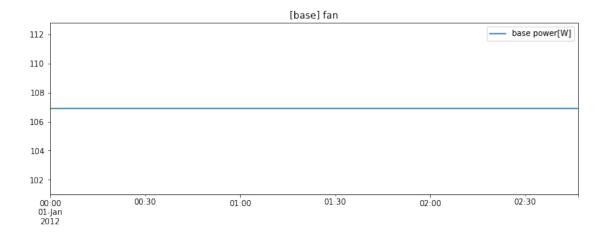


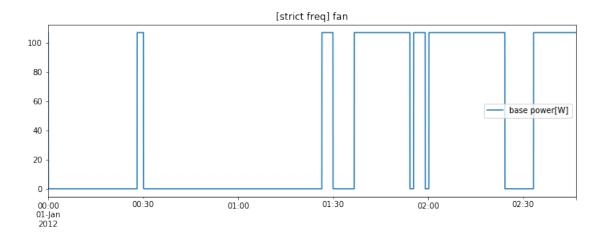
In [32]: # we look at jitter for the zipload in shorter duration as well

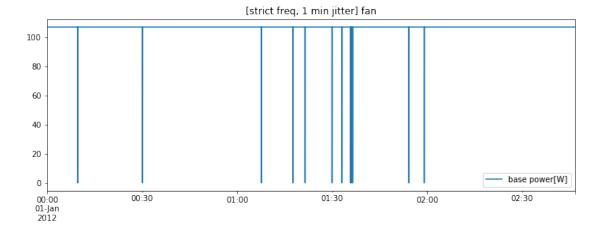
As we can see, they behave quiet differently since we don't need to consider

the thermal condition here. Once the frequency violation is detected, we can

Out[32]: <matplotlib.axes._subplots.AxesSubplot at 0x119bf1f60>







As is seen, after applying the jitter, it tends to correct the power trace from strict frequency control case to the base case. It is obvious for the zipload[fan] case. Let's try the jitter with longer duration to see the same trend for the waterheater.

5 Strict Frequency Control with Jitter (10 mins)

We now modify the jitter such that the start of GridBallast event will delay randomly with an expected value of 600 seconds (10 mins) so that we can clearly see the jitter effects in the electric water heater as well.

```
In [33]: !head -613 smSingle_strict_freq_jitter600.glm|tail -23
object waterheater {
        schedule_skew -810;
        water_demand weekday_hotwater*1;
        name waterheater1;
        parent house1;
        heating_element_capacity 4.8 kW;
        thermostat_deadband 2.9;
        location INSIDE;
        tank_volume 50;
        tank_setpoint 136.8;
        tank_UA 2.4;
        temperature 135;
        object player {
                file frequency.PLAYER;
                property measured_frequency;
        };
        enable_freq_control true;
        freq_lowlimit 59.97;
        freq_uplimit 60.03;
        heat_mode ELECTRIC;
```

```
enable_jitter true;
        average_delay_time 600;
};
In [34]: !head -760 smSingle_strict_freq_jitter600.glm|tail -21
object ZIPload {
        name fan2;
        parent house2;
        power_fraction 0.013500;
        current_fraction 0.253400;
        base_power fan1*0.106899;
        impedance_pf 0.970000;
        current_pf 0.950000;
        power_pf -1.000000;
        impedance_fraction 0.733200;
        object player {
                file frequency.PLAYER;
                property measured_frequency;
        };
        enable_freq_control true;
        freq_lowlimit 59.97;
        freq_uplimit 60.03;
        enable_jitter true;
        average_delay_time 600;
        groupid fan;
};
In [35]: # run the gridlabd.bin to start the simulation
         !local_gd/bin/gridlabd smSingle_strict_freq_jitter600.glm
WARNING [INIT]: waterheater::init(): height and diameter were not specified, defaulting to 3.
Core profiler results
_____
Total objects
                             37 objects
Parallelism
                              1 thread
Total time
                            27.0 seconds
 Core time
                            3.5 seconds (13.0%)
                            1.3 seconds (4.9%)
    Compiler
    Instances
                            0.0 seconds (0.0%)
   Random variables
                           0.0 \text{ seconds } (0.0\%)
```

0.0 seconds (0.0%)

0.1 seconds (0.2%)

0.0 seconds (0.1%)

0.2 seconds (0.7%)

Schedules Loadshapes

Transforms

Enduses

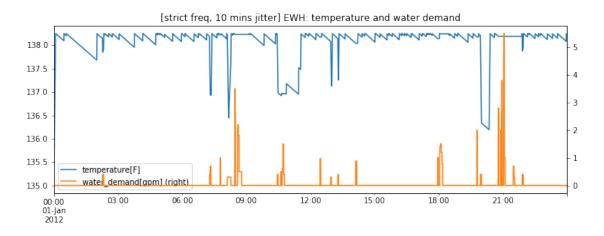
Model time	23.5 seconds/thread (87.0%)
Simulation time	1 days
Simulation speed	33 object.hours/second
Passes completed	86401 passes
Time steps completed	86401 timesteps
Convergence efficiency	1.00 passes/timestep
Read lock contention	0.0%
Write lock contention	0.0%
Average timestep	1 seconds/timestep
Simulation rate	3200 x realtime

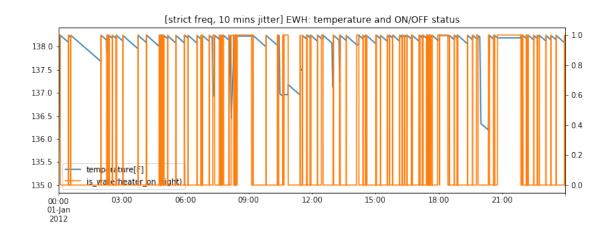
Model profiler results

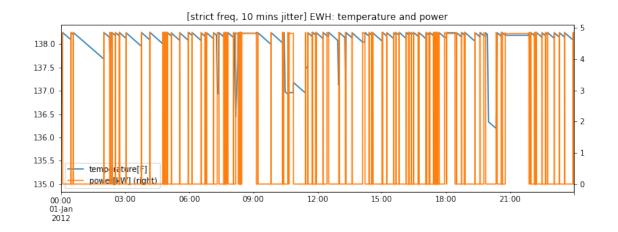
Class	Time (s)	Time (%)	msec/obj
node	13.705	58.3%	6852.5
triplex_meter	1.427	6.1%	475.7
recorder	1.392	5.9%	464.0
house	1.109	4.7%	554.5
player	1.084	4.6%	542.0
ZIPload	1.037	4.4%	129.6
waterheater	0.946	4.0%	473.0
transformer	0.799	3.4%	399.5
triplex_line	0.752	3.2%	376.0
regulator	0.491	2.1%	491.0
triplex_node	0.396	1.7%	396.0
auction	0.235	1.0%	235.0
climate	0.127	0.5%	127.0
==========	=======	=======	======
Total	23.500	100.0%	635.1

WARNING [2012-01-02 00:00:00 EST] : last warning message was repeated 1 times

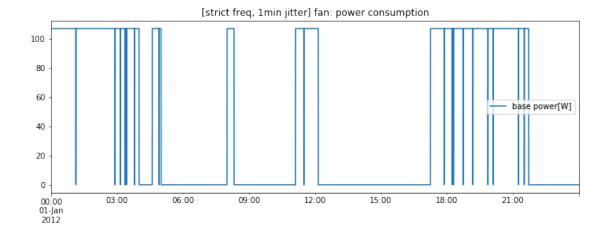
Out[36]: <matplotlib.axes._subplots.AxesSubplot at 0x119bf9f98>







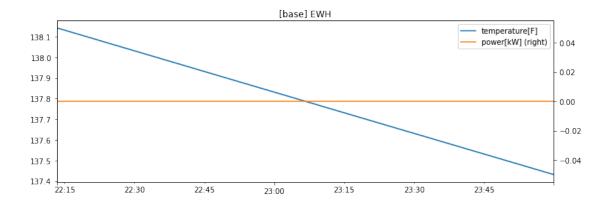
Out[37]: <matplotlib.axes._subplots.AxesSubplot at 0x11c0e49b0>

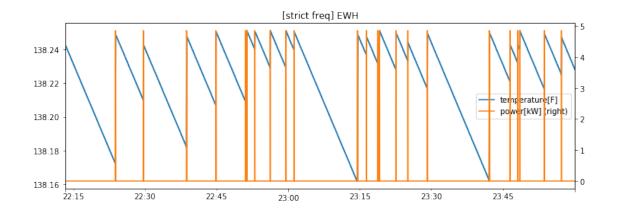


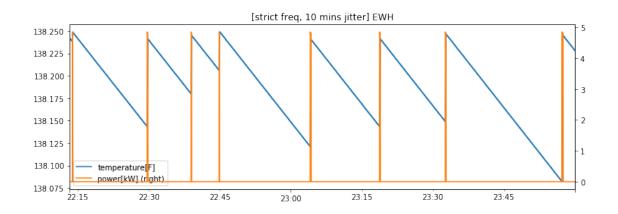
As we can see, after applying the 10 min jitter, now the water heater is engaged less often than in the previous experiment without jitter.

As we did in previous examples, we now look into a shorter duration to better understand the effect of the jitter.

Out[38]: <matplotlib.axes._subplots.AxesSubplot at 0x113b565f8>







Out[39]: <matplotlib.axes._subplots.AxesSubplot at 0x1116655f8>

