

Group E Assignment 5: NILMTK

Exercise 1

Load UKDALE data into memory and print out the metadata

```
In [1]: from nilmtk import DataSet
        from nilmtk.utils import print_dict
        from nilmtk.timeframe import TimeFrame
        import pandas as pd

        ukdale = DataSet('./data/ukdale.h5')
```

1.2 Print out Metadata

```
In [2]: print_dict(ukdale.metadata)
```

- **description_of_subjects:** 4 MSc students and 1 PhD student.
- **meter_devices:**
 - **EcoManagerTxPlug:**
 - **max_sample_period:** 120
 - **model_url:** <https://shop.edfenergy.com/Item.aspx?id=540>
(<https://shop.edfenergy.com/Item.aspx?id=540>)
 - **wireless_configuration:**
 - **base:** creators: [Jack Kelly] model:
rfm_edf_ecomanager model_url:
https://github.com/JackKelly/rfm_edf_ecomanager/
(creators: [Jack Kelly] model: rfm_edf_ecomanager
model_url:
https://github.com/JackKelly/rfm_edf_ecomanager/)
 - **protocol:** custom
 - **carrier_frequency:** 434
 - **brand:** EcoManager
 - **measurements:**
 - {'lower_limit': 0, 'upper_limit': 3300,
 'physical_quantity': 'power', 'type': 'active'}
 - **data_logger:**
 - **model:** rfm_ecomanager_logger
 - **creators:**
 - Jack Kelly
 - **model_url:**

https://github.com/JackKelly/rfm_ecomanager_logger
(https://github.com/JackKelly/rfm_ecomanager_logger)

- **sample_period:** 6
- **wireless:** True
- **brand_url:** <http://www.edfenergy.com/products-services/for-your-home/ecomanager> (<http://www.edfenergy.com/products-services/for-your-home/ecomanager>)
- **model:** EcoManagerTxPlug
- **seller:** EDF Energy
- **manufacturer:** Current Cost / Sailwider
- **CurrentCostTx:**
 - **max_sample_period:** 120
 - **model_url:** <http://www.currentcost.com/product-transmitter.html> (<http://www.currentcost.com/product-transmitter.html>)
 - **wireless_configuration:**
 - **base:** creators: [Jack Kelly] model: [rfm_edf_ecomanager](https://github.com/JackKelly/rfm_edf_ecomanager/) model_url: https://github.com/JackKelly/rfm_edf_ecomanager/ (creators: [Jack Kelly] model: [rfm_edf_ecomanager](https://github.com/JackKelly/rfm_edf_ecomanager/) model_url: https://github.com/JackKelly/rfm_edf_ecomanager/)
 - **protocol:** custom
 - **carrier_frequency:** 434
 - **measurements:**
 - {'lower_limit': 0, 'upper_limit': 25000, 'physical_quantity': 'power', 'type': 'apparent'}
 - **data_logger:**
 - **model:** rfm_ecomanager_logger
 - **creators:**
 - Jack Kelly
 - **model_url:** https://github.com/JackKelly/rfm_ecomanager_logger (https://github.com/JackKelly/rfm_ecomanager_logger)
 - **sample_period:** 6
 - **wireless:** True
 - **model:** CurrentCost Tx
 - **manufacturer:** Current Cost
- **SoundCardPowerMeter:**
 - **max_sample_period:** 3
 - **wireless:** False
 - **model_url:** https://github.com/JackKelly/snd_card_power_meter (https://github.com/JackKelly/snd_card_power_meter)
 - **model:** Sound Card Power Meter
 - **measurements:**
 - {'lower_limit': 0, 'upper_limit': 25000, 'physical_quantity': 'power', 'type': 'active'}

- {'lower_limit': 0, 'upper_limit': 25000, 'physical_quantity': 'power', 'type': 'apparent'}
 - {'lower_limit': 180, 'upper_limit': 275, 'physical_quantity': 'voltage', 'description': 'RMS voltage'}
 - **manufacturer:** Jack Kelly / Imperial College London
 - **sample_period:** 1
- **EcoManagerWholeHouseTx:**
 - **max_sample_period:** 120
 - **model_url:** <https://shop.edfenergy.com/Item.aspx?id=547> (<https://shop.edfenergy.com/Item.aspx?id=547>)
 - **wireless_configuration:**
 - **base:** creators: [Jack Kelly] model: rfm_edf_ecomanager model_url: https://github.com/JackKelly/rfm_edf_ecomanager/ (creators: [Jack Kelly] model: rfm_edf_ecomanager model_url: https://github.com/JackKelly/rfm_edf_ecomanager/)
 - **protocol:** custom
 - **carrier_frequency:** 434
 - **brand:** EcoManager
 - **measurements:**
 - {'lower_limit': 0, 'upper_limit': 25000, 'physical_quantity': 'power', 'type': 'apparent'}
 - **data_logger:**
 - **model:** rfm_ecomanager_logger
 - **creators:**
 - Jack Kelly
 - **model_url:** https://github.com/JackKelly/rfm_ecomanager_logger (https://github.com/JackKelly/rfm_ecomanager_logger)
 - **sample_period:** 6
 - **wireless:** True
 - **brand_url:** <http://www.edfenergy.com/products-services/for-your-home/ecomanager> (<http://www.edfenergy.com/products-services/for-your-home/ecomanager>)
 - **model:** EcoManagerWholeHouseTx
 - **seller:** EDF Energy
 - **site_meter:** True
 - **manufacturer:** Current Cost / Sailwider
- **description:** Appliance-by-appliance and whole-home power demand for 5 UK homes. Appliance power demand was recorded once every 6 seconds. Whole-home power demand was recorded once every 6 seconds for all homes and additionally at 16kHz for homes 1, 2 and 5. Detailed metadata is included.
- **rights_list:**
 - {'name': 'Creative Commons Attribution 4.0 International (CC BY 4.0)', 'uri': 'http://creativecommons.org/licenses/by/4.0/'}
- **long_name:** UK Domestic Appliance-Level Electricity

- **geo_location:**
 - **latitude:** 51.464462
 - **country:** GB
 - **longitude:** -0.076544
 - **locality:** London
- **date:** 2015-01-05
- **timezone:** Europe/London
- **institution:** Imperial College London
- **subject:** Disaggregated domestic electricity demand
- **publisher:** UK Energy Research Centre Energy Data Centre (UKERC EDC)
- **funding:**
 - Jack Kelly's PhD is funded by an EPSRC DTA
 - Hardware necessary for this project was funded from Jack Kelly's Intel EU PhD Fellowship
- **name:** UK-DALE
- **number_of_buildings:** 5
- **related_documents:**
 - Dataset is available for download from <http://www.doc.ic.ac.uk/~dk3810/data/> (Dataset is available for download from <http://www.doc.ic.ac.uk/~dk3810/data/>)
 - Dataset is also available from the UK Energy Research Council's Energy Data Centre: The 1-second data is available from http://data.ukedc.rl.ac.uk/cgi-bin/dataset_catalogue/view.cgi.py?id=19 and the 6-second data is available from http://data.ukedc.rl.ac.uk/cgi-bin/dataset_catalogue/view.cgi.py?id=18 but please note that this archive is updated less frequently than the data on www.doc.ic.ac.uk/~dk3810/data/ (Dataset is also available from the UK Energy Research Council's Energy Data Centre: The 1-second data is available from http://data.ukedc.rl.ac.uk/cgi-bin/dataset_catalogue/view.cgi.py?id=19 and the 6-second data is available from http://data.ukedc.rl.ac.uk/cgi-bin/dataset_catalogue/view.cgi.py?id=18 but please note that this archive is updated less frequently than the data on www.doc.ic.ac.uk/~dk3810/data/)
 - This research paper describes the data collection: <http://arxiv.org/abs/1404.0284> (This research paper describes the data collection: <http://arxiv.org/abs/1404.0284>)
 - The following poster describes the metering setup and provides some analyses: Jack Kelly and William Knottenbelt. Smart Meter Disaggregation: Data Collection & Analysis. UK Energy Research Council Summer School Ph.D. poster session. June 2013. PDF: http://www.doc.ic.ac.uk/~dk3810/writing/UKERC_poster2013_v2.pdf (The following poster describes the metering setup and provides some analyses: Jack Kelly and William Knottenbelt. Smart Meter Disaggregation: Data Collection & Analysis. UK Energy Research Council Summer School Ph.D. poster session. June 2013. PDF: http://www.doc.ic.ac.uk/~dk3810/writing/UKERC_poster2013_v2.pdf)
- **contact:** jack.kelly@imperial.ac.uk

- **timeframe:**
 - **start:** 2012-11-09T22:28:15+00:00
 - **end:** 2015-01-05T06:26:44+00:00
- **geospatial_coverage:** Southern England
- **creators:**
 - Kelly, Jack
- **schema:** https://github.com/nilmtnk/nilm_metadata/tree/v0.2
(https://github.com/nilmtnk/nilm_metadata/tree/v0.2)

Print out Buildings

```
In [3]: print_dict(ukdale.buildings)
```

- 1: Building(instance=1, dataset='UK-DALE')
- 2: Building(instance=2, dataset='UK-DALE')
- 3: Building(instance=3, dataset='UK-DALE')
- 4: Building(instance=4, dataset='UK-DALE')
- 5: Building(instance=5, dataset='UK-DALE')

1.3 Print out the sub-metered appliances in each building

```
In [4]: for build in ukdale.buildings:
        print("Appliances of Building " +str(build))
        print(ukdale.buildings[build].elec.submeters())
        print("---")
```

Appliances of Building 1

MeterGroup(meters=

ElecMeter(instance=2, building=1, dataset='UK-DALE', appliances=[Appliance(type='boiler', instance=1)])

ElecMeter(instance=3, building=1, dataset='UK-DALE', appliances=[Appliance(type='solar thermal pumping station', instance=1)])

ElecMeter(instance=4, building=1, dataset='UK-DALE', appliances=[Appliance(type='laptop computer', instance=1), Appliance(type='laptop computer', instance=3)])

ElecMeter(instance=5, building=1, dataset='UK-DALE', appliances=[Appliance(type='washer dryer', instance=1)])

ElecMeter(instance=6, building=1, dataset='UK-DALE', appliances=[Appliance(type='dish washer', instance=1)])

ElecMeter(instance=7, building=1, dataset='UK-DALE', appliances=[Appliance(type='television', instance=1)])

ElecMeter(instance=8, building=1, dataset='UK-DALE', appliances=[Appliance(type='light', instance=1), Appliance(type='light', instance=2)])

ElecMeter(instance=9, building=1, dataset='UK-DALE', appliances=[Appliance(type='HTPC', instance=1)])

ElecMeter(instance=10, building=1, dataset='UK-DALE', appliances=[Appliance(type='kettle', instance=1), Appliance(type='food processor', instance=1), Appliance(type='toasted sandwich maker', instance=1)])

```
ElecMeter(instance=11, building=1, dataset='UK-DALE', appliances
=[Appliance(type='toaster', instance=1), Appliance(type='kitchen a
id', instance=1), Appliance(type='food processor', instance=2)])
ElecMeter(instance=12, building=1, dataset='UK-DALE', appliances
=[Appliance(type='fridge freezer', instance=1)])
ElecMeter(instance=13, building=1, dataset='UK-DALE', appliances
=[Appliance(type='microwave', instance=1)])
ElecMeter(instance=14, building=1, dataset='UK-DALE', appliances
=[Appliance(type='computer monitor', instance=1)])
ElecMeter(instance=15, building=1, dataset='UK-DALE', appliances
=[Appliance(type='audio system', instance=1)])
ElecMeter(instance=16, building=1, dataset='UK-DALE', appliances
=[Appliance(type='breadmaker', instance=1)])
ElecMeter(instance=17, building=1, dataset='UK-DALE', appliances
=[Appliance(type='audio amplifier', instance=1)])
ElecMeter(instance=18, building=1, dataset='UK-DALE', appliances
=[Appliance(type='broadband router', instance=1)])
ElecMeter(instance=19, building=1, dataset='UK-DALE', appliances
=[Appliance(type='light', instance=3)])
ElecMeter(instance=20, building=1, dataset='UK-DALE', appliances
=[Appliance(type='soldering iron', instance=1)])
ElecMeter(instance=21, building=1, dataset='UK-DALE', appliances
=[Appliance(type='ethernet switch', instance=1), Appliance(type='U
SB hub', instance=1)])
ElecMeter(instance=22, building=1, dataset='UK-DALE', appliances
=[Appliance(type='vacuum cleaner', instance=1)])
ElecMeter(instance=23, building=1, dataset='UK-DALE', appliances
=[Appliance(type='light', instance=4)])
ElecMeter(instance=24, building=1, dataset='UK-DALE', appliances
=[Appliance(type='light', instance=5)])
ElecMeter(instance=25, building=1, dataset='UK-DALE', appliances
=[Appliance(type='light', instance=16)])
ElecMeter(instance=26, building=1, dataset='UK-DALE', appliances
=[Appliance(type='light', instance=6)])
ElecMeter(instance=27, building=1, dataset='UK-DALE', appliances
=[Appliance(type='tablet computer charger', instance=1)])
ElecMeter(instance=28, building=1, dataset='UK-DALE', appliances
=[Appliance(type='active subwoofer', instance=1)])
ElecMeter(instance=29, building=1, dataset='UK-DALE', appliances
=[Appliance(type='light', instance=7)])
ElecMeter(instance=30, building=1, dataset='UK-DALE', appliances
=[Appliance(type='radio', instance=1)])
ElecMeter(instance=31, building=1, dataset='UK-DALE', appliances
=[Appliance(type='light', instance=8)])
ElecMeter(instance=32, building=1, dataset='UK-DALE', appliances
=[Appliance(type='wireless phone charger', instance=1), Appliance(
type='audio system', instance=2)])
ElecMeter(instance=33, building=1, dataset='UK-DALE', appliances
=[Appliance(type='light', instance=9)])
ElecMeter(instance=34, building=1, dataset='UK-DALE', appliances
=[Appliance(type='mobile phone charger', instance=1)])
ElecMeter(instance=35, building=1, dataset='UK-DALE', appliances
=[Appliance(type='light', instance=10)])
ElecMeter(instance=36, building=1, dataset='UK-DALE', appliances
=[Appliance(type='coffee maker', instance=1)])
ElecMeter(instance=37, building=1, dataset='UK-DALE', appliances
=[Appliance(type='radio', instance=2)])
```

```

    ElecMeter(instance=38, building=1, dataset='UK-DALE', appliances
=[Appliance(type='mobile phone charger', instance=2), Appliance(ty
pe='baby monitor', instance=2), Appliance(type='radio', instance=3
)])
    ElecMeter(instance=39, building=1, dataset='UK-DALE', appliances
=[Appliance(type='hair dryer', instance=1)])
    ElecMeter(instance=40, building=1, dataset='UK-DALE', appliances
=[Appliance(type='hair straighteners', instance=1)])
    ElecMeter(instance=41, building=1, dataset='UK-DALE', appliances
=[Appliance(type='clothes iron', instance=1)])
    ElecMeter(instance=42, building=1, dataset='UK-DALE', appliances
=[Appliance(type='oven', instance=1)])
    ElecMeter(instance=43, building=1, dataset='UK-DALE', appliances
=[Appliance(type='computer', instance=1), Appliance(type='external
hard disk', instance=1)])
    ElecMeter(instance=44, building=1, dataset='UK-DALE', appliances
=[Appliance(type='light', instance=11)])
    ElecMeter(instance=45, building=1, dataset='UK-DALE', appliances
=[Appliance(type='light', instance=12)])
    ElecMeter(instance=46, building=1, dataset='UK-DALE', appliances
=[Appliance(type='baby monitor', instance=1)])
    ElecMeter(instance=47, building=1, dataset='UK-DALE', appliances
=[Appliance(type='charger', instance=1)])
    ElecMeter(instance=48, building=1, dataset='UK-DALE', appliances
=[Appliance(type='light', instance=13)])
    ElecMeter(instance=49, building=1, dataset='UK-DALE', appliances
=[Appliance(type='light', instance=14)])
    ElecMeter(instance=50, building=1, dataset='UK-DALE', appliances
=[Appliance(type='light', instance=15)])
    ElecMeter(instance=51, building=1, dataset='UK-DALE', appliances
=[Appliance(type='desktop computer', instance=1)])
    ElecMeter(instance=52, building=1, dataset='UK-DALE', appliances
=[Appliance(type='fan', instance=1)])
    ElecMeter(instance=53, building=1, dataset='UK-DALE', appliances
=[Appliance(type='printer', instance=1)])
)

```

Appliances of Building 2

MeterGroup(meters=

```

    ElecMeter(instance=2, building=2, dataset='UK-DALE', appliances=
[Appliance(type='laptop computer', instance=1)])
    ElecMeter(instance=3, building=2, dataset='UK-DALE', appliances=
[Appliance(type='computer monitor', instance=1)])
    ElecMeter(instance=4, building=2, dataset='UK-DALE', appliances=
[Appliance(type='active speaker', instance=1)])
    ElecMeter(instance=5, building=2, dataset='UK-DALE', appliances=
[Appliance(type='computer', instance=1)])
    ElecMeter(instance=6, building=2, dataset='UK-DALE', appliances=
[Appliance(type='broadband router', instance=1)])
    ElecMeter(instance=7, building=2, dataset='UK-DALE', appliances=
[Appliance(type='external hard disk', instance=1)])
    ElecMeter(instance=8, building=2, dataset='UK-DALE', appliances=
[Appliance(type='kettle', instance=1)])
    ElecMeter(instance=9, building=2, dataset='UK-DALE', appliances=
[Appliance(type='rice cooker', instance=1)])
    ElecMeter(instance=10, building=2, dataset='UK-DALE', appliances
=[Appliance(type='running machine', instance=1)])

```

```

    ElecMeter(instance=11, building=2, dataset='UK-DALE', appliances
=[Appliance(type='laptop computer', instance=2)])
    ElecMeter(instance=12, building=2, dataset='UK-DALE', appliances
=[Appliance(type='washing machine', instance=1)])
    ElecMeter(instance=13, building=2, dataset='UK-DALE', appliances
=[Appliance(type='dish washer', instance=1)])
    ElecMeter(instance=14, building=2, dataset='UK-DALE', appliances
=[Appliance(type='fridge', instance=1)])
    ElecMeter(instance=15, building=2, dataset='UK-DALE', appliances
=[Appliance(type='microwave', instance=1)])
    ElecMeter(instance=16, building=2, dataset='UK-DALE', appliances
=[Appliance(type='toaster', instance=1)])
    ElecMeter(instance=17, building=2, dataset='UK-DALE', appliances
=[Appliance(type='games console', instance=1)])
    ElecMeter(instance=18, building=2, dataset='UK-DALE', appliances
=[Appliance(type='modem', instance=1)])
    ElecMeter(instance=19, building=2, dataset='UK-DALE', appliances
=[Appliance(type='cooker', instance=1)])
)

```

Appliances of Building 3

```

MeterGroup(meters=
    ElecMeter(instance=2, building=3, dataset='UK-DALE', appliances=
[Appliance(type='kettle', instance=1)])
    ElecMeter(instance=3, building=3, dataset='UK-DALE', appliances=
[Appliance(type='electric space heater', instance=1)])
    ElecMeter(instance=4, building=3, dataset='UK-DALE', appliances=
[Appliance(type='laptop computer', instance=1)])
    ElecMeter(instance=5, building=3, dataset='UK-DALE', appliances=
[Appliance(type='projector', instance=1)])
)

```

Appliances of Building 4

```

MeterGroup(meters=
    ElecMeter(instance=2, building=4, dataset='UK-DALE', appliances=
[Appliance(type='television', instance=1), Appliance(type='DVD pla
yer', instance=1), Appliance(type='set top box', instance=1), Appl
iance(type='light', instance=1)])
    ElecMeter(instance=3, building=4, dataset='UK-DALE', appliances=
[Appliance(type='kettle', instance=1), Appliance(type='radio', ins
tance=1)])
    ElecMeter(instance=4, building=4, dataset='UK-DALE', appliances=
[Appliance(type='boiler', instance=1)])
    ElecMeter(instance=5, building=4, dataset='UK-DALE', appliances=
[Appliance(type='freezer', instance=1)])
    ElecMeter(instance=6, building=4, dataset='UK-DALE', appliances=
[Appliance(type='washing machine', instance=1), Appliance(type='mi
crowave', instance=1), Appliance(type='breadmaker', instance=1)])
)

```

Appliances of Building 5

```

MeterGroup(meters=
    ElecMeter(instance=2, building=5, dataset='UK-DALE', appliances=
[Appliance(type='active speaker', instance=1)])
    ElecMeter(instance=3, building=5, dataset='UK-DALE', appliances=
[Appliance(type='desktop computer', instance=1)])
    ElecMeter(instance=4, building=5, dataset='UK-DALE', appliances=

```



```

[Appliance(type='hair dryer', instance=1)])
    ElecMeter(instance=5, building=5, dataset='UK-DALE', appliances=
[Appliance(type='television', instance=1)])
    ElecMeter(instance=6, building=5, dataset='UK-DALE', appliances=
[Appliance(type='computer monitor', instance=1)])
    ElecMeter(instance=7, building=5, dataset='UK-DALE', appliances=
[Appliance(type='running machine', instance=1)])
    ElecMeter(instance=8, building=5, dataset='UK-DALE', appliances=
[Appliance(type='network attached storage', instance=1)])
    ElecMeter(instance=9, building=5, dataset='UK-DALE', appliances=
[Appliance(type='server computer', instance=1)])
    ElecMeter(instance=10, building=5, dataset='UK-DALE', appliances
=[Appliance(type='computer monitor', instance=2)])
    ElecMeter(instance=11, building=5, dataset='UK-DALE', appliances
=[Appliance(type='games console', instance=1)])
    ElecMeter(instance=12, building=5, dataset='UK-DALE', appliances
=[Appliance(type='clothes iron', instance=1)])
    ElecMeter(instance=13, building=5, dataset='UK-DALE', appliances
=[Appliance(type='coffee maker', instance=1)])
    ElecMeter(instance=14, building=5, dataset='UK-DALE', appliances
=[Appliance(type='desktop computer', instance=2)])
    ElecMeter(instance=15, building=5, dataset='UK-DALE', appliances
=[Appliance(type='toaster', instance=1)])
    ElecMeter(instance=16, building=5, dataset='UK-DALE', appliances
=[Appliance(type='audio amplifier', instance=1)])
    ElecMeter(instance=17, building=5, dataset='UK-DALE', appliances
=[Appliance(type='set top box', instance=1)])
    ElecMeter(instance=18, building=5, dataset='UK-DALE', appliances
=[Appliance(type='kettle', instance=1)])
    ElecMeter(instance=19, building=5, dataset='UK-DALE', appliances
=[Appliance(type='fridge freezer', instance=1)])
    ElecMeter(instance=20, building=5, dataset='UK-DALE', appliances
=[Appliance(type='electric oven', instance=1)])
    ElecMeter(instance=21, building=5, dataset='UK-DALE', appliances
=[Appliance(type='electric stove', instance=1)])
    ElecMeter(instance=22, building=5, dataset='UK-DALE', appliances
=[Appliance(type='dish washer', instance=1)])
    ElecMeter(instance=23, building=5, dataset='UK-DALE', appliances
=[Appliance(type='microwave', instance=1)])
    ElecMeter(instance=24, building=5, dataset='UK-DALE', appliances
=[Appliance(type='washer dryer', instance=1)])
    ElecMeter(instance=25, building=5, dataset='UK-DALE', appliances
=[Appliance(type='vacuum cleaner', instance=1)])
)
---

```

```
In [5]: elec = ukdale.buildings[1].elec
```

1.4 Calculate the total energy consumption for building 1 in kWh

```
In [6]: elec.mains().total_energy()
```

```
Out[6]: apparent    5835.953591  
       active      5008.108254  
       dtype: float64
```

1.5 Print out the type of power for mains and sub-meters

```
In [7]: elec.mains().available_ac_types('power')
```

```
Out[7]: ['active', 'apparent']
```

```
In [8]: elec.submeters().available_ac_types('power')
```

```
Out[8]: ['active', 'apparent']
```

Exercise 2

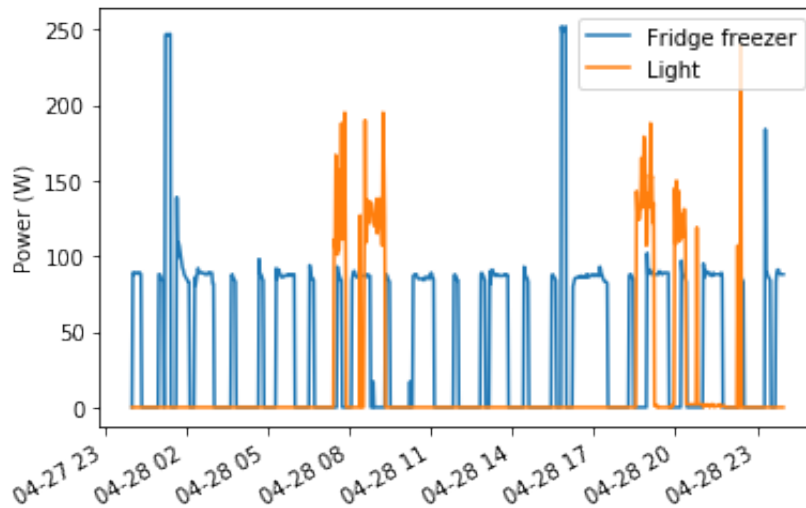
2.1 Timeframed "Fridge Freezer" and "Light" Power Plot

```
In [9]: ukdale_window = DataSet('./data/ukdale.h5')  
        ukdale_window.set_window(start='2014-04-28', end='2014-04-29')  
  
        fridge_meter = ukdale_window.buildings[1].elec['fridge freezer']  
        light_meter = ukdale_window.buildings[1].elec['light']  
        elec = ukdale_window.buildings[1].elec
```

```
In [10]: fridge_meter.plot()  
light_meter.plot()
```

```
/Users/hardanimaulana/anaconda2/envs/nilmk-env/lib/python3.6/site  
-packages/nilmk/electmeter.py:189: RuntimeWarning: Multiple applia  
nces are associated with meter {} but none are marked as the domin  
ant appliance. Hence returning the first appliance in the list.  
  ' returning the first appliance in the list.', RuntimeWarning)
```

```
Out[10]: <matplotlib.axes._subplots.AxesSubplot at 0x1b6f2f60>
```



2.2 Plot Overall Consumption For that time period

```
In [11]: all_window = next(ukdale_window.buildings[1].elec.load())  
all_window.head()
```

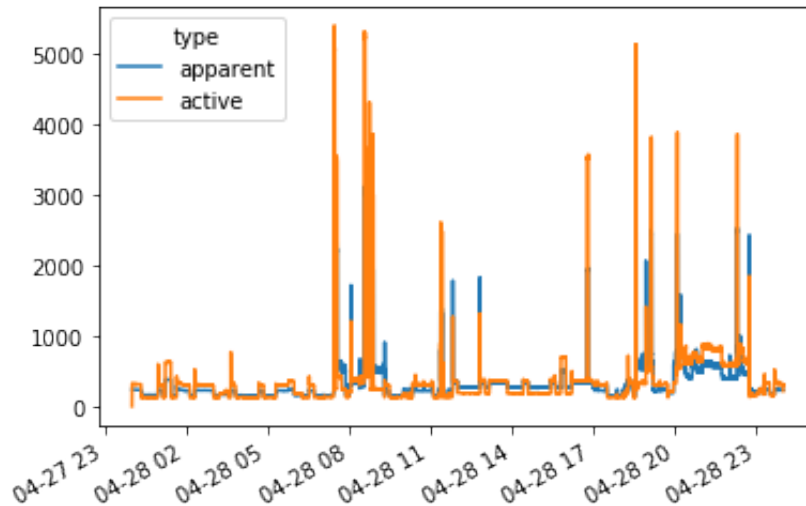
```
Loading data for meter ElecMeterID(instance=54, building=1, datase  
t='UK-DALE')  
Done loading data all meters for this chunk.
```

```
Out[11]:
```

| physical_quantity | power | | voltage |
|---------------------------|------------|------------|------------|
| type | apparent | active | |
| 2014-04-28 00:00:00+01:00 | NaN | 4.000000 | NaN |
| 2014-04-28 00:00:06+01:00 | 241.339996 | 229.830002 | 241.539993 |
| 2014-04-28 00:00:12+01:00 | 241.289993 | 321.580017 | 241.460007 |
| 2014-04-28 00:00:18+01:00 | 241.220001 | 321.570007 | 241.570007 |
| 2014-04-28 00:00:24+01:00 | 241.529999 | 322.640015 | 241.669998 |

```
In [12]: all_window['power'].plot()
```

```
Out[12]: <matplotlib.axes._subplots.AxesSubplot at 0xa1bf33710>
```

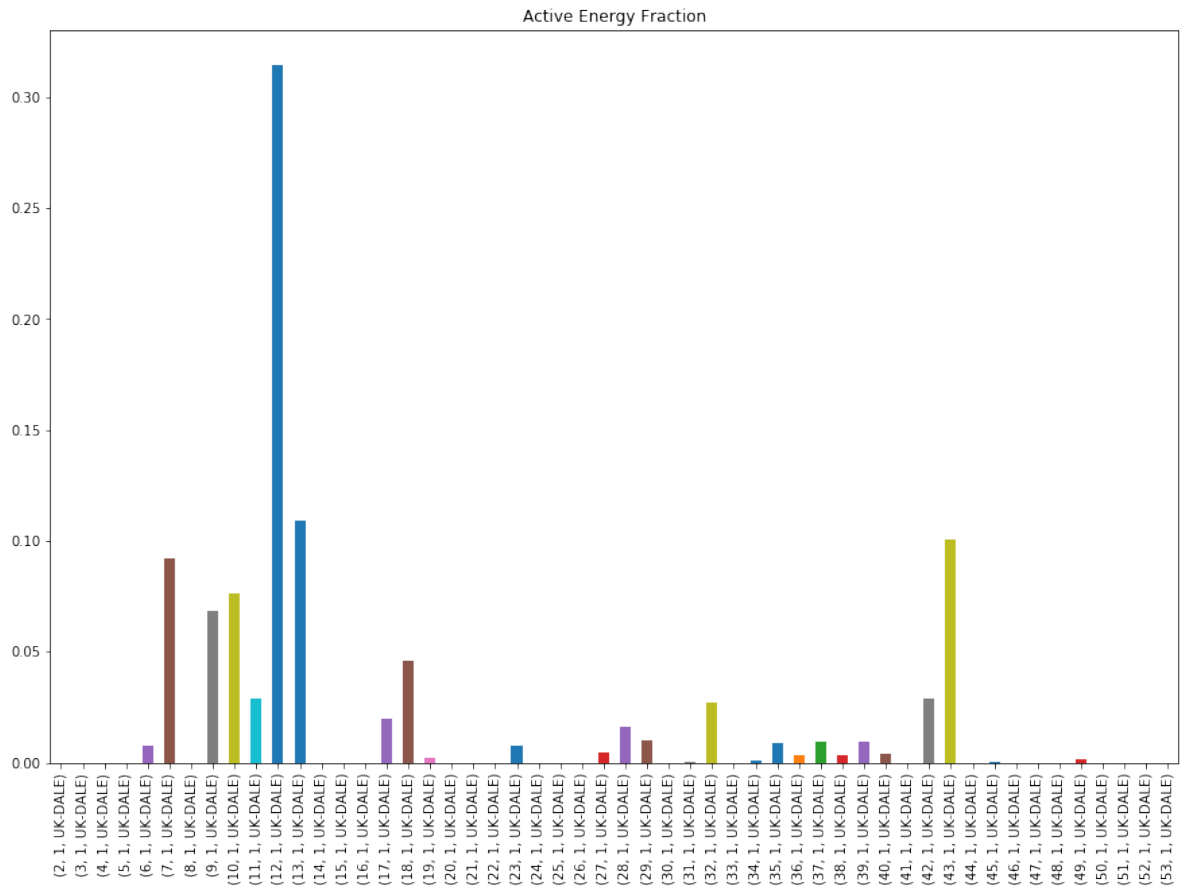


2.3 Calculate and plot the energy consumption fraction for each sub-meter

```
In [13]: energy_fraction_per_submeter = elec.submeters().energy_per_meter().  
transpose().fillna(0)  
del energy_fraction_per_submeter['reactive']  
active_en = energy_fraction_per_submeter['active']  
active_en_frac = active_en/active_en.sum()  
active_en_frac.plot(kind="bar", figsize=(15,10), title="Active Energy Fraction")
```

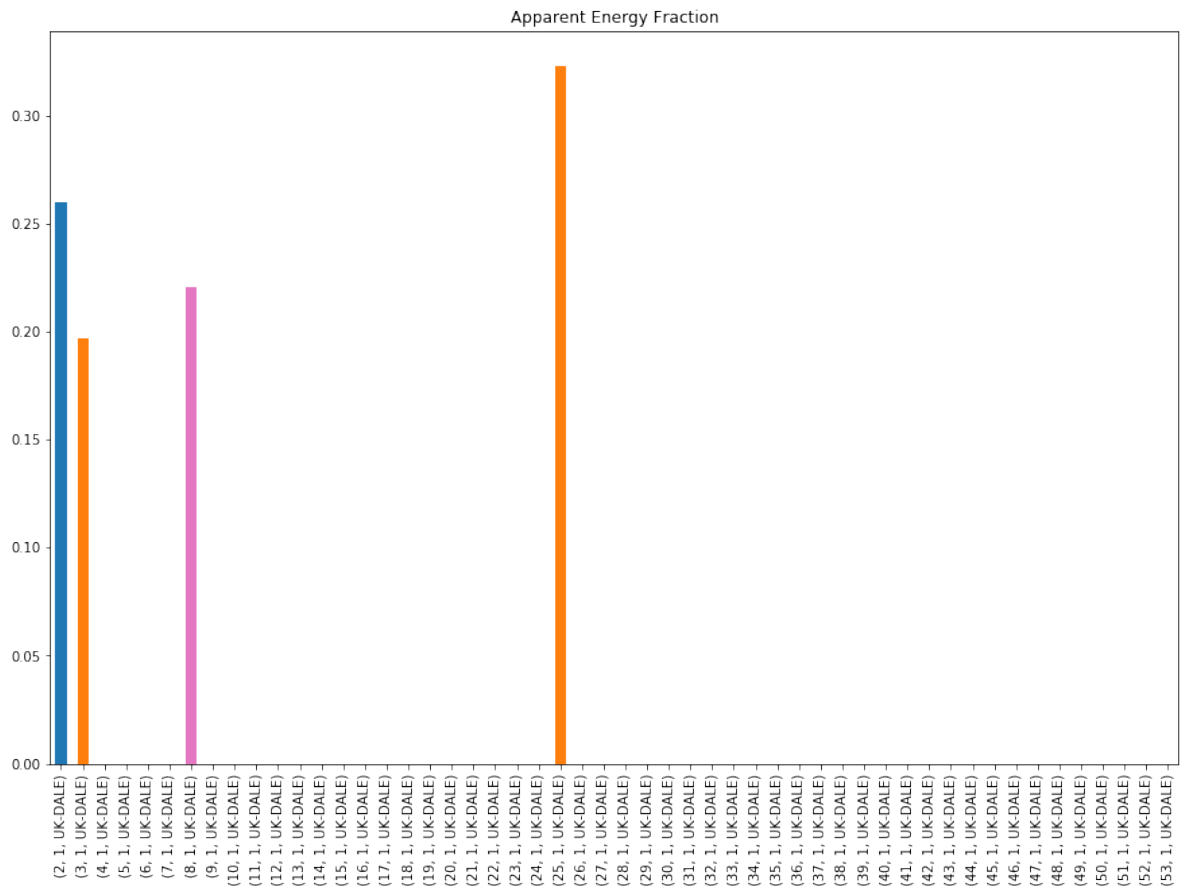
```
52/52 ElecMeter(instance=53, building=1, dataset='UK-DALE', appliances=[Appliance(type='printer', instance=1)]e=1))e(type='external hard disk', instance=1)]e=2), Appliance(type='radio', instance=3)]e=1))
```

Out[13]: <matplotlib.axes._subplots.AxesSubplot at 0xalc658e10>



```
In [14]: apparent_en = energy_fraction_per_submeter['apparent']
apparent_en_frac = apparent_en/apparent_en.sum()
apparent_en_frac.plot(kind="bar", figsize=(15,10), title="Apparent
Energy Fraction")
```

Out[14]: <matplotlib.axes._subplots.AxesSubplot at 0x1c234a58>



2.4 Highest Power Consuming Appliance

```
In [15]: max_appliance = elec.submeters().select_top_k(k=1).energy_per_meter
()
```

```
1/1 ElecMeter(instance=12, building=1, dataset='UK-DALE', appliances=[Appliance(type='fridge freezer', instance=1)]1))e(type='external hard disk', instance=1)]e=2), Appliance(type='radio', instance=3)]1))
```

2.5 Find appliances of the type “single-phase induction motor”

```
In [16]: elec.select_using_appliances(category='single-phase induction motor')
```

```
Out[16]: MeterGroup(meters=
    ElecMeter(instance=2, building=1, dataset='UK-DALE', appliances=
    [Appliance(type='boiler', instance=1)])
    ElecMeter(instance=3, building=1, dataset='UK-DALE', appliances=
    [Appliance(type='solar thermal pumping station', instance=1)])
    ElecMeter(instance=5, building=1, dataset='UK-DALE', appliances=
    [Appliance(type='washer dryer', instance=1)])
    ElecMeter(instance=6, building=1, dataset='UK-DALE', appliances=
    [Appliance(type='dish washer', instance=1)])
    ElecMeter(instance=10, building=1, dataset='UK-DALE', appliances=
    [Appliance(type='kettle', instance=1), Appliance(type='food processor', instance=1), Appliance(type='toasted sandwich maker', instance=1)])
    ElecMeter(instance=11, building=1, dataset='UK-DALE', appliances=
    [Appliance(type='toaster', instance=1), Appliance(type='kitchen aid', instance=1), Appliance(type='food processor', instance=2)])
    ElecMeter(instance=12, building=1, dataset='UK-DALE', appliances=
    [Appliance(type='fridge freezer', instance=1)])
    ElecMeter(instance=16, building=1, dataset='UK-DALE', appliances=
    [Appliance(type='breadmaker', instance=1)])
    ElecMeter(instance=22, building=1, dataset='UK-DALE', appliances=
    [Appliance(type='vacuum cleaner', instance=1)])
    ElecMeter(instance=52, building=1, dataset='UK-DALE', appliances=
    [Appliance(type='fan', instance=1)])
    ElecMeter(instance=54, building=1, dataset='UK-DALE', site_meter,
    appliances=[Appliance(type='immersion heater', instance=1), Appliance(type='water pump', instance=1), Appliance(type='security alarm', instance=1), Appliance(type='fan', instance=2), Appliance(type='drill', instance=1), Appliance(type='laptop computer', instance=2)])
)
```

Exercise 3

```
In [17]: import time
from six import iteritems
import matplotlib.pyplot as plt
import numpy as np

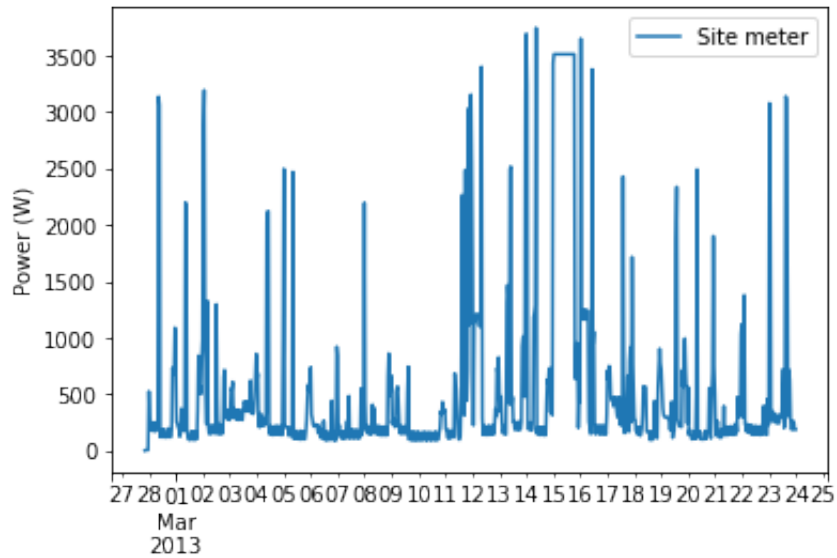
train = DataSet('./data/ukdale.h5')
test = DataSet('./data/ukdale.h5')
```

```
In [18]: train.set_window(end="24-3-2013")
test.set_window(start="25-3-2013")

train_elec = train.buildings[3].elec
test_elec = test.buildings[3].elec
```

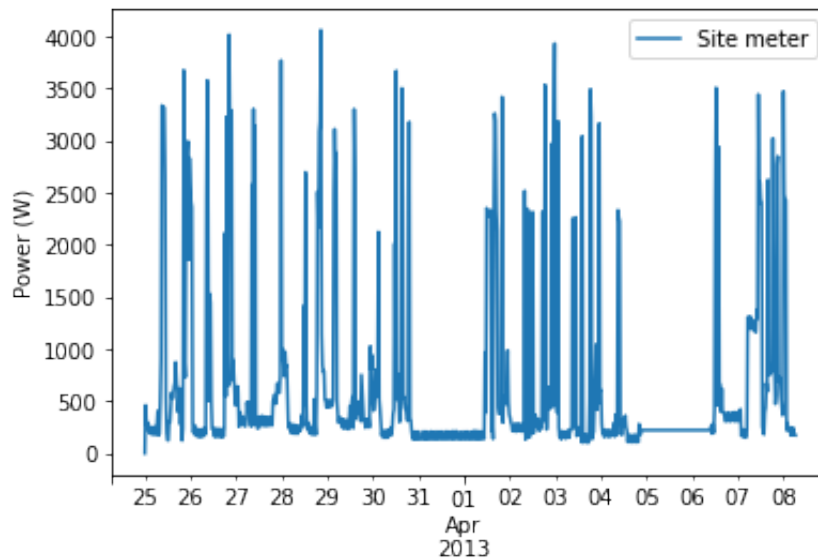
```
In [19]: train_elec.mains().plot()
```

```
Out[19]: <matplotlib.axes._subplots.AxesSubplot at 0xa1cd58cf8>
```



```
In [20]: test_elec.mains().plot()
```

```
Out[20]: <matplotlib.axes._subplots.AxesSubplot at 0xa1d7916d8>
```




```
In [21]: mains = train_elec.mains()
mains_df = next(mains.load())
mains_df.head()
```

Out[21]:

| physical_quantity | power |
|---------------------------|----------|
| type | apparent |
| 2013-02-27 20:35:14+00:00 | 5.0 |
| 2013-02-27 20:35:20+00:00 | 4.0 |
| 2013-02-27 20:35:26+00:00 | 5.0 |
| 2013-02-27 20:35:32+00:00 | 5.0 |
| 2013-02-27 20:35:38+00:00 | 4.0 |

Prepare a Method for Predicting and Calculating the F-Score

```
In [22]: from nilmtk.disaggregate import CombinatorialOptimisation, FHMM
from nilmtk.tests.testingtools import data_dir
from sklearn.metrics import f1_score
```

Disaggregate and Calculate the F-Score With this function

```
In [23]: def disaggr_and_fscore(algorithm, train_elec, test_elec, train_timezone, show_debug=True):
    start = time.time()
    algorithm.train(train_elec, sample_period=6)
    end = time.time()
    print("Train runtime =", end-start, "seconds.")
    pred = {}
    gt = {}

    for i, chunk in enumerate(test_elec.mains().load(sample_period=6)):
        chunk_drop_na = (chunk).dropna()
        pred[i] = algorithm.disaggregate_chunk(chunk_drop_na)
        gt[i] = {}

        for meter in test_elec.submeters().meters:
            # Only use the meters that we trained on (this saves time!)
            gt[i][meter] = next(meter.load(sample_period=6))
        gt[i] = pd.DataFrame({k:v.squeeze() for k,v in iteritems(gt[i])}, index=next(iter(gt[i].values())).index).dropna()

    gt_overall = pd.concat(gt)
    gt_overall.index = gt_overall.index.droplevel()
    pred_overall = pd.concat(pred)
    pred_overall.index = pred_overall.index.droplevel()
```

```

gt_overall = gt_overall[pred_overall.columns]

gt_index_utc = gt_overall.index.tz_convert("UTC")
pred_index_utc = pred_overall.index.tz_convert("UTC")
common_index_utc = gt_index_utc.intersection(pred_index_utc)

common_index_local = common_index_utc.tz_convert(train_timezone
)

gt_overall = gt_overall.ix[common_index_local]
pred_overall = pred_overall.ix[common_index_local]

if show_debug:
    gt_overall.head()

appliance_labels = [m.label() for m in gt_overall.columns.values
s]
gt_overall.columns = appliance_labels
pred_overall.columns = appliance_labels

if show_debug:
    pred_overall.head()
    pred_overall.head(100000).plot(title="Pred",figsize=(15,5))
    gt_overall.head(100000).plot(title="GT",figsize=(15,5))
    plt.legend()

resulting_f_score = {}
threshold_w = 5
for appliance in gt_overall.columns:
    temp_gt = gt_overall[appliance].copy()
    temp_gt[temp_gt<=threshold_w] = 0
    temp_gt[temp_gt>threshold_w] = 1
    temp_pred = pred_overall[appliance].copy()
    temp_pred[temp_pred<=threshold_w] = 0
    temp_pred[temp_pred>threshold_w] = 1
    resulting_f_score[appliance] = f1_score(temp_gt, temp_pred)

return resulting_f_score

```

```

In [24]: classifiers = {'CO':CombinatorialOptimisation(), 'FHMM':FHMM()}
resulting_f_scores = {}

```

3.1 Combinatorial Optimisation

```

In [25]: resulting_f_scores['CO'] = disaggr_and_fscore(CombinatorialOptimisa
tion(),train_elec, test_elec,train.metadata['timezone'],show_debug=
True)

```

Training model for submeter 'ElecMeter(instance=2, building=3, dat
aset='UK-DALE', appliances=[Appliance(type='kettle', instance=1)])

```
/Users/hardanimaulana/anaconda2/envs/nilmk-env/lib/python3.6/site-packages/sklearn/metrics/pairwise.py:257: RuntimeWarning: invalid value encountered in sqrt
```

```
    return distances if squared else np.sqrt(distances, out=distances)
```

```
Training model for submeter 'ElecMeter(instance=3, building=3, dataset='UK-DALE', appliances=[Appliance(type='electric space heater', instance=1)])'
```

```
/Users/hardanimaulana/anaconda2/envs/nilmk-env/lib/python3.6/site-packages/sklearn/metrics/pairwise.py:257: RuntimeWarning: invalid value encountered in sqrt
```

```
    return distances if squared else np.sqrt(distances, out=distances)
```

```
Training model for submeter 'ElecMeter(instance=4, building=3, dataset='UK-DALE', appliances=[Appliance(type='laptop computer', instance=1)])'
```

```
/Users/hardanimaulana/anaconda2/envs/nilmk-env/lib/python3.6/site-packages/sklearn/metrics/pairwise.py:257: RuntimeWarning: invalid value encountered in sqrt
```

```
    return distances if squared else np.sqrt(distances, out=distances)
```

```
Training model for submeter 'ElecMeter(instance=5, building=3, dataset='UK-DALE', appliances=[Appliance(type='projector', instance=1)])'
```

```
/Users/hardanimaulana/anaconda2/envs/nilmk-env/lib/python3.6/site-packages/sklearn/metrics/pairwise.py:257: RuntimeWarning: invalid value encountered in sqrt
```

```
    return distances if squared else np.sqrt(distances, out=distances)
```

Done training!

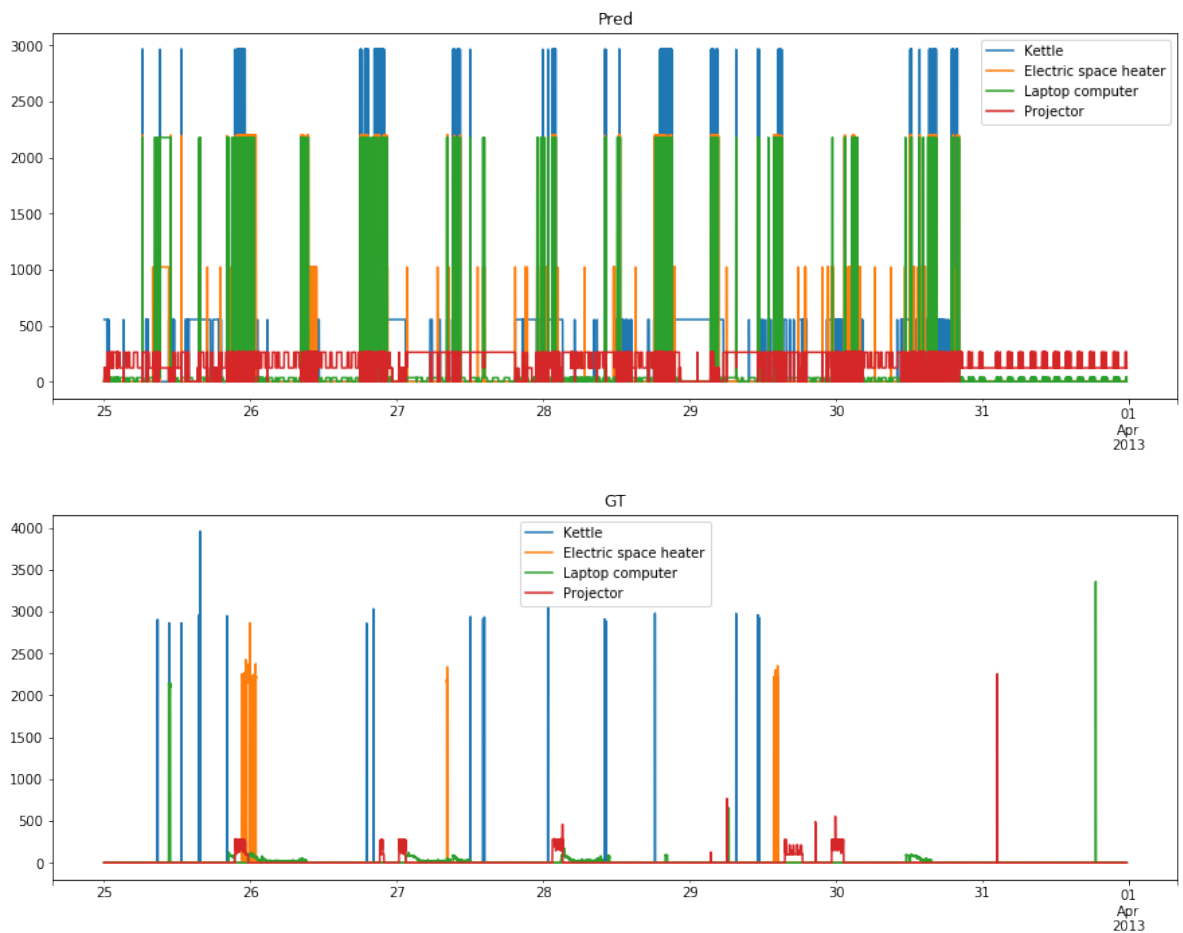
Train runtime = 2.218951940536499 seconds.

```
Estimating power demand for 'ElecMeter(instance=2, building=3, dataset='UK-DALE', appliances=[Appliance(type='kettle', instance=1)])'
```

```
Estimating power demand for 'ElecMeter(instance=3, building=3, dataset='UK-DALE', appliances=[Appliance(type='electric space heater', instance=1)])'
```

```
Estimating power demand for 'ElecMeter(instance=4, building=3, dataset='UK-DALE', appliances=[Appliance(type='laptop computer', instance=1)])'
```

```
Estimating power demand for 'ElecMeter(instance=5, building=3, dataset='UK-DALE', appliances=[Appliance(type='projector', instance=1)])'
```



3.2 FHMM

```
In [26]: resulting_f_scores['FHMM'] = disaggr_and_fscores(FHMM(),train_elec,
test_elec,train.metadata['timezone'],show_debug=True)
```

```
/Users/hardanimaulana/anaconda2/envs/nilm-tk-env/lib/python3.6/site-
-packages/sklearn/metrics/pairwise.py:257: RuntimeWarning: invalid
value encountered in sqrt
```

```
    return distances if squared else np.sqrt(distances, out=distance
s)
```

```
Training model for submeter 'ElecMeter(instance=2, building=3, dat
aset='UK-DALE', appliances=[Appliance(type='kettle', instance=1)])'
```

```
/Users/hardanimaulana/anaconda2/envs/nilm-tk-env/lib/python3.6/site-
-packages/sklearn/metrics/pairwise.py:257: RuntimeWarning: invalid
value encountered in sqrt
```

```
    return distances if squared else np.sqrt(distances, out=distance
s)
```

```
Training model for submeter 'ElecMeter(instance=3, building=3, dat
aset='UK-DALE', appliances=[Appliance(type='electric space heater'
, instance=1)])'
```

```
/Users/hardanimaulana/anaconda2/envs/nilmk-env/lib/python3.6/site-packages/sklearn/metrics/pairwise.py:257: RuntimeWarning: invalid value encountered in sqrt
```

```
return distances if squared else np.sqrt(distances, out=distances)
```

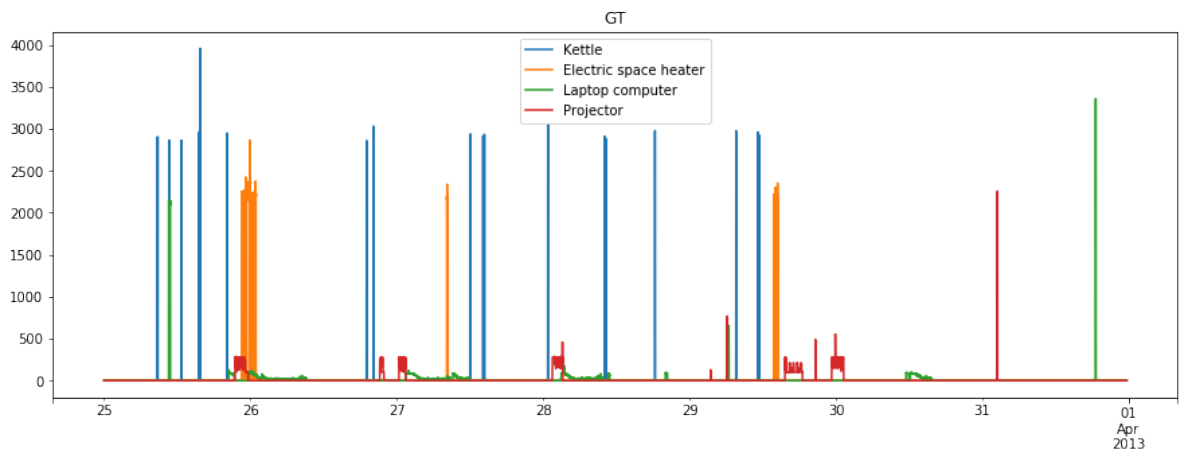
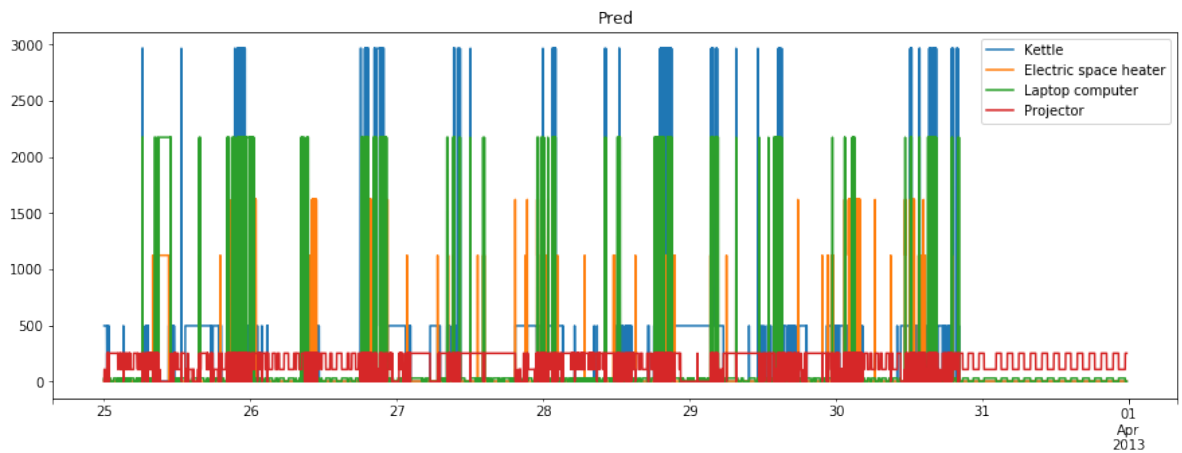
```
Training model for submeter 'ElecMeter(instance=4, building=3, dataset='UK-DALE', appliances=[Appliance(type='laptop computer', instance=1)])'
```

```
/Users/hardanimaulana/anaconda2/envs/nilmk-env/lib/python3.6/site-packages/sklearn/metrics/pairwise.py:257: RuntimeWarning: invalid value encountered in sqrt
```

```
return distances if squared else np.sqrt(distances, out=distances)
```

```
Training model for submeter 'ElecMeter(instance=5, building=3, dataset='UK-DALE', appliances=[Appliance(type='projector', instance=1)])'
```

Train runtime = 35.651565074920654 seconds.



Exercise 4

Compare F-Score of CO and FHMM

```
In [27]: f_score_df={}
f_score_df['FHMM']=pd.Series(resulting_f_scores['FHMM'])
f_score_df['CO'] = pd.Series(resulting_f_scores['CO'])
f_score_df = pd.DataFrame(f_score_df)
f_score_df
```

Out[27]:

| | CO | FHMM |
|------------------------------|----------|----------|
| Electric space heater | 0.381523 | 0.367336 |
| Kettle | 0.016292 | 0.009945 |
| Laptop computer | 0.374046 | 0.351022 |
| Projector | 0.088006 | 0.091067 |

```
In [28]: f_score_df.plot(kind='bar')
```

Out[28]: <matplotlib.axes._subplots.AxesSubplot at 0x1a371f8b70>

