

In [ ]:

```
# from nilm_metadata import get_appliance_types  
# appliance_types = get_appliance_types()  
# print(appliance_types)  
  
# import os  
# os.getcwd()
```

**Carregando bibliotecas...**

In [1]:

```

!pip install seaborn

import seaborn as sns

from matplotlib import rcParams
import matplotlib.pyplot as plt
import pandas as pd
import nilmtk
from nilmtk import MeterGroup
from nilmtk.api import API
import warnings
warnings.filterwarnings("ignore")

plt.style.use('ggplot')
rcParams['figure.figsize'] = (13, 10)

# import pathlib
# pathlib.Path().resolve()

```

```

Requirement already satisfied: seaborn in ./miniconda3/envs/nilm_0.4.3/lib/python3.7/site-packages (0.11.2)
Requirement already satisfied: matplotlib>=2.2 in ./miniconda3/envs/nilm_0.4.3/lib/python3.7/site-packages (from seaborn) (3.1.3)
Requirement already satisfied: numpy>=1.15 in ./miniconda3/envs/nilm_0.4.3/lib/python3.7/site-packages (from seaborn) (1.19.5)
Requirement already satisfied: pandas>=0.23 in ./miniconda3/envs/nilm_0.4.3/lib/python3.7/site-packages (from seaborn) (0.25.3)
Requirement already satisfied: scipy>=1.0 in ./miniconda3/envs/nilm_0.4.3/lib/python3.7/site-packages (from seaborn) (1.7.1)
Requirement already satisfied: cyclor>=0.10 in ./miniconda3/envs/nilm_0.4.3/lib/python3.7/site-packages (from matplotlib>=2.2->seaborn) (0.10.0)
Requirement already satisfied: pyparsing!=2.0.4,!=2.1.2,!=2.1.6,>=2.0.1 in ./miniconda3/envs/nilm_0.4.3/lib/python3.7/site-packages (from matplotlib>=2.2->seaborn) (2.4.7)
Requirement already satisfied: kiwisolver>=1.0.1 in ./miniconda3/envs/nilm_0.4.3/lib/python3.7/site-packages (from matplotlib>=2.2->seaborn) (1.3.2)
Requirement already satisfied: python-dateutil>=2.1 in ./miniconda3/envs/nilm_0.4.3/lib/python3.7/site-packages (from matplotlib>=2.2->seaborn) (2.8.2)
Requirement already satisfied: six in ./miniconda3/envs/nilm_0.4.3/lib/python3.7/site-packages (from cyclor>=0.10->matplotlib>=2.2->seaborn) (1.16.0)
Requirement already satisfied: pytz>=2017.2 in ./miniconda3/envs/nilm_0.4.3/lib/python3.7/site-packages (from pandas>=0.23->seaborn) (2021.1)

```

## Converter

In [ ]:

```

# from nilmtk.dataset_converters import convert_hb
# convert_hb('./BD/CASA/convert', './data/teste17.h5')

```

In [ ]:

```
# st = pd.HDFStore("./data/teste17.h5")  
# print (st.keys())  
  
# print (st['/building1/elec/meter1'].head())  
# print (st['/building1/elec/meter2'].head())  
# print (st['/building1/elec/meter3'].head())  
  
# st.close()
```

## Carregando dataset

In [2]:

```

from nilmtk.api import API
import warnings
warnings.filterwarnings("ignore")

from nilmtk import DataSet
from nilmtk.utils import print_dict

hb = DataSet('teste17.h5')
# redd = DataSet('redd.h5')

#iawe = DataSet('/data/iawe.h5')

print_dict(hb.metadata)
print_dict(hb.buildings)

```

- **name:** HB
- **long\_name:** The Reference Energy Disaggregation Data set
- **creators:**
  - Henrique
- **publication\_date:** 2021
- **institution:** IFCE
- **contact:** henrique@ufc.br
- **description:** Several weeks of power data for 6 different homes.
- **subject:** Disaggregated power demand from domestic buildings.
- **number\_of\_buildings:** 1
- **timezone:** America/Fortaleza
- **geo\_location:**
  - **locality:** Fortaleza
  - **country:** BR
  - **latitude:** -3.743443904897663
  - **longitude:** -38.526093995496886
- **related\_documents:**
  - <http://redd.csail.mit.edu> (<http://redd.csail.mit.edu>)
  - J. Zico Kolter and Matthew J. Johnson. REDD: A public data set for energy disaggregation research. In proceedings of the SustKDD workshop on Data Mining Applications in Sustainability, 2011. <http://redd.csail.mit.edu/kolter-kddsust11.pdf> (<http://redd.csail.mit.edu/kolter-kddsust11.pdf>)
- **schema:** [https://github.com/nilmtk/nilm\\_metadata/tree/v0.2](https://github.com/nilmtk/nilm_metadata/tree/v0.2) ([https://github.com/nilmtk/nilm\\_metadata/tree/v0.2](https://github.com/nilmtk/nilm_metadata/tree/v0.2))
- **meter\_devices:**
  - **eMonitor:**
    - **model:** sonoff
    - **manufacturer:** Powerhouse Dynamics
    - **manufacturer\_url:** <http://powerhousedynamics.com> (<http://powerhousedynamics.com>)
    - **description:** ...
    - **sample\_period:** 5
    - **max\_sample\_period:** 30
    - **measurements:**
      - {'physical\_quantity': 'power', 'type': 'active', 'upper\_limit': 1142, 'lower\_limit': 0}

- {'physical\_quantity': 'power', 'type': 'apparent', 'upper\_limit': 1215, 'lower\_limit': 0}
- {'physical\_quantity': 'power', 'type': 'reactive', 'upper\_limit': 901, 'lower\_limit': 0}
- {'physical\_quantity': 'power factor', 'upper\_limit': 1, 'lower\_limit': 0}
- {'physical\_quantity': 'voltage', 'upper\_limit': 232, 'lower\_limit': 0}
- {'physical\_quantity': 'current', 'upper\_limit': 6, 'lower\_limit': 0}
- **wireless**: True
- **REDD\_whole\_house**:
  - **model**: pzem004t
  - **description**: ...
  - **sample\_period**: 0.5
  - **max\_sample\_period**: 30
  - **measurements**:
    - {'physical\_quantity': 'voltage', 'upper\_limit': 230, 'lower\_limit': 0}
    - {'physical\_quantity': 'current', 'upper\_limit': 15, 'lower\_limit': 0}
    - {'physical\_quantity': 'power', 'type': 'active', 'upper\_limit': 3016, 'lower\_limit': 0}
    - {'physical\_quantity': 'frequency', 'upper\_limit': 61, 'lower\_limit': 0}
    - {'physical\_quantity': 'power factor', 'upper\_limit': 1, 'lower\_limit': 0}
  - **wireless**: False
- **1**: Building(instance=1, dataset='HB')

## Gráfico Geral

In [3]:

```
build = 1
elec = hb.buildings[build].elec
elec.mains().power_series_all_data().head()
```

Out[3]:

```
2021-09-02 07:14:34.515000-03:00    167.199997
2021-09-02 07:14:35.014000-03:00    167.199997
2021-09-02 07:14:35.513000-03:00    167.199997
2021-09-02 07:14:36.013000-03:00    167.199997
2021-09-02 07:14:36.527000-03:00    166.899994
Name: (power, active), dtype: float32
```

In [4]:

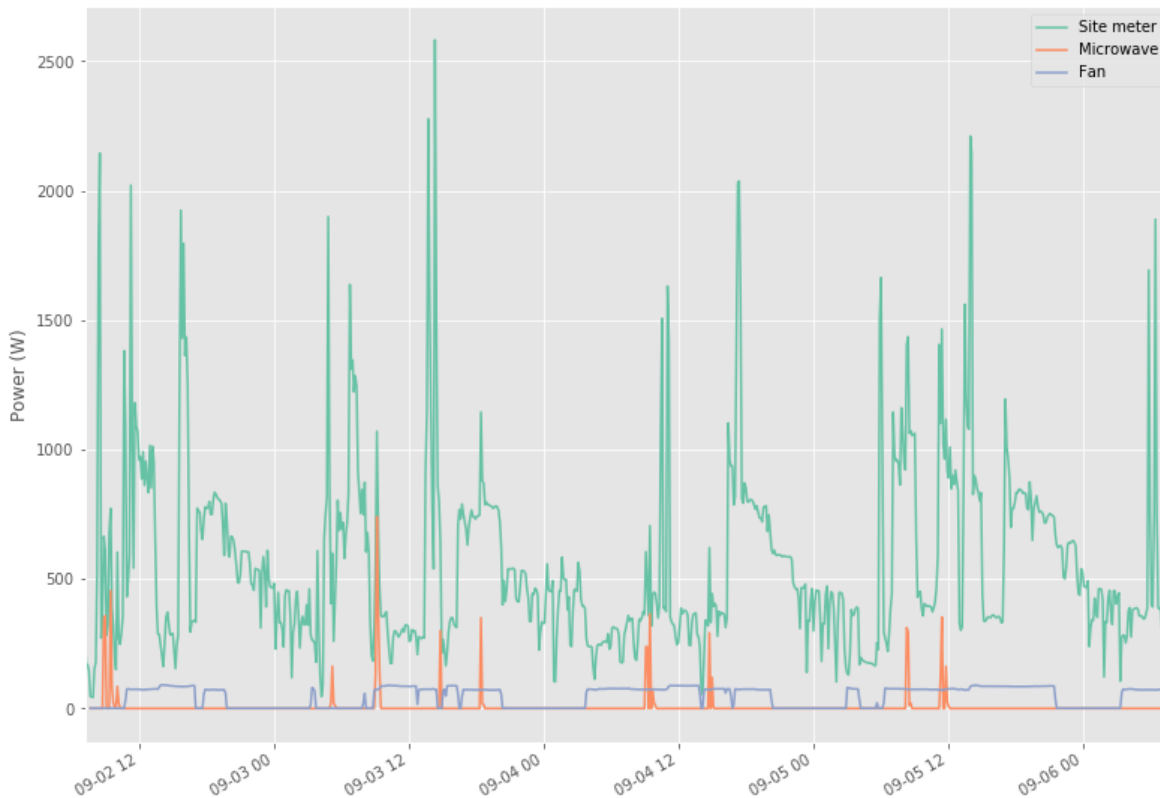
```
sns.set_palette("Set2", n_colors=5)
elec.mains().plot()
elec['microwave'].plot()
elec['fan'].plot()

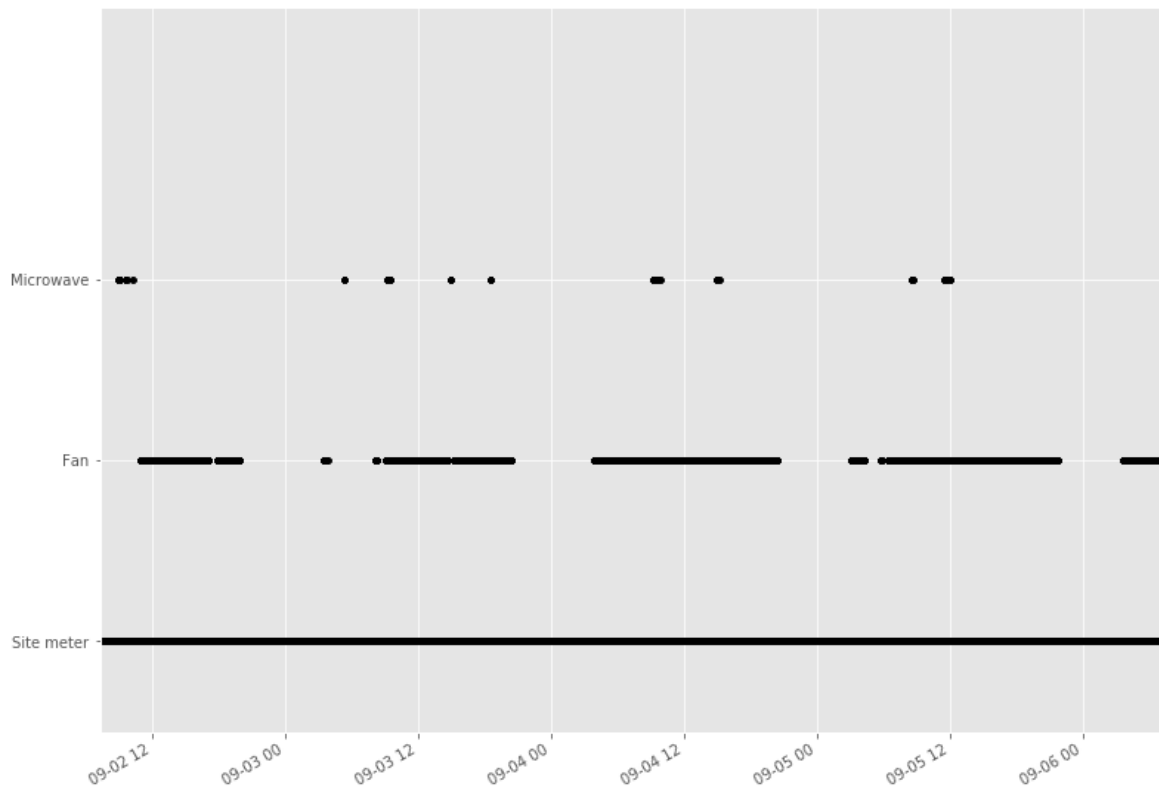
# Set a threshold to remove residual power noise when devices are off
elec.plot_when_on(on_power_threshold = 40) # Plot appliances when they are in use

# elec.draw_wiring_graph()
```

Out[4]:

<matplotlib.axes.\_subplots.AxesSubplot at 0x7f667cabb6d0>





## Dados

### *Proporção de energia submedida*

In [5]:

```
elec.proportion_of_energy_submetered()
```

Running MeterGroup.proportion\_of\_energy\_submetered...

Out[5]:

0.09288249528613458

### *Total Energy*

In [6]:

```
elec.mains().total_energy()
```

Out[6]:

active 53.946047

dtype: float64

**Energy per submeter**

In [7]:

```
energy_per_meter = elec.submeters().energy_per_meter() # kWh, again
energy_per_meter
```

2/2 ElecMeter(instance=3, building=1, dataset='HB', appliances=[Appliance(type='microwave', instance=1)])

Out[7]:

	(2, 1, HB)	(3, 1, HB)
active	4.298278	0.757815
apparent	NaN	NaN
reactive	NaN	NaN

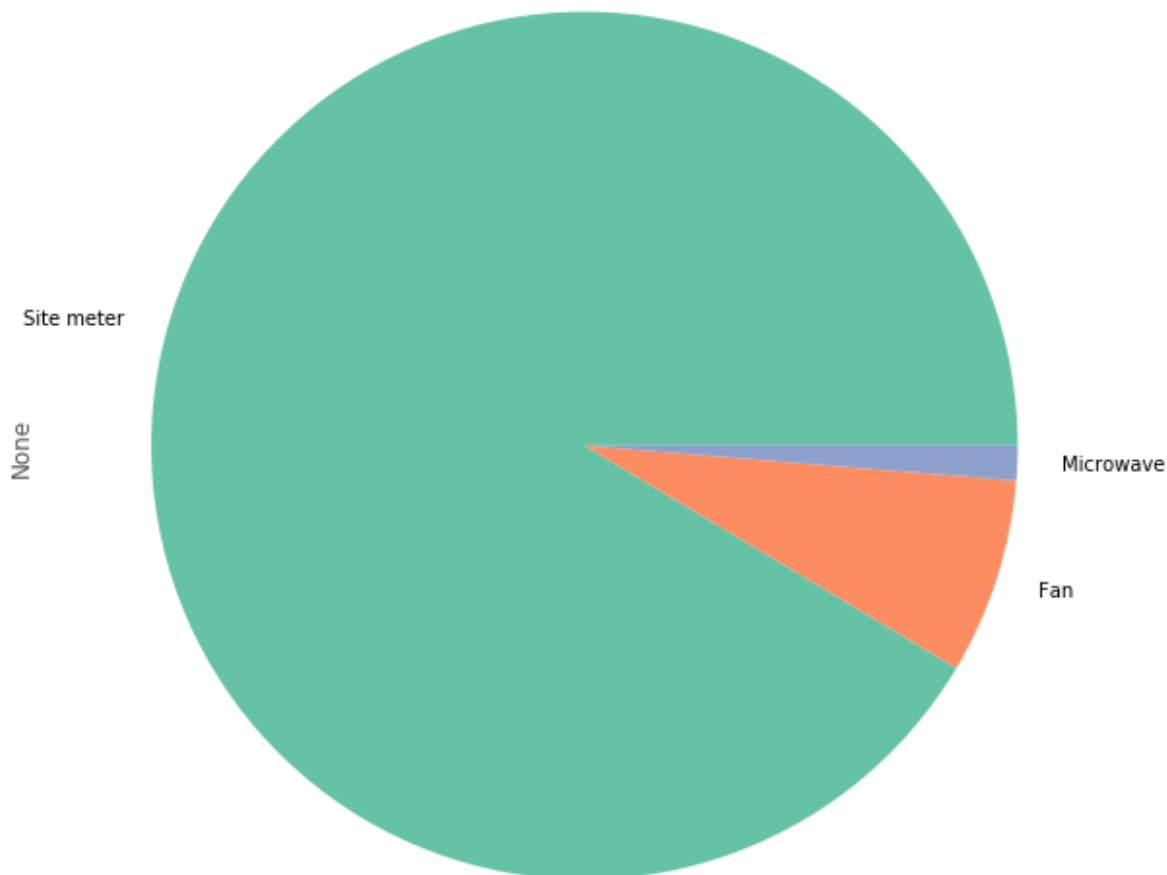
**Plot fraction of energy consumption of each appliance**



In [5]:

```
# fraction = elec.submeters().fraction_per_meter().dropna()
fraction = elec.fraction_per_meter().dropna()
# Create convenient labels
labels = elec.get_labels(fraction.index)
plt.figure(figsize=(10,30))
fraction.plot(kind='pie', labels=labels);
```

3/3 ElecMeter(instance=3, building=1, dataset='HB', appliances=[Appliance(type='microwave', instance=1)])



## Quadro Geral

In [6]:

```
print(elec)
elec.mains()
```

```
MeterGroup(meters=
  ElecMeter(instance=1, building=1, dataset='HB', site_meter, appliances=[])
  ElecMeter(instance=2, building=1, dataset='HB', appliances=[Appliance(type='fan', instance=1)])
  ElecMeter(instance=3, building=1, dataset='HB', appliances=[Appliance(type='microwave', instance=1)])
)
```

Out[6]:

```
ElecMeter(instance=1, building=1, dataset='HB', site_meter, appliances=[])
```

In [11]:

```
from nilmtk.electrometer import ElecMeterID##### Quadro Geral
meter1 = elec[ElecMeterID(instance=1, building=build, dataset='HB')]
next(meter1.load()).tail()
```

Out[11]:

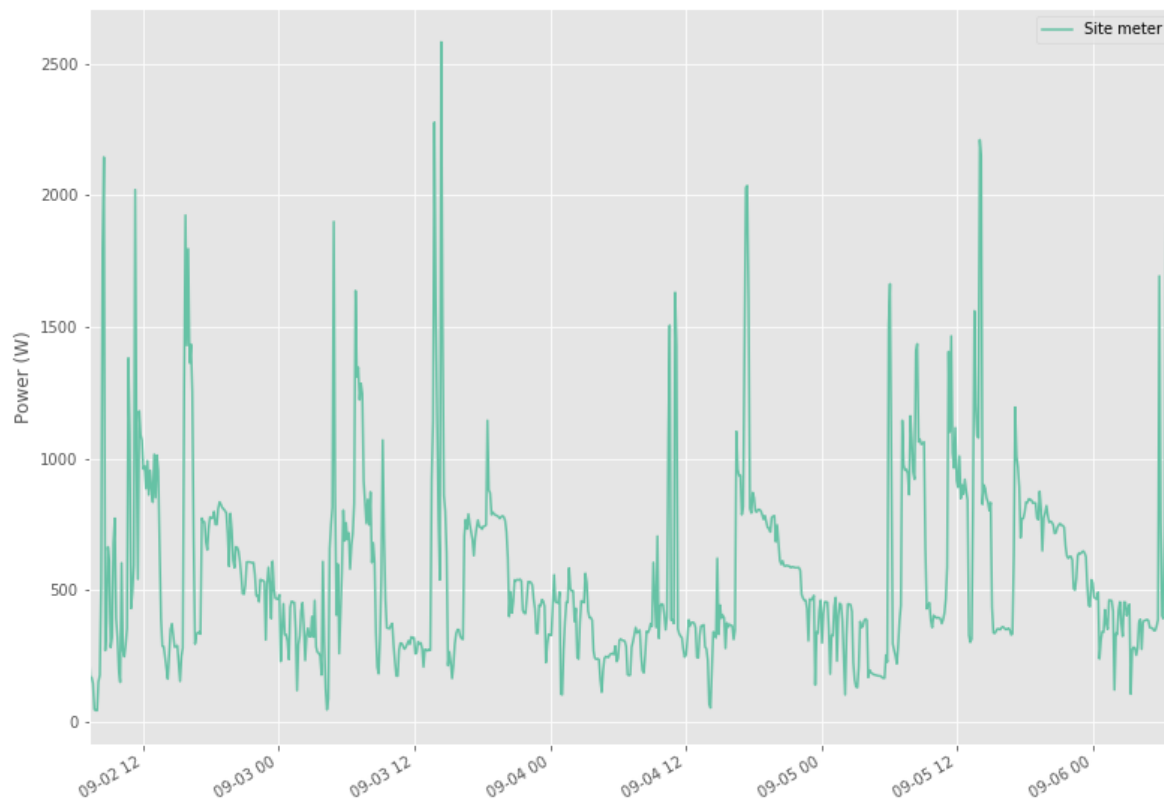
physical_quantity	voltage	frequency	power	power factor	current
type			active		
2021-09-06 07:24:13.545000-03:00	221.300003	60.0	458.399994	0.91	2.286
2021-09-06 07:24:14.060000-03:00	221.300003	60.0	458.399994	0.91	2.286
2021-09-06 07:24:14.559000-03:00	221.500000	60.0	458.299988	0.91	2.282
2021-09-06 07:24:15.042000-03:00	221.500000	60.0	458.299988	0.91	2.282
2021-09-06 07:24:15.557000-03:00	221.600006	60.0	459.000000	0.91	2.286

In [12]:

```
meter1.plot()
```

Out[12]:

<matplotlib.axes.\_subplots.AxesSubplot at 0x7f667a0fdd90>



A taxa de abandono é um número entre 0 e 1 que especifica a proporção de amostras ausentes. Uma taxa de abandono de 0 significa que nenhuma amostra está faltando. Um valor de 1 significaria que todas as amostras estão faltando

In [13]:

```
meter1.dropout_rate()
```

Out[13]:

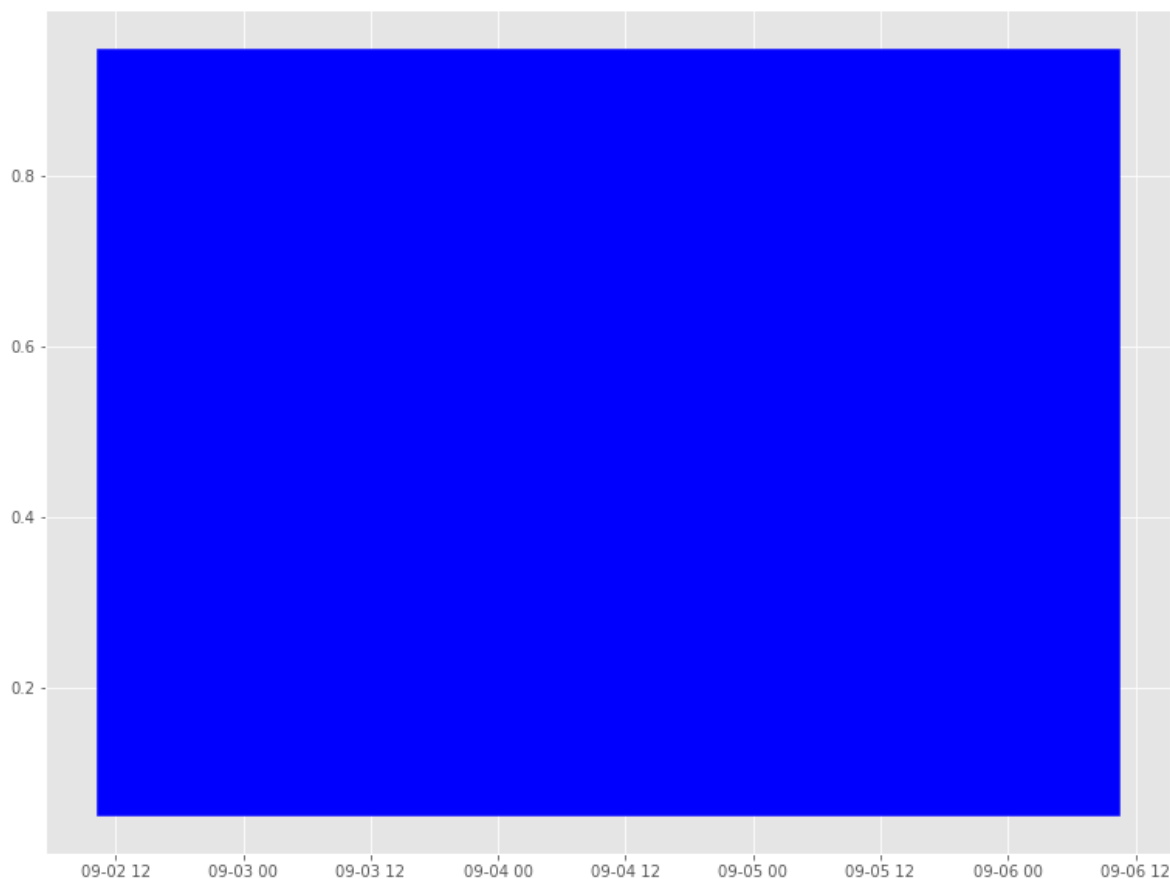
0.0002946431279545747

In [14]:

```
good_sections = meter1.good_sections(full_results=True)  
good_sections.plot()
```

Out[14]:

<matplotlib.axes.\_subplots.AxesSubplot at 0x7f667b21ed10>



In [15]:

```
good_sections.combined()
```

Out[15]:

[TimeFrame(start='2021-09-02 07:14:34.515000-03:00', end='2021-09-06 07:24:15.557000-03:00', empty=False)]

**Microondas**

In [16]:

```
microwave= elec['microwave']  
#microwave.available_columns()  
next(microwave.load()).head()
```

Out[16]:

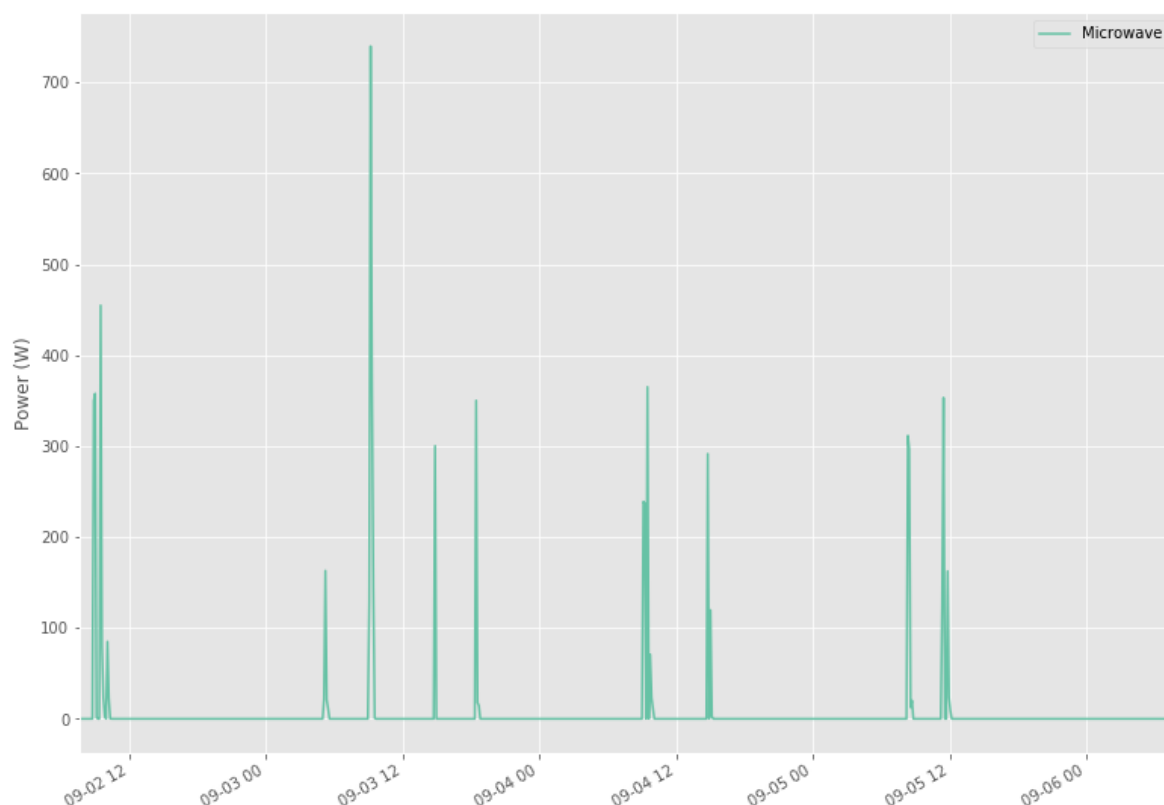
physical_quantity	voltage	power	power factor	power	current
type		apparent	active	reactive	
2021-09-02 07:47:51-03:00	221.882004	0.0	0.0	0.0	0.0
2021-09-02 07:47:56-03:00	221.882004	0.0	0.0	0.0	0.0
2021-09-02 07:48:01-03:00	222.406006	0.0	0.0	0.0	0.0
2021-09-02 07:48:06-03:00	222.143997	0.0	0.0	0.0	0.0
2021-09-02 07:48:11-03:00	221.621994	0.0	0.0	0.0	0.0

In [17]:

```
microwave.plot()
```

Out[17]:

&lt;matplotlib.axes.\_subplots.AxesSubplot at 0x7f667a10a910&gt;



A taxa de abandono é um número entre 0 e 1 que especifica a proporção de amostras ausentes. Uma taxa de abandono de 0 significa que nenhuma amostra está faltando. Um valor de 1 significaria que todas as amostras estão faltando

In [18]:

```
microwave.dropout_rate()
```

Out[18]:

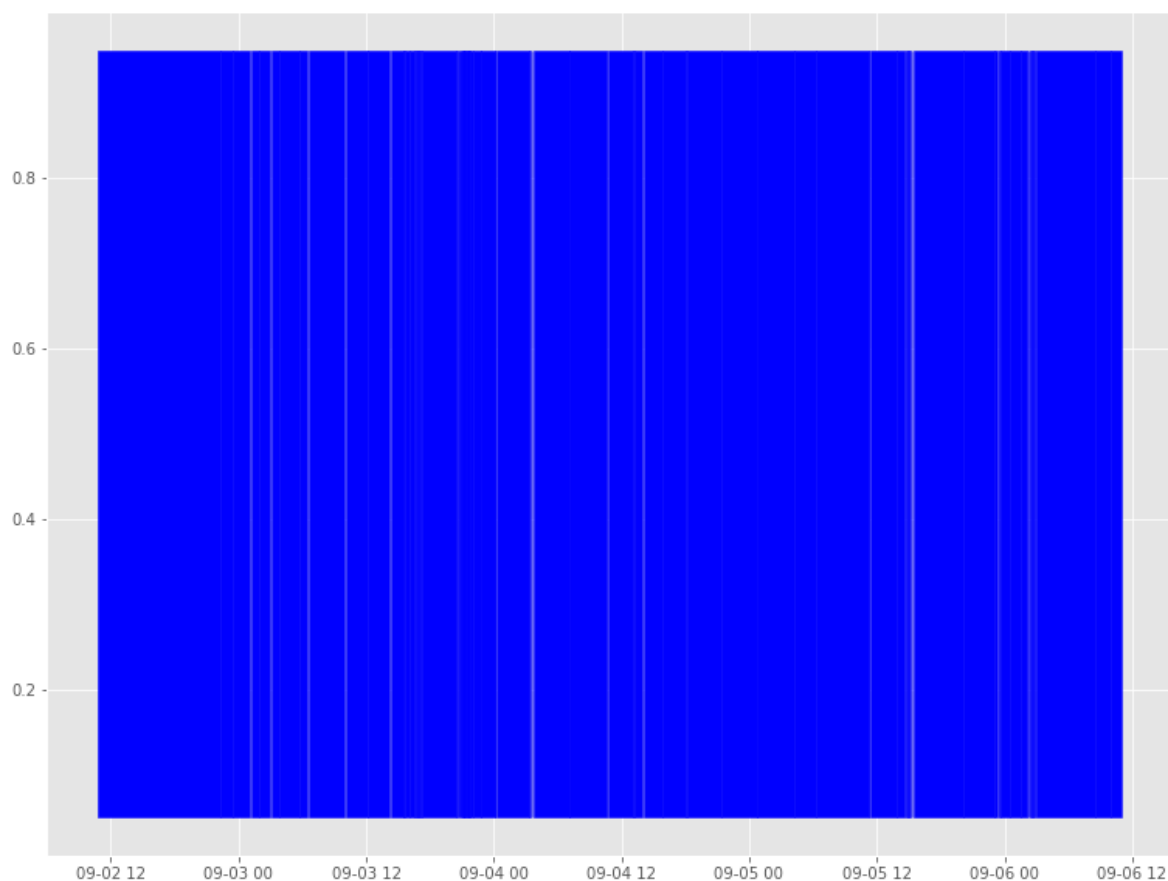
0.001913041828182637

In [19]:

```
good_sections = microwave.good_sections(full_results=True)  
good_sections.plot()
```

Out[19]:

<matplotlib.axes.\_subplots.AxesSubplot at 0x7f66785fc890>



In [20]:

```
good_sections.combined()
```

Out[20]:

```
[TimeFrame(start='2021-09-02 07:47:51-03:00', end='2021-09-02 19:17:21-03:00', empty=False),
 TimeFrame(start='2021-09-02 19:20:01-03:00', end='2021-09-02 20:25:21-03:00', empty=False),
 TimeFrame(start='2021-09-02 20:26:06-03:00', end='2021-09-02 22:07:21-03:00', empty=False),
 TimeFrame(start='2021-09-02 22:07:56-03:00', end='2021-09-02 22:59:11-03:00', empty=False),
 TimeFrame(start='2021-09-02 23:00:03-03:00', end='2021-09-03 00:01:28-03:00', empty=False),
 TimeFrame(start='2021-09-03 00:05:58-03:00', end='2021-09-03 00:51:43-03:00', empty=False),
 TimeFrame(start='2021-09-03 00:53:23-03:00', end='2021-09-03 02:39:33-03:00', empty=False),
 TimeFrame(start='2021-09-03 02:40:18-03:00', end='2021-09-03 03:30:48-03:00', empty=False),
 TimeFrame(start='2021-09-03 03:33:08-03:00', end='2021-09-03 07:00:39-03:00', empty=False),
 TimeFrame(start='2021-09-03 07:02:10-03:00', end='2021-09-03 09:10:29-03:00', empty=False),
 TimeFrame(start='2021-09-03 09:11:09-03:00', end='2021-09-03 11:13:15-03:00', empty=False),
 TimeFrame(start='2021-09-03 11:15:39-03:00', end='2021-09-03 12:31:03-03:00', empty=False),
 TimeFrame(start='2021-09-03 12:31:49-03:00', end='2021-09-03 12:32:03-03:00', empty=False),
 TimeFrame(start='2021-09-03 12:32:49-03:00', end='2021-09-03 12:39:04-03:00', empty=False),
 TimeFrame(start='2021-09-03 12:40:29-03:00', end='2021-09-03 13:05:33-03:00', empty=False),
 TimeFrame(start='2021-09-03 13:06:09-03:00', end='2021-09-03 13:28:08-03:00', empty=False),
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 TimeFrame(start='2021-09-03 13:40:58-03:00', end='2021-09-03 13:49:08-03:00', empty=False),
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 TimeFrame(start='2021-09-03 13:56:54-03:00', end='2021-09-03 14:00:33-03:00', empty=False),
 TimeFrame(start='2021-09-03 14:01:13-03:00', end='2021-09-03 14:05:53-03:00', empty=False),
 TimeFrame(start='2021-09-03 14:07:48-03:00', end='2021-09-03 14:13:28-03:00', empty=False),
 TimeFrame(start='2021-09-03 14:15:29-03:00', end='2021-09-03 17:29:05-03:00', empty=False),
 TimeFrame(start='2021-09-03 17:30:14-03:00', end='2021-09-03 17:35:59-03:00', empty=False),
 TimeFrame(start='2021-09-03 17:37:57-03:00', end='2021-09-03 17:39:02-03:00', empty=False),
 TimeFrame(start='2021-09-03 17:40:12-03:00', end='2021-09-03 17:41:02-03:00', empty=False),
 TimeFrame(start='2021-09-03 17:42:52-03:00', end='2021-09-03 17:43:02-03:00', empty=False)]
```

```
-03:00', empty=False),
    TimeFrame(start='2021-09-03 17:44:12-03:00', end='2021-09-03 17:45:02
-03:00', empty=False),
    TimeFrame(start='2021-09-03 17:46:57-03:00', end='2021-09-03 17:47:07
-03:00', empty=False),
    TimeFrame(start='2021-09-03 17:49:02-03:00', end='2021-09-03 17:49:07
-03:00', empty=False),
    TimeFrame(start='2021-09-03 17:50:17-03:00', end='2021-09-03 17:51:07
-03:00', empty=False),
    TimeFrame(start='2021-09-03 17:52:17-03:00', end='2021-09-03 17:53:07
-03:00', empty=False),
    TimeFrame(start='2021-09-03 17:54:18-03:00', end='2021-09-03 17:55:07
-03:00', empty=False),
    TimeFrame(start='2021-09-03 17:55:47-03:00', end='2021-09-03 17:57:07
-03:00', empty=False),
    TimeFrame(start='2021-09-03 17:58:17-03:00', end='2021-09-03 17:59:07
-03:00', empty=False),
    TimeFrame(start='2021-09-03 18:00:17-03:00', end='2021-09-03 18:01:07
-03:00', empty=False),
    TimeFrame(start='2021-09-03 18:01:47-03:00', end='2021-09-03 18:03:07
-03:00', empty=False),
    TimeFrame(start='2021-09-03 18:03:47-03:00', end='2021-09-03 18:05:07
-03:00', empty=False),
    TimeFrame(start='2021-09-03 18:05:47-03:00', end='2021-09-03 18:06:52
-03:00', empty=False),
    TimeFrame(start='2021-09-03 18:08:22-03:00', end='2021-09-03 18:09:07
-03:00', empty=False),
    TimeFrame(start='2021-09-03 18:09:47-03:00', end='2021-09-03 18:10:12
-03:00', empty=False),
    TimeFrame(start='2021-09-03 18:10:52-03:00', end='2021-09-03 18:11:07
-03:00', empty=False),
    TimeFrame(start='2021-09-03 18:12:17-03:00', end='2021-09-03 18:13:07
-03:00', empty=False),
    TimeFrame(start='2021-09-03 18:14:17-03:00', end='2021-09-03 18:15:07
-03:00', empty=False),
    TimeFrame(start='2021-09-03 18:16:17-03:00', end='2021-09-03 18:17:08
-03:00', empty=False),
    TimeFrame(start='2021-09-03 18:18:17-03:00', end='2021-09-03 18:19:07
-03:00', empty=False),
    TimeFrame(start='2021-09-03 18:20:17-03:00', end='2021-09-03 18:21:07
-03:00', empty=False),
    TimeFrame(start='2021-09-03 18:22:17-03:00', end='2021-09-03 18:23:07
-03:00', empty=False),
    TimeFrame(start='2021-09-03 18:24:17-03:00', end='2021-09-03 18:25:07
-03:00', empty=False),
    TimeFrame(start='2021-09-03 18:26:17-03:00', end='2021-09-03 18:27:07
-03:00', empty=False),
    TimeFrame(start='2021-09-03 18:28:17-03:00', end='2021-09-03 18:29:07
-03:00', empty=False),
    TimeFrame(start='2021-09-03 18:30:17-03:00', end='2021-09-03 18:31:07
-03:00', empty=False),
    TimeFrame(start='2021-09-03 18:31:47-03:00', end='2021-09-03 18:33:07
-03:00', empty=False),
    TimeFrame(start='2021-09-03 18:33:47-03:00', end='2021-09-03 18:35:07
-03:00', empty=False),
    TimeFrame(start='2021-09-03 18:37:02-03:00', end='2021-09-03 18:37:07
-03:00', empty=False),
    TimeFrame(start='2021-09-03 18:37:47-03:00', end='2021-09-03 18:39:07
-03:00', empty=False),
    TimeFrame(start='2021-09-03 18:40:57-03:00', end='2021-09-03 18:44:08
-03:00', empty=False),
```



```
TimeFrame(start='2021-09-03 18:44:48-03:00', end='2021-09-03 18:45:07-03:00', empty=False),
TimeFrame(start='2021-09-03 18:47:53-03:00', end='2021-09-03 19:05:41-03:00', empty=False),
TimeFrame(start='2021-09-03 19:06:21-03:00', end='2021-09-03 19:43:06-03:00', empty=False),
TimeFrame(start='2021-09-03 19:43:52-03:00', end='2021-09-03 19:47:36-03:00', empty=False),
TimeFrame(start='2021-09-03 19:48:41-03:00', end='2021-09-03 21:04:57-03:00', empty=False),
TimeFrame(start='2021-09-03 21:05:42-03:00', end='2021-09-03 21:07:08-03:00', empty=False),
TimeFrame(start='2021-09-03 21:07:47-03:00', end='2021-09-03 21:07:52-03:00', empty=False),
TimeFrame(start='2021-09-03 21:08:47-03:00', end='2021-09-03 21:09:47-03:00', empty=False),
TimeFrame(start='2021-09-03 21:12:07-03:00', end='2021-09-04 00:19:02-03:00', empty=False),
TimeFrame(start='2021-09-04 00:19:57-03:00', end='2021-09-04 00:30:42-03:00', empty=False),
TimeFrame(start='2021-09-04 00:31:22-03:00', end='2021-09-04 00:38:07-03:00', empty=False),
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-03:00', empty=False),
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-03:00', empty=False),
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-03:00', empty=False),
    TimeFrame(start='2021-09-05 23:20:38-03:00', end='2021-09-05 23:23:23
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    TimeFrame(start='2021-09-05 23:54:49-03:00', end='2021-09-05 23:57:19
-03:00', empty=False),
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-03:00', empty=False),
    TimeFrame(start='2021-09-06 07:02:09-03:00', end='2021-09-06 07:55:59
-03:00', empty=False)]
```

**Ventilador**

In [21]:

```
fan = elec['fan']
#microwave.available_columns()
next(fan.load()).head()
```

Out[21]:

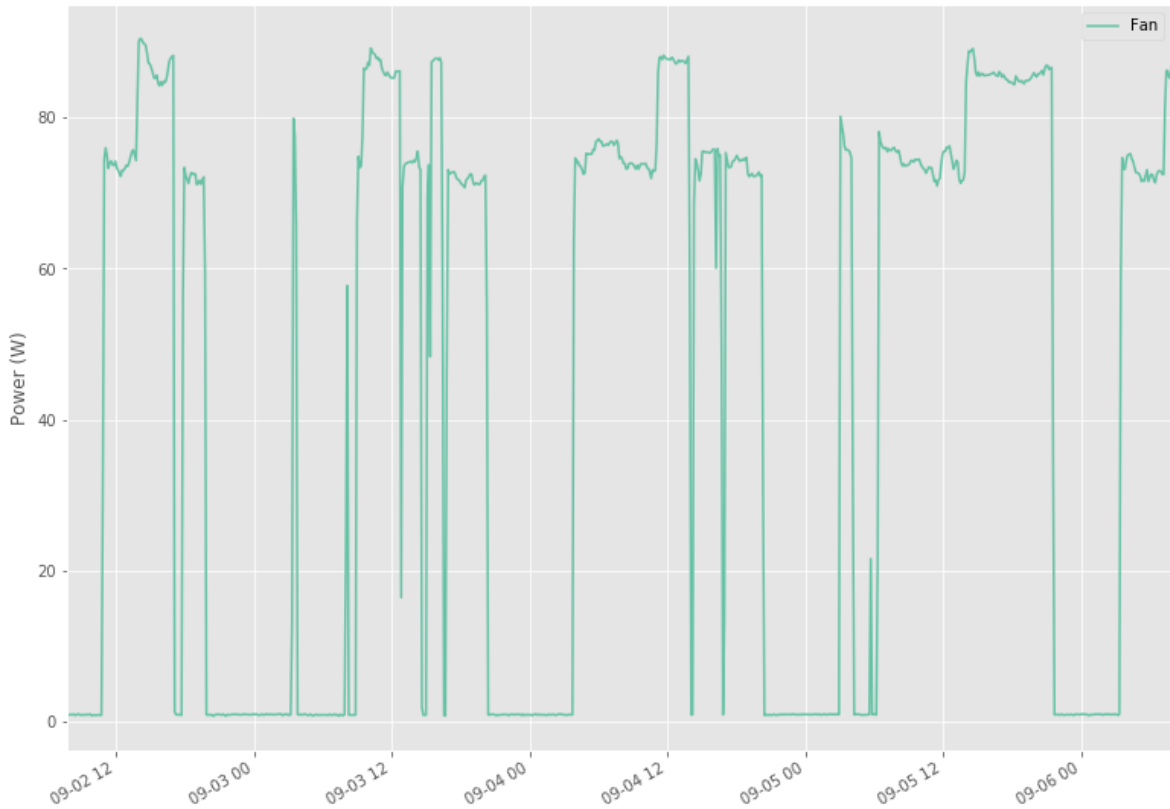
physical_quantity	voltage	power	power factor	power	current	
type		apparent	active		reactive	
2021-09-02 07:47:51-03:00	222.287003	18.454000	0.767	0.04	18.400000	0.083
2021-09-02 07:47:56-03:00	222.546997	31.761999	1.091	0.03	31.700001	0.143
2021-09-02 07:48:01-03:00	222.028000	20.479000	1.091	0.05	20.400000	0.092
2021-09-02 07:48:06-03:00	222.287003	31.187000	0.923	0.03	31.200001	0.140
2021-09-02 07:48:11-03:00	221.770004	23.195999	0.923	0.04	23.200001	0.105

In [22]:

```
fan.plot()
```

Out[22]:

<matplotlib.axes.\_subplots.AxesSubplot at 0x7f667845a050>

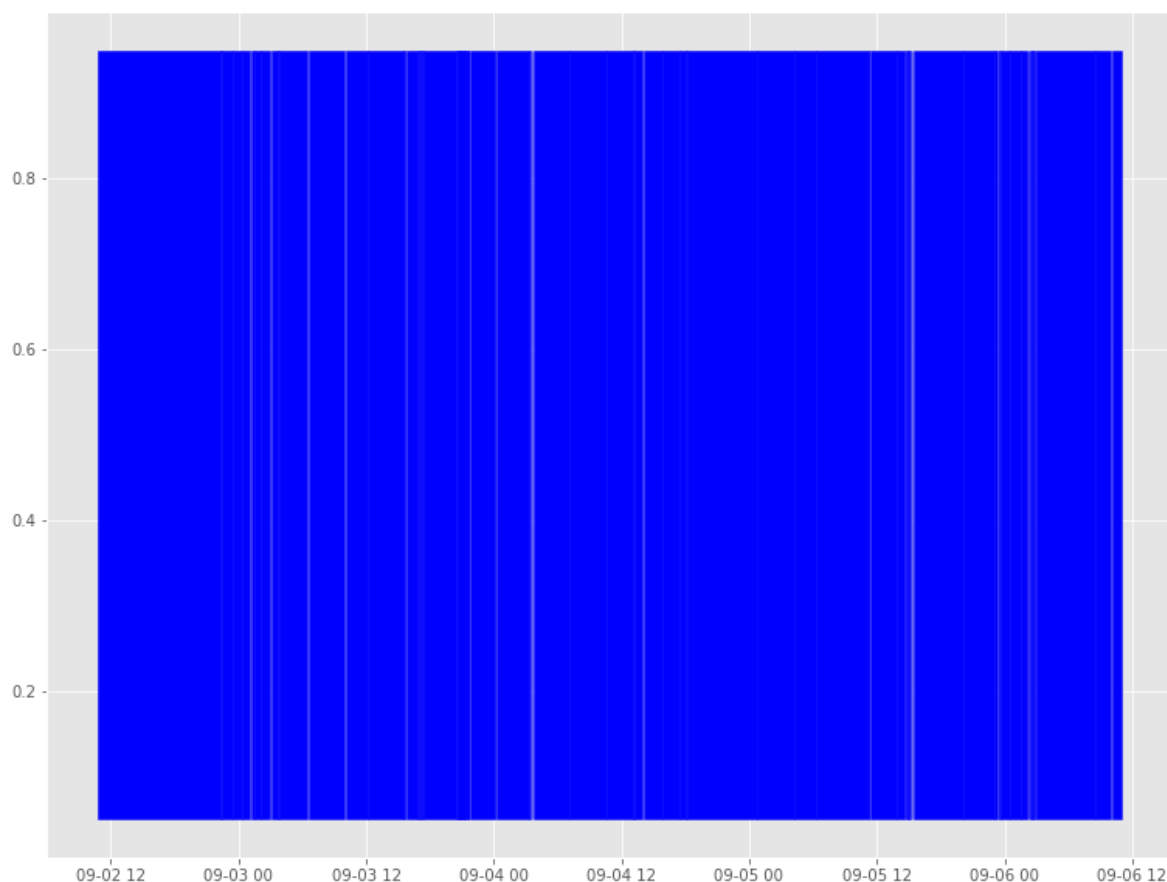


In [23]:

```
good_sections = fan.good_sections(full_results=True)  
good_sections.plot()
```

Out[23]:

<matplotlib.axes.\_subplots.AxesSubplot at 0x7f66783d2910>



A taxa de abandono é um número entre 0 e 1 que especifica a proporção de amostras ausentes. Uma taxa de abandono de 0 significa que nenhuma amostra está faltando. Um valor de 1 significaria que todas as amostras estão faltando

In [24]:

```
fan.dropout_rate()
```

Out[24]:

0.002014694526278486

In [25]:

```
good_sections.combined()
```

Out[25]:

```
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-03:00', empty=False),
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```

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TimeFrame(start='2021-09-05 08:18:54-03:00', end='2021-09-05 10:48:09-03:00', empty=False),
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TimeFrame(start='2021-09-05 11:45:04-03:00', end='2021-09-05 11:48:49-03:00', empty=False),
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```

```
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-03:00', empty=False),
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-03:00', empty=False),
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-03:00', empty=False),
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-03:00', empty=False),
    TimeFrame(start='2021-09-05 23:49:00-03:00', end='2021-09-05 23:52:35
-03:00', empty=False),
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-03:00', empty=False),
    TimeFrame(start='2021-09-05 23:58:20-03:00', end='2021-09-06 05:30:44
-03:00', empty=False),
    TimeFrame(start='2021-09-06 05:33:59-03:00', end='2021-09-06 07:01:05
-03:00', empty=False),
    TimeFrame(start='2021-09-06 07:02:45-03:00', end='2021-09-06 07:56:00
-03:00', empty=False)]
```

## Autocorrelation Plot

In [26]:

```
# from pandas.plotting import autocorrelation_plot
# elec.mains().plot_autocorrelation();
```

## Dataframe de correlação dos aparelhos

In [27]:

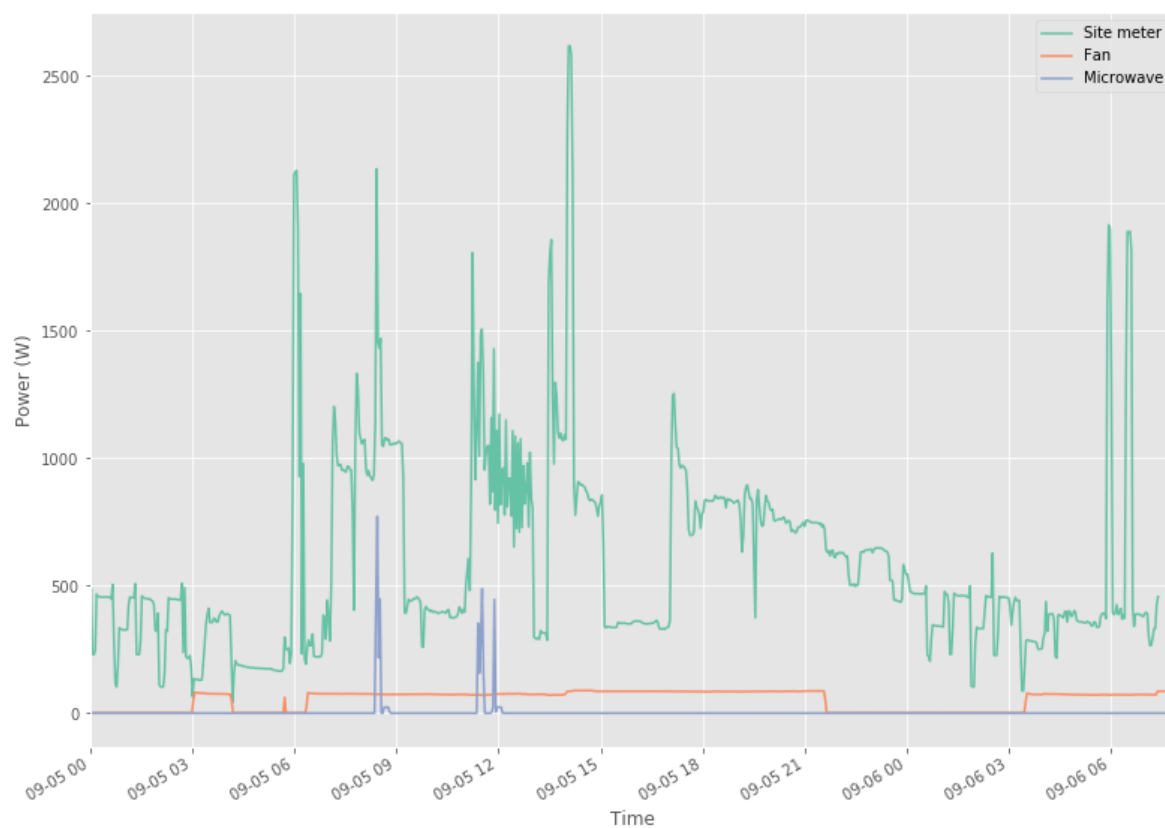
```
# correlation_df = elec.pairwise_correlation()
# correlation_df
```

## Traçar dados submedidos em um 1 dia



In [28]:

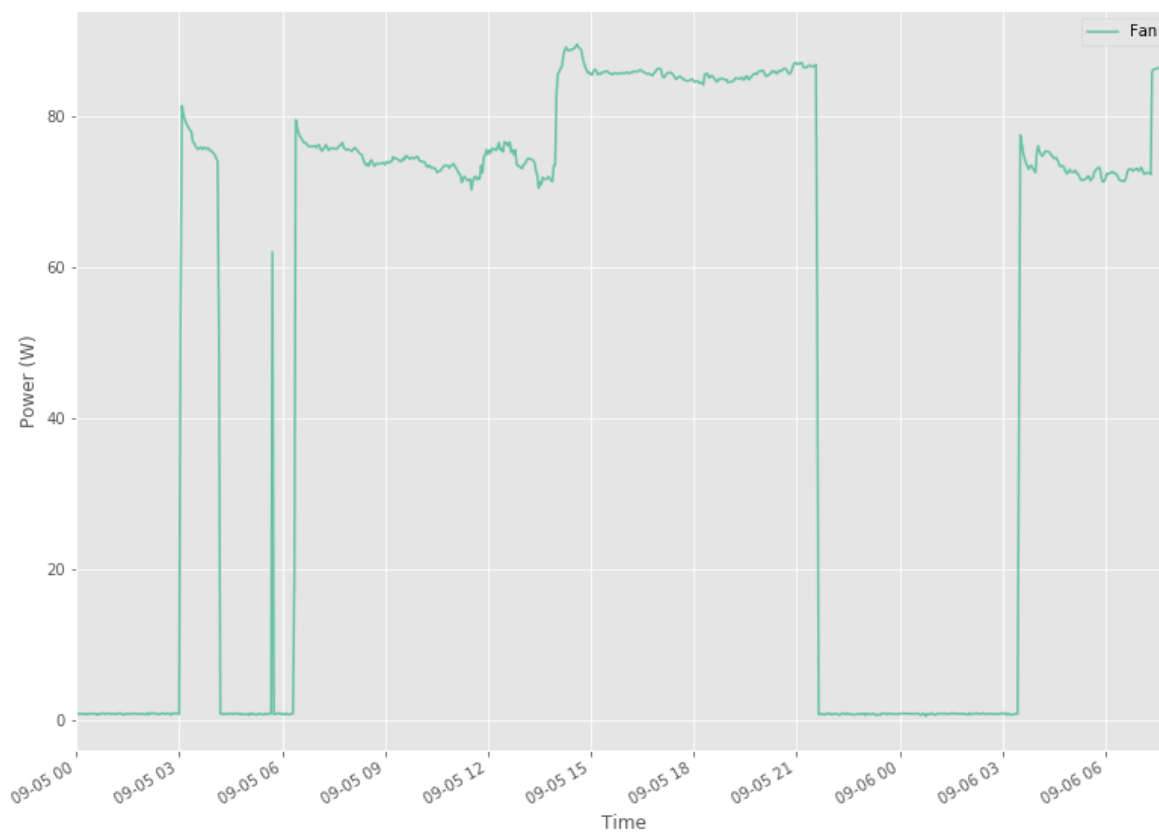
```
hb.set_window(start='2021-09-05', end='2021-09-07')  
elec.plot();  
plt.xlabel("Time");
```



In [29]:

```
# hb.set_window(start='2021-09-05 00:00:00', end='2021-09-06 23:59:59')
hb.set_window(start='2021-09-05', end='2021-09-07')

# elec['microwave'].plot()
elec['fan'].plot()
plt.xlabel("Time");
```



Importamos os algoritmos que desejamos executar os experimentos:

Mean: Mean Algorithm

Hart's Algorithm

CO: Combinatorial Optimization

Discriminative Sparse Coding

Additive Factorial Hidden Markov Model

Additive Factorial Hidden Markov Model with Signal Aggregate Constraints

DSC: Discriminative Sparse Coding

RNN: Long short-term memory - LSTM

DAE: Denoising Auto Encoder

Seq2Point\*

Seq2Seq

WindowGRU/Online GRU: Similar a LSTM, mas usa Gated Recurrent Unit (GRU)

ELM

In [2]:

```
from nilmtk.disaggregate import Mean, CO, Hart85
# from nilmtk_contrib.disaggregate import AFHMM, AFHMM_SAC, DSC, RNN, Seq2Point, Seq2Seq
from nilmtk_contrib.disaggregate import RNN, Seq2Point, Seq2Seq, WindowGRU
```

Using TensorFlow backend.

Em seguida, inserimos os valores para os diferentes parâmetros no dicionário. Como precisamos de vários aparelhos, inserimos os nomes de todos os aparelhos necessários no parâmetro 'appliances'.

Métricas: <https://github.com/nilmtk/nilmtk/blob/master/nilmtk/losses.py>.  
(<https://github.com/nilmtk/nilmtk/blob/master/nilmtk/losses.py>).

Error: <https://github.com/nilmtk/nilmtk-contrib/issues/56> (<https://github.com/nilmtk/nilmtk-contrib/issues/56>).

In [11]:

```

d = {
    'power': {
        'mains': ['active'],
        'appliance': ['apparent']
    },
    # 'mains': ['active', 'frequency', 'power factor', 'current', 'voltage'],
    # 'appliance': ['active', 'apparent', 'reactive', 'power factor', 'current', 'v
},
    'artificial_aggregate': False,
    'sample_rate': 5,
    'display_predictions': True,
    'appliances': ['microwave', 'fan'],
    'methods': {
        'Mean': Mean({}),
        'CO': CO({}),
        'Hart85': Hart85({}),
        'RNN': RNN({'n_epochs': 50, 'batch_size': 1024}),
        'Seq2Point': Seq2Point({'n_epochs': 50, 'batch_size': 1024}),
        'Seq2Seq': Seq2Seq({'n_epochs': 50, 'batch_size': 1024}),
        'WindowGRU': WindowGRU({'n_epochs': 30, 'batch_size': 1024})
    },
    'train': {
        'datasets': {
            'hb': {
                'path': 'teste17.h5',
                'buildings': {
                    1: {
                        'start_time': '2021-09-02',
                        'end_time': '2021-09-04'
                    }
                }
            }
        }
    },
    'test': {
        'datasets': {
            'hb': {
                'path': 'teste17.h5',
                'buildings': {
                    1: {
                        'start_time': '2021-09-05',
                        'end_time': '2021-09-07'
                    }
                }
            }
        }
    },
    'metrics': ['rmse', 'mae', 'relative_error', 'r2score', 'nde', 'nep', 'f1score']
}

```

raiz do erro quadrático médio (RMSE) e o erro médio absoluto (MAE)

Quanto menor o seu valor, melhor é o modelo, já que a previsão se mostra mais próxima ao valor real.

Comparando as duas métricas têm se que o RMSE penaliza desvios grandes, enquanto o MAE tem pesos iguais para todos os desvios.

We can observe the prediction vs. truth graphs in the above cell. The accuracy metrics can be accessed using the following commands:

In [12]:

api\_res = API(d)

Joint Testing for all algorithms

Loading data for hb dataset

Dropping missing values

Generating predictions for : Mean

Generating predictions for : C0

.....C0 disaggregate\_chunk running.....

Generating predictions for : Hart85ave'

Finding Edges, please wait ...

Edge detection complete.

Creating transition frame ...

Transition frame created.

Creating states frame ...

States frame created.

Finished.

Generating predictions for : RNN

Generating predictions for : Seq2Point

Generating predictions for : Seq2Seq

Generating predictions for : WindowGRU

	rmse				
	Mean	C0	Hart85	RNN	Seq2Point
Seq2Seq \					
microwave	75.115949	652.180214	320.255745	90.794464	75.997086
74.058798					
fan	37.900123	64.104072	74.820997	28.767712	28.246002
26.304125					

	WindowGRU
microwave	75.727233
fan	29.800886

	mae				
	Mean	C0	Hart85	RNN	Seq2Point
Seq2Seq \					
microwave	16.872429	397.170288	100.987816	16.946432	6.496365
6.317146					
fan	37.287132	48.720425	64.062813	22.901848	22.636448
20.133600					

	WindowGRU
microwave	7.985390
fan	22.876396

	relative_error					
	Mean	C0	Hart85	RNN	Seq2Point	Seq
2Seq \						
microwave	1.302848	0.948665	2.739608	2.624932	1.525452	2.22
2900						
fan	0.617993	25.188070	55.413353	0.419135	0.568237	0.36
8461						

	WindowGRU
microwave	1.562649
fan	0.458613

	r2score					
	Mean	C0	Hart85	RNN	Seq2Point	Seq
2Seq \						
microwave	-0.007559	-74.952354	-17.314701	-0.472057	-0.031335	0.02
0602						
fan	-0.156958	-2.309845	-3.509033	0.333428	0.357386	0.44

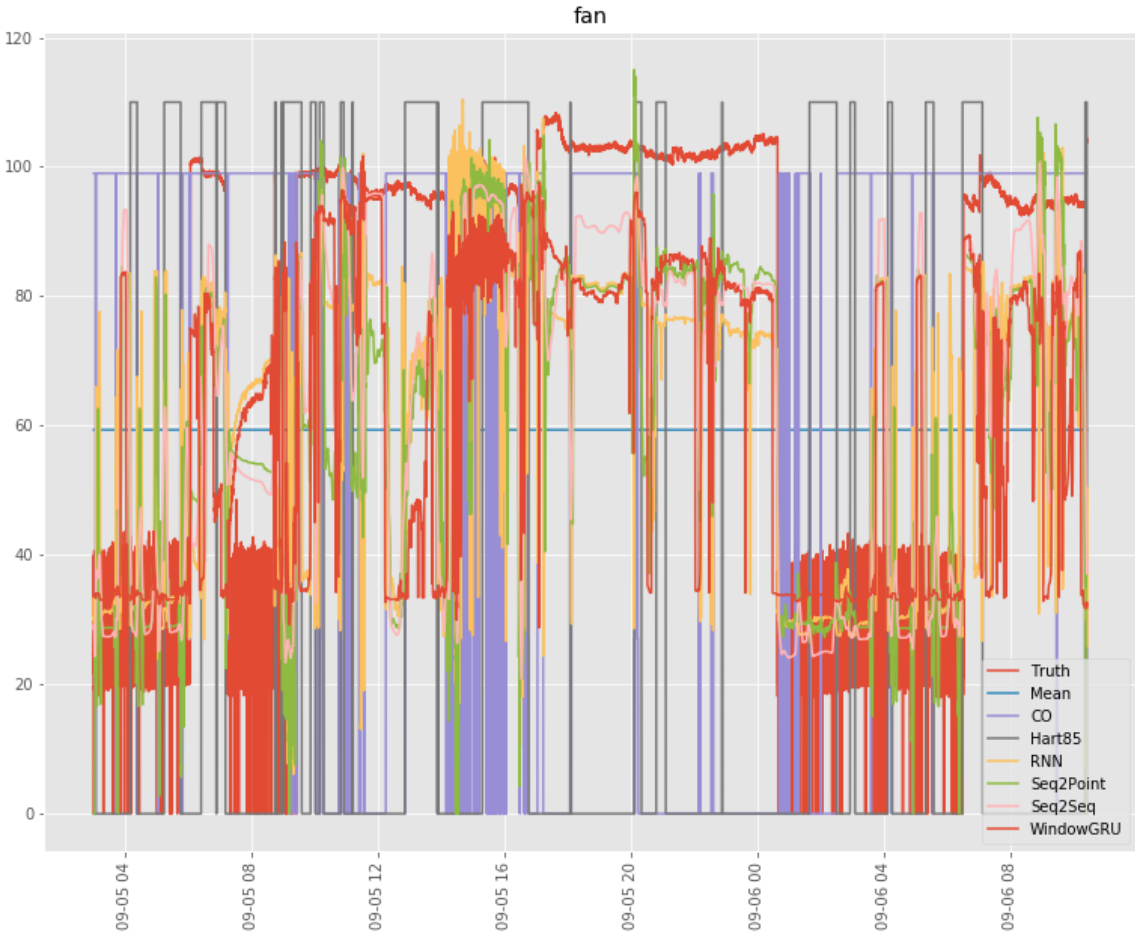
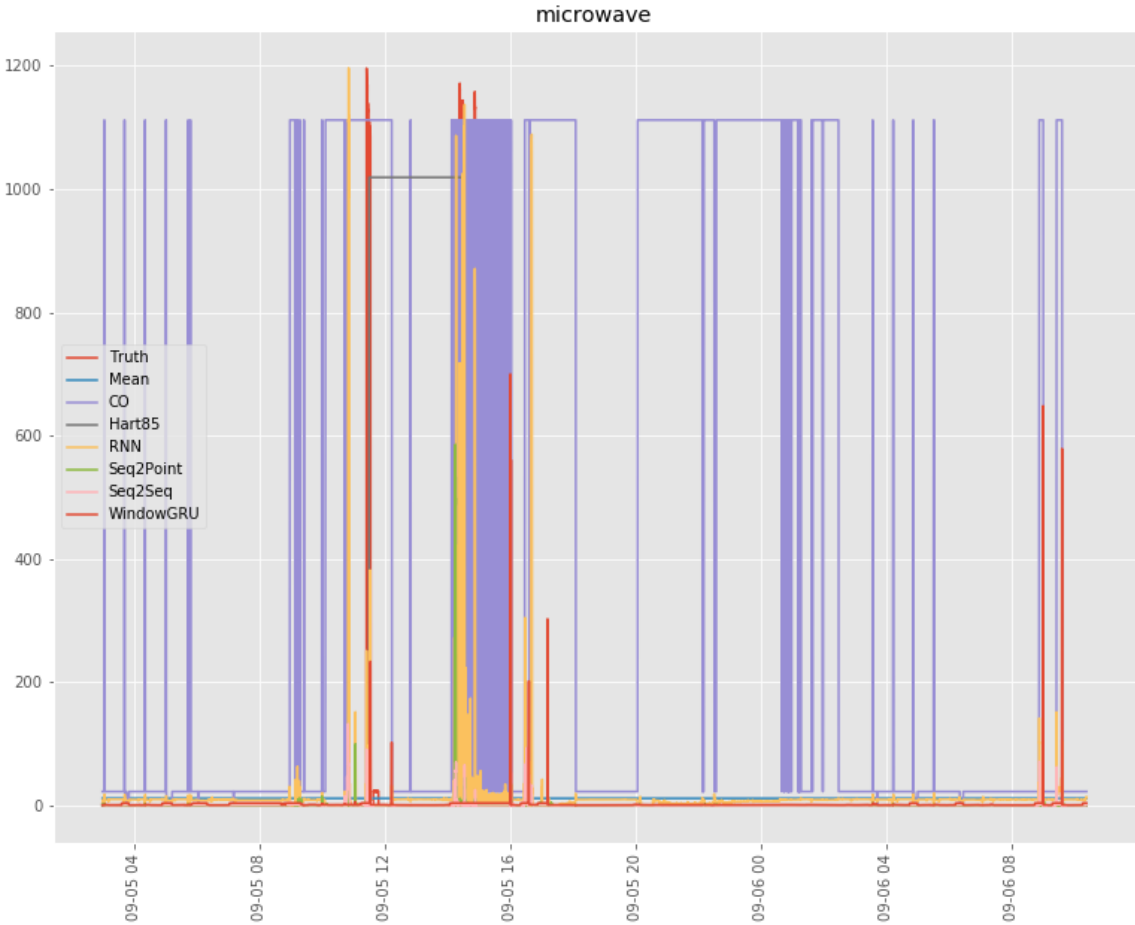
2706

	WindowGRU						
microwave	-0.024024						
fan	0.284689						
.....	nde	.....					
	Mean	C0	Hart85	RNN	Seq2Point	Seq2S	
eq \							
microwave	1.001126	8.692091	4.268286	1.210085	1.012870	0.9870	
37							
fan	0.466032	0.788244	0.920023	0.353737	0.347322	0.3234	
44							

	WindowGRU						
microwave	1.009273						
fan	0.366441						
.....	nep	.....					
	Mean	C0	Hart85	RNN	Seq2Point	Seq	
2Seq \							
microwave	3.099038	72.950119	18.548904	3.112630	1.193218	1.16	
0300							
fan	0.508723	0.664713	0.874035	0.312459	0.308838	0.27	
4691							

	WindowGRU						
microwave	1.466714						
fan	0.312112						
.....	flscore	.....					
	Mean	C0	Hart85	RNN	Seq2Point	Seq2S	
eq \							
microwave	0.041814	0.042490	0.197968	0.040739	0.083333	0.1330	
28							
fan	0.992823	0.831522	0.388553	0.992731	0.988951	0.9928	
23							

	WindowGRU	
microwave	0.030476	
fan	0.992823	





In [ ]:

In [ ]:

```
import numpy as np
import pandas as pd

vals = np.concatenate([np.expand_dims(df.values,axis=2) for df in api_res.errors],a

cols = api_res.errors[0].columns
indexes = api_res.errors[0].index

mean = np.mean(vals,axis=2)
std = np.std(vals,axis=2)
print ('\n\n')
print ("Mean")
print (pd.DataFrame(mean,index=indexes,columns=cols))
print ('\n\n')
print ("Standard Deviation")
print (pd.DataFrame(std,index=indexes,columns=cols))
```

In [ ]:

