# Possibilities of Submetering Analysis

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IOT Analytics

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### Agenda

#### Background

What is Submetering?
What are the Possibilities of Submetering for IOT?

#### Analysis

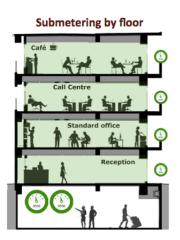
The Data
Basic Stats
Missing Data and Other Problems

Possible Applications
Predictive Analytics
Dashboards



### What is Submetering?







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This means that we can...

- 1. Make it easier to save energy by finding out what is actually using it
- 2. Pinpoint possible failure points fast and precisely
- 3. Easily gather data for future analysis



#### The Data

▶ Minute level readings from 3 submeters and overall energy usage between December 2006 and November 2010 in a house in Sceaux



Sceaux



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- ▶ Minute level readings from 3 submeters and overall energy usage between December 2006 and November 2010 in a house in Sceaux
- ➤ The three submeters cover the kitchen, the laundry room and the combination of the water-heater and air-conditioning



Sceaux



#### The Data

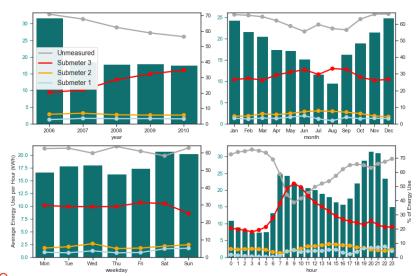
- ▶ Minute level readings from 3 submeters and overall energy usage between December 2006 and November 2010 in a house in Sceaux
- ► The three submeters cover the kitchen, the laundry room and the combination of the water-heater and air-conditioning
- ► Electricity use not covered by submeters can be calculated by deducting the submeter readings from overall electricity use



Sceaux



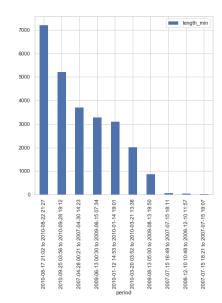
### **Basic Stats**





## Missing Data and Other Problems

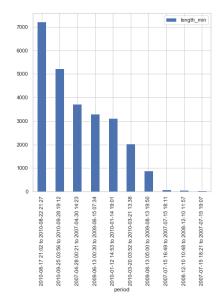
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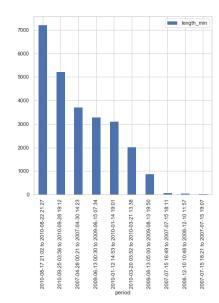
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  - Refrigerator is in the laundry room
  - ► Water heater and air-conditioner not separated





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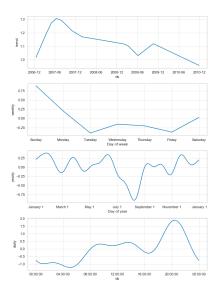
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- Grouping of submeters is based on room and not function
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- Electricity use not covered by submeters makes up over half of the energy consumption





### Predictive Analytics

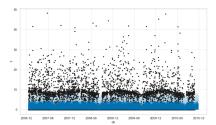
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### Predictive Analytics

- ► Multiple seasonal patterns easily modeled
- ► Minute level data impossible to model ⇒ have to aggregate
- ► Hourly level realistic in overall use and daily level in submeters

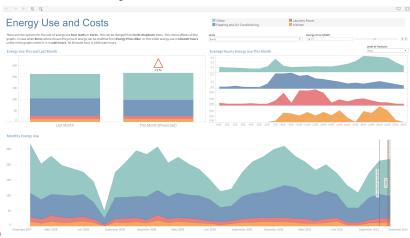


Submeter-level energy use has distinctive on/off states that are impossible to predict



#### Dashboards

▶ Dashboard for the breakdown of electricity use by period combined with predictions





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  - Submeter groupings should be more intuitive and grouped by use rather that location
  - ▶ What is the right number of submeters?



### The End

Questions?

