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

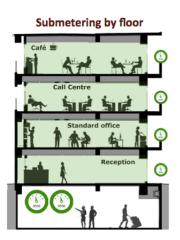
The Data
Basic Stats
Missing Data and Other Problems

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



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



Sceaux



The Data

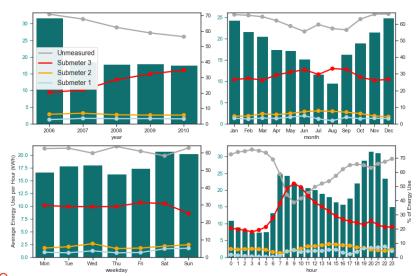
- ▶ Minute level readings from 3 submeters and overall energy usage between December 2006 and November 2010 in a house in Sceaux
- ► The three submeters cover the kitchen, the laundry room and the combination of the water-heater and air-conditioning
- ► Electricity use not covered by submeters can be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



Sceaux



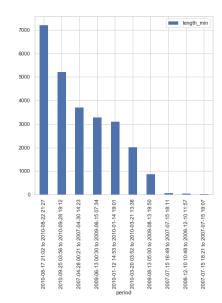
Basic Stats





Missing Data and Other Problems

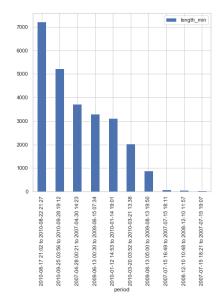
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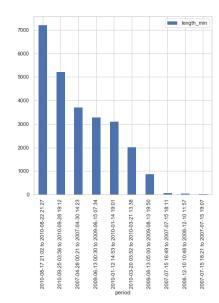
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 - Fixed with a predictive model
- Grouping of submeters is based on room and not function
 - Refrigerator is in the laundry room
 - ► Water heater and air-conditioner not separated





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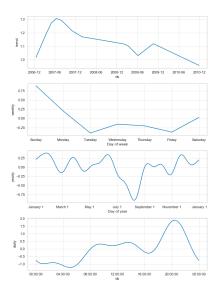
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 - Refrigerator is in the laundry room
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- Electricity use not covered by submeters makes up over half of the energy consumption





Predictive Analytics

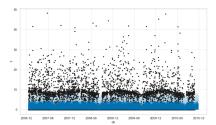
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Predictive Analytics

- ► 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

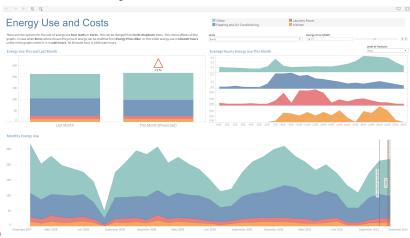


Submeter-level energy use has distinctive on/off states that are impossible to predict



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?

