

Aggregation of flexible domestic heat pumps for the provision of reserve in power systems

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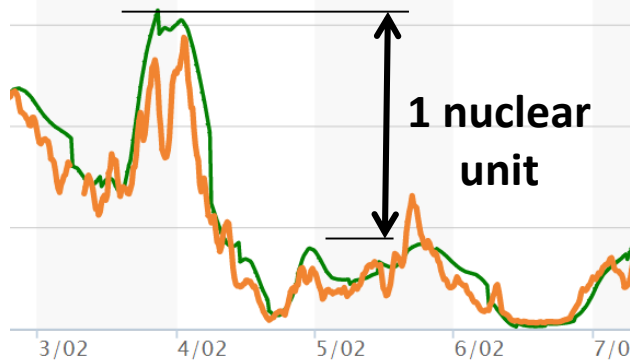
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 - Models of buildings and systems
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Introduction

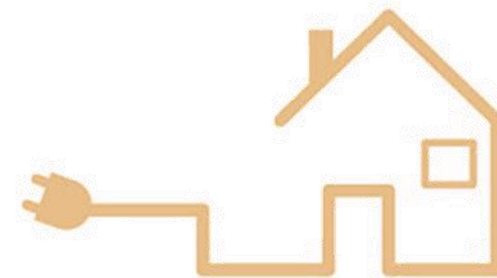
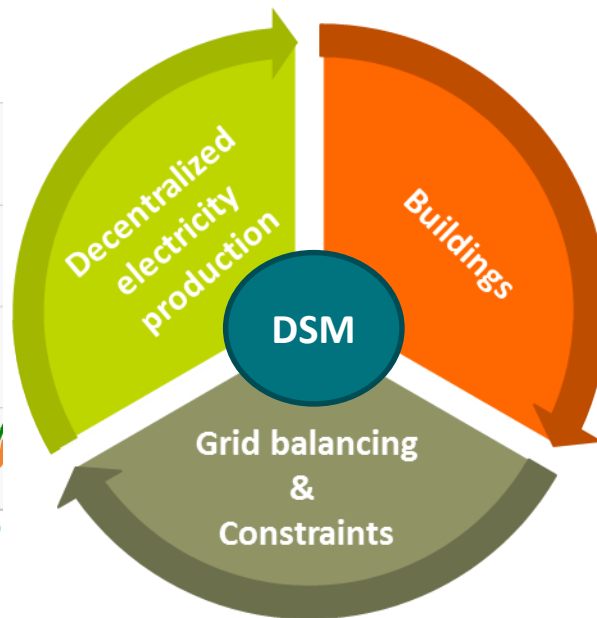
Weekly Belgian Wind-Power Forecasting

- Intermittent production



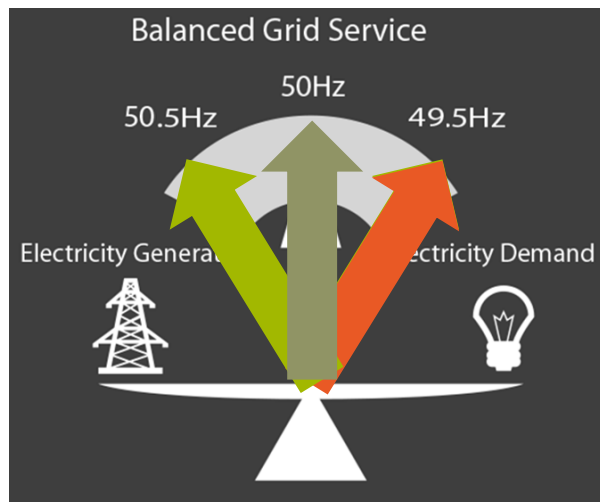
Time Horizon

(Source: Elia)



Electrification

- Heat pumps
- Electric vehicles
- Batteries



DSM = incentives to modify consumers' demand profiles
⇒ **Demand response**

Introduction

Grid balancing

Day - 1

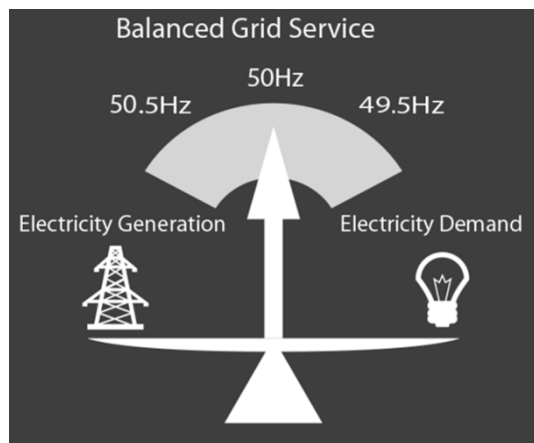
Day

Prediction:

If \sum power injections \neq \sum power intakes
 \Rightarrow Imbalance

Prediction uncertainty

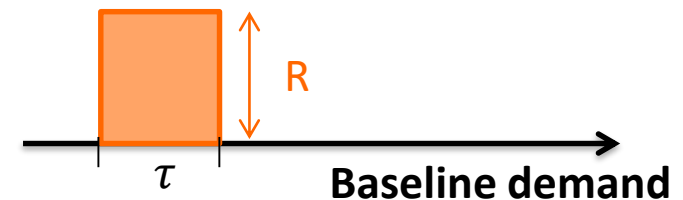
\Rightarrow System Imbalance



Ancillary services

Provision of power reserve

Power modulation



\Rightarrow With 40000 heat pumps, how much **reserve** can we provide?

\Rightarrow Reservation **cost**?

Introduction

Load aggregator

- gathers, pools and trades the flexibility of consumers
 - Residential houses with heat pumps
- to offer services to other market actors
 - Congestion
 - Balancing

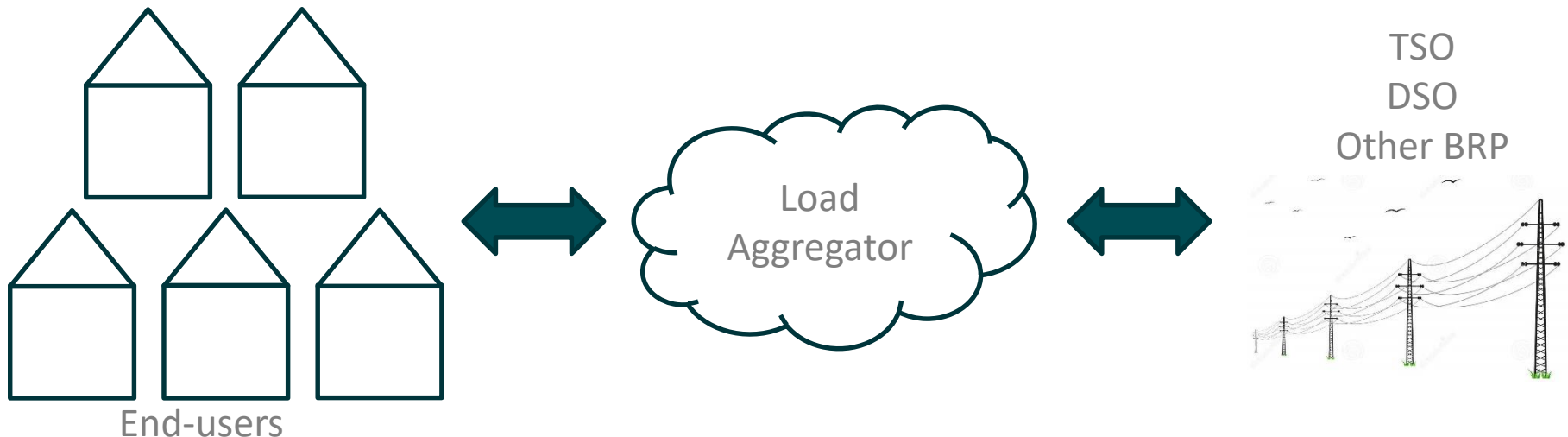


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Modeling framework

Buildings

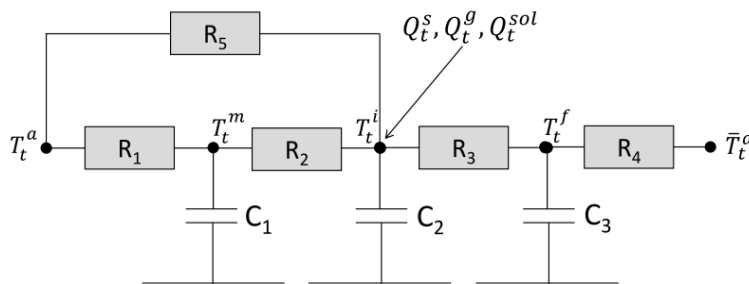
Detailed building models

- Modelica (Dymola)

System Identification

Reduced-order models

- Grey-box models



RC network

$$\begin{aligned}x_{t+1} &= Ax_t + Bu_t \\y_t &= Cx_t + Du_t\end{aligned}$$

where

- x is the vector of state variables
⇒ temperature nodes

- y is the zone temperature

- u gathers model inputs (heat input, internal heat gains, weather data,...)

- $A, B = f(C_i, R_i)$

$$\Rightarrow \min RMSE(y) = \sqrt{\frac{1}{n} \sum_t (y_t - T_t^z)^2}$$

Zone temperature

Modeling framework

Systems

Heat pump /



Empirical modeling of steady-state performance:

$$COP = f(T^{su}, T^{amb}, PLR)$$

for space-heating and DHW production

(manufacturer data)

Water tanks



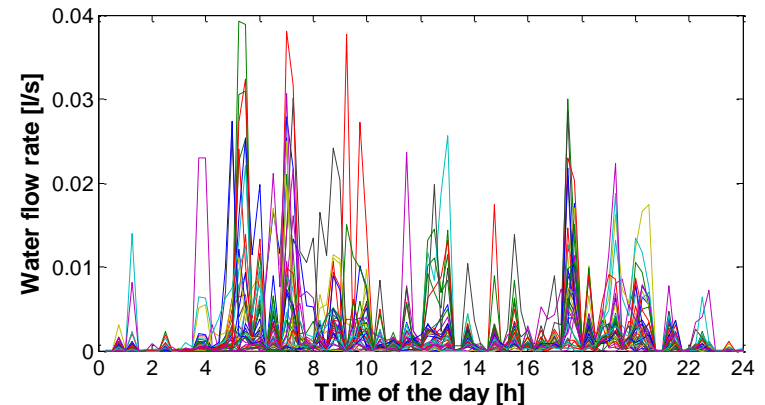
One-node water tank models:

$$\frac{CdT}{dt} = Q^h - AU(T - T^{surr}) - \dot{m}c_w(T - T^{w,mains})$$

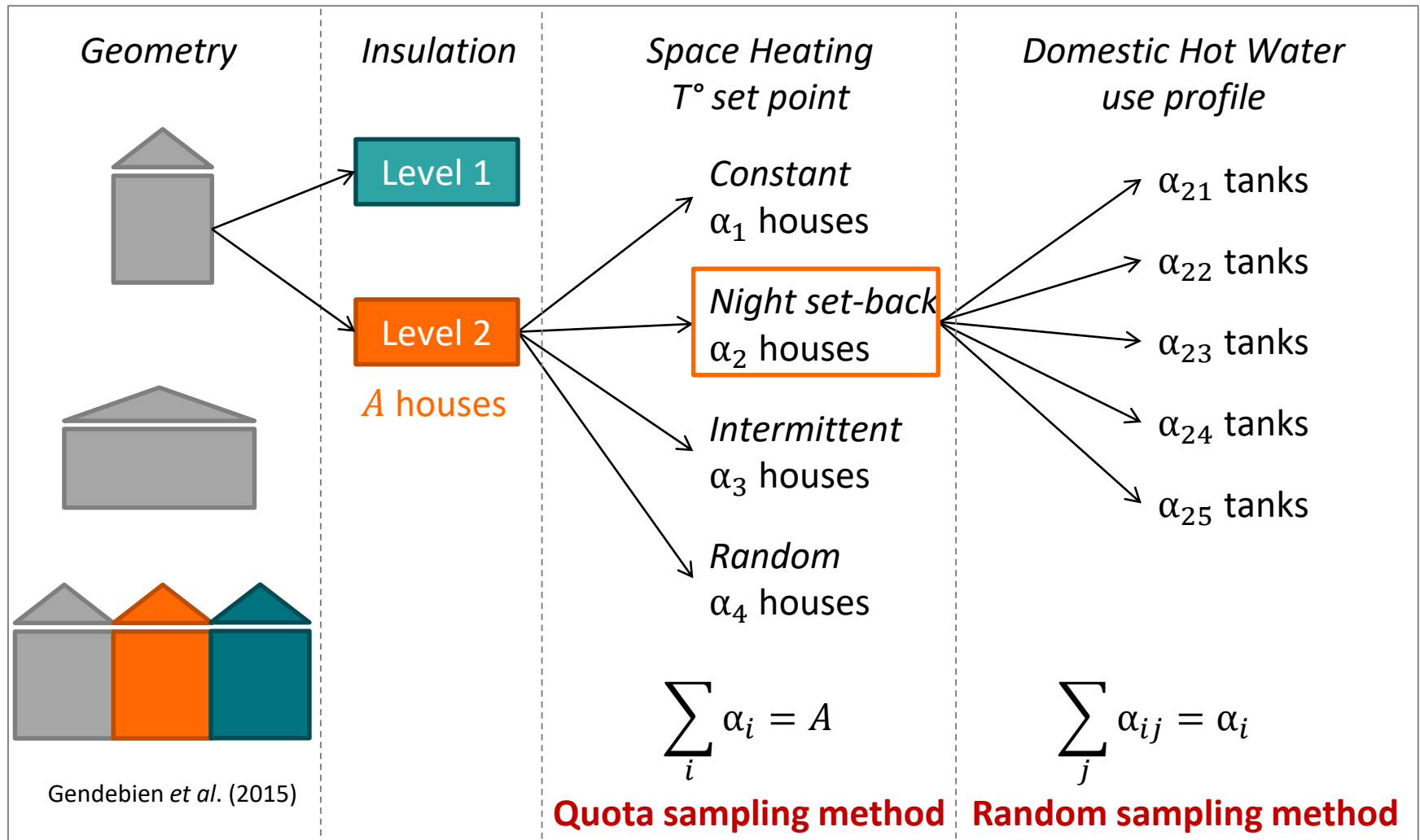
Occupants-related profiles

- Appliances and lighting use profiles
- Domestic hot water consumption profiles
- Zone temperature set point profiles

⇒ **Stochastic profiles**

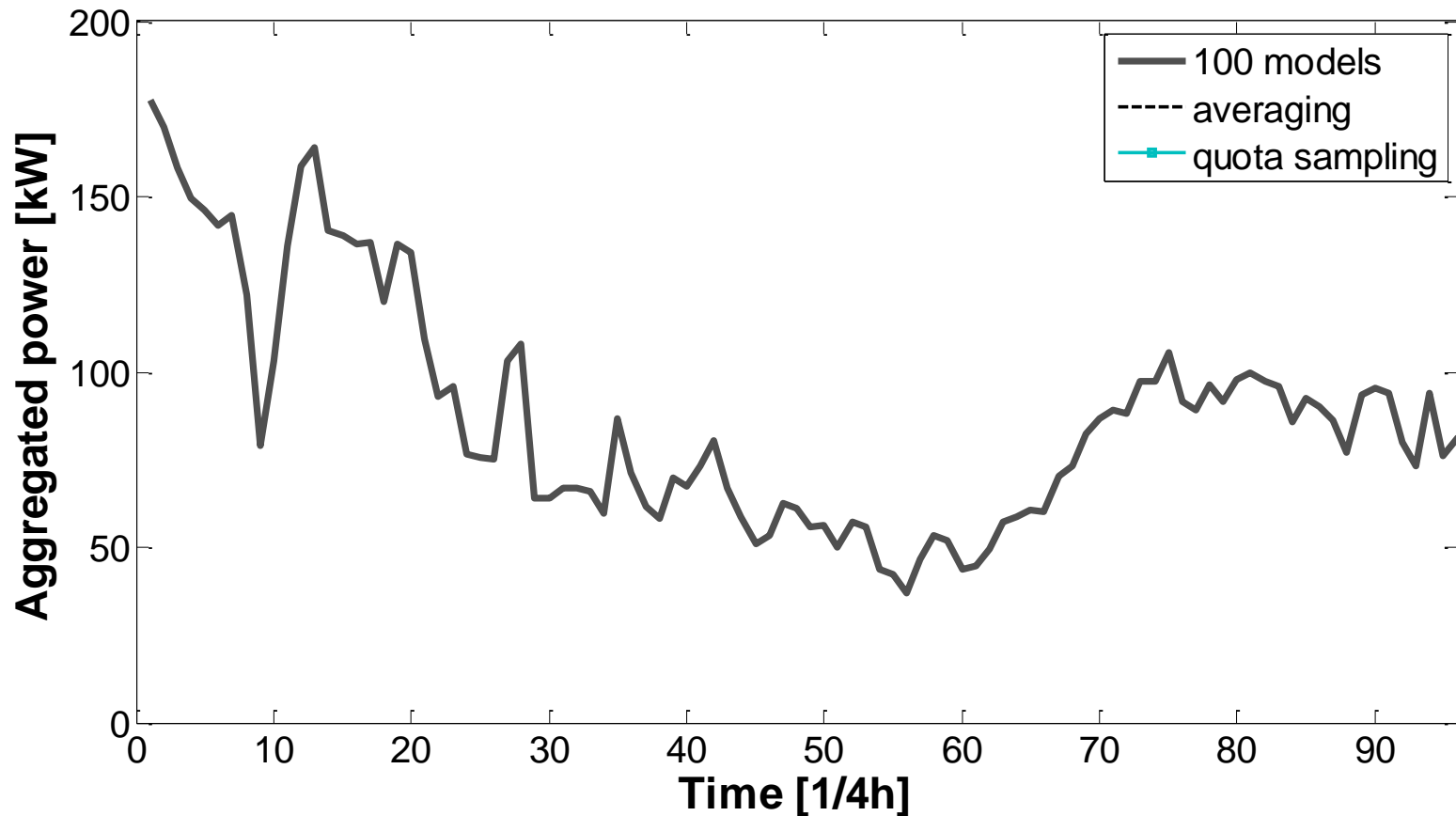


Load aggregation method



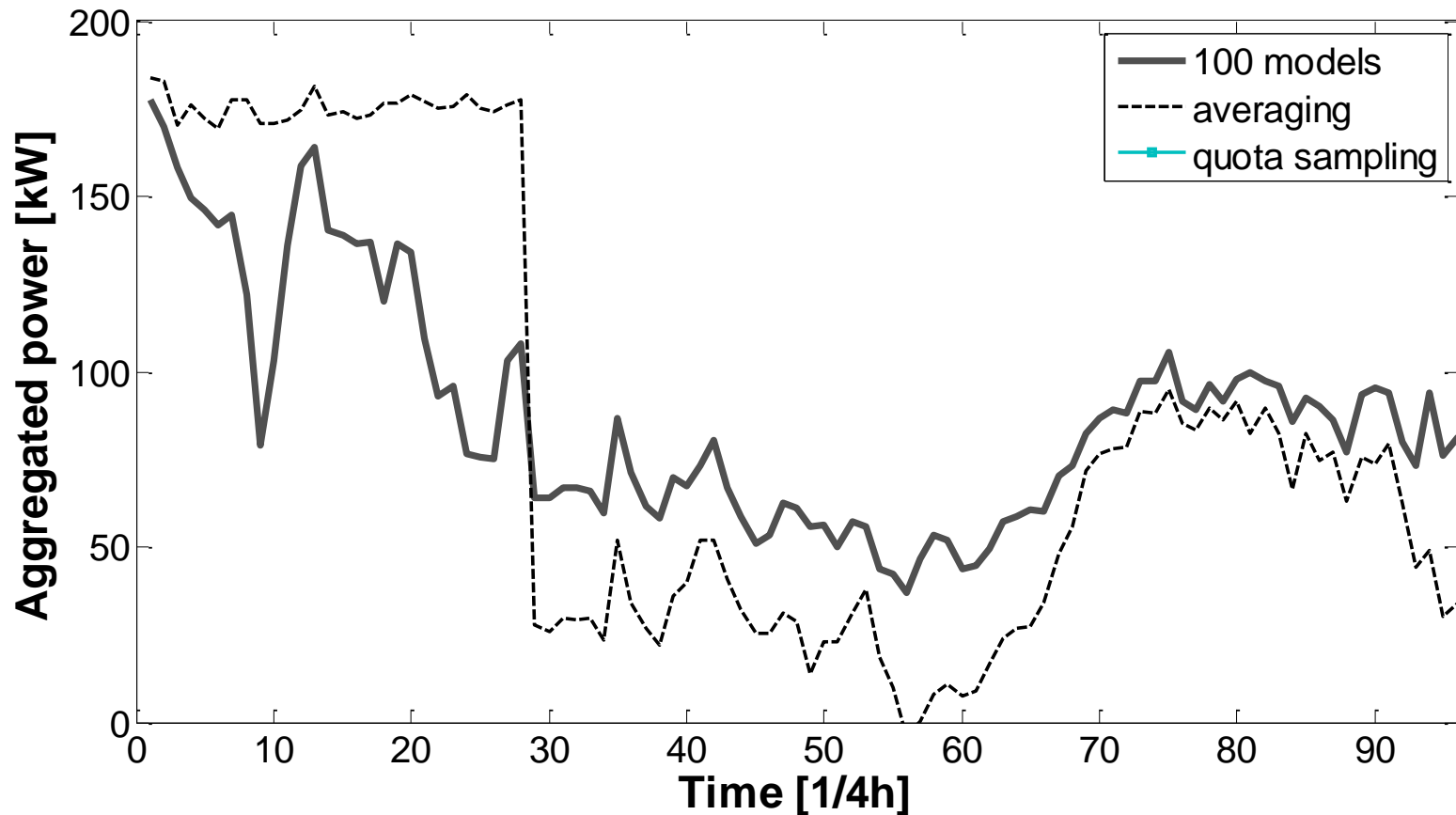
Load aggregation method

- Space-heating demand
 - Example: aggregation of 100 houses



Load aggregation method

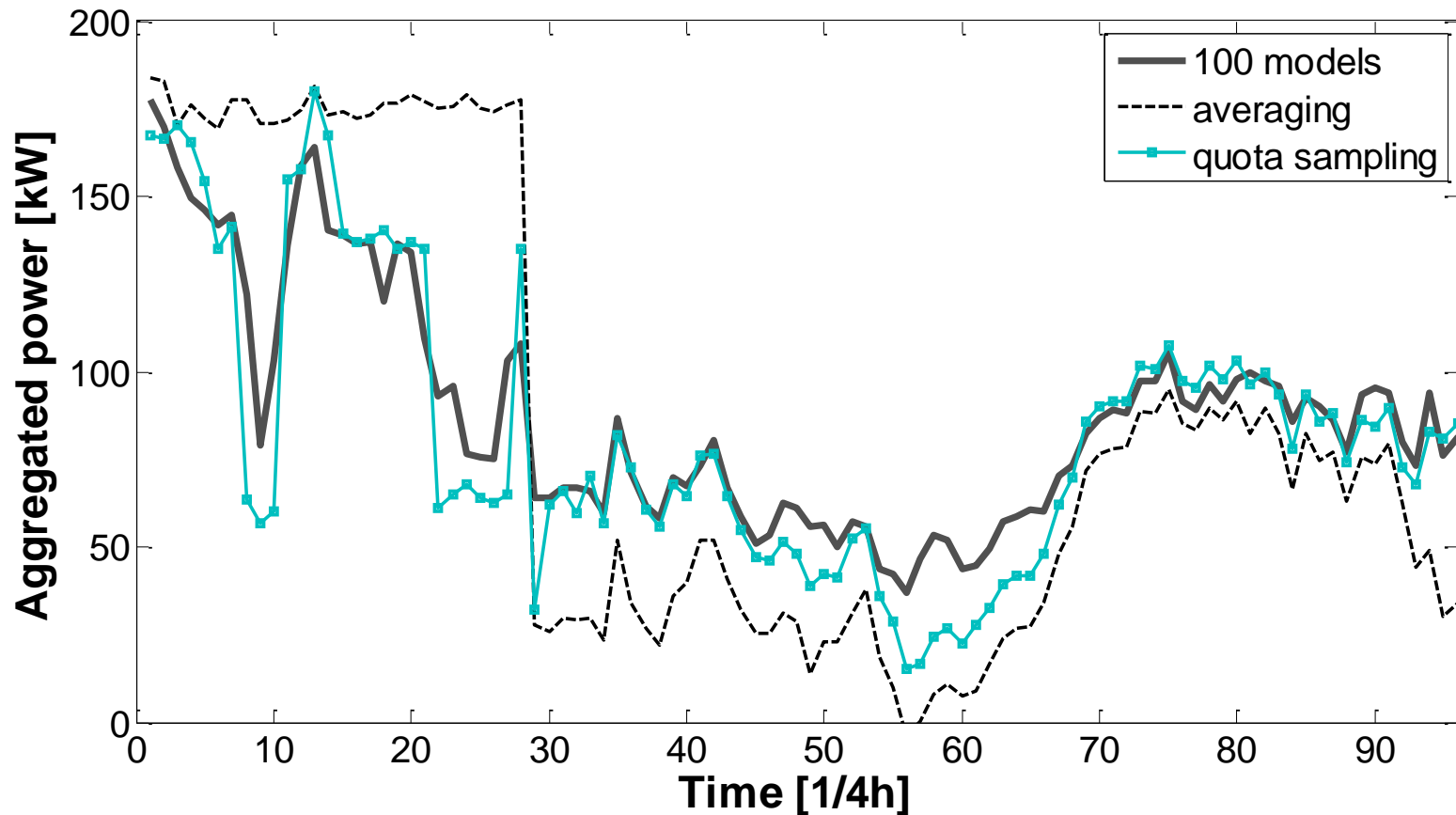
- Space-heating demand
 - Example: aggregation of 100 houses



With one aggregated model – error = **37%**

Load aggregation method

- Space-heating demand
 - Example: aggregation of 100 houses



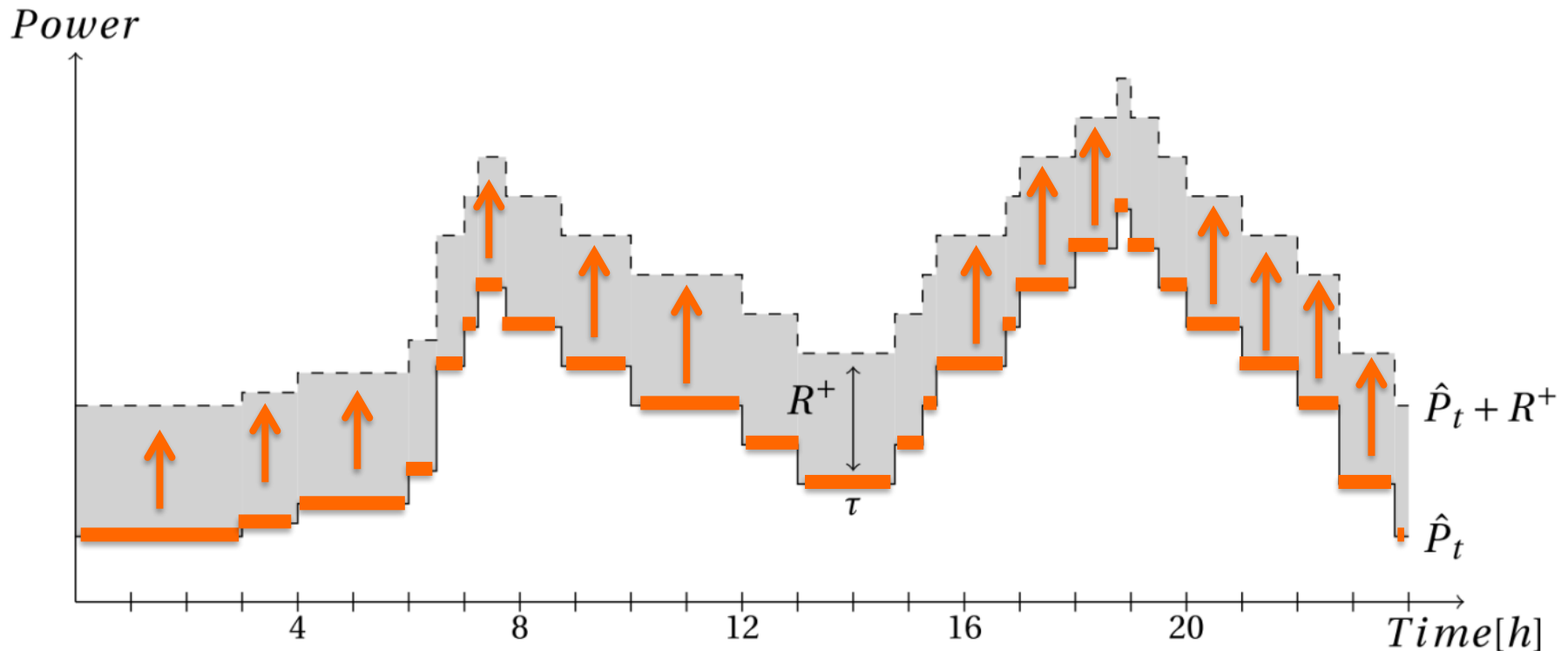
With four aggregated model – error = **12%**

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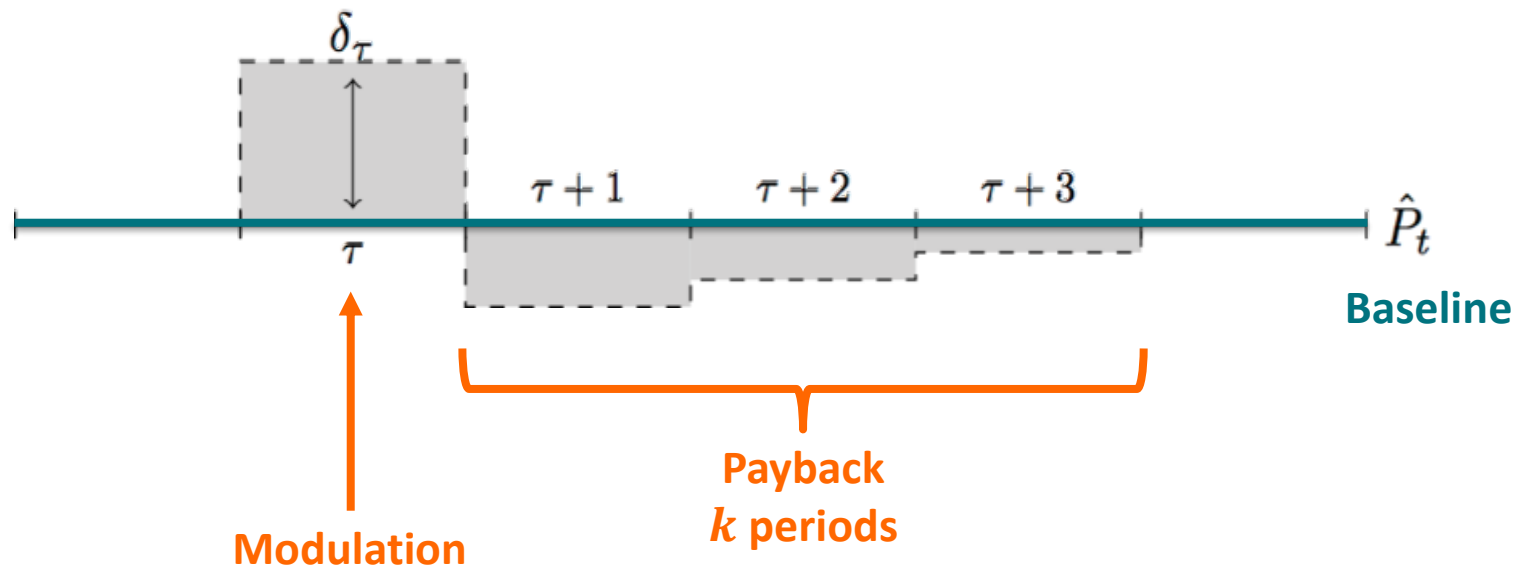
Provision of power reserve

- Problem statement:
 - Objective: pool flexible heat pumps to provide power reserve at every time period of the day



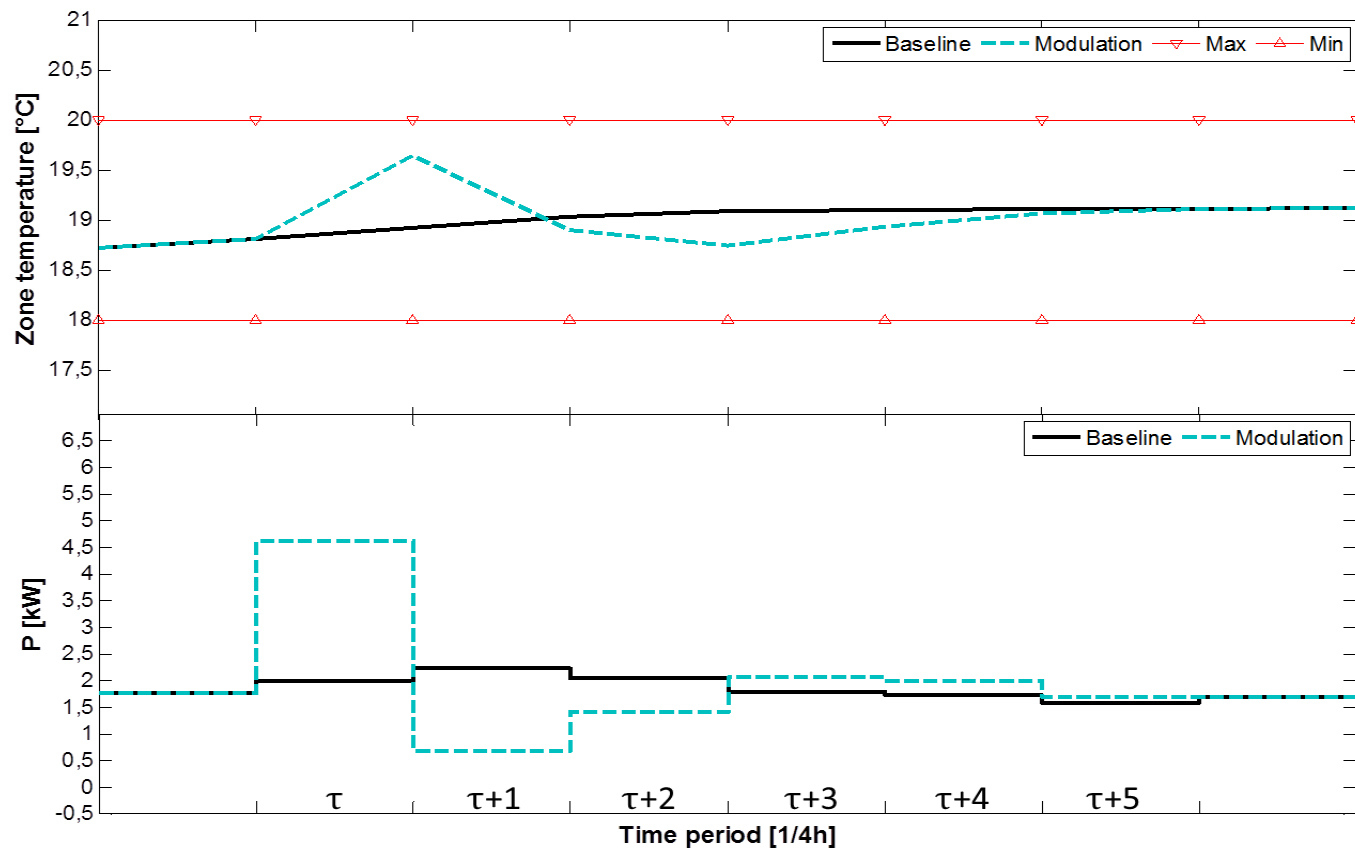
Provision of power reserve

- **payback period** to allow the system to **return to its baseline** after the power modulation
- At each time step τ :



Provision of power reserve

- τ **payback period** to allow the system to **return to its baseline** after the power modulation
- At each time step τ :



Provision of power reserve

- Problem statement:

CENTRALIZED OPTIMIZATION

minimize electricity costs on day-ahead market

$$\min \sum_t \left(\sum_i^{\# \text{ clusters}} P_{i,t} \alpha_i \right) \pi_t + \beta \sum_\tau \lambda_\tau$$

while providing a defined amount of power reserve:

$$\sum_i^{\# \text{ clusters}} \delta_\tau^i \alpha_i \geq R^+ (1 - \lambda_\tau)$$

while ensuring that any activation can be corrected within comfort limits:

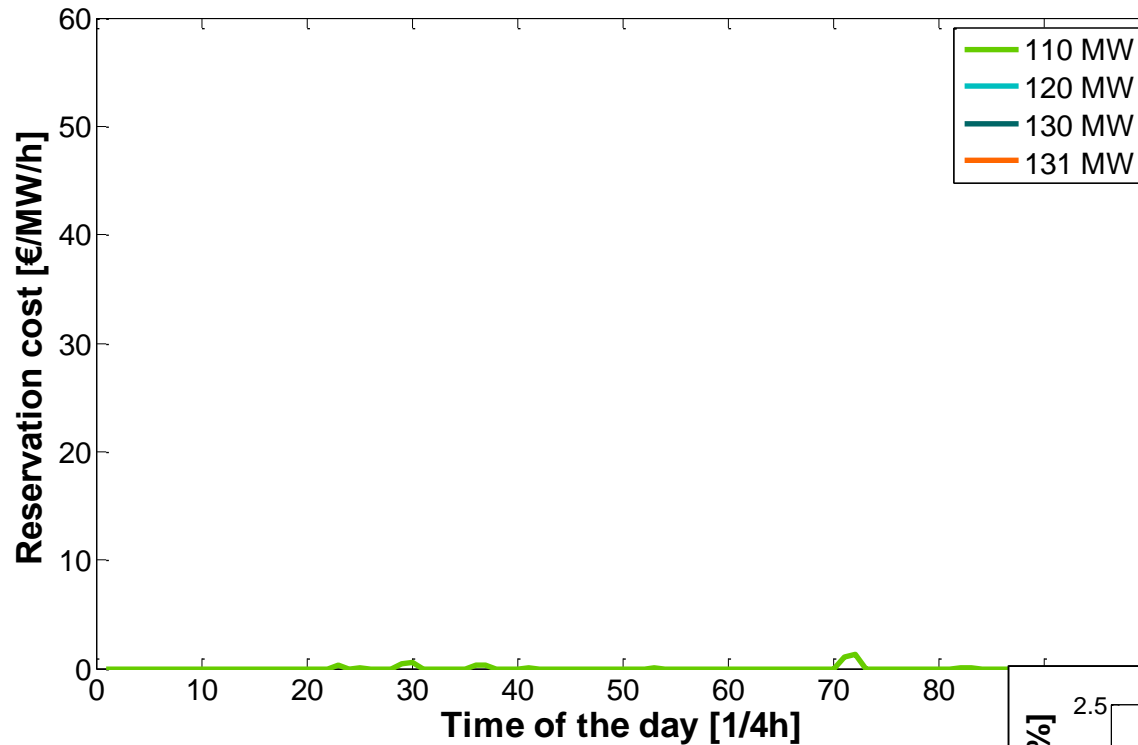
$$-\sigma \leq \hat{\mathbf{x}}_{i,\tau+k+1} - \mathbf{x}_{i,\tau,k+1} \leq \sigma$$

and under thermal comfort, power and energy limitation constraints

Reservation cost = opportunity cost due to the constraint

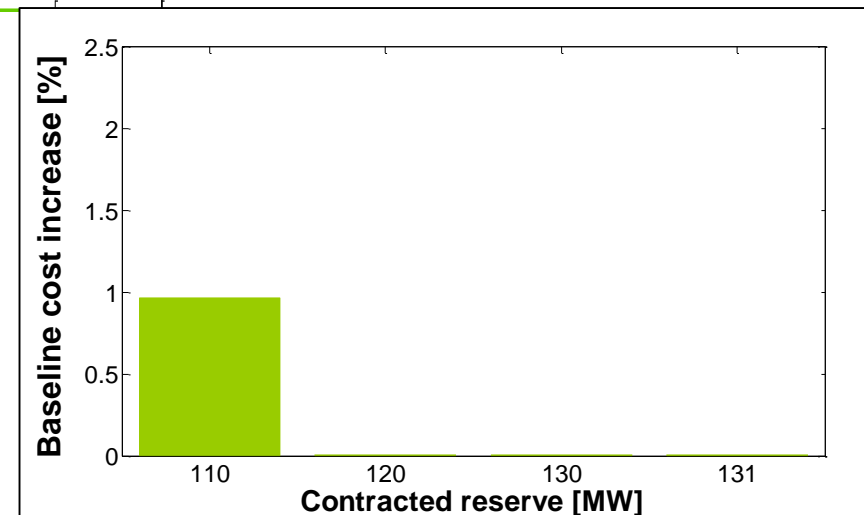
⇒ Given by the **dual value** of the constraint

Bases of reservation costs

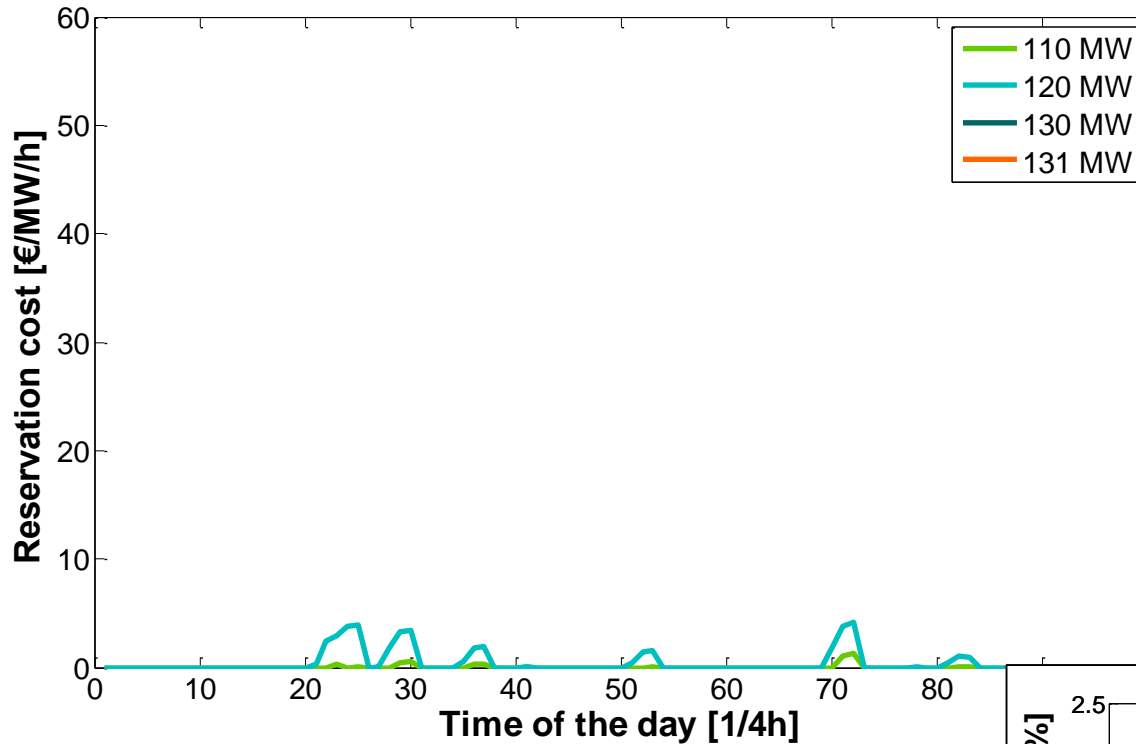


Upward power reservation:

- 40000 identical HP and building geometries
- constant ambient temperature
- constant DA market price

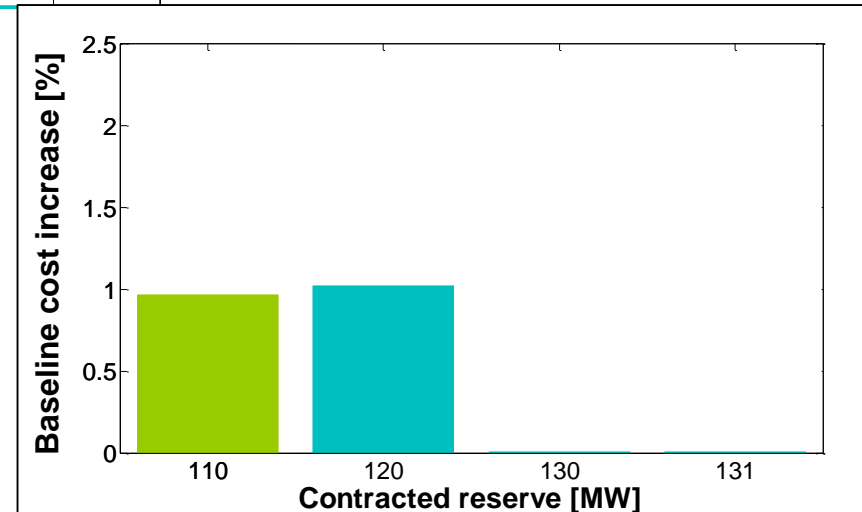


Bases of reservation costs

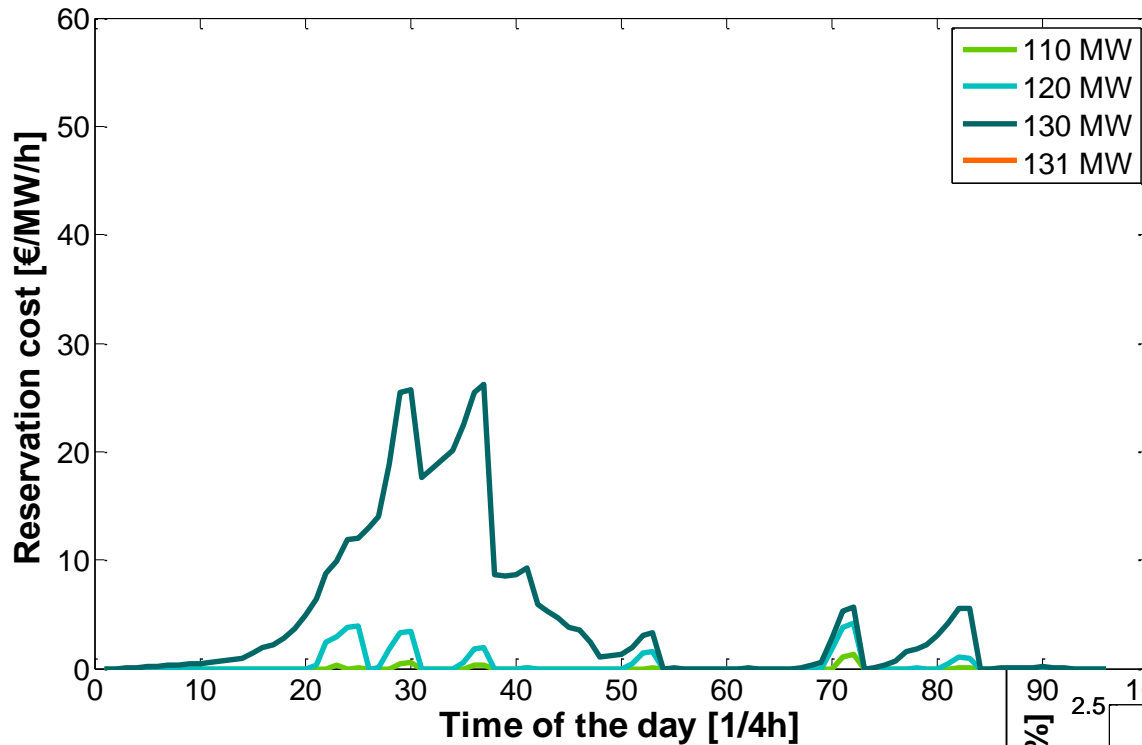


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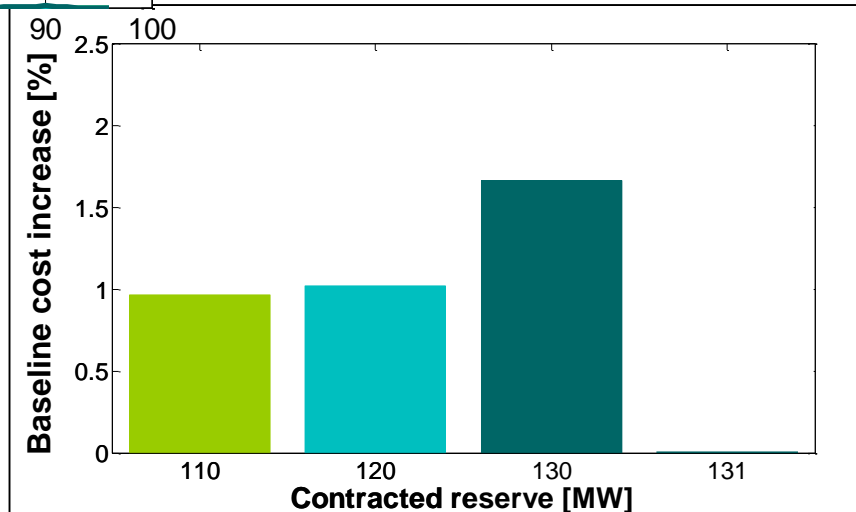


Bases of reservation costs

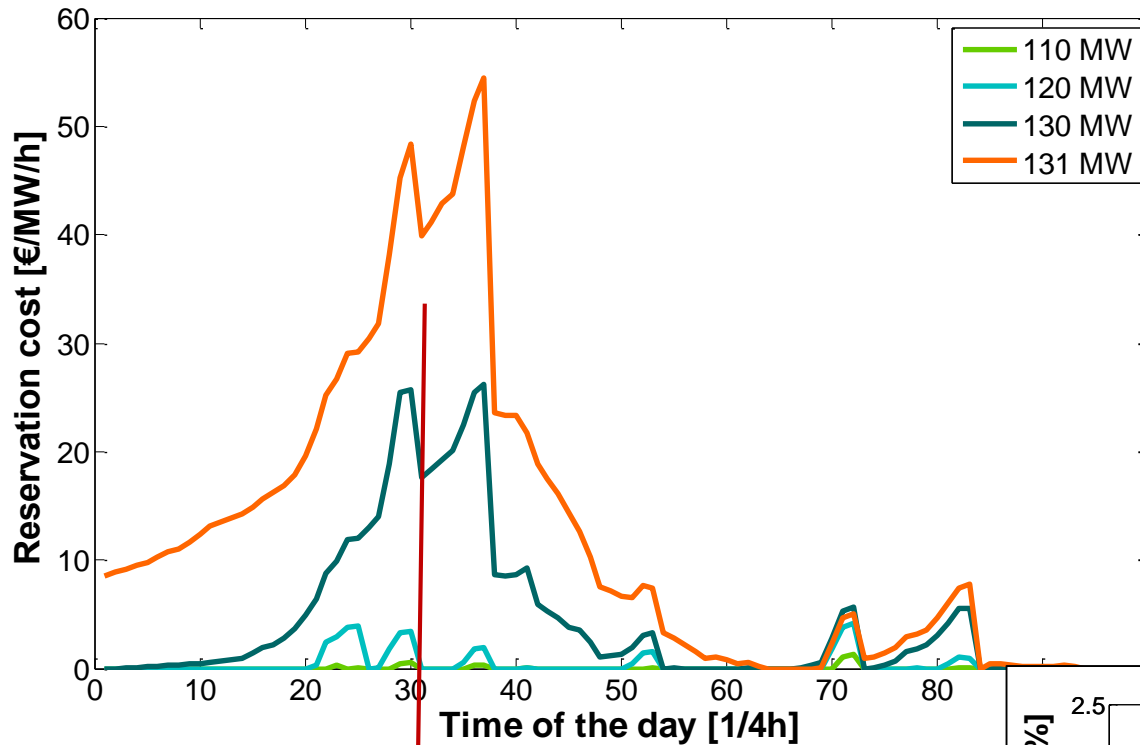


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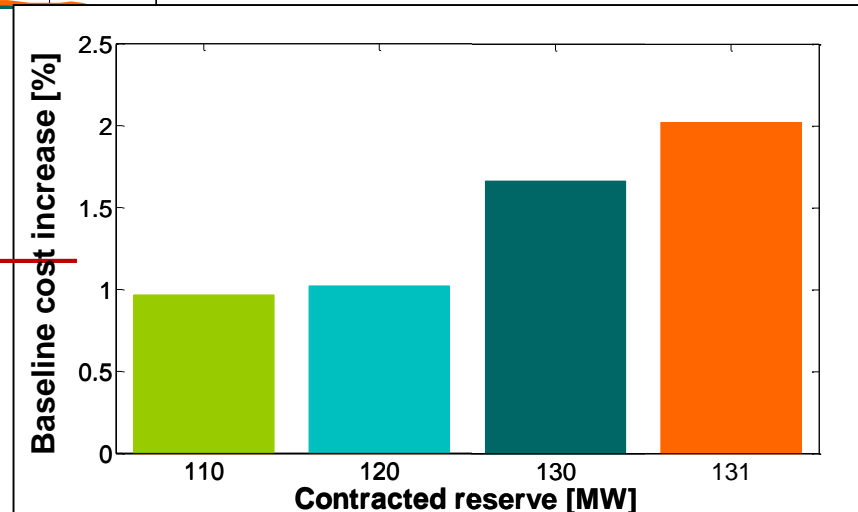
Bases of reservation costs



Upward power reservation:

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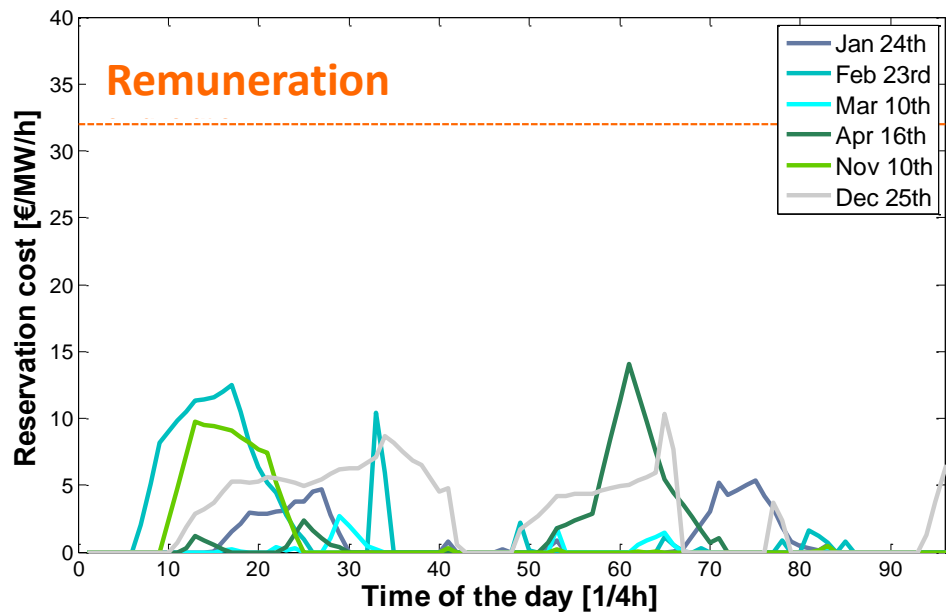
Full-load operation
+
constrained rebound effect



Reservation costs

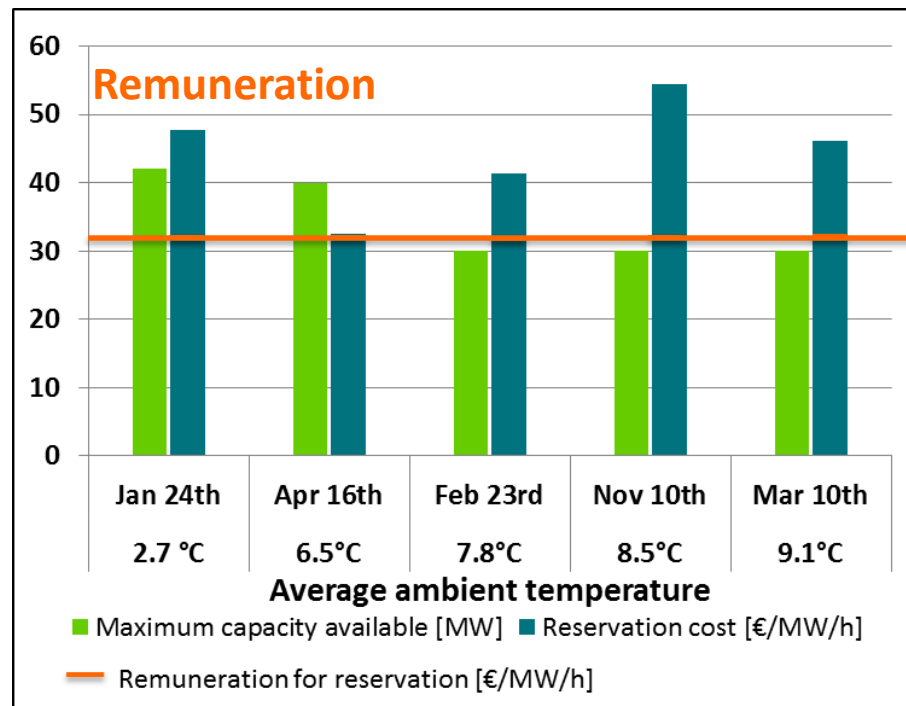
- 40000 heat pumps with two building typologies
- Historical DA market prices for Belgium
- Historical weather conditions

Upward power reservation



100 MW (70% of total reserve)

Downward power reservation



Conclusions

- A method to develop reliable **aggregated models** of residential buildings equipped with heat pumps and water storage with different energy use profiles was presented.
- The method is used to assess the provision of power reserve with such flexible loads:
 - A **combined optimization problem** that aims at the minimization of procurement costs on the day-ahead market while ensuring a certain amount of reserve is proposed.
 - Results show that
 - the provision of upward reserve is limited by the ability of the system to return to its baseline state, and by limited heat pump capacities. The provision of up **to 70% of the current contracted amount of reserve** (140MW) can be achieved with 40000 units during the winter at 44% of the cost.
 - the provision of downward reserve is hampered by **significant overconsumption** and may become non competitive compared to current reserve market prices.

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