Methodologies for Controlling the Electricity Load in Future Intelligent and Integrated Energy Systems



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## **The Danish Wind Power Case**

.... balancing of the power system



■ Wind power □ Demand



■ Wind power □ Demand

# In the first half of 2017 more than 44 pct of electricity load was covered by wind power.

For several days the wind power production was more than 100 pct of the power load.

Periods with more than 140 pct of the power load covered by wind power are seen





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# Existing Markets - Challenges 🗮

- Dynamics
- Stochasticity
- Nonlinearities
- Many power related services (voltage, frequency, balancing, spinning reserve, congestion, ...)
- Speed / problem size
- Characterization of flexibility
- Requirements on user installations



# Challenges







### COMPETITIVE BIDDING AND STABILITY ANALYSIS IN ELECTRICITY MARKETS USING CONTROL THEORY





Informati

Informatics and Mathematical Modelling

### **Smart-Energy OS**



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## **Control and Optimization**





## In the Wiley Book: Control of Electric Loads in Future Electric Energy Systems, 2015

### Day Ahead:

Stoch. Programming based on eg. Scenarios Cost: Related to the market (one or two levels)

### **Direct Control:**

Actuator: Power

Two-way communication

Models for DERs are needed

Constraints for the DERs (calls for state est.)

Contracts are complicated

### **Indirect Control**:

#### Actuator: Price

Cost: E-MPC at **low (DER) level**, One-way communication

Models for DERs are not needed

Simple 'contracts'







ΠΤΠ

### Proposed methodology Control-based methodology





## **Models for systems of systems**



Intelligent systems integration using data and ICT solutions are based on grey-box models for real-time operation of flexible energy systems





## Lab testing ....



## SE-OS Control loop design – **logical drawing**



## **SN-10 Smart House Prototype**



## **SE-OS Characteristics**

- 'Bidding clearing activation' at higher levels
- Nested sequence of systems systems of systems
- Hierarchy of optimization (or control) problems
- Control principles at higher spatial/temporal resolutions
- Cloud or Fog (IoT, IoS) based solutions eg. for forecasting and control
- Facilitates energy systems integration (power, gas, thermal, ...)
- Allow for new players (specialized aggregators)
- Simple setup for the communication and contracts
- Provides a solution for all ancillary services
- Harvest flexibility at all levels







### Case study (Level III)

# Price-based Control of Power Consumption (peak shaving)









## Response on Price Step Change







## Control of Power Consumption







# **Control performance**

Considerable reduction in peak consumption





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### Case study

# Control of Power Consumption to Summer Houses with a Pool (H2020 SmartNet Project)









## **Services**





- The large inertia of pools allows for shift of electricity consumption by several hours.
- Via active coordination of the flexibility below a critical node on the DSO grid.
- Active load management to help finding an optimal routing of the power.











#### Share of electricity originating from renewables in Denmark Late Nov 2016 - Start Dec 2016

Source: pro.electicitymap.org









### Case study No. 2

# Control of Heat Pumps for buildings with a thermal solar collector (minimizing cost)





# Modeling Heat Pump and Solar Collector

Simplified System



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## **Avanced Controller**

Economic Model Predictive Control

### Formulation

The Economic MPC problem, with the constraints and the model, can be summarized into the following formal formulation:

$$\min_{\{u_k\}_{k=0}^{N-1}} \phi = \sum_{k=0}^{N-1} c' u_k \tag{4a}$$
Subject to  $x_{k+1} = Ax_k + Bu_k + Ed_k k = 0, 1, \dots, N-1 \tag{4b}$   
 $y_k = Cx_k \qquad k = 1, 2, \dots, N \qquad (4c)$   
 $u_{min} \le u_k \le u_{max} \qquad k = 0, 1, \dots, N-1 \qquad (4d)$   
 $\Delta u_{min} \le \Delta u_k \le \Delta u_{max} \qquad k = 0, 1, \dots, N-1 \qquad (4e)$   
 $y_{min} \le y_k \le y_{max} \qquad k = 0, 1, \dots, N \qquad (4f)$ 









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### (Virtual) Storage Solutions



#### Flexibility (or virtual storage) characteristics:

- Supermarket refrigeration can provide storage 0.5-2 hours ahead
- Buildings thermal capacity can provide storage up to, say, 5-10 hours ahead
- Buildings with local water storage can provide storage up to, say, 2-16 hours ahead
- District heating/cooling systems can provide storage up to 1-3 days ahead
- DH systems with thermal solar collectors can often provide seasonal storage solutions
- Gas systems can provide seasonal/long term storage solutions

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## Summary



- A procedure for data intelligent control of power load, using the Smart-Energy OS (SE-OS) setup, is suggested.
- The SE-OS controllers can focus on
- ★ Peak Shaving
- **Smart Grid demand (like ancillary services needs, ...)**
- ★ Energy Efficiency
- \* Cost Minimization
- ★ Emission Efficiency
  - We have demonstrated a large potential in Demand Response in Buildings. Automatic solutions and end-user focus are important
  - We see large problems with the tax and tariff structures in many countries (eg. Denmark).





# For more information ...

See for instance

www.smart-cities-centre.org

...or contact

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#### Some 'randomly picked' books on modeling ....







International Series in Operations Research & Management Science

Juan M. Morales - Antonio J. Conejo Henrik Madsen - Pierre Pinson Marco Zugno

#### Integrating Renewables in Electricity Markets

**Operational Problems** 



2 Springer

