

# Data Intelligent Temperature Optimization (Temp. Opt. v.4.0)



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## Software solutions

### Software for combined physical and statistical modelling

Continuous Time Stochastic Modelling (CTSM) is a software package for modelling and simulation of combined physical and statistical models. You find a technical description and the software at [CTSM.info](http://CTSM.info).

### Software for Model Predictive Control

HPMPC is a toolbox for High-Performance implementation of solvers for Model Predictive Control (MPC). It contains routines for fast solution of MPC and MHE (Moving Horizon Estimation) problems on embedded hardware. The software is available on [GitHub](#).

MPCR is a toolbox for building Model Predictive Controllers written in R, the free statistical software. It contains several examples for different MPC problems and interfaces to opensource solvers in R. The software is available on [GitHub](#).

#### Latest news

Summer School at DTU, Lyngby,  
Denmark – July 4th-8th 2016

Summer School – Granada,  
Spain, June 19th-24th 2016

Third general consortium  
meeting – DTU, May 24th-25th  
2016

Smart City Challenge in  
Copenhagen – April 20th 2016

Guest lecture by Pierluigi  
Mancarella at DTU, April 6th  
2016



## Topics



# Data Management and Cloud Based Solutions



## 1. Datainfrastruktur for smarte byer og distrikter

Lead: LU

Co-lead DTU

*Dette emne er et generisk komponent der kan indgå i alle ovenfor nævnte indsatsområder. Det skal sikres at der kan opnås en bedre og/eller større datatilgængelighed, så der gives bedre mulighed for prediction-/fremskrivningsmodeller, forudsigelse af forbrug og produktion, justering af forbrug til produktion, etc. Der skal derfor for hvert indsatsområde laves en definition af behovet for datatilgængelighed og analyse af mulige datakilder. Der udvikles videre på de eksisterende datainfrastrukturer som indbringes i Interreg-projektet fra de forskellige partnere. Målet er at disse kan samarbejde på en transparent måde, så anvenderne ikke mærker om de bruger deres egen infrastruktur eller låner sig til nogle services på andre partnerses set-up eller cloud løsninger. Principielt består denne IT-tunge løsning af tre grundlæggende komponenter; dataindsamling, datahåndtering/-analytics og præsentation. Endelig vil der være en fjerde komponent der kan håndtere kommunikationen for styringen parallelt med dataindsamlingen.*



# Big Data value chain

## Sense

### Data Origins

The Internet, sensors, machines, etc.

## Think

### Data Collection

Web log, sensor data, images/audio, RFID and videos, etc.

### Data Storage

Technologies supporting data storage

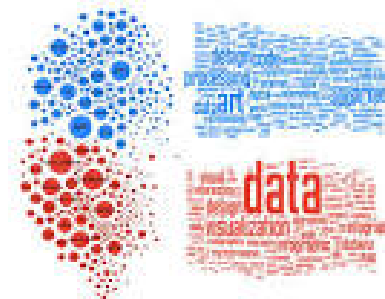
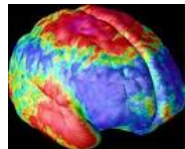
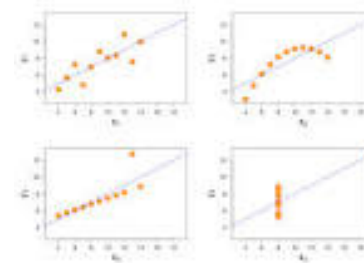
## Act

### Analytics:

Predictive analytics, patterns in data, decision making

### Consumers:

Business processes, humans, and applications



# CITIES Data Management System

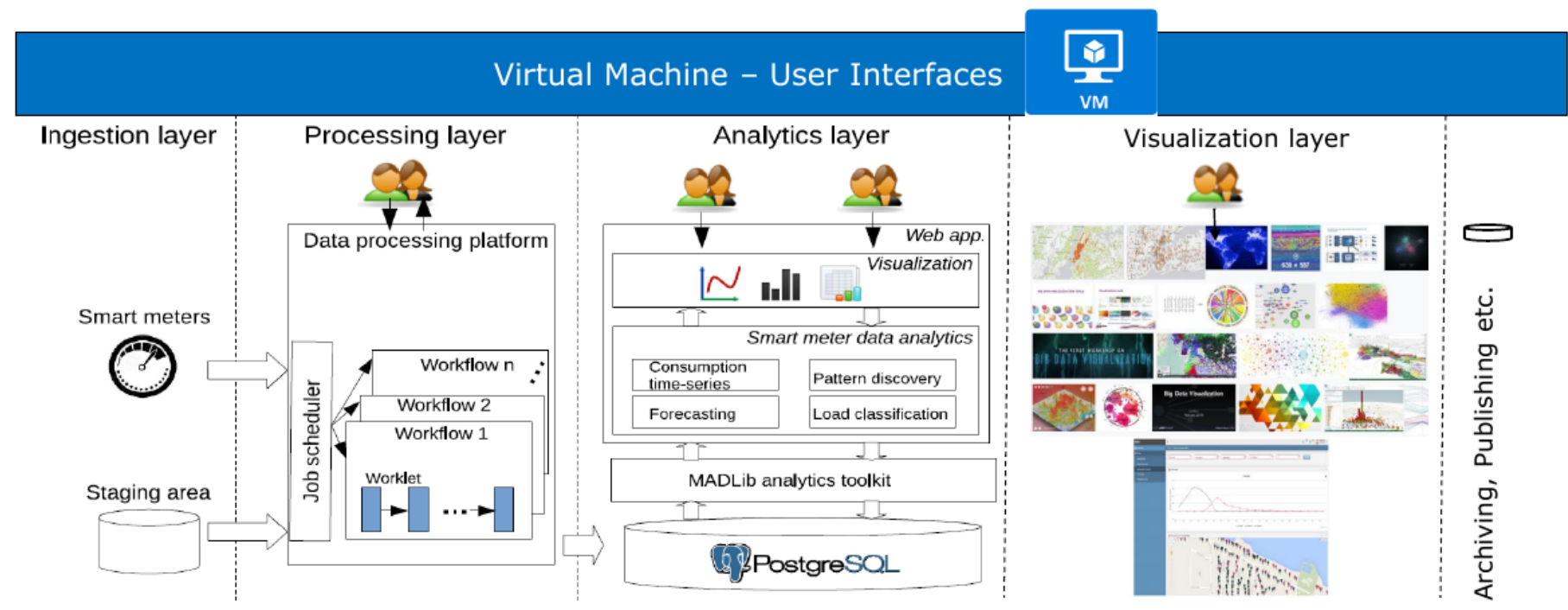
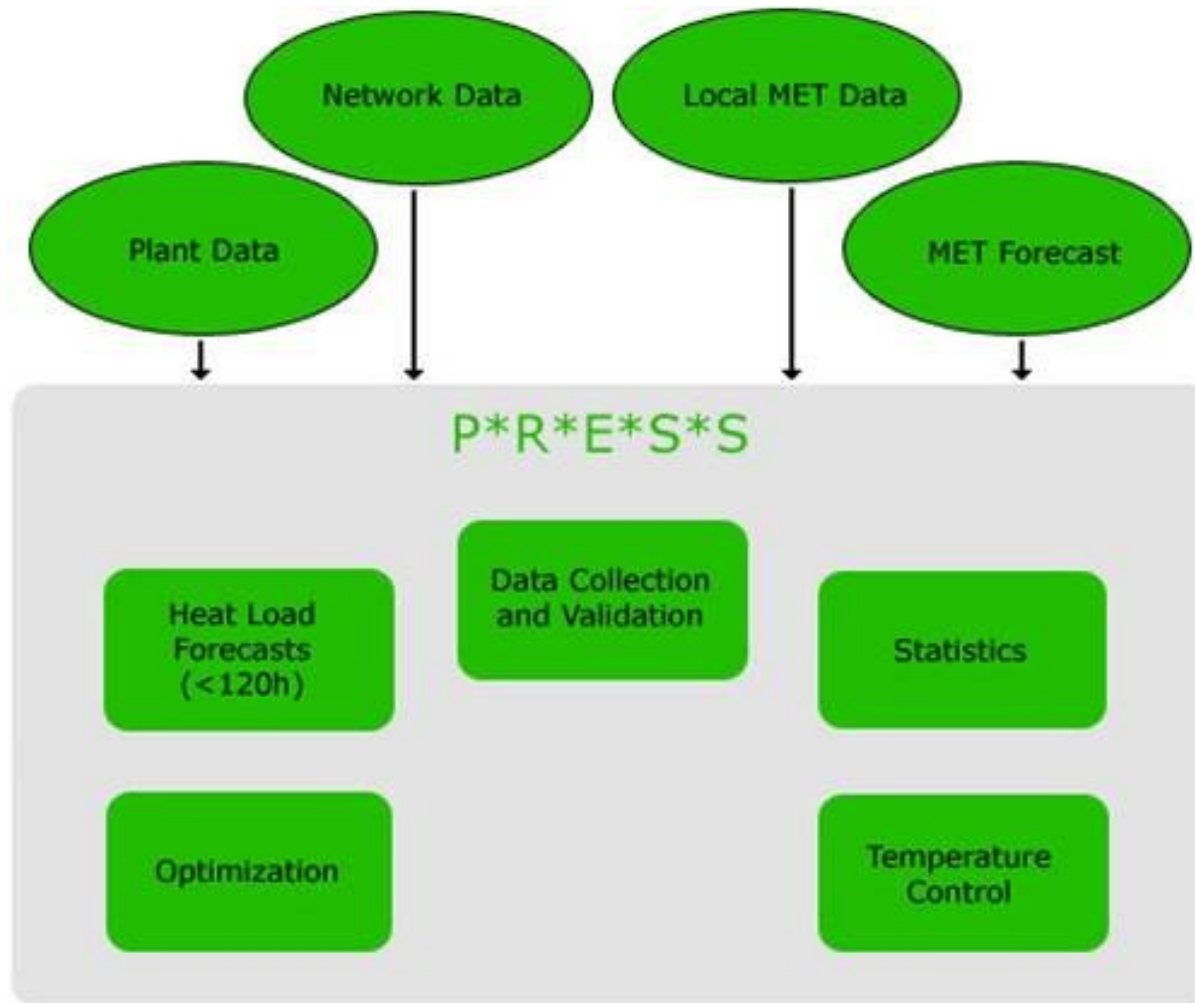


Fig. 1. The system architecture of smart meter data analytics system

Discovery of data  
Citation of data

# PRESS Setup





# Data Intelligent Temperature Optimization for DH Systems (incl. load forecasting)



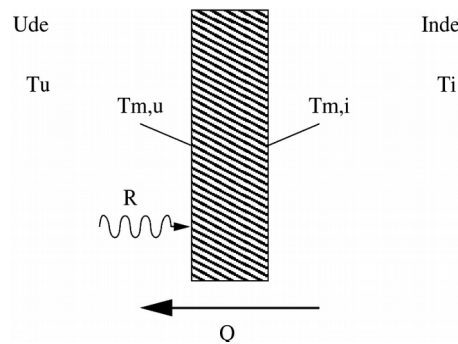
## 2. Integrering af lav-temperatur fjernvarme til eksisterende byområder

CITY lead: Høje Taastrup Fjernvarme - CITY co-lead: Malmö Stad  
 SCIENCE lead: DTU

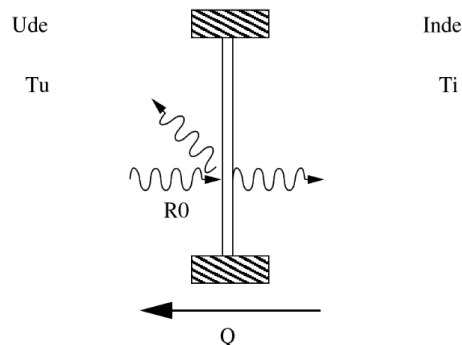
*På begge sider af Øresund er der en stor andel af fjernvarmesystemer, men systemerne er ret forskellige. Samspeilet mellem fjernvarme og el-systemer forventes at spille en stor rolle i forhold til mulighederne for at integrere store mængder af sol- og vindenergi. For nyere og velisolerede bygninger vil fokus være på lavtemperatur fjernvarme. Dels vil det lave temperaturniveau øge mulighederne for at opsamle spildvarme fra eksempelvis forretningscentre og kølehuse, og dels vil lave temperaturer være vigtige for at minimere det samlede nettab. I CITIES projektet er der udviklet nogle nye data- og prognosebaserede metoder til optimeret styring af fremløbstemperaturer, samt til optimeret brug af termiske energilagere i såvel ledningsnet som i akkumulatortanke i fjernvarmesystemer. Endelig er der også udviklet metoder til reduktion af f.eks. morgenspidsen i fjernvarmesystemerne, idet temperaturen ofte med fordel kan hæves lidt tidligere end ellers planlagt. I f.eks. dele af Københavnsområdet (VEKS) vil der blive undersøgt metoder til at sænke det nødvendige temperaturniveau i transmissionsnettet i forhold til kravet fra sekundær områderne. Der vil passende kunne undersøges potentialer for solvarmecentraler i disse lavtemperatur fjernvarme, hvormed VE-andelen kan øges betragteligt. I disse anlæg vil store lagre kunne naturlig integreres hvormed solandelen øges til meget store andele.*

# Model components in load forecasting

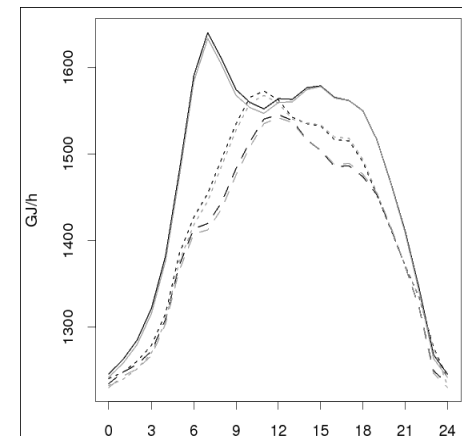
Wall: Slow reaction on climate



Windows + ventilation: Fast reaction



Occupant behavior



# PRESS Load Forecast

## (Model principles)

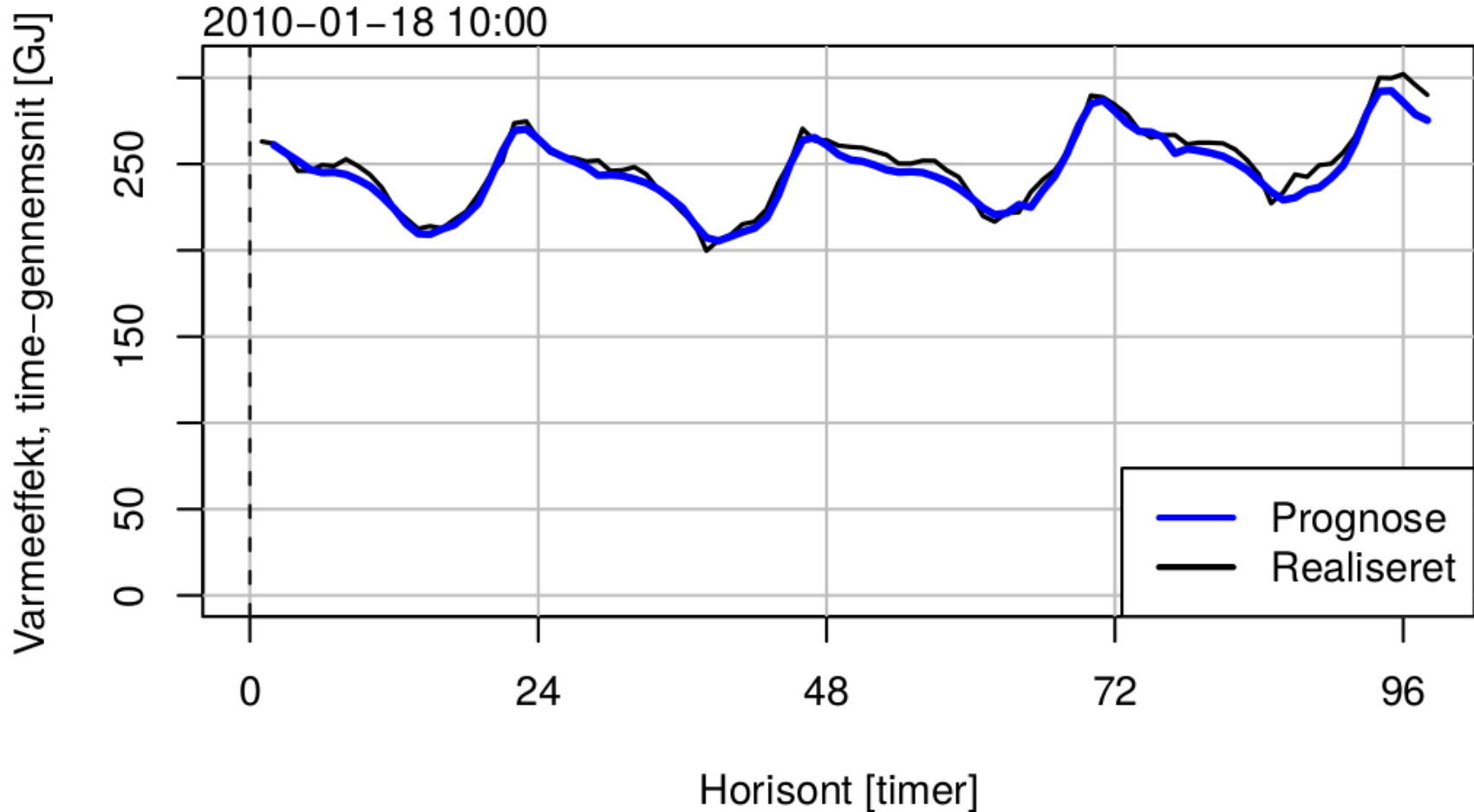
Load forecast for time  $t+k$ ,  $P_p(t+k)$ , is written:

$$P_p(t+k) = F_{mur}(V_{ejr}(t+k)) + F_{vv}(V_{ejr}(t+k)) + F_{ar}(P_p(t) - P(t)) + DP(t+k)$$

where

- $F_{mur}$ ,  $F_{vv}$ ,  $F_{ar}$  and  $DP$  are semi-parametric functions (estimated by PRESS)
- $V_{ejr}(t+k)$  is weather input (measured + forecasts) for time  $t+k$ .
- $P(t)$  is measured heat load for time  $t$ .

# PRESS Load Forecast (Example)

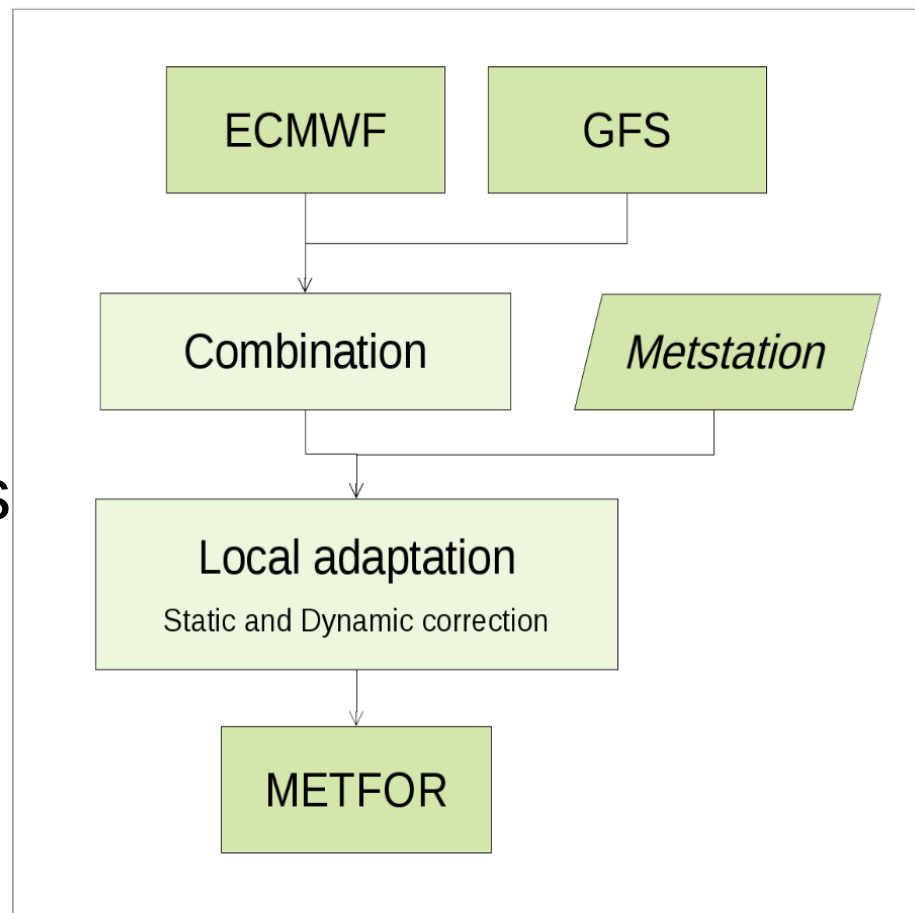




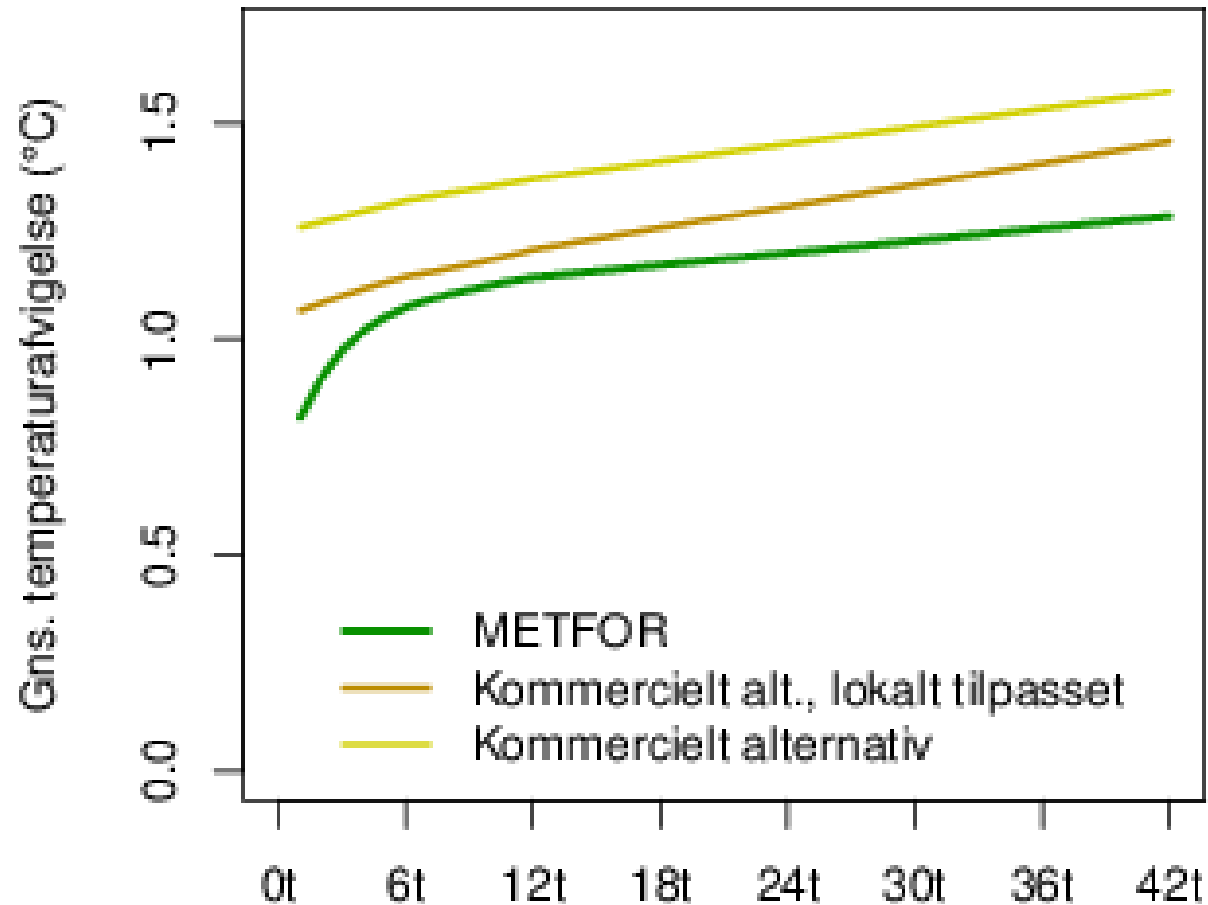
# Weather data and forecasts

Optimize local weather forecast base on:

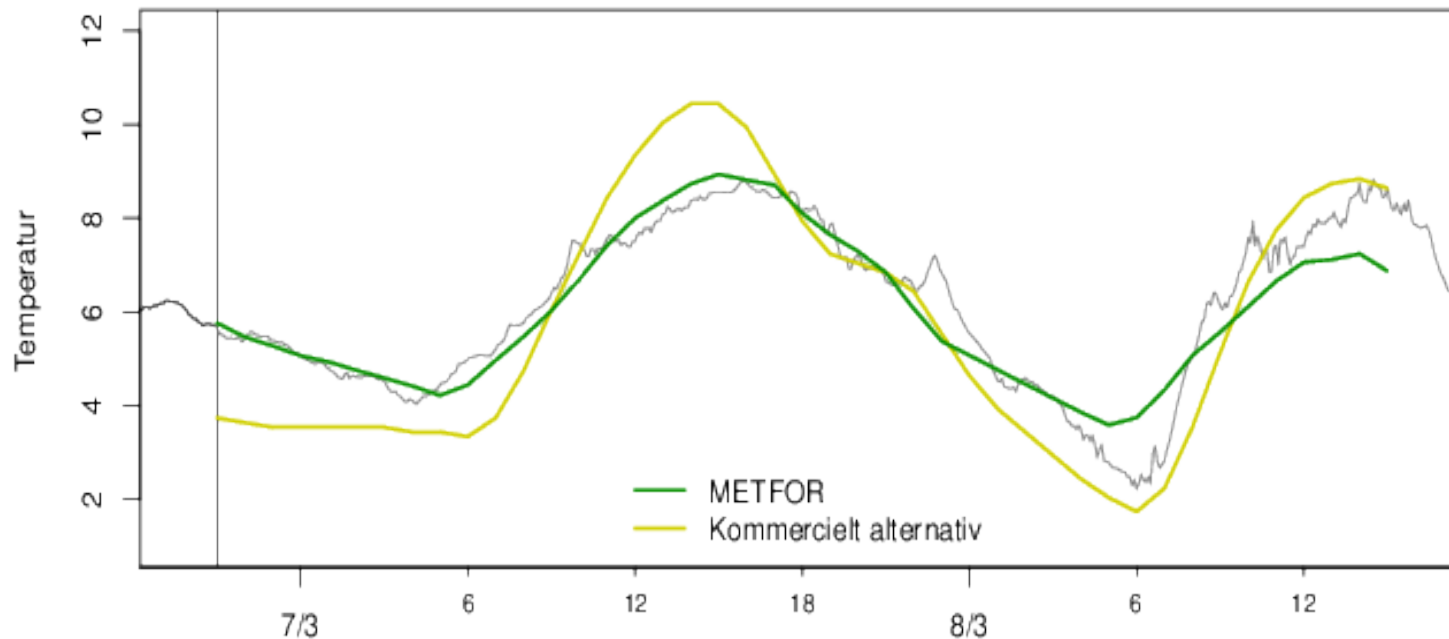
- Local climate data
- Several MET forecasts



# MetFor performance

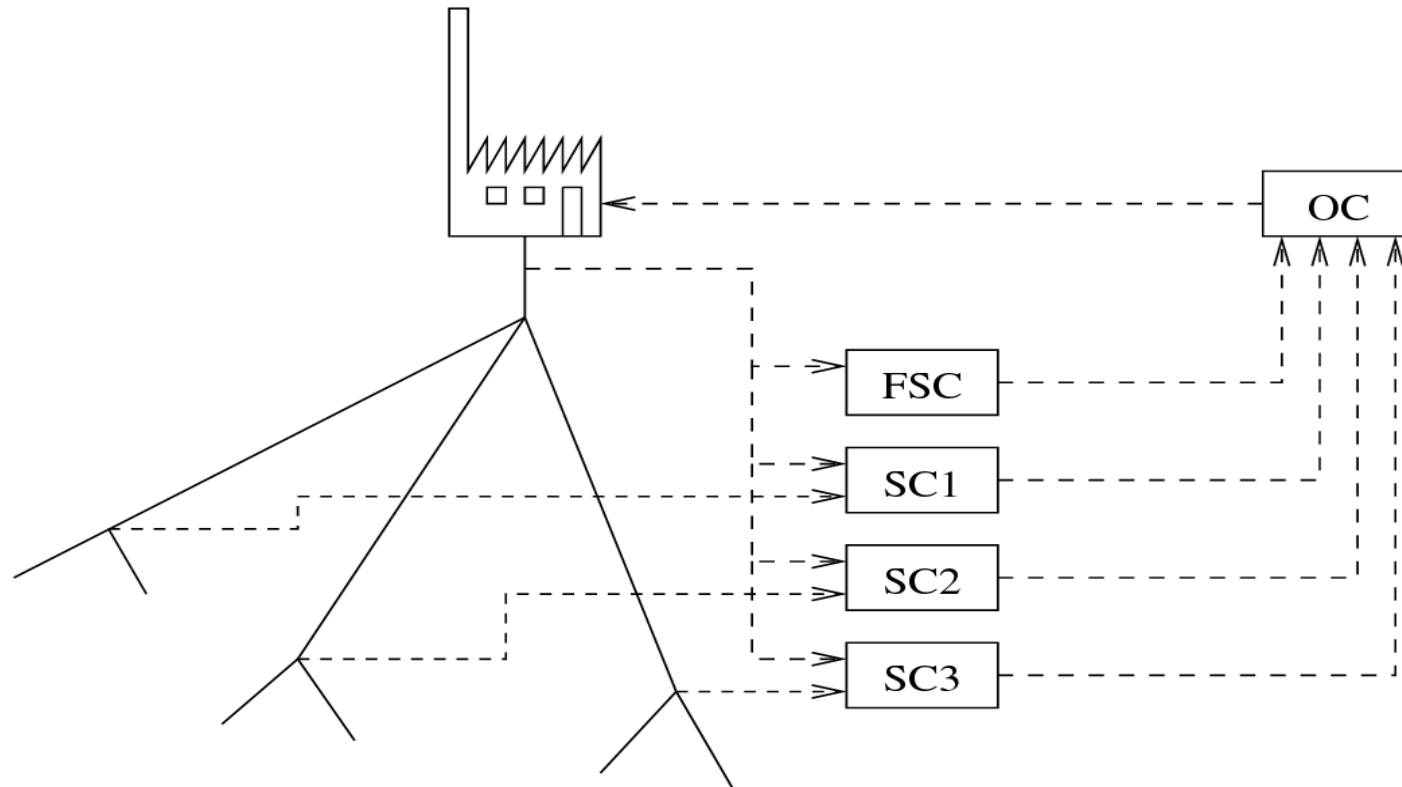


# MetFor forecast example



# Models and Controllers

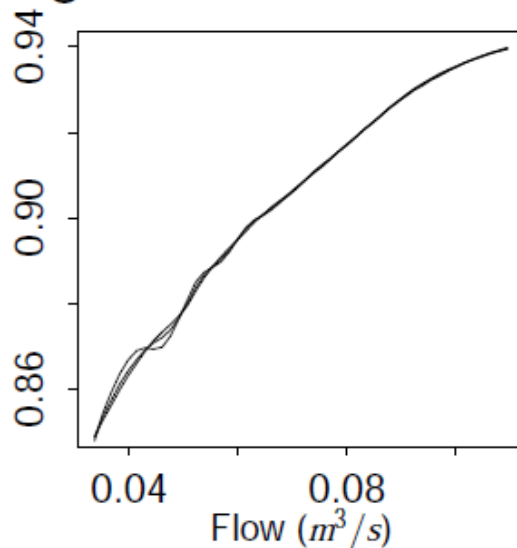
(Highly simplified!)



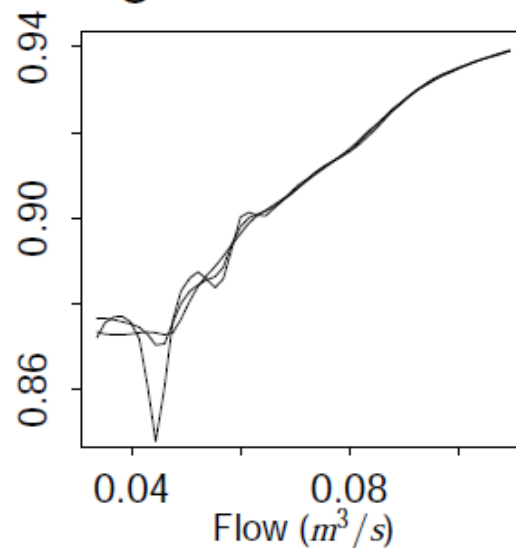
# Characteristics

30%, 40%, 50%

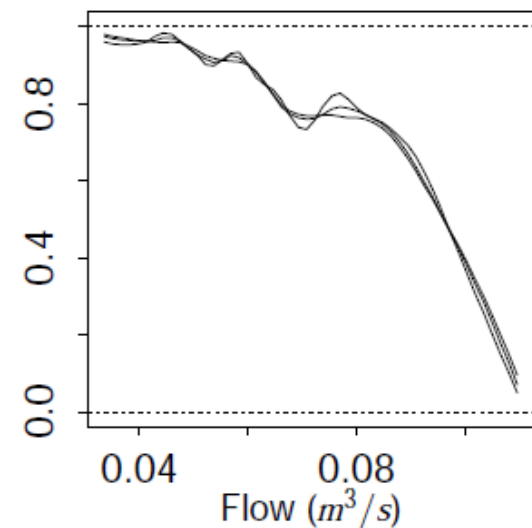
Stationary gain of FIR



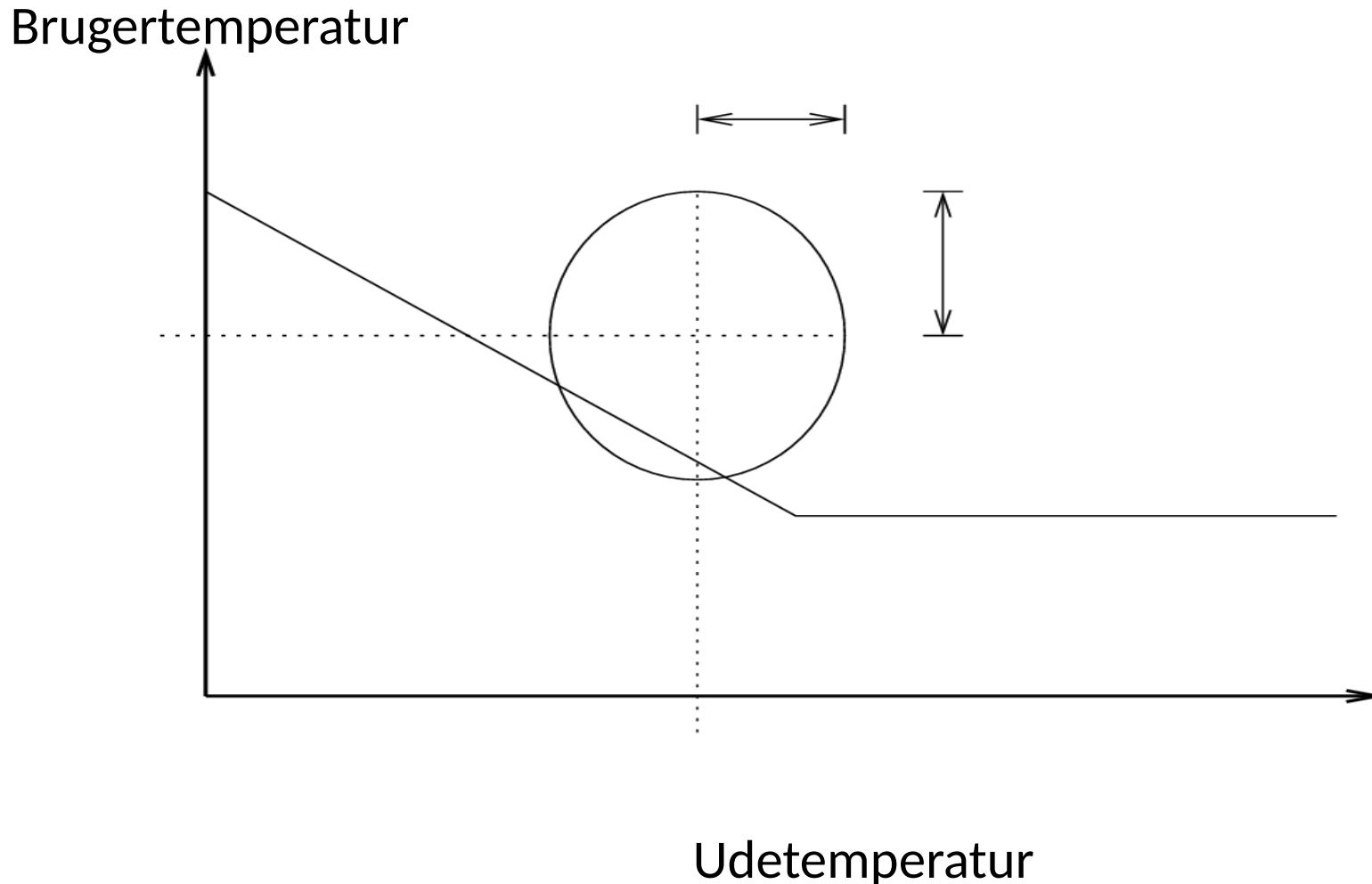
Stationary gain of ARX



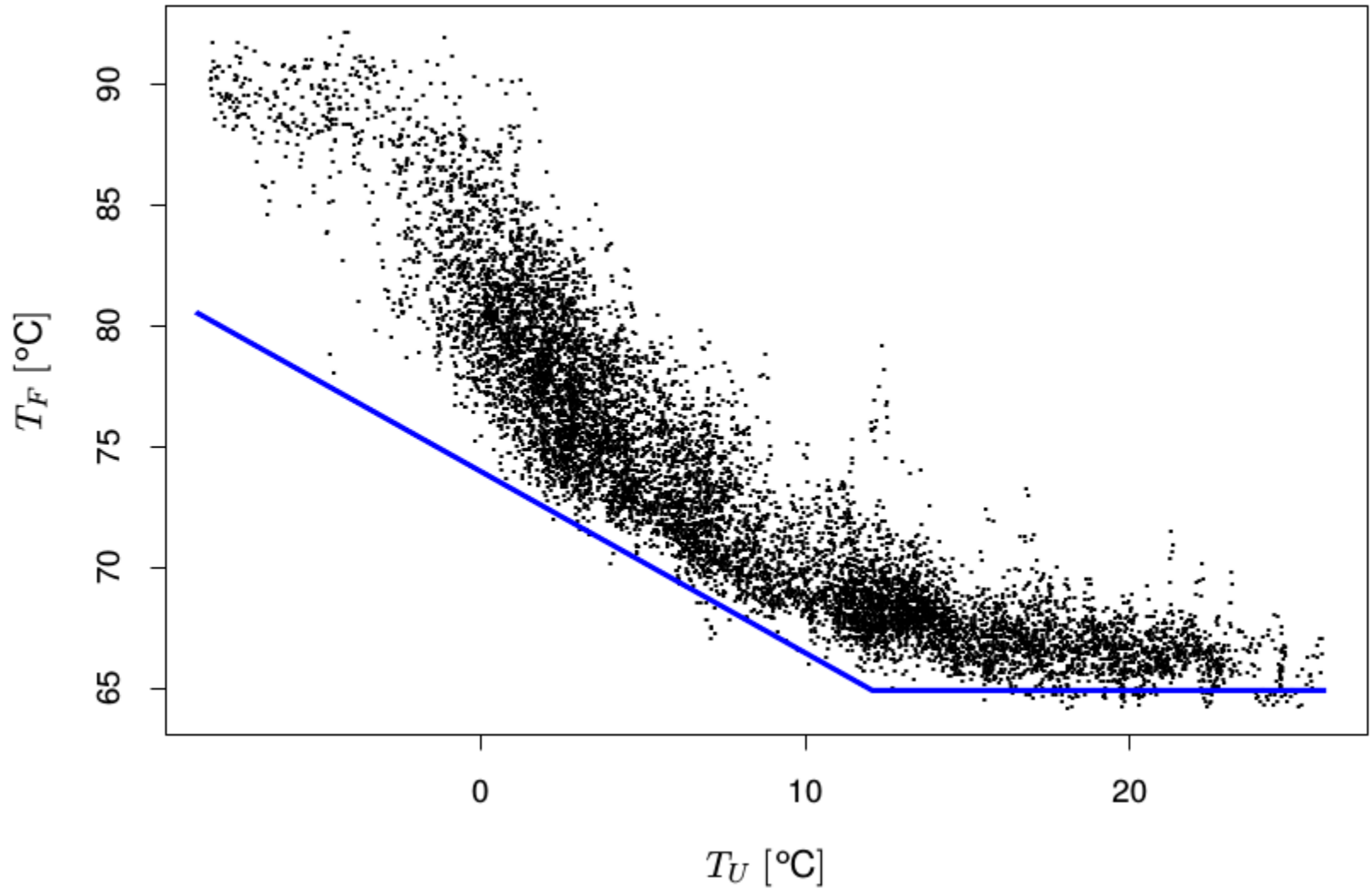
Pole of ARX



# Optimal set-point taking uncertainty into account



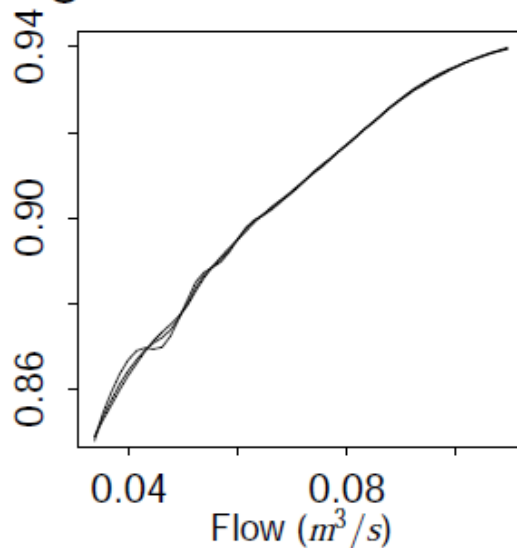




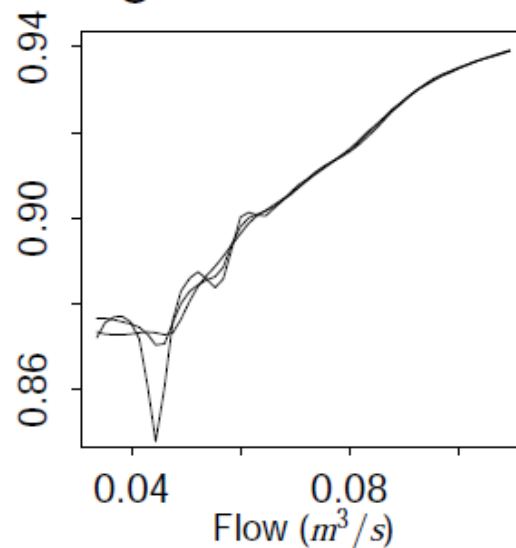
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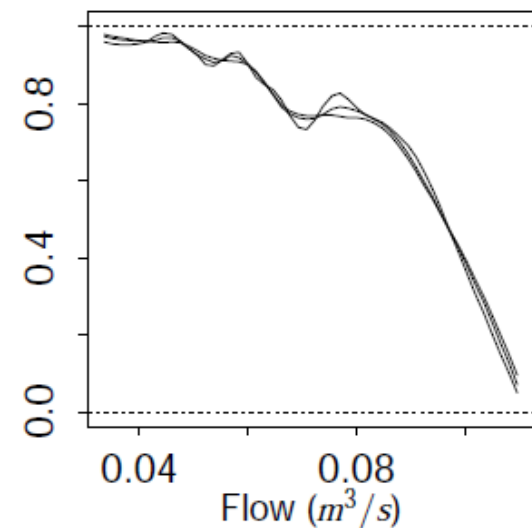
Stationary  
gain of FIR



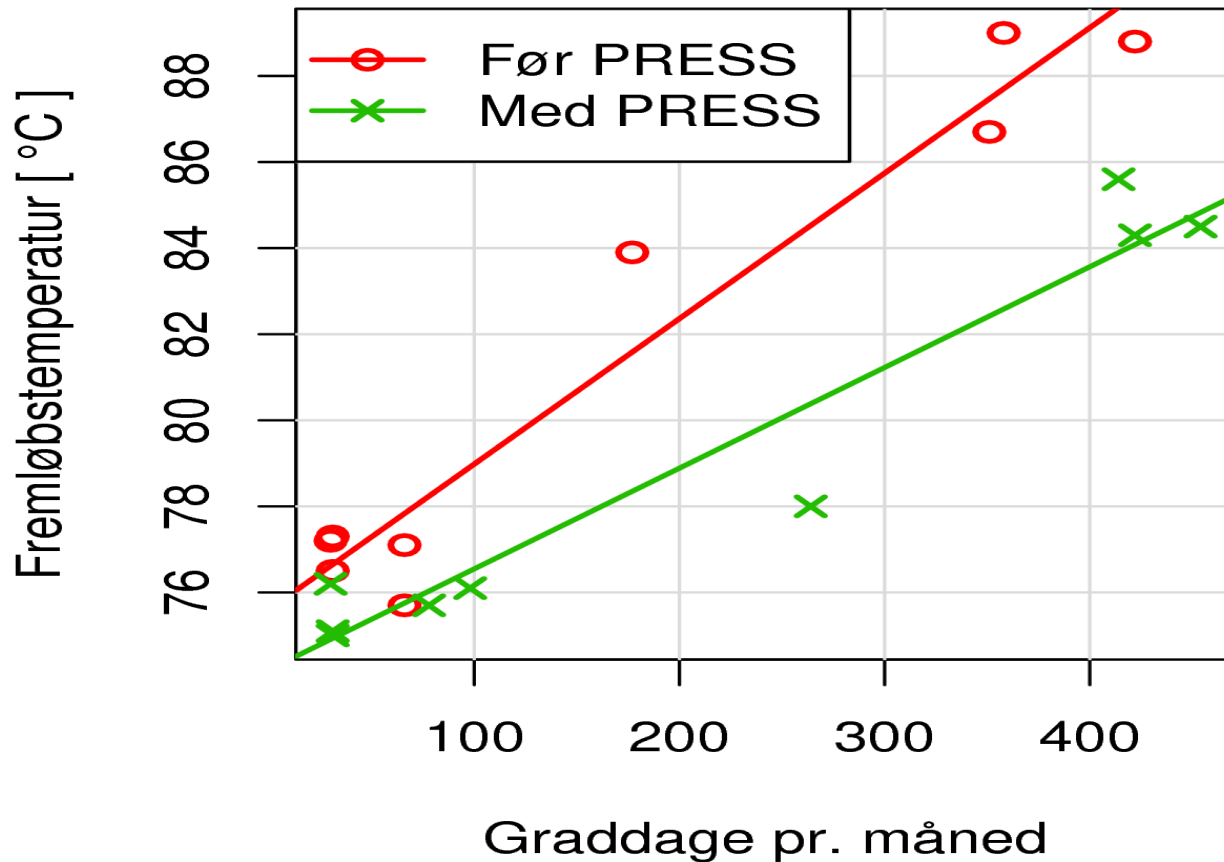
Stationary  
gain of ARX



Pole of ARX



# Supply temperature with/without data intelligent control



# Savings

(Reduction of heat loss = 18.3 pct)

|           | Varmekøb |        | Elkøb    |        |
|-----------|----------|--------|----------|--------|
|           | GJ       | 1000kr | kWh      | 1000kr |
| Før PRESS | 653,000  | 30,750 | 499,000  | 648    |
| Med PRESS | 615,000  | 28,990 | 648,000  | 842    |
| Forskel   | 37,400   | 1,760  | -149,000 | -194   |

Total besparelse (9 første måneder af normalår): **1,566,000kr**

Besparelse for et normalår:

- $12/9 \times 1,566,000\text{kr} = \mathbf{2.1 \text{ mill.}}$
- Imidlertid står jan.–sept. (75% af året) kun for ca. 65% af graddagen i et normalår.
- $1,566,000\text{kr}/0.65 = \mathbf{2.4 \text{ mill.}}$

# Control of Temperatures in DH Systems



## Lesson learned:

- Control using **simulation** of temperature gives **up to 10 pct reduction** of heat loss.
- Control using **data and predictions** gives **up to 20 pct. reduction** of heat loss.

FJERNVARMEN | 5 2010

**Styring af temperatur rummer kæmpe sparepotentiale**

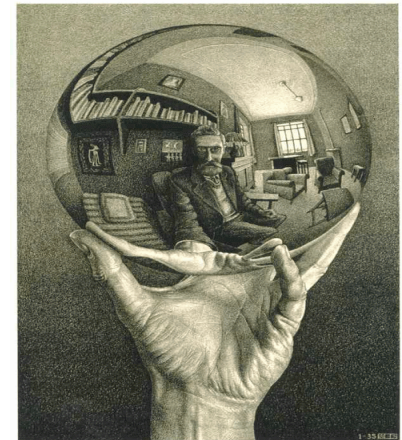
## Which approach to use?

- Use **simulation based control** if:
  - No access to data from the DH network
  - Want an evaluation of new operational scenarios
- Use **prediction based control** if:
  - Access to network data online
  - Want to use meteorological forecasts automatically
  - Want to combine MET forecasts with local climate data
  - Want automated update of models



# Data Intelligent Temperature Optimization for DH Systems

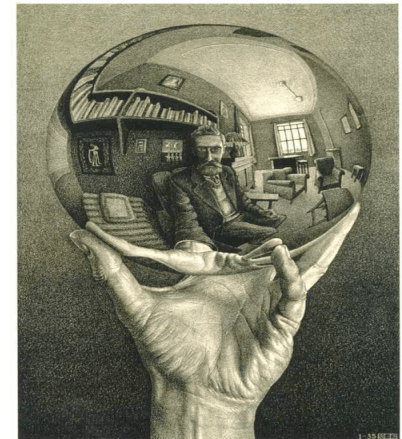
- Able to take advantage of information in data
- Self-calibrating models for the DH network
- Shows where to upgrade the DH network
- Fast (real time) calculations
- Use DH net for peak shaving and storage
- Able to use online MET forecasts etc.





# Data Int. Temp. Opt (v.4.0)

- Big Data Analytics – more specificall:
- Take advantage of (smart) meter readings
- Use of all available MET forecast
- Combination of MET forecasts with data from local climate stations
- New grey-box models



# For more information ...

See for instance

[www.henrikmadsen.org](http://www.henrikmadsen.org)

[www.smart-cities-centre.org](http://www.smart-cities-centre.org)

[www.citiesinnovation.org](http://www.citiesinnovation.org)

...or contact

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