## Comparison of MPC Strategies for Building Control

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Problem: Almost 40% of final energy use in the world goes towards comfort control in buildings - heating, ventilation and air conditioning (HVAC).\*

<sup>\*</sup>International Energy Agency 'Energy efficiency requirements in building codes, energy efficiency policies for new buildings' 2013 OECD/IEA.

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Solution: Building control

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#### Presentation Outline

Building Modeling and Control

2 Model Predictive Control

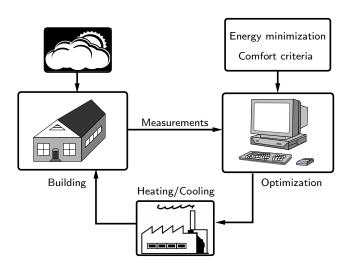
Case Study

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# Building Thermal Control Scheme



# Single Zone Building Model

#### State Variables

 $x_1$  – floor temperature

 $x_2-$  internal facade temperature

 $x_3$  – external facade temperature

x<sub>4</sub> – internal temperature



#### Disturbances

 $d_1$  – external temperature

 $d_2$  – occupancy

d<sub>3</sub> – solar radiation

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## Control Objectives

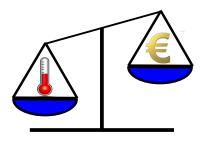
- Thermal Comfort
- Minimization of Energy Consumption

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#### Model Predictive Control

Objective function

$$\min_{u_0,...,u_{N-1}} \sum_{k=0}^{N-1} \ell(x_k, u_k)$$

Constraints

$$\begin{aligned} x_{k+1} &= Ax_k + Bu_k + Ed_k, \\ \underline{x} &\leq x_k \leq \overline{x}, \\ \underline{x} &\leq u_k \leq \overline{u}, \\ \underline{x} &\leq u_k \leq \overline{u}, \end{aligned}$$

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$$x_0 = x(t)$$

# Different Formulations of the Objective Function

## Reference Tracking + Energy Minimization (Basic)

$$\ell(x_k,u_k)=q_x(Cx_k-r)^2+q_uu_k^2$$



#### Comfort Zone Tracking + Energy Minimization (CZT)

$$\ell(s_k, u_k) = q_s s_k^2 + q_u u_k^2$$
  
s.t.  $r - \epsilon - s_k \le C x_k \le r + \epsilon + s_k$ 

### Minimization of Zone Violations + Energy Minimization (Hybrid)

$$\ell(\delta_k, u_k) = q_\delta \delta_k + q_u u_k^2$$
  
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 $(s_k > 0) \Longrightarrow (\delta_k = 1)$ 

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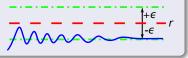
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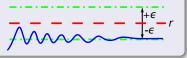
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## Simulation Study

# Closed Loop Simulation Parameters

• Prediction horizon:

$$N = 10$$

Sampling time:

$$T_s = 444 \, {\rm sec}$$

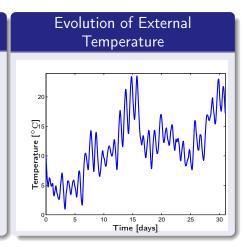
Simulation time:

$$T_{sim} = 31 \text{ days}$$

Initial indoor temperature:

$$x_4 = 10^{\circ} \text{C}$$

No weather predictions



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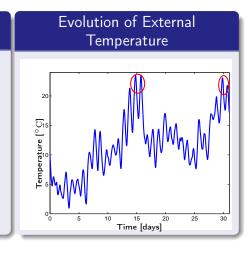
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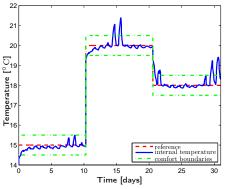
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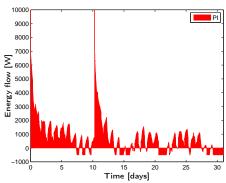
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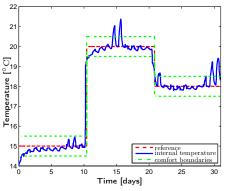
## PI Controller

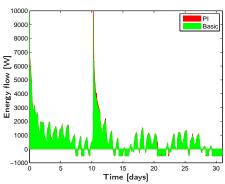




Control strategy	PI
Thermal comfort [%]	87.5
Energy consumption [kWh]	753.0
Energy savings [%]	-

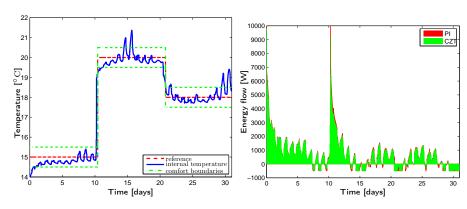
# Reference Tracking (Basic)





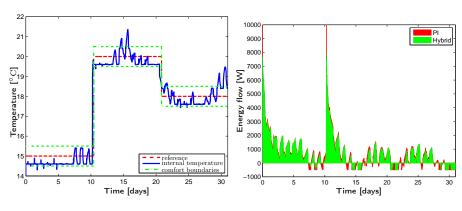
Control strategy	PI	Basic
	87.5	89.2
Energy consumption [kWh]	753.0	722.7
Energy savings [%]	-	4.0

# Comfort Zone Tracking (CZT)

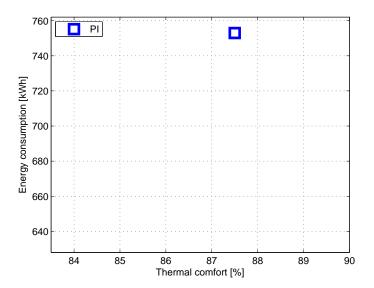


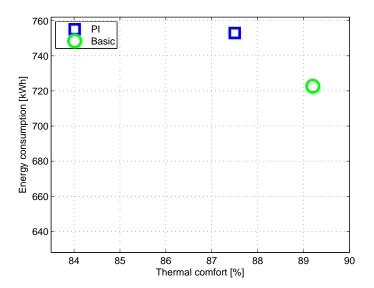
Control strategy	PI	Basic	CZT
[, 0]	87.5	89.2	84.1
Energy consumption [kWh]	753.0	722.7	684.0
Energy savings [%]	-	4.0	9.1

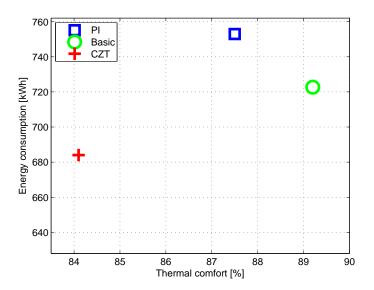
# Minimization of Comfort Zone Violations (Hybrid)

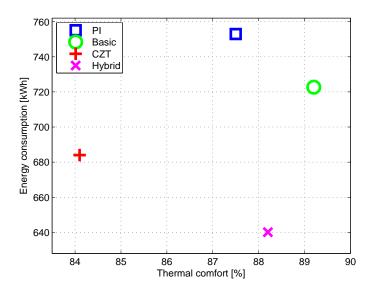


Control strategy	PI	Basic	CZT	Hybrid
[, •]		89.2	84.1	88.2
Energy consumption [kWh]	753.0	722.7	684.0	640.1
Energy savings [%]	-	4.0	9.1	15.0









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- Best case: hybrid formulation with energy savings up to 15%
- Drawback: higher computational complexity
- No weather predictions
- Suitable for application in "intelligent" building

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