

# Benchmarks for cyber-physical systems:

A modular model library for building automation systems

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ADHS 2018

University of Oxford

# Introduction



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- smart buildings are exemplars of CPS



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- research aims of interest:
  - ensure comfort
  - minimise consumption
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- **smart buildings** are exemplars of CPS
- research aims of interest:
  - ensure comfort
  - minimise consumption
  - ascertain reliability
- need for framework to **verify** correctness

# Introduction

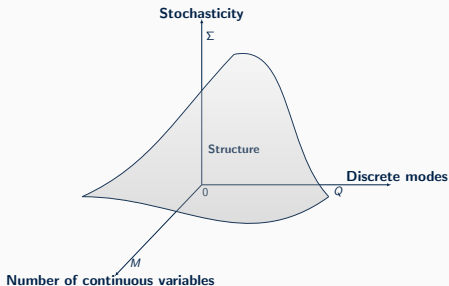
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- mixed digital controls & continuous processes
- choice of model is an art
- different trade-offs of complexities

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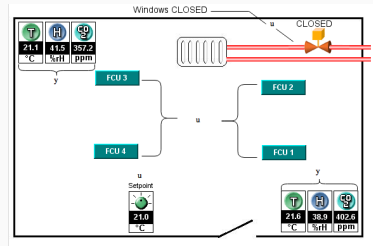
# Building Automation Systems (BAS) setup

- vary in size and topology of building,
- smart buildings laboratory within the University of Oxford
- highly sensorised setup
- focus on modelling temperature

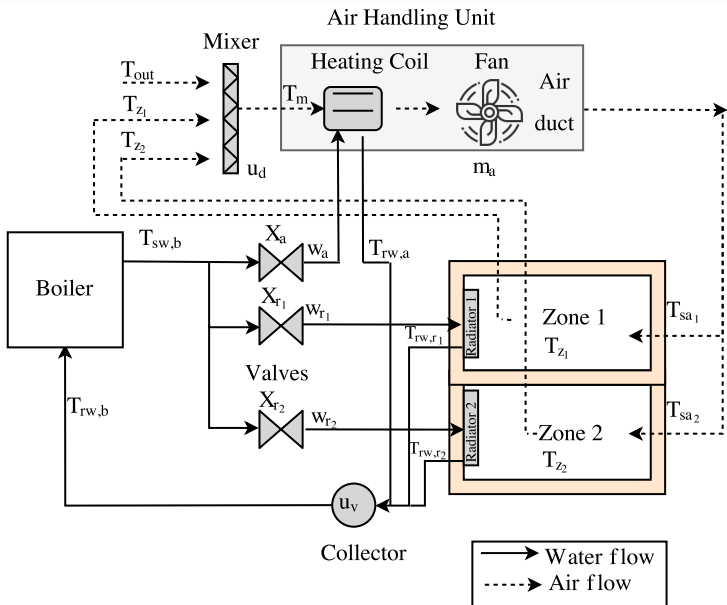


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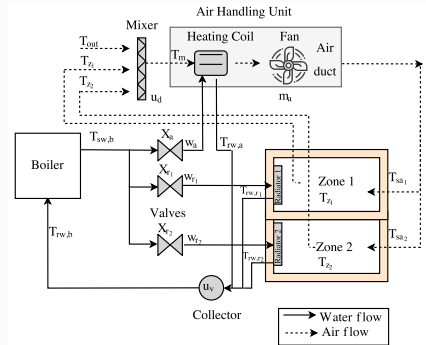
# Building Automation Systems (BAS) setup



# Library of models

## Components

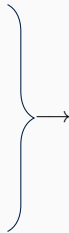
- boiler
- valve
- heating coil
- mixer
- ...
- ...
- zone



# Library of models

## Components

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## Model description

- 1 discrete variable :  $B_{en}$
- 1 continuous variable :  $T_{sw,b}$
- 1 output :  $T_{sw,b}$
- process noise:  $\sigma_{sw}$
- constants;  $\tau_{sw}$ ,  $k_b$

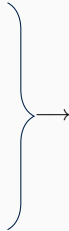
## Model dynamics

$$dT_{sw,b}(t) = \begin{cases} 0 & B_{en}(t) = 0 \\ (\tau_{sw})^{-1} [(-T_{sw,b}(t) + k_b)dt] + \sigma_{sw}dW & B_{en}(t) = 1 \end{cases}$$

# Library of models

## Components

- boiler
- valve
- heating coil
- mixer
- ...
- ...
- zone



## Types

- algebraic / differential
- non / linear
- continuous variables
- discrete modes
- noise

## Coupling

- input-output
- control laws

## Characteristics:

- modular structure
- flexible as it allows for generation of different benchmarks

## Format:

- Matlab files

`github.com/natchi92/BASBenchmarks`

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- select **individual** components modules
- couple using **input-output** relationships



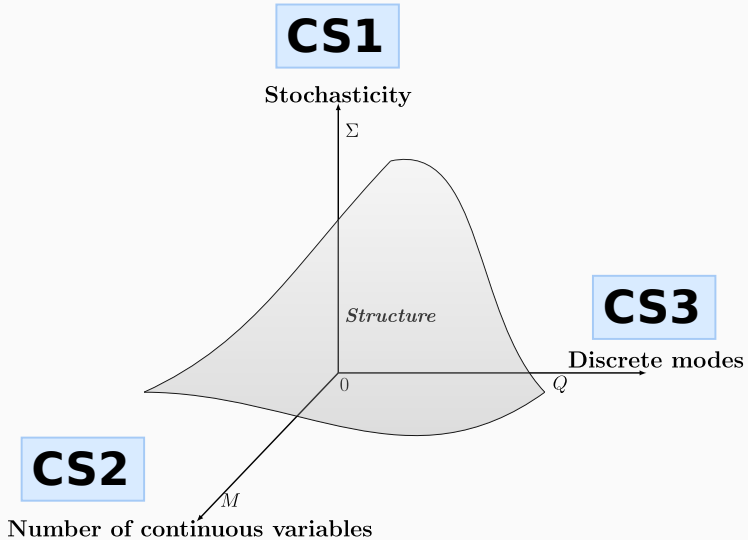
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## Case studies:

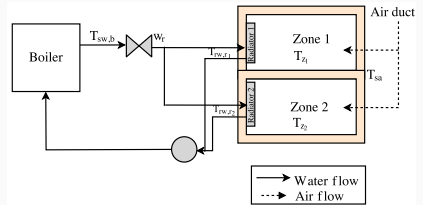
- set-up three case studies
- each trading off a particular characteristic

# Case studies



# CS1: deterministic or stochastic dynamics

- two zones, one radiator and a common supply air:
- we consider two different dynamics:
  - purely deterministic ones;
  - a stochastic model
- we discretise time



# CS1: deterministic or stochastic dynamics

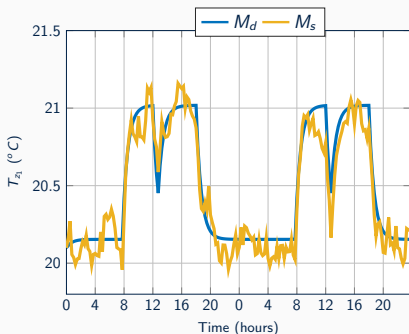
- $x \in \mathbb{R}^4, u \in \mathbb{R}, y \in \mathbb{R}^2, \Sigma \in \mathbb{R}^4$
- constant gain vector  $Q_d$
- **task**: decide if traces remain within safe set for given time period

**$M_d$ : deterministic**

$$x[k+1] = Ax[k] + Bu[k] + Q_d$$

**$M_s$ : stochastic**

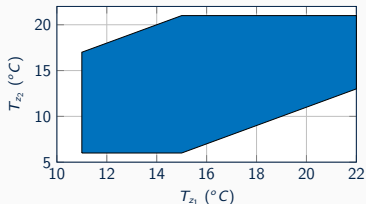
$$x[k+1] = Ax[k] + Bu[k] + Q_d + \Sigma W[k]$$



# CS1: deterministic or stochastic dynamics

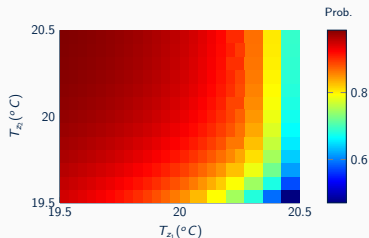
## deterministic model

- reachability analysis (ra)
- **tool**: Axelerator

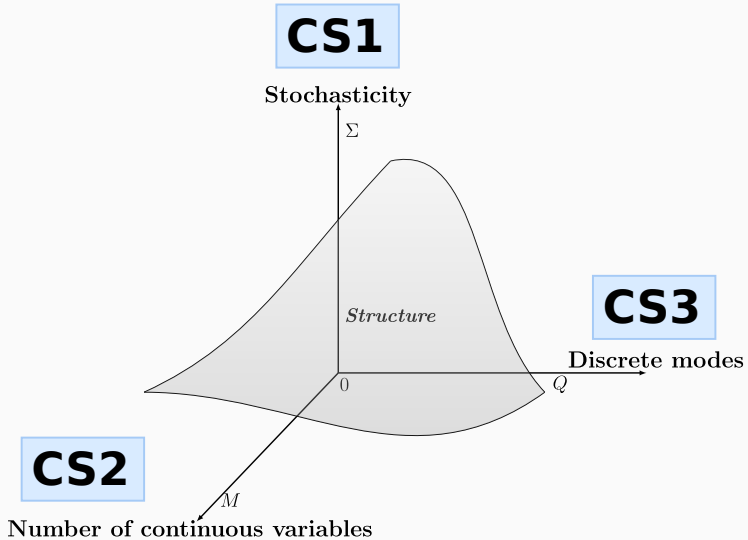


## stochastic model

- probabilistic ra
- **tool**: FAUST<sup>2</sup>

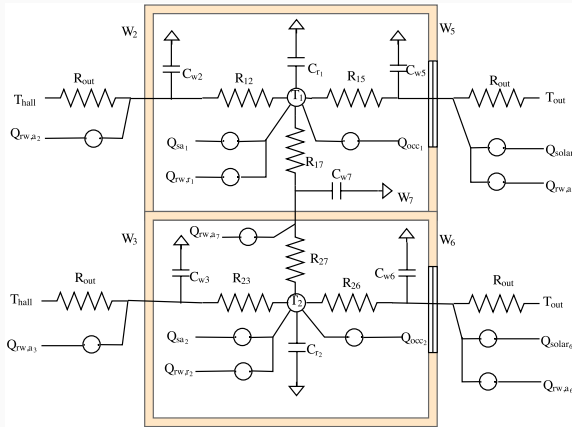


# Case studies



## CS2: large number of continuous variables

- focus on internal dynamics of **two zones**



## CS2: large number of continuous variables

- discretise model
- neglect process noise
- $x_c \in \mathbb{R}^7, u_c \in \mathbb{R}, y_c \in \mathbb{R}^2, d_c \in \mathbb{R}^5$
- constant gain vector  $Q_c$

$$\mathbf{M}_c : \begin{cases} x_c[k+1] &= A_c x_c[k] + B_c u_c[k] + F_c d_c[k] + Q_c \\ y_c[k] &= \begin{bmatrix} 1 & 0 & 0 & 0 & 0 & 0 & 0 \end{bmatrix} x_c[k]. \end{cases}$$

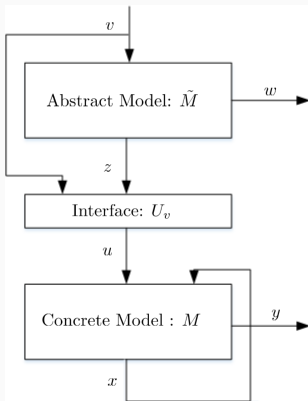


## CS2: large number of continuous variables

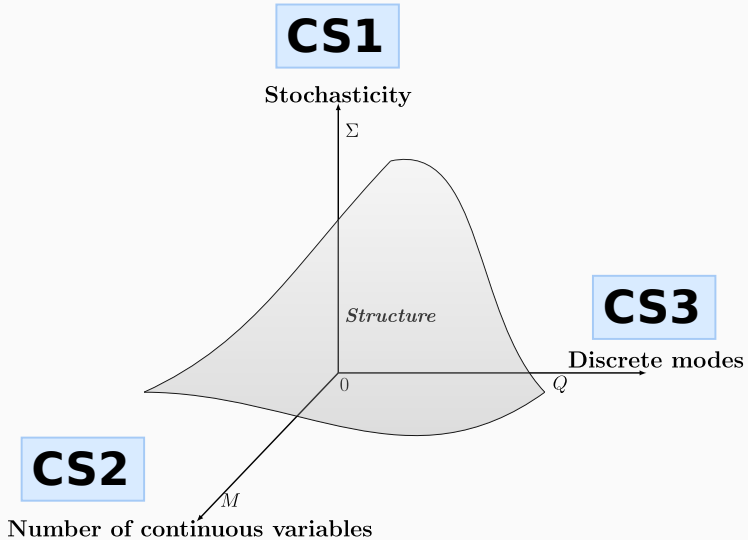
- **task**: synthesis policy that minimises deviation from mean

### policy synthesis

- set of **abstract** models
- relate via  $(\varepsilon, \delta)$  **simulation** relations
- **synthesise** policy on **abstract**
- **refine** policy for original model
- resulting policy: safety probability of  $p = 0.7657$



# Case studies



## CS3: multiple switching controls

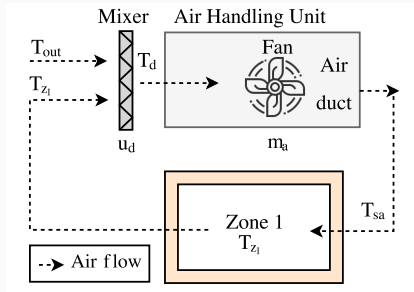
- focus on mixer, AHU air duct, and 1 zone components
- mixer position and fan settings used to maintain a comfortable temperature within the zone

## CS3: multiple switching controls

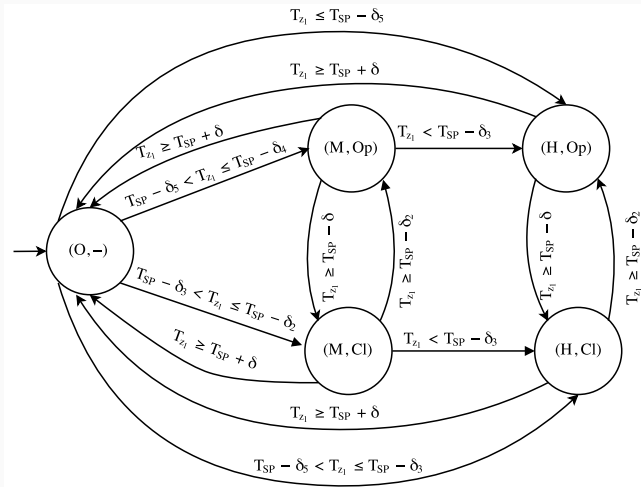
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### switching controls

- **mixer**: open (*Op*) or closed (*Cl*).
- **fan**: (off *O*, medium *M*, and high *H*)



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- discrete modes  $q$  are in the set:

$$\{(O, -), (M, Op), (M, Cl), (H, Op), (H, Cl)\},$$

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  - zone temperature ( $T_{z1}$ ) and supply air temperature ( $T_{sa}$ )
  - continuous-time ordinary differential equations
  - neglect process noise

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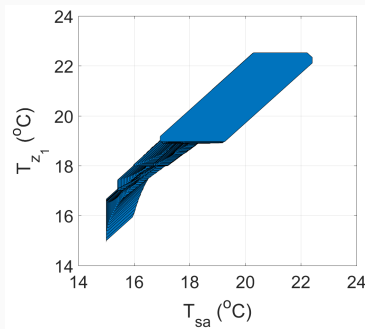
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- continuous dynamics:
  - zone temperature ( $T_{z1}$ ) and supply air temperature ( $T_{sa}$ )
  - continuous-time ordinary differential equations
  - neglect process noise
- transitions occur when crossing spatial guards:
  - denote deviations from temperature set-point

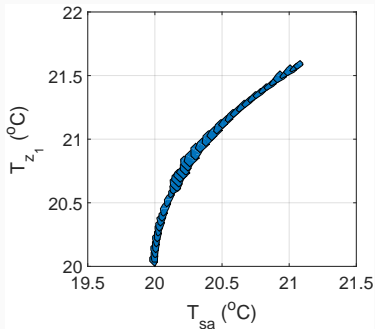


## CS3: multiple switching controls

- **task:** reachability analysis of the hybrid model
- **tool:** SpaceEx



**(a)** Initial condition:  $T_{z_1} = 15^\circ\text{C}$ ,  
 $T_{sa} = 15^\circ\text{C}$



**(b)** Initial condition:  $T_{z_1} = 20^\circ\text{C}$ ,  
 $T_{sa} = 20^\circ\text{C}$

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  - presence of stochasticity
  - number of continuous variables
  - number of discrete modes

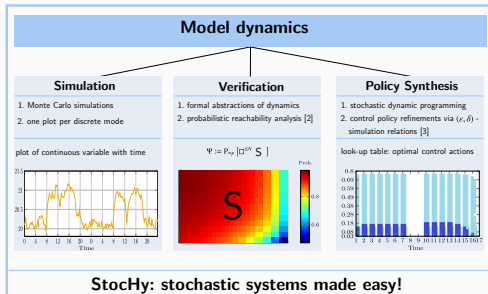
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- identified three sources of complexity:
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  - number of discrete modes
- three different case studies
- need for a unified framework to address these complexities

## Future work

- extension of library components
- formal description language

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- extension of library components
- formal description language
- **StocHy**: Stochastic hybrid systems made easy!



Come find us at poster session!

**Thank you!**

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`github.com/natchi92/BASBenchmarks`

**Questions?**