

# WIDE Kick-off Meeting



ROYAL INSTITUTE  
OF TECHNOLOGY

Partner presentation of the  
**Automatic Control Laboratory**  
**School of Electrical Engineering**  
**KTH, Stockholm, Sweden**

Attending the kick-off:

Mikael Johansson

Henrik Sandberg

Pablo Soldati

Bo Wahlberg

# Outline

- About KTH
- About the Automatic Control Lab
- Contributions to WIDE
  - Distributed optimization
  - Wireless sensor networks
  - System identification
  - Model reduction



ROYAL INSTITUTE  
OF TECHNOLOGY

# Welcome to KTH

**KTH**, the Royal Institute of Technology  
Excellence in Education, Research and Entrepreneurship



ROYAL INSTITUTE  
OF TECHNOLOGY



# KTH in Stockholm

**KTH was founded** in 1827 and has remained the largest of Sweden's technical universities. Since 1917, activities have been housed in central Stockholm in beautiful buildings which are currently protected as being of special historical interest.

**Associated colleges** are found at various places in the Stockholm surroundings – Haninge, Södertälje, and Kista.

**KTH co-operates with** Stockholm University in Kista, the main Swedish resource centre of information technology, and in the AlbaNova Centre, with its departments of physics and biotechnology.



ROYAL INSTITUTE  
OF TECHNOLOGY

# Students 2007

- A total of approximately 17,000 programme students
- 338 KTH students travelling to other universities
- 1,057 foreign exchange students began their studies at KTH
- 1,105 international master's students began their studies at KTH
- 1,434 active postgraduate students with a minimum of 50% activity



ROYAL INSTITUTE  
OF TECHNOLOGY

# Research 2007

## NUMBERS OF PROFESSORS

- 259 professors
- 5 part-time consulting professors
- 202 associate professors

## INTERNATIONALLY PUBLISHED MATERIALS

- 1,800 conference contributions (papers, etc.)

## GROWTH AREAS IN FOCUS

- Biotechnology
- Material Science and Engineering
- Information Technology
- Energy and Environment



ROYAL INSTITUTE  
OF TECHNOLOGY

# Schools

From January 2005

School of **Architecture and the Built Environment**

School of **Biotechnology**

School of **Computer Science and Communication**

School of **Electrical Engineering**

School of **Industrial Engineering and Management**

School of **Information and Communication Technology**

School of **Chemical Science and Engineering**

School of **Engineering Sciences**

School of **Technology and Health**

**Scientific Information and Learning**

KTH **Business Liaison**



ROYAL INSTITUTE  
OF TECHNOLOGY

# Automatic Control Lab

- Belongs to School of Electrical Engineering

- 4 professors
- 1 associate professor
- 2 assistant professors
- 5 postdocs
- 16 Ph.D. students
- ~ 10 persons involved in WIDE



- Main areas of research
  - Networked Embedded Systems
  - Modeling and Estimation
  - Systems Biology



ROYAL INSTITUTE  
OF TECHNOLOGY



# Distributed optimization

**Researchers: Björn Johansson, Mikael Johansson**

Research focus:

Large-scale optimization, decomposition techniques

Novel algorithms for distributed optimization

Applications in networking, wireless systems and control



ROYAL INSTITUTE  
OF TECHNOLOGY

# Sample application

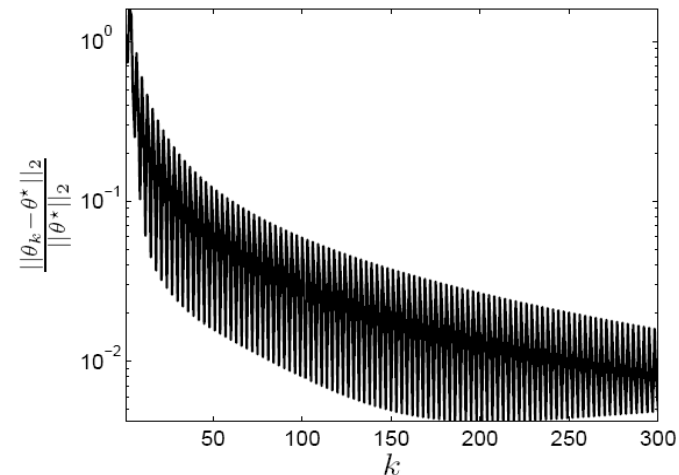
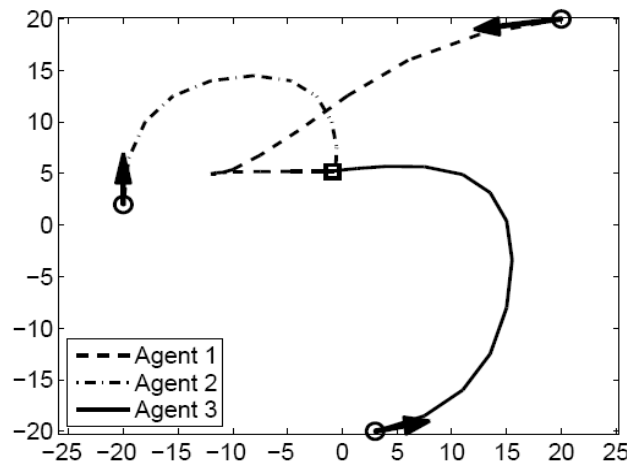
## “Distributed model-predictive consensus”

Agents should distributively agree on optimal “meeting point”

Each agent subject to linear dynamics and constraints



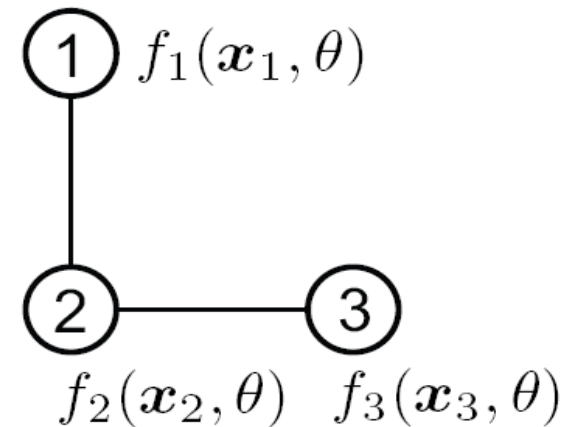
ROYAL INSTITUTE OF TECHNOLOGY



$$\begin{aligned} &\text{minimize} && \sum_i \sum_t (x_i(t) - \theta)^T Q_i (x_i(t) - \theta) + u_i^T(t) R_i u_i(t) \\ &\text{subject to} && x_i(t+1) = A_i x_i(t) + B_i u_i(t) \\ &&& x_i \in X_i, \quad \theta \in \Theta \end{aligned}$$

# A prototypical problem

$$\begin{aligned} &\text{minimize} && \sum_i f_i(x_i; \theta) \\ &\text{subject to} && x_i \in X_i, \theta \in \Theta \end{aligned}$$



Each computational node associated with a cost function  $f_i$ , and local variables  $x_i$

Can communicate with subset of “neighboring” nodes

Need to distributively agree on optimal global variables  $\theta$



ROYAL INSTITUTE  
OF TECHNOLOGY

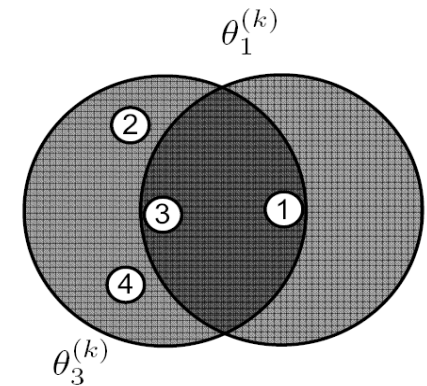
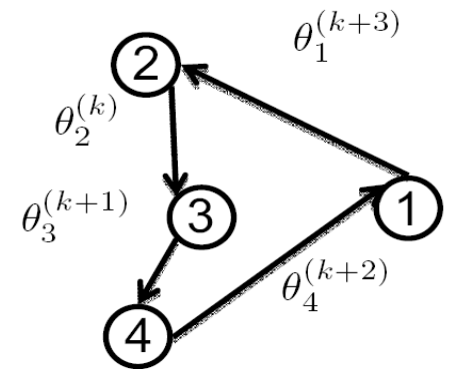
# Results and research

## Theory:

New incremental subgradient methods based on peer-to-peer communication only

Novel combinations of subgradient and consensus algorithms

$$\begin{aligned} & \text{minimize} && \sum_i f_i(x_i; \theta) \\ & \text{subject to} && x_i \in X_i, \theta \in \Theta \end{aligned}$$



## Evaluation:

Detailed simulations (ns2) + real WSN implementation (ongoing)



ROYAL INSTITUTE  
OF TECHNOLOGY

# Wireless sensor networks

**Researchers: Henrik Sandberg, Pablo Soldati,  
Haibo Zhang, Mikael Johansson**

**Research focus:**

Link scheduling and routing for wireless HART

Energy efficient networking

Control algorithms adapted to WSNs



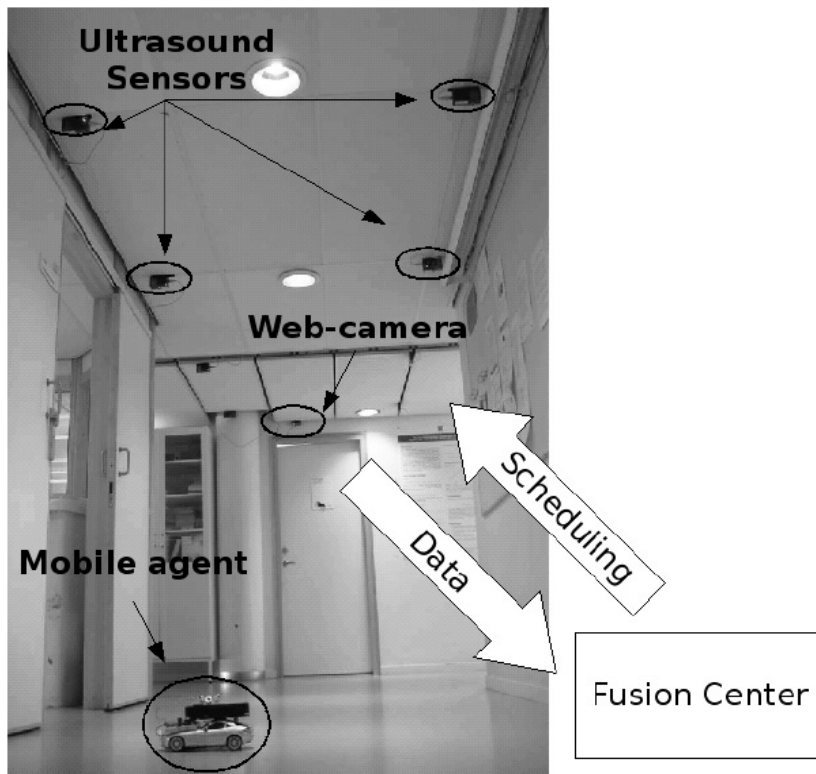
ROYAL INSTITUTE  
OF TECHNOLOGY

# Test bed and test cases

Internal test bed at KTH, industrial test case at Boliden (with ABB)



ROYAL INSTITUTE OF TECHNOLOGY



# Sample problems

## Scheduling for wireless HART networks

Scheduling of deadline-constrained traffic

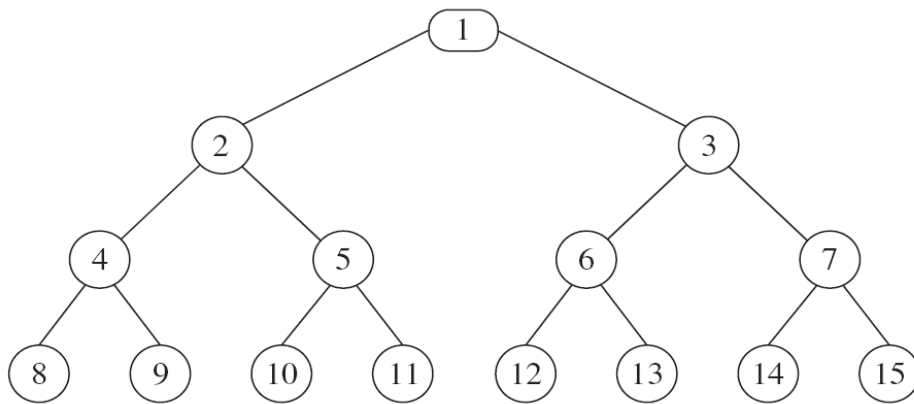
Data evacuation on trees and graphs

Graph (routing) for increased resiliency

Control algorithms for wHART networks



ROYAL INSTITUTE  
OF TECHNOLOGY



## Link scheduling to evacuate data

in minimal time,

using minimum no. channels

# System identification

**Researchers: Märta Barenthin, Mathias Barkhagen,  
Cristian Rojas, Bo Wahlberg, Håkan Hjalmarsson**

## **Visitors 2008-2009:**

Roland Hildebrand (Université Joseph Fourier, Grenoble)  
Alireza Karimi (EPFL)  
Xavier Bombois (TU Delft)

## **Research focus:**

Orthonormal basis functions (Laguerre, Kautz)  
Subspace identification  
Nonlinear systems  
Identification for control  
Experiment design  
Model accuracy



ROYAL INSTITUTE  
OF TECHNOLOGY



# Results and research

## What do we bring to WIDE?

### 1) Analysis tools for model accuracy and experiment design



ROYAL INSTITUTE  
OF TECHNOLOGY

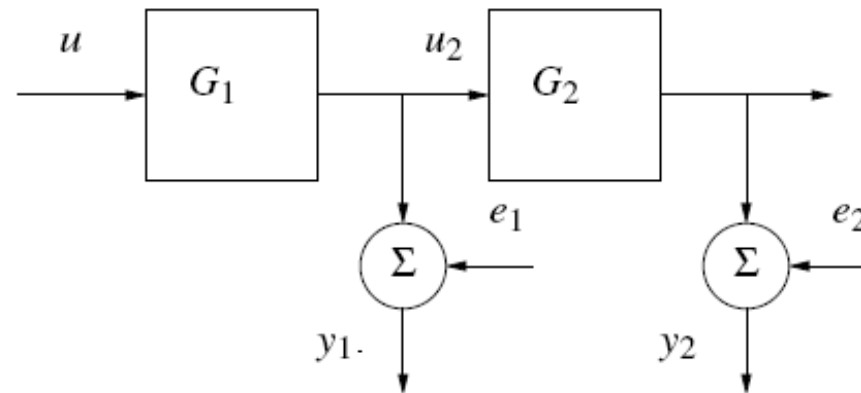
Geometric view

Brings the subspace spanned by the predictor gradient into focus

Can be used to analyze structural properties, e.g. what happens when a new input or new output is added to the system?

Potential for WIDE: Analysis of identification in decentralized systems. Which network structures are good and which are bad, from an identification point of view?

# Sample problem: Cascade (serial) system



ROYAL INSTITUTE  
OF TECHNOLOGY

Very common structure!

Sensor  $y_1$  often worse than  $y_2$ . Typically, speed and position or flow and level.

Result: Sensor  $y_2$  useless for estimating  $G_1$  when  $G_1 = G_2$ .

# Results and research

## 2) How to cope with the "curse of dimensionality"

Common belief: Complex systems = Difficult system id. problems

Key insight: "Clever" excitation can

- make important properties visible in data and easy to estimate, but also
- hide irrelevant properties so that these do not have to be identified.

Embodied in optimal experiment design

Example: Use a constant input to estimate the static gain. Works for any LTI system!



ROYAL INSTITUTE  
OF TECHNOLOGY

# Results and research

## 3) Experience from identification for control

The application governs the properties of interest

Optimal experiment design [c.f. 1)+2) above]

**Challenge:** Do the modeling requirements for MPC differ from "traditional" control?

## Earlier study with ABB

Subspace system identification

Merging of submodels using structure

Model reduction to simplify the resulting model to be used for optimization



ROYAL INSTITUTE  
OF TECHNOLOGY

# Model reduction

**Researchers: 1 Ph.D. student (to be recruited),  
Bo Wahlberg, Henrik Sandberg**



**ROYAL INSTITUTE  
OF TECHNOLOGY**

**Visitors during 2008-2009:**

Michael Cantoni (Univ. of Melbourne)

Alexander Lanzon (Univ. of Manchester)

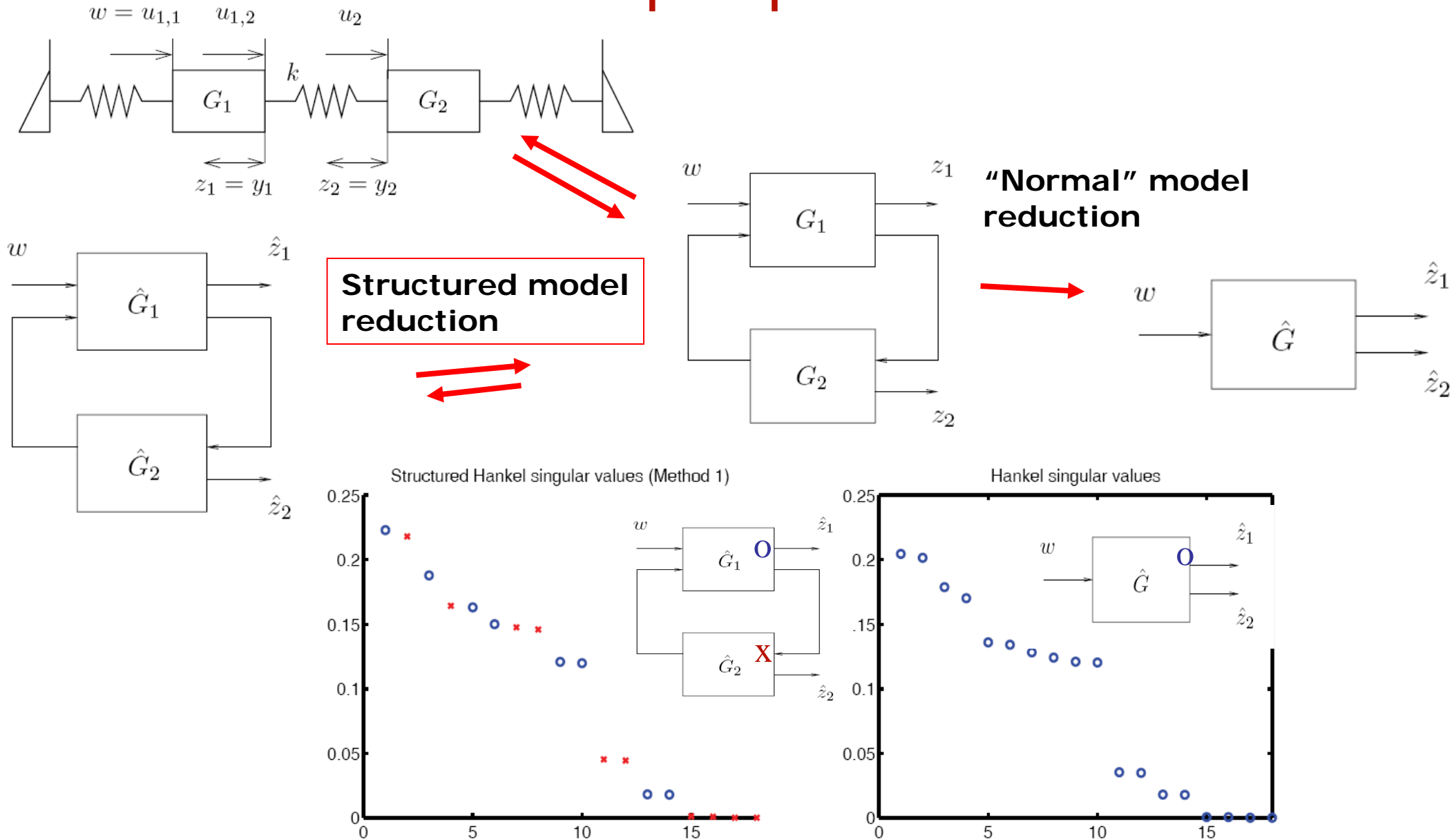
**Research focus:**

Structure constraints, networked models, LMIs

Model reduction for system identification

Time-varying and stochastic systems

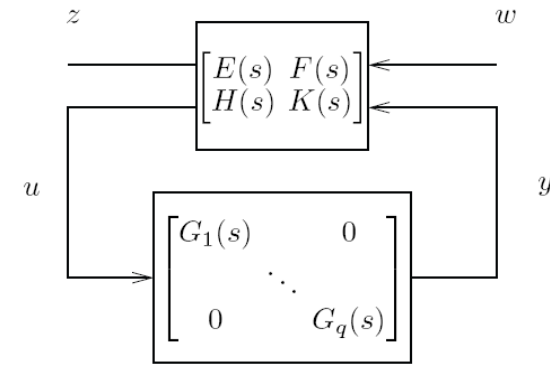
# Sample problem



# Results and research

## Theory

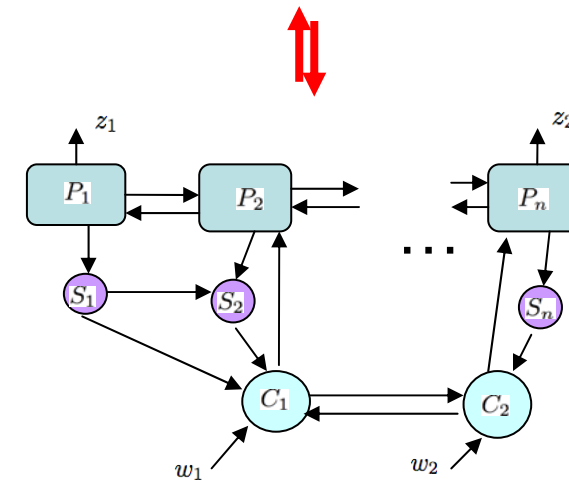
Linear Fractional Transforms (LFTs) for modeling of networked systems



Structured Hankel singular values  $\sigma_{k,i}$

Global error bounds to determine sufficient submodel complexity

$$\|\mathcal{F}_l(N, G) - \mathcal{F}_l(N, \hat{G})\|_\infty \leq 2 \sum_{k=1}^q \sum_{i=r_k+1}^{n_k} \sigma_{k,i}$$



## Evaluation

Reduce order of distributed controllers and plants (ongoing)

Quantify importance of links in models (ongoing)

Large-scale models needed!



ROYAL INSTITUTE OF TECHNOLOGY