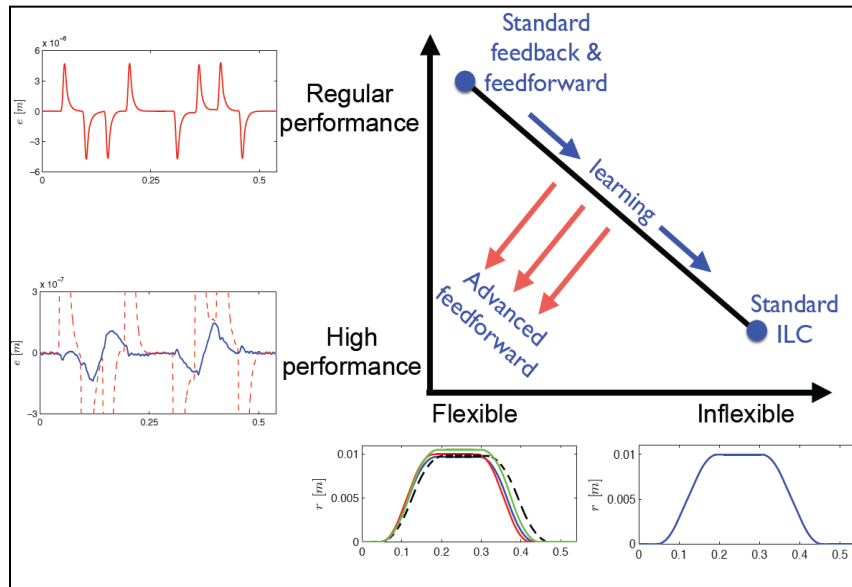


# Advanced Feedforward & Learning Control

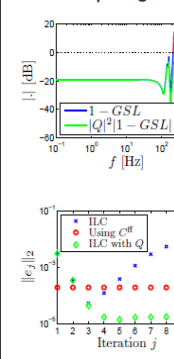


## TOPICS

- Feed-forward design for high-precision motion systems: velocity, acceleration, jerk, snap feedforward
- Iterative learning control (ILC): basics, frequency domain approach, convergence/robustness analysis, design
- Lifted iterative learning control
- Automated FF tuning using identification-based approach
- Input shaping and rational feedforward
- Repetitive control
- Simulation and design using Matlab and SIMULINK
- Hands-on experience with real-time implementation on HP printer setup.

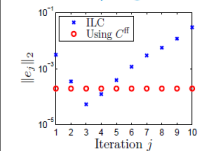


### ILC example again



### Convergence Analysis

#### Servo example again

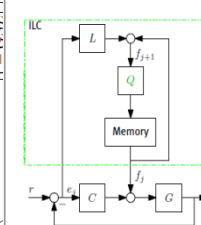


#### ILC convergence

- ▶ sampling time  $h = 5 \cdot 10^{-4}$
- ▶ monotonic convergence if  $|1 - G(e^{j\omega h})S(e^{j\omega h})L(e^{j\omega h})| < 1$
- ▶ condition violated in example:  $L$

### Enforcing Robustness

#### Basic ILC scheme



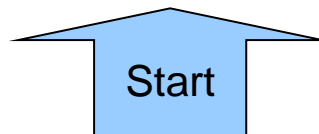
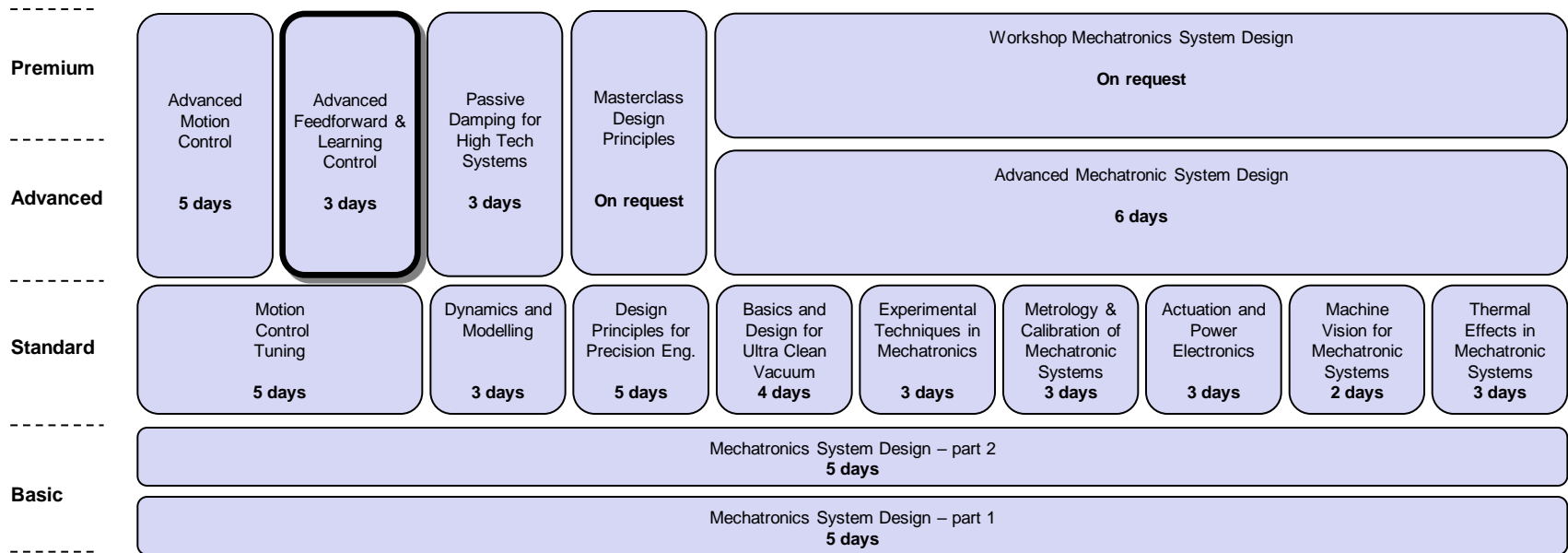
#### ILC algorithm

- ▶ introduce  $Q$
- ▶ learning update:  
$$f_{j+1} = Q(f_j + Le_j)$$
- ▶ exploit freedom in  $Q$  to ensure robustness

# Contents

- Mechatronics Training Curriculum
- Details of Course *Advanced Feedforward & Learning Control*

# Mechatronics Training Curriculum



Relevant partner trainings:  
 Applied Optics, Electronics for non-electrical engineers, System Architecture, Soft skills for technology professionals, ...

[www.mechatronics-academy.nl](http://www.mechatronics-academy.nl)

# Mechatronics Academy

- In the past, many trainings were developed within Philips to train own staff, but the training center CTT stopped.
- **Mechatronics Academy B.V.** has been setup to provide continuity of the existing trainings and develop new trainings in the field of precision mechatronics. It is founded and run by:
  - Prof. Maarten Steinbuch
  - Prof. Jan van Eijk
  - Dr. Adrian Rankers
- We cooperate in the **High Tech Institute** consortium that provides sales, marketing and back office functions.

# Advanced Feedforward Control

# Topics

- Overview application areas
- Feed-forward design for high-precision motion systems: velocity, acceleration, jerk, snap feedforward
- Iterative learning control: basic principles, frequency domain approach, convergence and robustness analysis, and design
- Lifted iterative learning control: basic principles, analysis, optimal design
- Basis functions in iterative learning control
- Automated feedforward tuning through identification-based approach
- Input shaping and rational feedforward
- Repetitive control: basic principles
- Simulation and design of systems using Matlab and SIMULINK
- Hands-on experience with real-time implementation on HP printer setup.

# Course Directors / Trainers

## Course Director(s)

- Dr.ir. Tom Oomen (TU/e)
- Dr.ir. Adrian Rankers (Mechatronics Academy)

## Teachers

- TU/Eindhoven:
  - Prof.dr.ir. Maarten Steinbuch,
  - Dr. ir. Tom Oomen
  - Ir. Robin de Rozario
  - Ir. Lennart Blanken
- Invited experts from industry
  - Dr.ir. Joost Bolder (ASML)
  - Dr.ir. Sjirk Koekebakker (Océ)

# Program

Day	Timing	Topic	Trainers
1	Morning	<ul style="list-style-type: none"> <li>• Introduction &amp; (Advanced) Feedforward</li> <li>• Frequency Domain ILC</li> </ul>	Oomen Oomen
	Afternoon	<ul style="list-style-type: none"> <li>• Frequency Domain ILC (continued)</li> <li>• Hands-on experiments</li> </ul>	Oomen
2	Morning	<ul style="list-style-type: none"> <li>• Repetitive Control</li> <li>• Hands-on experiments</li> </ul>	Blanken
	Afternoon	<ul style="list-style-type: none"> <li>• Lifted ILC</li> <li>• Hands-on experiments</li> </ul>	Oomen
3	Morning	<ul style="list-style-type: none"> <li>• Research overview</li> <li>• Automated Feedforward Tuning</li> <li>• Hands-on experiments</li> </ul>	Steinbuch Bolder
	Afternoon	<ul style="list-style-type: none"> <li>• Model-free ILC using FRFs</li> <li>• Hands-on experiments</li> <li>• Invited industry research presentation</li> </ul>	De Rozario  Koekebakker



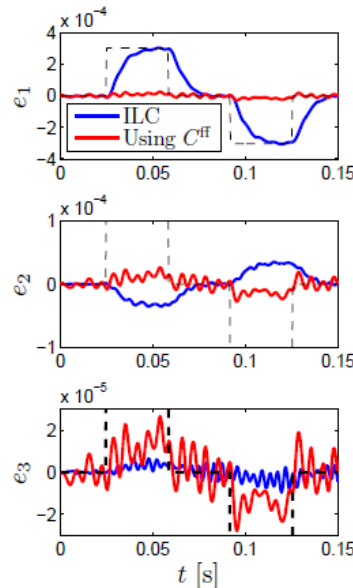
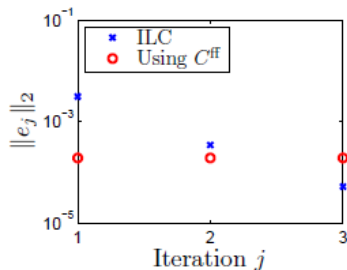
# Day 1 (morning):

- Introduction / Goals
- Advanced Feedforward
- Frequency Domain ILC

## ILC example

### ILC iterations

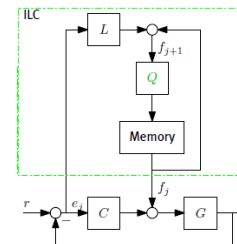
1. Initial error
2. After one iteration:
  - error reduced
3. After two iterations:
  - error further reduced
  - outperforms  $C^{ff}$ !
  - more iterations?



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## Enforcing Robustness

### Basic ILC scheme

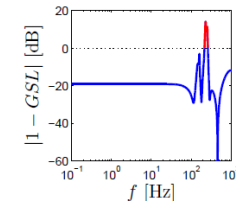
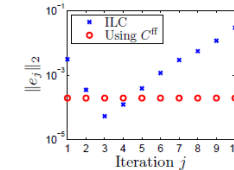


### ILC algorithm

- introduce  $Q$
- learning update:
 
$$f_{j+1} = Q(f_j + Le_j)$$
- exploit freedom in  $Q$  to ensure robustness

## Convergence Analysis

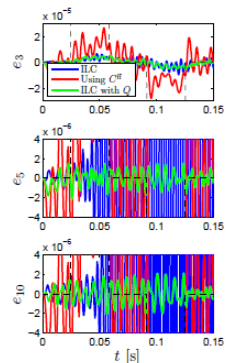
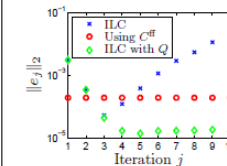
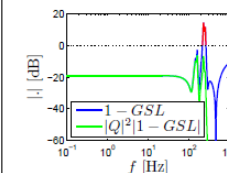
### Servo example again



### ILC converge

- sampling
- monotonic
- condition

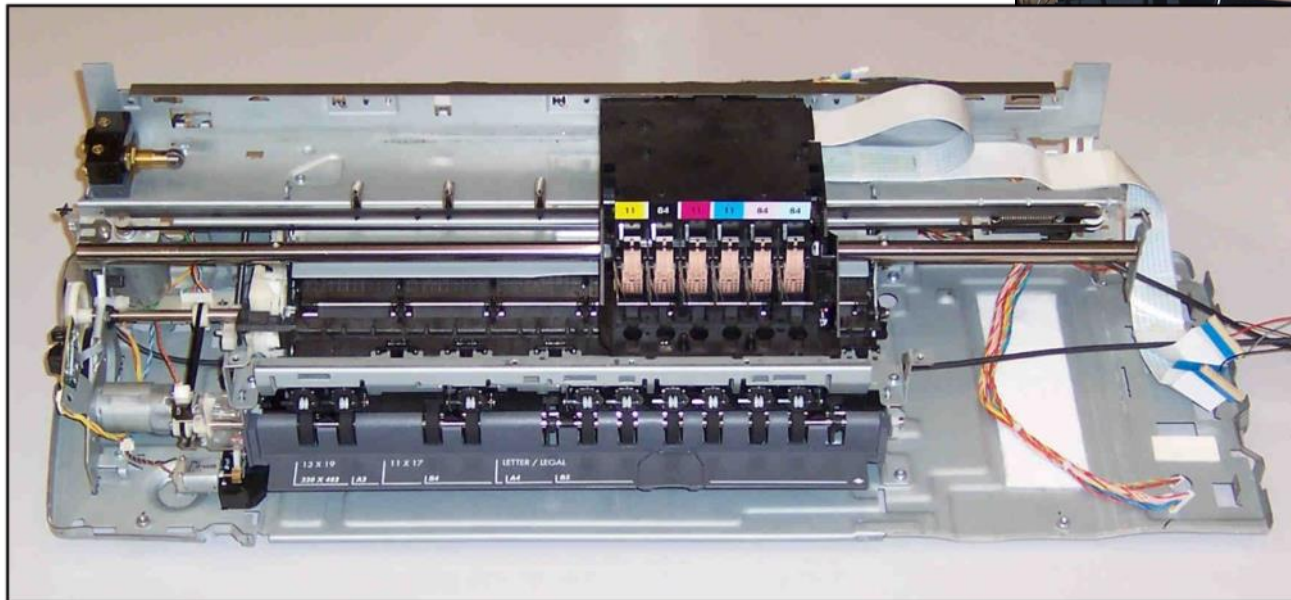
### ILC example again



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# Day 1 (afternoon):

- Frequency Domain ILC
- Hands-on experiments

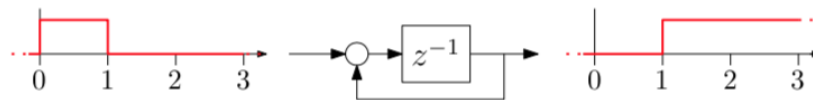


# Day 2 (morning):

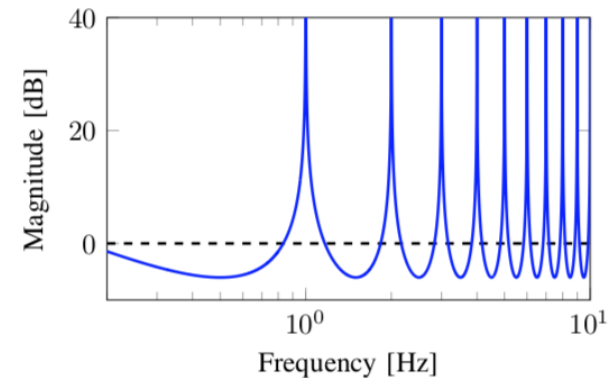
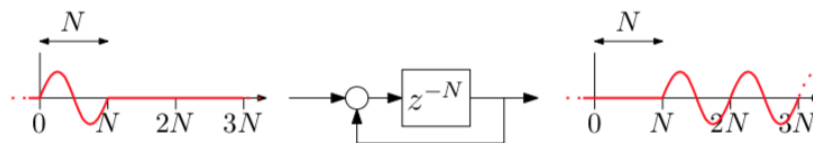
- Repetitive Control
- Experiments

## Periodic signal models

- Step disturbance: integrator



- General  $N$ -periodic disturbance: memory loop ( $N$  integrators)



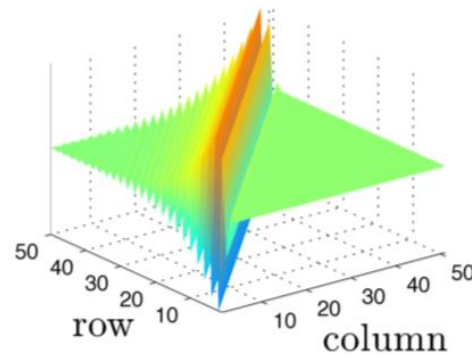
# Day 2 (afternoon):

- Lifted ILC
- Experiments

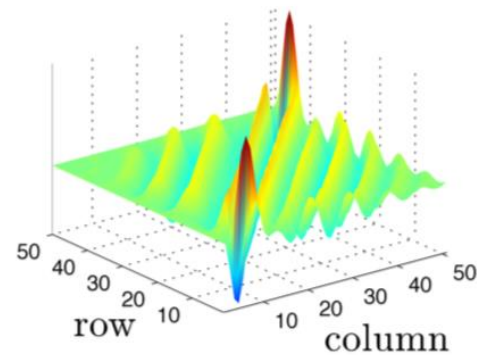
## Example revisited: frequency domain ILC

Toeplitz matrix of  $L$ :

Frequency domain ILC



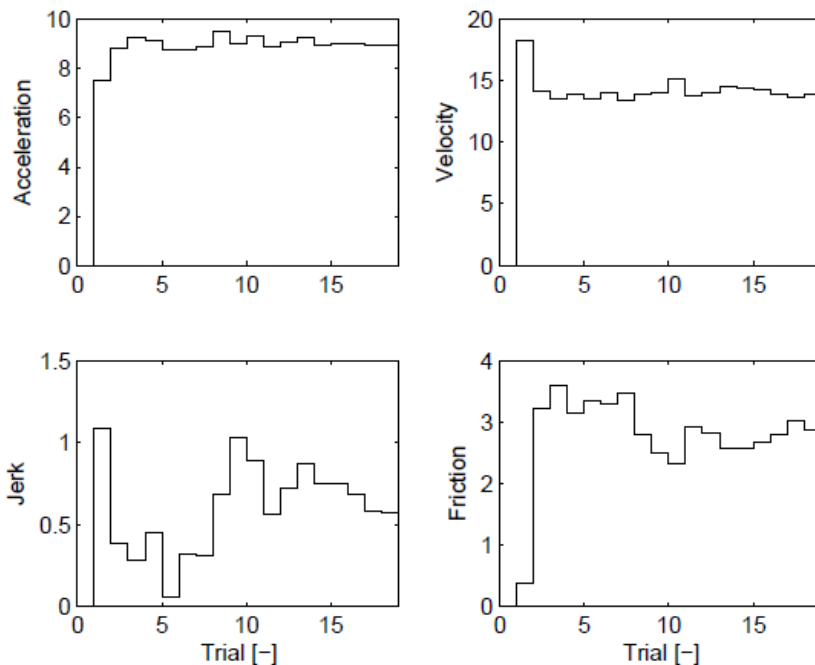
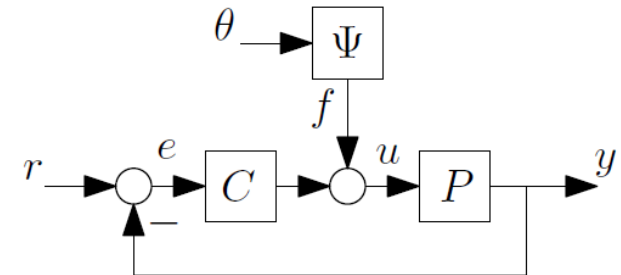
Lifted ILC



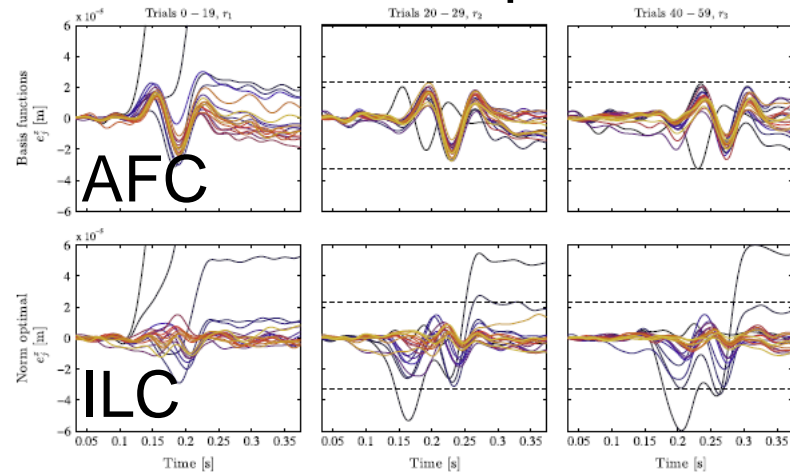
- Important difference: edge effects in red and blue
- Note: frequency domain ILC uses ZPETC

# Day 3 (morning):

- Research outlook
- Automated Feedforward tuning
- Experiments

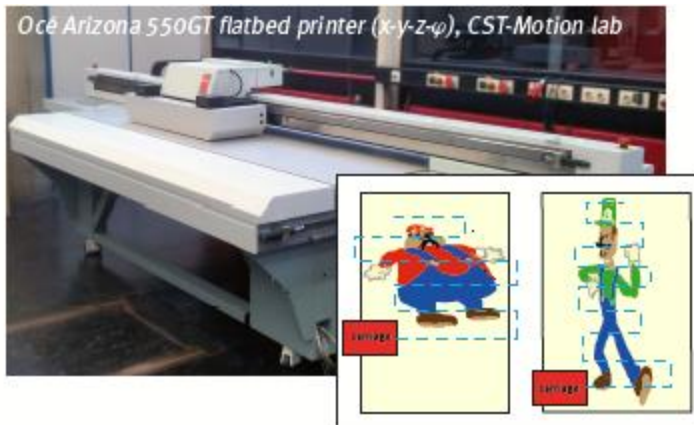


## Different setpoints

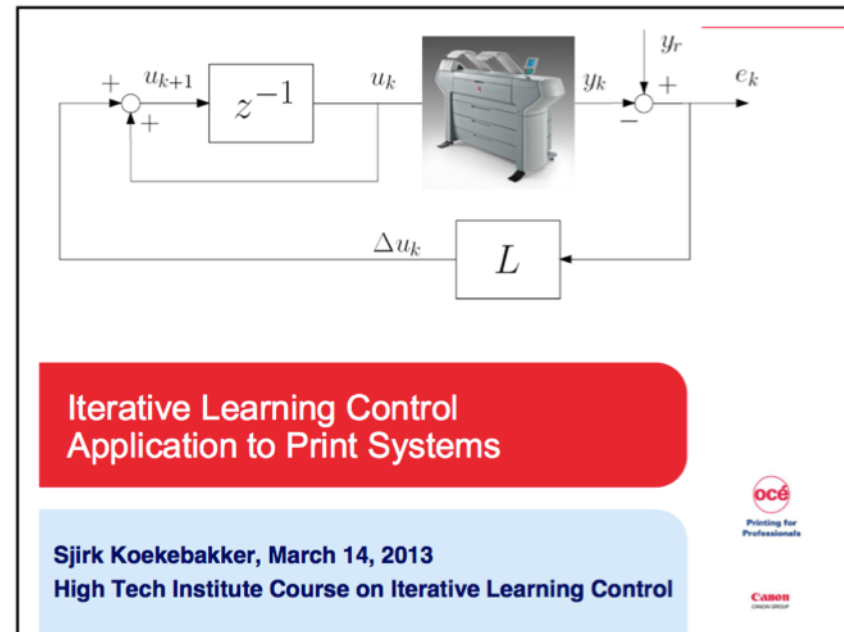
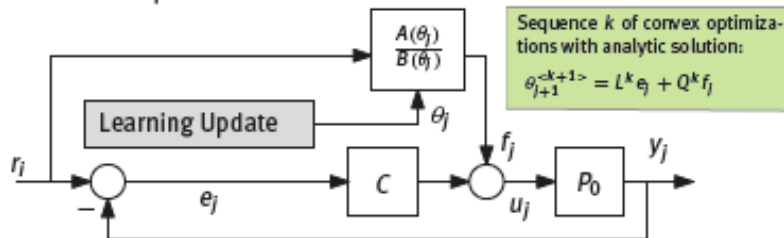


# Day 3 (afternoon): Applications/Research

- Model free ILC using FRFs
- Research outlook: printer applications, basis functions, and extensions



Data-based optimization



Sign-up for this training

Via the website of our partner  
High Tech Institute