# An LMI Approach to the Control of a Compact Disc Player

Marco Dettori SC Solutions Inc. Santa Clara, California

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Joint project between:

- Systems and Control Group, Delft University of Technology, The Netherlands.
- Philips Research Laboratories.
- Theoretical side:

Development of LMI algorithms for analysis and synthesis of control systems.

• Practical side:

Application to a Compact Disc Player system:

- Multi-objective design.
- Gain-scheduling design.

Theoretical part

- LMIs in control theory.
- Gain-scheduling for LPV systems.

Application

- Gain-scheduling design for CD player.
- Experimental set-up.
- Implementation results.

Conclusions and discussion.

A generic Linear Matrix Inequality is:

 $F(\boldsymbol{x}) < 0$ 

 $x \in \mathbf{R}^m$ , F(x) is a real symmetric matrix F(.) is an affine mapping '<' means negative definite.

Form with matrix variables:

$$X := \begin{bmatrix} x_1 & x_2 \\ x_3 & x_4 \end{bmatrix}$$

$$A'XB + B'X'A + C < 0$$

Solving an LMI is a convex optimization problem:

$$\min t$$
$$\lambda_{max}(A'XB + B'X'A + C) < t$$

# Lyapunov stability criterion

 $\dot{x} = Ax$  is asymptotically stable iff

$$X > 0, \quad A'X + XA < 0$$

# **Bounded Real Lemma**

The system

$$\dot{x} = Ax + Bu$$
$$y = Cx$$

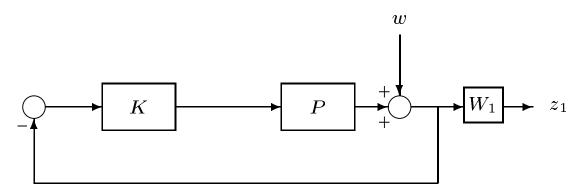
has  $\mathcal{H}_\infty$  norm smaller than 1 iff

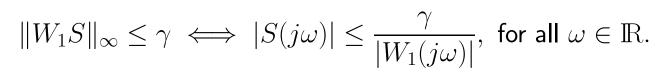
 $\boldsymbol{X} > 0, \quad \boldsymbol{A'X} + \boldsymbol{X}\boldsymbol{A} + \boldsymbol{X}\boldsymbol{B}\boldsymbol{B'X} + \boldsymbol{C'C} < 0$  iff

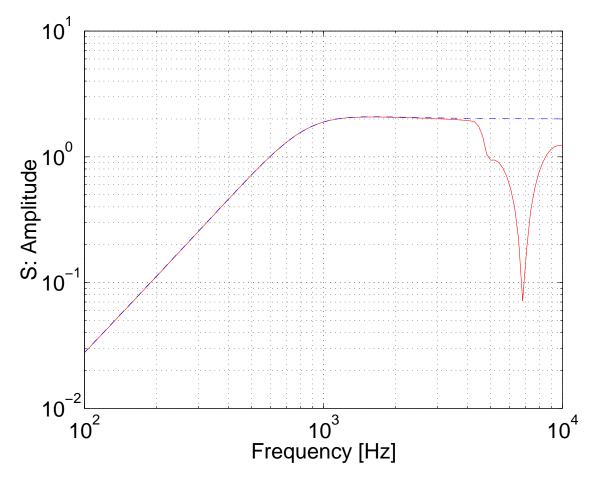
$$X > 0, \quad \begin{bmatrix} A'X + XA + C'C \ XB \\ B'X \ -I \end{bmatrix} < 0$$

# $H_{\infty}$ loopshaping: S scheme

#### Disturbance attenuation

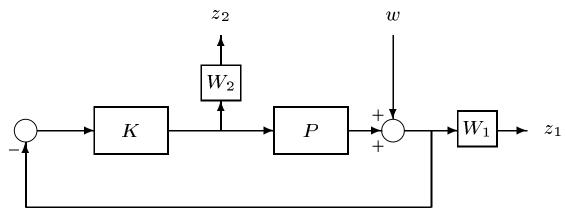






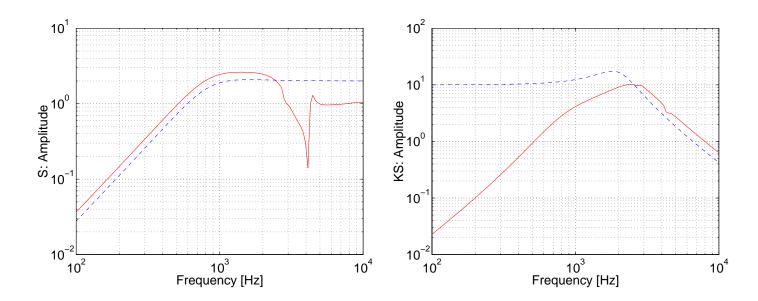
# $H_{\infty}$ loopshaping: S/KS scheme

Disturbance attenuation with bounded control



$$\left(\begin{array}{c} W_1S\\ W_2KS \end{array}\right) \bigg\|_{\infty} \leq \gamma \iff$$

 $\sqrt{|W_1(j\omega)S(j\omega)|^2 + |W_2(j\omega)K(j\omega)S(j\omega)|^2} \le \gamma, \, \forall \, \omega \in \mathbb{R}.$ 



# Benefits of LMI formulation

• Recent development of powerful interior point methods for convex optimization (1994).

Available software packages:

LMI Toolbox for Matlab: Gahinet, Nemirovskij,
Laub, Chilali
SP: Boyd, Vandenberghe
LMITOOL: El Ghaoui, Delebecque, Nikoukhah
SDPpack: Overton, Alizadeh et al.

• Through LMIs it is possible to numerically solve problems otherwise unsolvable.

Multi-objective Control Linear Parametrically Varying Control

#### Motivation

Gain scheduling: design controller for nonlinear systems using linear design tools.

- Classical approach:
  - linearize the system at various operating points
  - design linear controller at each point
  - interpolate to get a 'global' controller

Drawback: no systematic way to perform interpolation.

- LPV approach:
  - systematic design method
  - no need for interpolation step
  - based on LMI techniques

Given the nonlinear system

$$\dot{x} = a(x, q_1) + b_1(x, q_1)w + b_2(x, q_1)u$$
$$z = c_1(x, q_1) + d_1(x, q_1)w + d_2(x, q_1)u$$
$$y = c(x, q_1) + d(x, q_1)w$$

Suppose x = 0 is an equilibrium for all  $q_1$ . Rewrite

$$\dot{x} = A(x, q_1)x + B_1(x, q_1)w + B_2(x, q_1)u$$
$$z = C_1(x, q_1)x + D_1(x, q_1)w + D_2(x, q_1)u$$
$$y = C(x, q_1)x + D(x, q_1)w$$

Arrive at LPV system:

- Replace  $\boldsymbol{x}$  by  $q_2$ 

- Define 
$$p = \begin{pmatrix} q_1 \\ q_2 \end{pmatrix} \in \Pi$$

# LPV system

$$llpv \dot{x} = A(p(t))x + B_1(p(t))w + B_2(p(t))u$$
$$z = C_1(p(t))x + D_1(p(t))w + D_2(p(t))u$$
$$y = C(p(t))x + D(p(t))w.$$

where  $p(t) \in \Pi$  for all t.

Example:

$$\dot{x} = x \sin(x)$$

can be transformed into

$$\dot{x} = p x, \quad p \in [-1, 1]$$

# The LPV system

$$\dot{x}(t) = A(p(t))x(t) + B(p(t))w_1(t)$$
$$z_1(t) = C(p(t))x(t) + D(p(t))w_1(t)$$

is exponentially stable and has  $L_2$  gain  $w_1 \to z_1$  smaller than  $\gamma$  if

$$\exists \text{ Lyapunov matrix } X > 0 \text{ s.t. } \forall p \in \Pi$$

$$\begin{bmatrix} A(p)'X + XA(p) \ XB_1(p) \ C_1(p)' \\ B_1(p)'X \ -\gamma I \ D_1(p)' \\ C_1(p) \ D_1(p) \ -\gamma I \end{bmatrix} < 0$$

Infinitely many LMI's in X. Two ways to proceed:

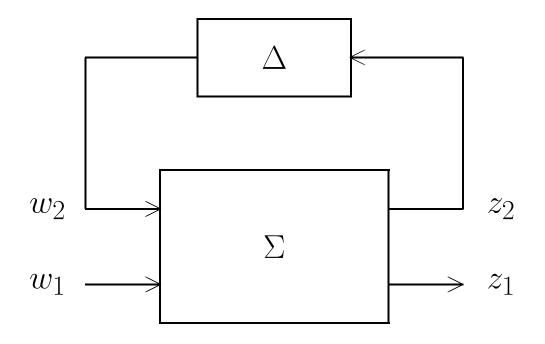
- Gridding techniques
- Introduction of scalings

# LFT representation of LPV systems

"Pulling out" the parameter p:

$$\begin{bmatrix} \dot{x} \\ z_1 \\ z_2 \end{bmatrix} = \begin{bmatrix} A & B_1 & B_2 \\ C_1 & D_1 & D_{12} \\ C_2 & D_{21} & D_2 \end{bmatrix} \begin{bmatrix} x \\ w_1 \\ w_2 \end{bmatrix}, w_2 = \Delta(\mathbf{p})z_2$$

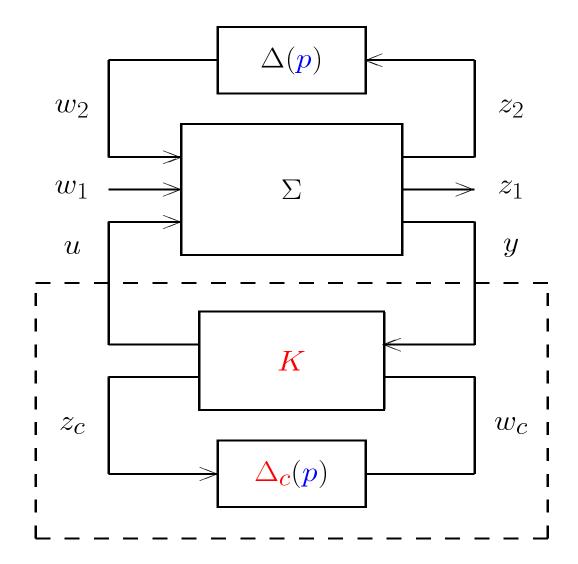
where  $\Delta(.)$  is continuous



# Controller synthesis

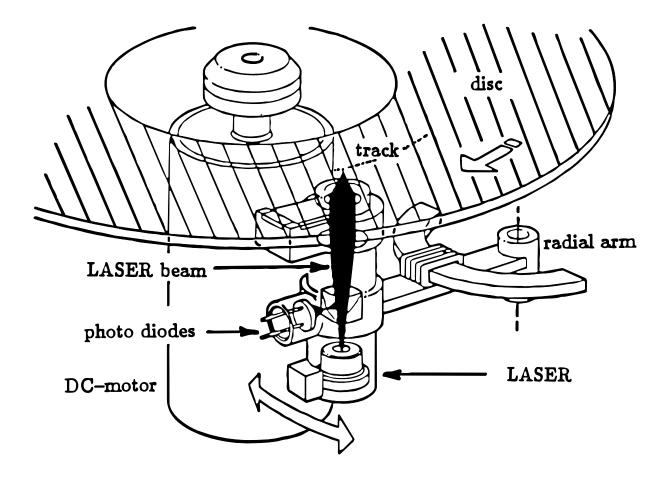
Controller with same structure of the plant

$$\begin{bmatrix} \dot{x} \\ u \\ z_c \end{bmatrix} = \begin{bmatrix} A_c & B_{c1} & B_{c2} \\ C_{c1} & D_{c1} & D_{c12} \\ C_{c2} & D_{c21} & D_{c2} \end{bmatrix} \begin{bmatrix} x \\ y \\ w_c \end{bmatrix}, w_c = \Delta_c(p) z_c$$

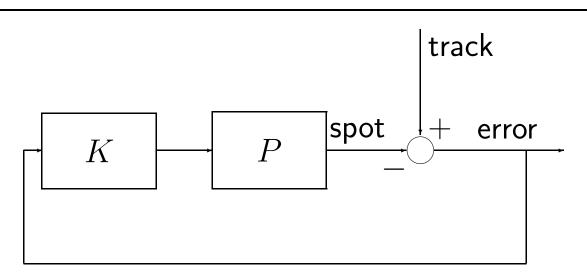


Synthesis algorithms based om LMI techniques

# The CD player system



# Specs for the CD



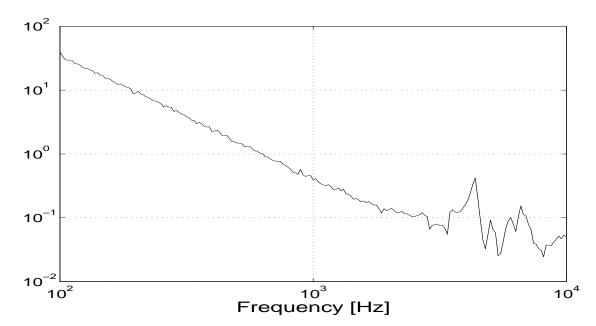
Disturbance suppression

 max. track eccentricity: 100 μm
 max. allowable position error: 0.1 μm
 ⇒ Factor 1000 time-domain attenuation

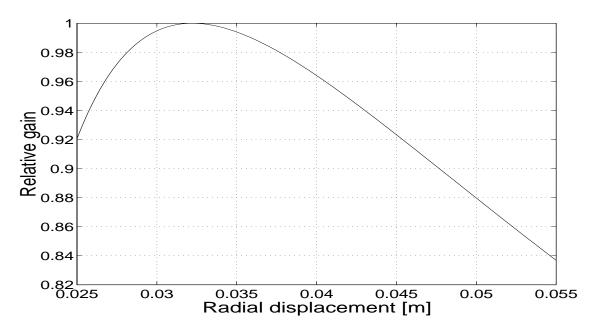
 Relatively small bandwidth avoid high power consumption no amplification of audible noise robustness

#### Plant characteristics

#### Amplitude of P at a fixed track position

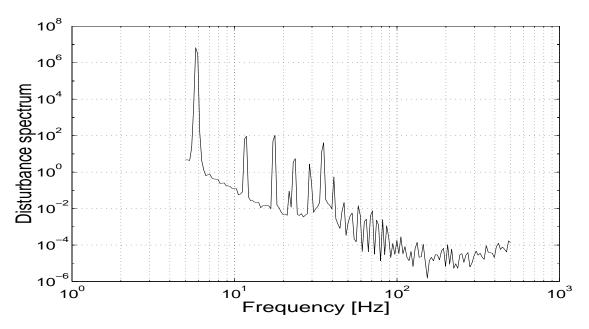


The gain of P varies with track position:



# Disturbance characteristics

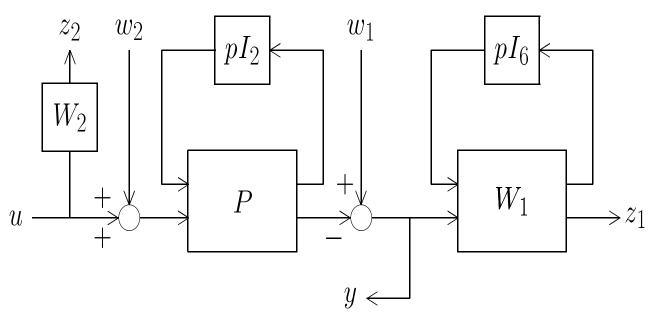
# Spectrum of the disturbance at a fixed track



Location of harmonics vary with rotational frequency.

New high-performance applications require higher rotational frequency (30 Hz)  $\Rightarrow$  necessity of adaptive selective disturbance suppression.

#### LPV model of the CD



Scheduling parameter is  $p = 2\pi f_{rot}$ , with 25 Hz  $\leq f_{rot} \leq$  35 Hz.

 $\boldsymbol{P}$  is scheduled for gain variations.

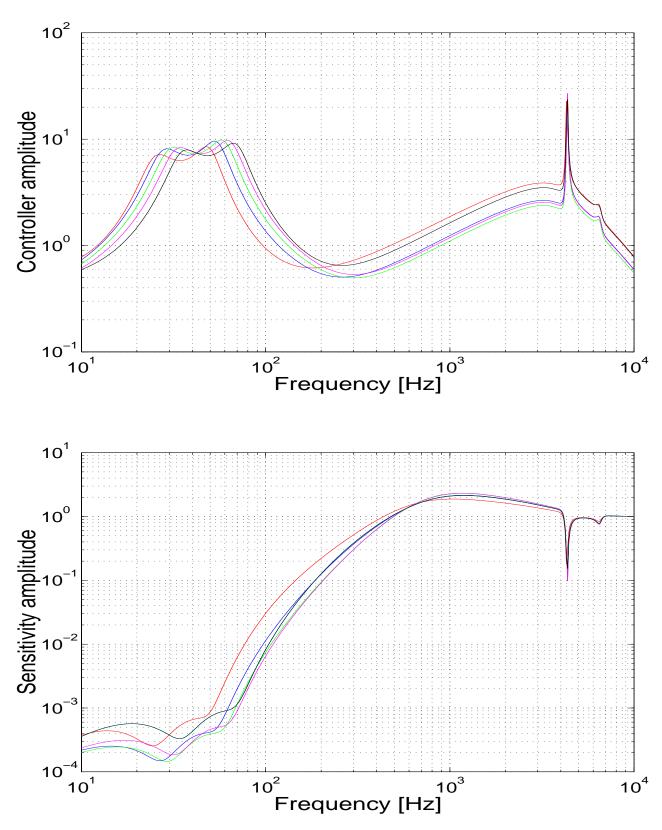
Performance filter  $W_1$  models frequency-varying notches

$$W_1(s, p) = \frac{s^2 + 2\zeta_z ps + p^2}{s^2 + 2\zeta_p ps + p^2} \frac{s^2 + 4\zeta_z ps + 4p^2}{s^2 + 4\zeta_p ps + 4p^2}$$

Filter  $W_2$  for robustness issues.

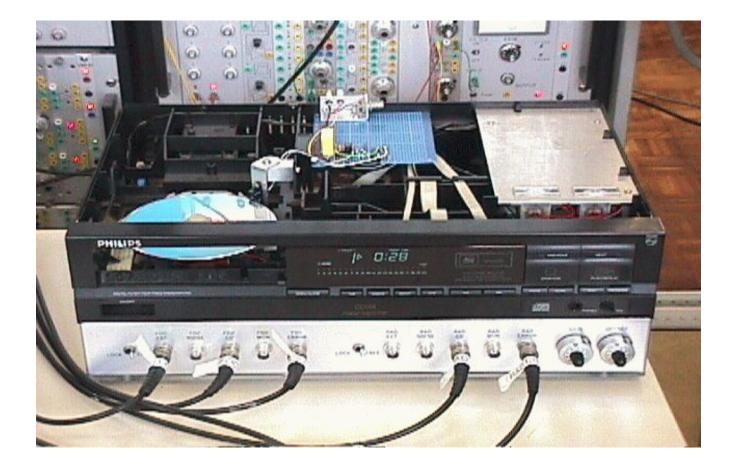
# Results: "Frequency domain"

Amplitude of controller and sensitivity for the five "frozen" values  $f_{rot}=25, 27.5, 30, 32.5, 35$  Hz:



## Experimental set-up

# "Old" Philips audio CD Player



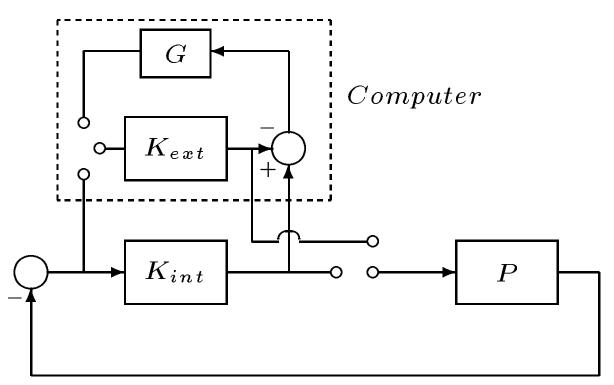
Set-up with two dSpace systems:

- C40 to measure rotational frequency.
- Multiprocessor (C40 and Alpha) to implement the controller.

Implementation scheme

Problems:

- Implementation of unstable controllers
- Bumpless switch from internal to external controller



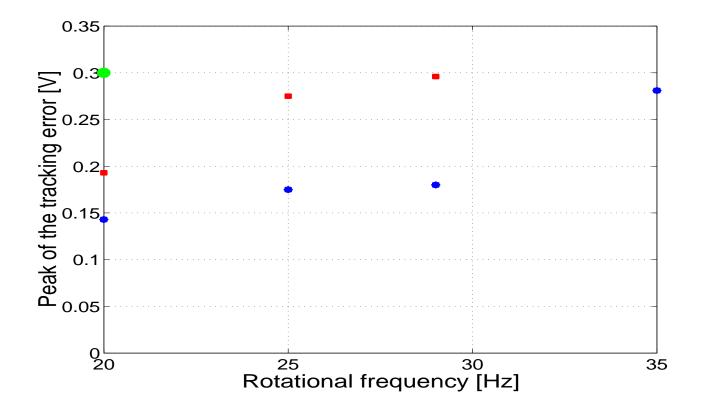
G stabilizes  $K_{ext}$  during the start-up procedure

- High order controllers
- High sampling rate (20 kHz)

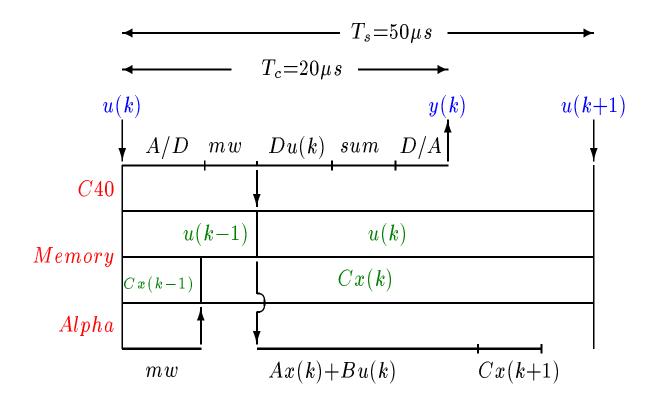
## Experimental results

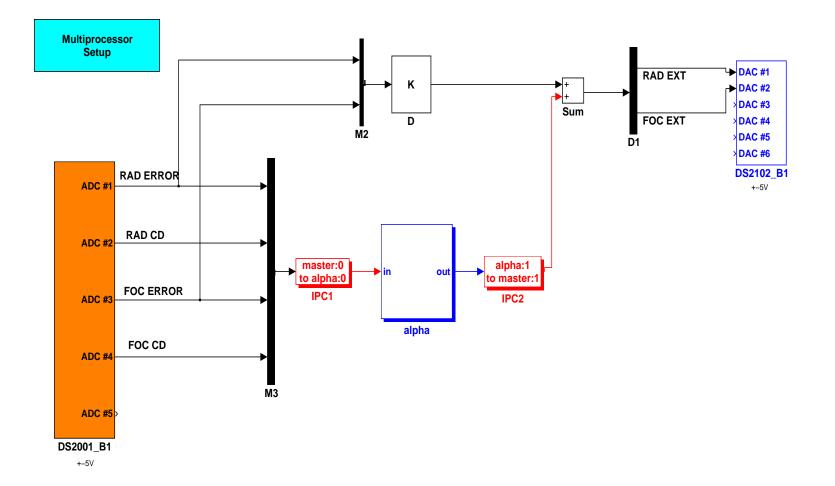
Comparison with a high performing LTI controller.

Peak of tracking error for several fixed values of the rotational frequency

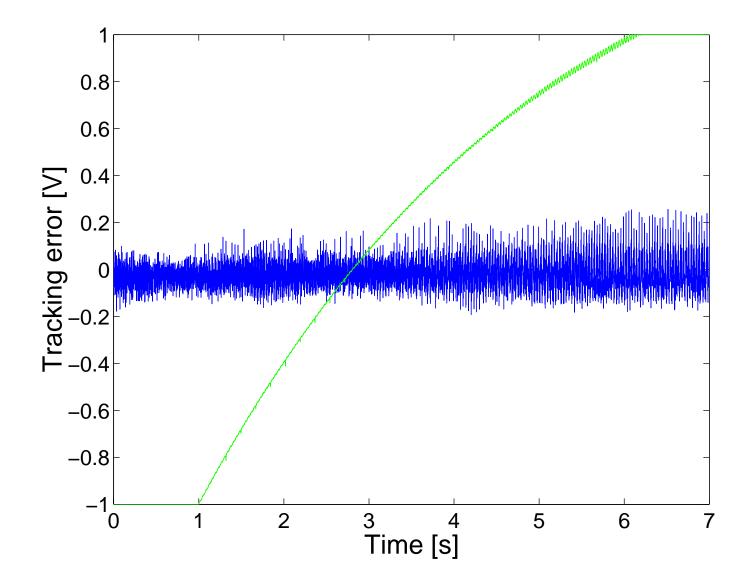


LPV controller LTI controller Internal controller



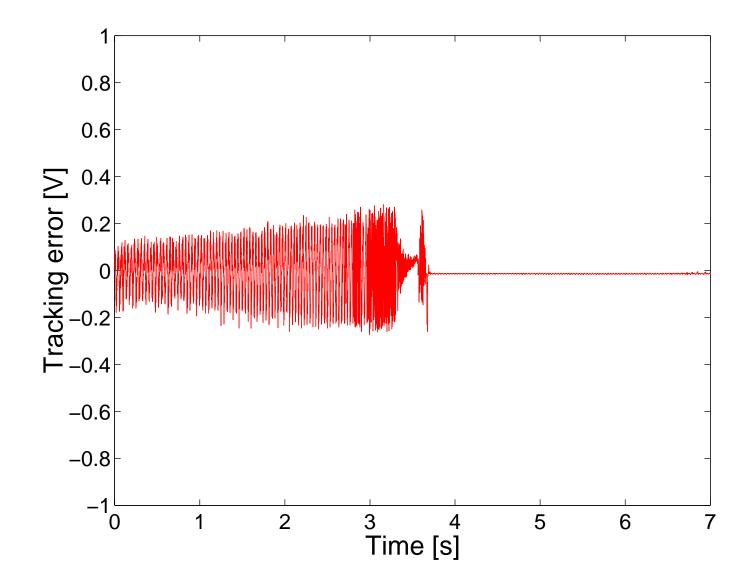


#### Experimental results: fast parameter transition



Parameter transition LPV tracking error:

# Experimental results: fast parameter transition



## LTI tracking error

- LPV techniques allow to design controller with stability and performance guarantees over the whole operative range of the plant.
- Experimental set-up based on dSpace systems to implement LPV controllers.
- LPV controller improves performance of the CD player servosystem as required by high-demanding applications.