Toward nonlinear tracking and rejection using LPV control

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Tracking and rejection

- Usual control problems involve both tracking and rejection specifications
- Let us focus on a simple problem: Given a nonlinear plant G_{NL} , find K_{NL} such that



Typical control specs

- tracking of step references with a null static error and a response time ≤ a given time (e.g. 0.1 s)
- rejection of step disturbances at the plant input
- limited control energy

LTI case: H_{∞} control achieves tracking and rejection specs

■ NL case: the usually proposed extension is \mathcal{L}_2 gain control

\blacksquare \mathcal{L}_2 gain nonlinear controller can be computed using LPV approach

Does the (LPV/nonlinear) \mathcal{L}_2 gain controller achieves tracking and rejection?

LTI case: H_{∞} control approach

- With weighting functions W_1 , W_2 , W_3 suitable for the specs
- Compute K_{LTI} such that H_{∞} norm of the following closed loop system less than 1



H_{∞} control approach (recall)





Given an (augmented) LTI plant PLTI

$$\begin{cases} \dot{x}(t) = Ax(t) + B_w w(t) + B_u u(t) \\ z(t) = C_z x(t) + D_{zw} w(t) + D_{zu} u(t) \\ y(t) = C_y x(t) + D_{yw} w(t) + D_{yu} u(t) \end{cases}$$

Compute an LTI controller KLTI

$$\begin{cases} \dot{\overline{x}}(t) = A_{\mathcal{K}}\overline{x}(t) + B_{\mathcal{K}}y(t) \\ u(t) = C_{\mathcal{K}}\overline{x}(t) \end{cases}$$

Such that

$$\|T_{w\to z}\|_{\infty} \leq 1$$

Efficient solution (Riccati or LMI)



- Nice steady state behaviour
 - Stability of LTI system \Rightarrow for constant input, output \longrightarrow constant
 - Stability + integral control ⇒ null error
- Nice transient behavior
 - Inequality on the weighted H_{∞} norm of the closed loop system

- LTI case: H_{∞} control achieves tracking and rejection specs
- **I** NL case: the usually proposed extension is \mathcal{L}_2 gain control
- $\blacksquare \ \mathcal{L}_2$ gain nonlinear controller can be computed using LPV approach

Does the (LPV/nonlinear) \mathcal{L}_2 gain controller achieves tracking and rejection?

\mathcal{L}_2 gain control problem



Given an (augmented) nonlinear plant P_{NL}

$$\begin{cases} \dot{x}(t) &= f(x(t), w(t), u(t)) \\ z(t) &= g(x(t), w(t), u(t)) \\ y(t) &= h(x(t), w(t)) \end{cases}$$

Compute a nonlinear controller K_{NL}

$$\begin{cases} \dot{\overline{x}}(t) = f_{\mathcal{K}}(\overline{x}(t), y(t)) \\ u(t) = g_{\mathcal{K}}(\overline{x}(t), y(t)) \end{cases}$$

such that the \mathcal{L}_2 gain of the closed loop system is less than 1: for all w

$$\forall T > 0, \quad \int_0^T z(t)^T z(t) \, dt \leq \int_0^T w(t)^T w(t) \, dt$$



■ For LTI system, ||T_{w→z}||_∞ ≤ 1 is equivalent to the L₂ gain is less than 1: for all w

$$\forall T > 0, \quad \int_0^T z(t)^T z(t) dt \le \int_0^T w(t)^T w(t) dt$$

• A natural idea: extend the H_{∞} control to nonlinear systems by the \mathcal{L}_2 gain control: usually referred to as "nonlinear H_{∞} control"

Two questions

How to compute a solution (nonlinear controller) to the \mathcal{L}_2 gain control problem?

No efficient direct approach \Rightarrow indirect approach: Quasi LPV control

Does the L₂ gain controller ensures nice tracking and rejection properties as in the LTI case?

See application on the illustrative example

Two questions

How to compute a solution (nonlinear controller) to the \mathcal{L}_2 gain control problem?

No efficient direct approach \Rightarrow indirect approach: Quasi LPV control

2 Does the \mathcal{L}_2 gain controller ensures nice tracking and rejection properties as in the LTI case?

See application on the illustrative example

Two questions

How to compute a solution (nonlinear controller) to the \mathcal{L}_2 gain control problem?

No efficient direct approach \Rightarrow indirect approach: Quasi LPV control

2 Does the \mathcal{L}_2 gain controller ensures nice tracking and rejection properties as in the LTI case?

See application on the illustrative example

Given a Linear Parameter Varying (LPV) plant GLPV

$$\begin{cases} \dot{x}(t) = \mathbf{A}(\theta(t))x(t) + \mathbf{B}_{1}(\theta(t))w(t) + \mathbf{B}_{2}(\theta(t))u(t) \\ z(t) = \mathbf{C}_{1}(\theta(t))x(t) + \mathbf{D}_{11}(\theta(t))w(t) + \mathbf{D}_{12}(\theta(t))u(t) \\ y(t) = \mathbf{C}_{2}(\theta(t))x(t) + \mathbf{D}_{21}(\theta(t))w(t) + \mathbf{D}_{22}(\theta(t))u(t) \end{cases}$$

- $\theta(t)$ = vector of time varying parameters, measured in real-time, which belong to a given interval
- **A**(.), **B**₁(.),... rational functions of $\theta_i(t)$

Compute an LPV controller K_{LPV}

$$\begin{cases} \dot{\overline{x}}(t) = \mathbf{A}_{\mathcal{K}}(\theta(t))\overline{x}(t) + \mathbf{B}_{\mathcal{K}}(\theta(t))y(t) \\ u(t) = \mathbf{C}_{\mathcal{K}}(\theta(t))\overline{x}(t) \end{cases}$$

Such that the \mathcal{L}_2 gain of the closed loop system is less than 1: for all w

$$\forall T > 0, \quad \int_0^T z(t)^T z(t) \, dt \le \int_0^T w(t)^T w(t) \, dt$$

 Solutions of the LPV control problem can be computed using LMI optimization

A strong motivation of the LPV control problem is to propose, in contrast with the gain scheduling control, a rigorous solution to the nonlinear L₂ gain control problem¹

¹W. J. Rugh and J. S. Shamma, "Research on gain scheduling," *Automatica*, vol. 36, pp. 1401–1425, 2000.

Connecting LPV control and nonlinear \mathcal{L}_2 gain control via quasi LPV

To the (augmented) nonlinear plant P_{NL}

$$\begin{cases} \dot{x}(t) &= f(x(t), w(t), u(t)) \\ z(t) &= g(x(t), w(t), u(t)) \\ y(t) &= h(x(t), w(t)) \end{cases}$$
(1)

is associated an LPV plant PLPV

$$\begin{cases} \dot{x}(t) = \mathbf{A}(\theta(t))x(t) + \mathbf{B}_{1}(\theta(t))w(t) + \mathbf{B}_{2}(\theta(t))u(t) \\ z(t) = \mathbf{C}_{1}(\theta(t))x(t) + \mathbf{D}_{11}(\theta(t))w(t) + \mathbf{D}_{12}(\theta(t))u(t) \\ y(t) = \mathbf{C}_{2}(\theta(t))x(t) + \mathbf{D}_{21}(\theta(t))w(t) + \mathbf{D}_{22}(\theta(t))u(t) \end{cases}$$
(2)

such that with

$$\Omega_{NL} = \left\{ \left(\begin{array}{ccc} x & z & y & w & u \end{array} \right) \mid (1) \text{ is satisfied} \right\}$$

and

$$\Omega_{LPV} = \left\{ \left(\begin{array}{cccc} x & z & y & w & u \end{array} \right) \mid (2) \text{ is satisfied} \right\}$$

we have

 $\Omega_{\textit{NL}} \subset \Omega_{\textit{LPV}}$

$$y = G_{NL}(u) \text{ with}$$

$$\begin{cases} \dot{x}_1(t) = -100\varphi(x_1(t)) - 70x_2(t) + 300u(t) \\ \dot{x}_2(t) = 70x_1(t) - 14x_2(t) \\ y(t) = x_1(t) \end{cases}$$

with φ defined by



that is

 $0 \leq \varphi(x_1) \leq 2x_1$

To the nonlinear plant G_{NL} :

$$\begin{cases} \dot{x}_1(t) = -100\varphi(x_1(t)) - 70x_2(t) + 300u(t) \\ \dot{x}_2(t) = 70x_1(t) - 14x_2(t) \\ y(t) = x_1(t) \end{cases}$$

we associate the LPV plant G_{LPV} :

$$\begin{cases} \dot{x}(t) = A_G(\theta(t))x(t) + \begin{bmatrix} 300\\ 0 \end{bmatrix} u(t) \\ y(t) = \begin{bmatrix} 1 & 0 \end{bmatrix} x(t) \end{cases}$$

with²

$$A_G(\theta(t)) = \begin{bmatrix} 0 & -70 \\ 70 & -14 \end{bmatrix} + \theta(t) \begin{bmatrix} -100 & 0 \\ 0 & 0 \end{bmatrix}$$

 $^{2}\theta(t) = \frac{\varphi(y(t))}{y(t)}$ with $0 \leq \varphi(y) \leq 2y$

Application to the illustrative example of the quasi LPV method

For step tracking and step rejection, an LPV controller is computed using the augmented plant defined as follows.



- Thanks to the embedding process, this controller is a solution to the nonlinear L₂ gain control problem
- Does the LPV controller ensure satisfying tracking and rejection?

Behaviour of the **LPV** closed loop system with respect to initial conditions & zero inputs

For a given function $\theta(t) \in [0, 2]$



Output y(t) for different initial conditions x_0



Behaviour of the **LPV** closed loop system with respect to initial conditions & zero inputs

Output y(t) for different initial conditions x_0



 $(\mathcal{L}_2 \text{ gain})$ stability ensures convergence to 0 for different initial conditions

Behaviour of the **LPV** closed loop system with respect to step reference & disturbance

For a given function $\theta(t) \in [0, 2]$



Output y(t) for $x_0 = 0$, a step disturbance at 4s and a square reference signal





Output y(t) for $x_0 = 0$, a step disturbance at 4s and a square reference signal



Behaviour of the **LPV** closed loop system with respect to step reference & disturbance

Output y(t) for $x_0 = 0$, a step disturbance at 4s and a square reference signal



 $(\mathcal{L}_2 \text{ gain})$ stability + integral control do not ensure step tracking/rejection for LPV system

What's going on with the non-linear plant?

Output y(t) for $x_0 = 0$, a step disturbance at 4s and a square reference signal





Output

Behaviour of the **non-linear** closed loop system with respect to step reference & disturbance

Output y(t) for $x_0 = 0$, a step disturbance at 4s and a square reference signal



 $(\mathcal{L}_2 \text{ gain})$ stability + integral control do not ensure step tracking/rejection for nonlinear system

Except for input signals close to 0

For inputs close to 0, the \mathcal{L}_2 gain control solution reduces to the H_∞ one³

Null static errors for step reference & disturbance by integral control depend on the property that for constant inputs, the system signals tend to constant values

 \blacksquare Unfortunately, this property is not ensured by (\mathcal{L}_2 gain) stability

How to ensure a good behavior?

 $^{^{3}}$ A. J. van der Schaft, " \mathcal{L}_{2} -gain analysis of nonlinear systems and nonlinear state feedback H_{∞} control," *IEEE Trans. Automatic Control*, vol. 37, no. 6, pp. 770–784, June 1992

Nonlinear plant G_{NL}

$$\begin{cases} \dot{x}(t) = f(x(t), w(t)) \\ z(t) = g(x(t), w(t)) \end{cases}$$

• (\mathcal{L}_2 gain) stability if $\exists \gamma \geq 0, \forall w$,

$$\forall T > 0, \quad \int_0^T z(t)^T z(t) \, dt \le \gamma^2 \int_0^T w(t)^T w(t) \, dt$$

 \mathcal{L}_2 gain of $\mathcal{G}_{\textit{NL}}$ ($\|\mathcal{G}_{\textit{NL}}\|_{i-2}$) = the smallest value of such γ

■ incremental (\mathcal{L}_2 gain) stability if stability and $\exists \eta \geq 0, \forall T > 0, \forall w_1, \forall w_2,$

$$\int_0^T (z_1(t) - z_2(t))^T (z_1(t) - z_2(t)) dt \le \eta^2 \int_0^T (w_1(t) - w_2(t))^T (w_1(t) - w_2(t)) dt$$

Incremental \mathcal{L}_2 gain of G_{NL} ($||G_{NL}||_{\Delta}$) = the smallest value of such η

For an LTI system, H_{∞} norm = \mathcal{L}_2 gain = incremental \mathcal{L}_2 gain

	LTI	NL	NL
\downarrow Specs \setminus Norm \rightarrow	H_{∞}	\mathcal{L}_2 gain	incremental gain
Unique steady state	YES	NO	YES
Convergence of the unperturbed motions	YES	NO	YES
Constant input \longrightarrow constant output	YES	NO	YES
T periodic input \longrightarrow T periodic output	YES	NO	YES
Quantitative perf.	YES	NO	YES
Robustness	YES	YES	YES

V. Fromion and S. Monaco and D. Normand-Cyrot, The weighted incremental norm approach: from linear to nonlinear H_∞ control,

Automatica 2001

- V. Fromion and G. Scorletti. The behavior of incrementally stable discrete time systems, System and Control Letters 2002
- V. Fromion, Some results on the behavior of Lipschitz continuous systems, ECC 97

Qualitative specifications



Convergence of the unperturbed motions

Constant (periodic) input \longrightarrow

Constant (periodic) output



Disturbance attenuation of a set of perturbation d, for any initial condition



for *d* such that $\|W_p^{-1}(d)\|_{2,T} \le \|d\|_{2,T} \Rightarrow \|y\|_{2,T} \le \alpha$

Given an (augmented) nonlinear plant P_{NL}

$$\begin{cases} \dot{x}(t) = f(x(t), w(t), u(t)) \\ z(t) = g(x(t), w(t), u(t)) \\ y(t) = h(x(t), w(t)) \end{cases}$$

Compute a nonlinear controller K_{NL}

$$\begin{cases} \dot{\overline{x}}(t) &= f_{\mathcal{K}}(\overline{x}(t), y(t)) \\ u(t) &= g_{\mathcal{K}}(\overline{x}(t), y(t)) \end{cases}$$

Such that the **incremental** \mathcal{L}_2 gain of the closed loop system is less than 1: for all w_1 , w_2

$$\forall T > 0, \int_0^T (z_1(t) - z_2(t))^T (z_1(t) - z_2(t)) dt < \int_0^T (w_1(t) - w_2(t))^T (w_1(t) - w_2(t)) dt$$

• As for \mathcal{L}_2 gain control, no efficient direct method for solving this problem

Equivalence between local properties and global properties

NL Plant $y = G_{NL}(u) : \begin{cases} \dot{x}(t) = f(x(t), u(t)) \\ y(t) = g(x(t), u(t)) \end{cases}$ (1)

(Gâteaux Derivative) TV Linearizations of G_{NL} at $u_r \in \mathcal{L}_2$

$$\overline{y} = DG_{NL}[u_r](\overline{u}) : \begin{cases} \dot{\overline{x}}(t) = \overline{A}(t)\overline{x}(t) + \overline{B}(t)\overline{u}(t) \\ \overline{y}(t) = \overline{C}(t)\overline{x}(t) + \overline{D}(t)\overline{u}(t) \end{cases}$$

with

$$\begin{bmatrix} \overline{A}(t) & \overline{B}(t) \\ \overline{C}(t) & \overline{D}(t) \end{bmatrix} = \begin{bmatrix} \frac{\partial f}{\partial x}(x_r(t), u_r(t)) & \frac{\partial f}{\partial u}(x_r(t), u_r(t)) \\ \frac{\partial g}{\partial x}(x_r(t), u_r(t)) & \frac{\partial g}{\partial u}(x_r(t), u_r(t)) \end{bmatrix}$$

where $x_r(t)$ is the solution of (1) for the input $u(t) \equiv u_r(t)$

NL Plant

$$y = G_{NL}(u) : \begin{cases} \dot{x}(t) = f(x(t), u(t)) \\ y(t) = g(x(t), u(t)) \end{cases}$$
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Mean Value Theorem in Norm

$$||G_{NL}||_{\Delta} \leq \gamma \quad \Leftrightarrow \quad ||DG_{NL}[u_r]||_{i,2} \leq \gamma, \ \forall \ u_r \in \mathcal{L}_2$$



 K_{NL} such that $||\mathcal{F}_{l}(G_{NL}, K_{NL})||_{\Delta} < \gamma$



 K_{NL} such that $||\mathcal{F}_{I}(G_{NL}, K_{NL})||_{\Delta} < \gamma$

 DK_{NL} such that $||\mathcal{F}_{l}(DG_{NL}, DK_{NL})||_{i,2} < \gamma$

1 How to compute for any $u_r \in \mathcal{L}_2$, $DK_{NL}[u_r]$?

 \hookrightarrow Use an LPV method with G_{LPV} which embeds $DG_{NL}[u_r]$ for any u_r

2 From $DK_{NL}[u_r]$, defined for any $u_r \in \mathcal{L}_2$, how to compute K_{NL} ?

 \hookrightarrow focus on a special class of nonlinear control problems with the appropriated LPV control method

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LPV model embeds time varying linearizations

To the time varying linearizations $DP_{NL}[w_r, u_r]$

$$\begin{cases} \dot{\overline{x}}(t) = A(t)\overline{x}(t) + B_w(t)\overline{w}(t) + B_u(t)\overline{u}(t) \\ \overline{z}(t) = C_z(t)\overline{x}(t) + D_{zw}(t)\overline{w}(t) + D_{zu}(t)\overline{u}(t) \\ \overline{y}(t) = C_y(t)\overline{x}(t) + D_{yw}(t)\overline{w}(t) + D_{yu}(t)\overline{u}(t) \end{cases}$$
(3)

is associated an LPV plant

$$\begin{cases} \dot{x}(t) = \mathbf{A}(\theta(t))x(t) + \mathbf{B}_{1}(\theta(t))w(t) + \mathbf{B}_{2}(\theta(t))u(t) \\ z(t) = \mathbf{C}_{1}(\theta(t))x(t) + \mathbf{D}_{11}(\theta(t))w(t) + \mathbf{D}_{12}(\theta(t))u(t) \\ y(t) = \mathbf{C}_{2}(\theta(t))x(t) + \mathbf{D}_{21}(\theta(t))w(t) + \mathbf{D}_{22}(\theta(t))u(t) \end{cases}$$
(4)

such that with

$$\Omega_{DNL} = \left\{ \left(\begin{array}{ccc} \overline{x} & \overline{z} & \overline{y} & \overline{w} & \overline{u} \end{array} \right) \mid \exists u_r, w_r, (3) \text{ is satisfied} \right\}$$

and

$$\Omega_{LPV} = \left\{ \left(\begin{array}{cccc} x & z & y & w & u \end{array} \right) \mid (4) \text{ is satisfied} \right\}$$

we have

 $\Omega_{\textit{DNL}} \subset \Omega_{\textit{LPV}}$

Roughly speaking, nonlinear system of the form

$$\begin{cases} \dot{x}(t) = Ax(t) + B_2u(t) + \tilde{f}(x(t)) \\ x(0) = x_0 \end{cases}$$

- with $\tilde{f}(x(t)) = B_0 p(t)$
- where p(t) is measured on-line or where the components of x(t), w(t) and u(t) necessary for the computation of p(t) are measured, that is, there exists a function α such that

$$p(t) = \alpha(x(t), w(t), u(t))$$

 More details in S. de Hillerin, G. Scorletti, and V. Fromion, "Reduced-Complexity Controllers for LPV Systems: Towards Incremental Synthesis," *Proc. IEEE Conf. on Decision and Control*, dec 2011









 \overline{K} such that $||\mathcal{F}_l(DG_{NL},\overline{K})||_{i,2} < \gamma$









Conclusion: toward a new approach of nonlinear control using LPV

- Two existing approaches of nonlinear control using LPV
 - Gain scheduling
 - Main idea: LPV model embeds time invariant linearizations of nonlinear plant
 - Interest: improve a widespread engineering practise
 - Drawback: few garantees on the closed loop behavior
 - Quasi LPV
 - Main idea: LPV model embeds nonlinear plant
 - Interest: stability garantees
 - Drawback: typical specs are not ensured

Proposition of a third LPV approach

- LPV for incremental control
 - Main idea: LPV model embeds time variant linearizations of nonlinear plant
 - Interest: stability and typical control specs are ensured
 - Drawback: more works for the controller integration

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- Pave the way to a common LTI/NL framework for performance control, ensuring typical closed-loop specifications
- A key result of robust control is the translation of performance specs in a well-posed optimisation problem (*H*_∞ norm, LTI case)
- Its extension for typical specs is not the L₂ gain / stability approach but the incremental L₂ gain / incremental stability one
- Combined with LPV methods, pave the way to the practical design of nonlinear controllers ensuring typical specifications
- Objective: propose a rigourous alternative to the widespread gain-scheduling control used by the engineers