

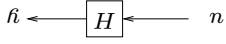
# Lecture 2: feedback systems as interconnections of operators

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Course website: <http://www.montefiore.ulg.ac.be/systems/grad04/iqc.htm>

## Systems as operators



$H$  'maps' the signal  $u$  to the signal  $y$

$H$  defines an operator from a signal space to a signal space.

? Does it work for a LTI differential system ?

? Does it work for more general situations (nonlinear, time-varying, ...)?

## Contents

1. Systems as operators
2. Feedback interconnections of operators
3. Stability analysis of feedback systems

## Signal spaces

This course: enough to view a signal  $f$  as a function from  $\mathbb{R}$  (or  $[0, \infty)$ ) to  $\mathbb{R}^p$ .

Minimal requirements:  $f \in \mathcal{L}$  **normed linear space**

(linear combinations of signals are signals and signals can be 'measured' by a norm)

Examples:  $L^p[0, \infty) = \{f \mid \|f\| = (\int_0^\infty |f(t)|^p dt) < \infty\}$ ,  $p = 1, 2, \dots$   
 $L^\infty[0, \infty) = \{f \mid \|f\| = \sup_{t \geq 0} |f(t)| < \infty\}$

Additional requirements (e.g. for passivity):  $f \in \mathcal{H}$  **Hilbert space**

(norm derives from an inner product + completeness)

Example:  $L_2[0, \infty)$ , with inner product  $\langle f, g \rangle = \int_0^\infty f(t)g(t)dt$

Operators are maps  $H : \mathcal{L} \rightarrow \mathcal{L}$  that can be composed and linearly combined. assume  $H(0) = 0$ .

Essential properties:

linearity:  $H(\alpha f + \beta g) = \alpha H(f) + \beta H(g)$

finite (linear) gain  $\gamma$  if  $\|H(f)\| \leq \gamma \|f\| \forall f \in \mathcal{L}$

causality: 'future' of  $H(f)$  only depends on 'past' of  $f$ .

The finite gain property is also called boundedness of the operator (which is different from BIBO!). The 'best' bound  $\gamma = \gamma(H)$  is called the operator gain. Note:  $\gamma(H_1 H_2) \leq \gamma(H_1) \gamma(H_2)$ .

### Examples of operators associated to LTI differential systems

The convolution operator

$$H u = h * u = \int_{-\infty}^{\infty} h(\tau) u(t - \tau) d\tau$$

linear bounded operator on  $L^p(-\infty, \infty)$  provided  $h \in L^1(-\infty, \infty)$ .

For any  $p = 1, 2, \dots$ , its  $L^p$  gain is bounded by  $\|h\|_1$ .

its  $L^2$  gain is  $\gamma_2 = \max_{\omega \in \mathbb{R}} \sigma_{\max}(j\omega H) = \|H\|_{H^\infty}$ .

its  $L^\infty$  gain is  $\gamma_\infty = \|h\|_1$ .

Proof: (1) see lecture notes (based on Hölder inequality); (2,3): homework!

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### Linear operators associated to LTI differential systems

Each transfer function  $H(s) = C(sI - A)^{-1}B + D$  which has no poles on the imaginary axis  $H \in \mathbf{RL}_{m \times m}^\infty$  defines a **bounded linear** operator on  $L^p(-\infty, \infty)$

$$H u = h * u = \int_{-\infty}^{\infty} h(\tau) u(t - \tau) d\tau$$

where  $h(t)$  is the *impulse response*, that is, the inverse Laplace transform of  $H(s)$  (restricted to the domain that contains the imaginary axis)

The operator is **causal** iff  $H(s)$  has no poles in the right-half plane. In this case,  $h(t) = 0 \forall t \leq 0$  and the operator is (also) defined on  $L^p[0, \infty)$

### Other examples of bounded operators

- a sector nonlinearity (the sector needs to be linearly bounded);

- multiplication by a time-varying bounded gain.

- a (nonlinear) dissipative system with supply  $\gamma|u|_2^2 - |y|_2^2$  and zero initial condition:

$$\int_t^0 |y(\tau)|_2^2 d\tau \leq \gamma \int_t^0 |u(\tau)|_2^2 d\tau - |y(t)|_2^2 - |x(t)|_2^2$$

(not much beyond that ...)

Note: causality expresses as  $P_T H P_T = P_T H P_T$  for all  $T$ .

$H$  is causal and bounded on  $\mathcal{L}^e$  iff  $H$  is causal and bounded on  $\mathcal{L}$

a causal operator  $H$  has finite gain (i.e. is bounded) on  $\mathcal{L}^e$  if  $\|Hf\| = \sup_{f \in \mathcal{L}^e \setminus \{0\}} \frac{\|Hf\|}{\|f\|}$  is finite.

$$P_T f(t) = \begin{cases} f(t), & t \leq T \\ 0, & t > T \end{cases}$$

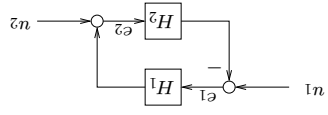
$f \in \mathcal{L}^e$  if the truncated signal  $P_T f \in \mathcal{L}$  for all  $T \geq 0$ .

### Extended signal spaces $\mathcal{L}^e$

A reasonable notion of stability: existence of a bounded (finite gain) causal operator

$\approx$  BIBO stability for linear systems

$$\begin{pmatrix} n_1 \\ n_2 \end{pmatrix} \xrightarrow{\gamma} \begin{pmatrix} e_1 \\ e_2 \end{pmatrix}$$



### Feedback interconnections of operators

- too strong: the theory should include unstable open-loop systems
  - too weak: does not guarantee the existence of a causal operator  $u \rightarrow e$
- Requiring *causality* and *boundedness* of  $H_1$  and  $H_2$  seems

### Problem

### Linear operators associated to LTI differential systems

Each transfer function  $H(s) = C(sI - A)^{-1}B + D$  defines a **causal linear** operator on  $L^{pe}[0, \infty)$

$$Hu = h * u = \int_{-\infty}^0 h(\tau)u(t - \tau)d\tau$$

where  $h(t)$  is the *impulse response*, that is, the inverse Laplace transform of  $H(s)$  (restricted to a RHP that contains no poles of  $H$ )

Proof:  $e^t \in L^{pe}[0, \infty)$ !

The operator is **bounded** if all the poles are in the (open) left half plane.

Stability analysis of feedback systems

Feedback interconnections of operators

Systems as operators

Contents

1. Contractions and the small gain theorem
2. Passive operators and the passivity theorem
3. Relationship to Nyquist criterion
4. Loop transformations and multipliers

Stability analysis of feedback systems

⇒ these ill-posed situations will be excluded by assumption

But it should for any physical system!

and  $H_2$  causal operators on  $\mathcal{L}^e \not\Leftarrow \frac{H_1}{1+H_1H_2}$  and  $\frac{H_2}{1+H_2H_1}$  causal operators on  $\mathcal{L}^e$ .

Well-posedness

Assumptions:

- $H_1, H_2$  causal operators on  $\mathcal{L}^e$
- Well-posedness: the feedback interconnection defines a causal operator in  $\mathcal{L}^e$ :

$$\begin{pmatrix} u_1 \\ u_2 \end{pmatrix} \mapsto \begin{pmatrix} e_1 \\ e_2 \end{pmatrix}$$

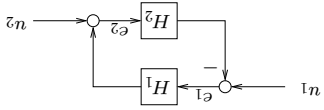
The feedback system  $(FS)$  will be said **stable** if  $H$  has a finite gain.

(Note: Uniqueness of the solution  $(e_1, e_2)$  for the input  $(u_1, u_2)$  can be relaxed)

Back to the feedback interconnection

### Contractions and the small gain theorem

An operator  $H : \mathcal{L}^e \rightarrow \mathcal{L}^e$  is a **contraction** if its gain is smaller than one.



**The small gain theorem:** the feedback system  $(FS)$  is stable if

$$\|H_1\| \cdot \|H_2\| < 1$$

### Passive operators

A causal operator  $H : \mathcal{H}_e \rightarrow \mathcal{H}_e$  is **passive** if

$$\langle H u, u \rangle^T \geq 0 \quad \forall u \in \mathcal{H}_e, \forall T \geq 0$$

it is called **output strictly passive** if

$$\langle H u, u \rangle^T \geq \epsilon \|P^T H(u)\|^2 \quad \forall u \in \mathcal{H}_e, \forall T \geq 0$$

### Proof of the small gain theorem

Consider the truncated signals

$$\begin{aligned} e_{1T} &= u_{1T} - P^T H_2(e_{2T}) \\ e_{2T} &= u_{2T} + P^T H_1(e_{1T}) \end{aligned}$$

and take norms to show

$$\|e_{1T}\| \leq \frac{1}{1 - \|H_1\| \cdot \|H_2\|} \|u_{1T}\| + \frac{\|H_2\|}{1 - \|H_1\| \cdot \|H_2\|} \|u_{2T}\|$$

### Passivity for LTI differential systems

The causal bounded operator  $H$  with transfer function  $H(s)$  is passive iff  $H(s)$  is **positive real**, i.e.

$$\operatorname{Re}\{H(j\omega) + H^*(j\omega)\} \geq 0 \quad \forall \omega \in \mathbb{R}$$

Proof:

(i)  $\langle H u, u \rangle^T = \langle u, H^* u \rangle^T$  where  $H^*$  is the causal operator with transfer function  $H^*(s)$

$$\langle H u, u \rangle^T = \frac{1}{2} \langle (H + H^*) u, u \rangle^T = \frac{1}{2} \langle (H(j\omega) + H^*(j\omega)) u(j\omega), u(j\omega) \rangle^T$$

### Passivity does not imply boundedness

Example:  $H(s) = \frac{s}{1}$ . Let  $U(t) = \int_t^0 u(\tau) d\tau$ . Then

$$\langle H u, u \rangle_T = \int_T^0 U dU = \frac{1}{2} U(T)^2 \geq 0$$

Note: the link between passivity and positive realness will be extended to transfer functions with poles on the imaginary axis in lecture 3.

### Link with the Nyquist criterion

Let  $H_1(s)$  and  $H_2(s)$  two stable (SISO) transfer functions.

Nyquist criterion requires no root for

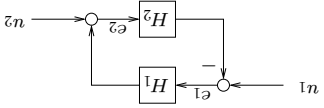
$$1 + H_1(j\omega)H_2(j\omega) = 0, \omega \in \mathbb{R}$$

Disregarding the phase information, a sufficient condition is  $|H_1(j\omega)H_2(j\omega)| > 1 \forall \omega \Leftrightarrow$  small-gain theorem

Disregarding the amplitude information, a sufficient condition is  $\angle H_1(j\omega)H_2(j\omega) \neq 180 \text{ deg} \forall \omega \Leftrightarrow$  passivity theorem

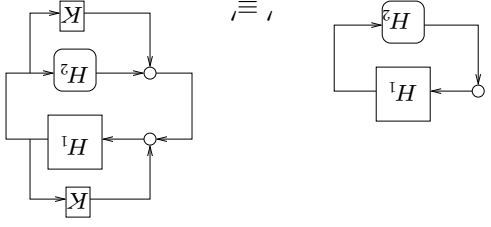
### The passivity theorem

Consider the feedback system  $(FS)$  with  $H_1$  and  $H_2$  defined on  $\mathcal{H}_e$  and  $n_2 = 0$ .



**Passivity theorem:** If  $H_1$  is output strictly passive and  $H_2$  is passive, then the feedback system is stable, that is, the operator  $n_1 \rightarrow e_2$  has finite gain.

### Loop transformations



The loop transformation serves to compensate for the shortage of passivity (resp. contraction) in one channel with the excess of passivity (resp. contraction) in the other channel.

The loop transformation is well posed if  $(I + KH_1)^{-1}H_1$  is a well defined causal operator on  $\mathcal{H}_e$ .

Note:  $H_1$  does not need to be bounded for the (loop transformed) feedback system to satisfy the assumptions of small gain or passivity theorem.

## A link between passivity and contraction

If  $I + H$  is invertible on  $\mathcal{H}$ , then

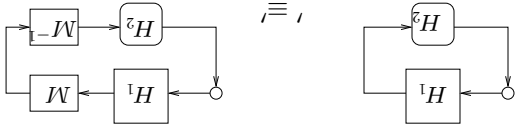
passivity of  $H$  is equivalent to contraction of  $S = (I + H)^{-1}$

This is a generalization of the conformal mapping  $\frac{s+1}{s-1}$  between the right half plane and the unit circle.

- Treating systems as operators provide a strong generalization of Nyquist criterion
- Feedback interconnections of operators do not always define operators
- causality of the operators is an important issue in stability analysis of interconnections
- passivity and contraction are fundamental properties for stability of interconnections

## Summary of lecture

## Multipliers



Same idea as loop transformations: broadens the application of the passivity/small gain theorems.  
 Equivalence if  $M$  and its inverse  $M^{-1}$  are bounded causal operators.

## Loop transformations, multipliers, and IQCs

- Causality of the multiplier can be relaxed if  $M$  can be factored into  $M = M^- M^+$  with  $M^*$ ,  $M^+$  and their inverses causal and bounded. The use of noncausal multipliers is important in practice. (This is a result of Zames).
- The IQC framework incorporates loop transformations and multipliers and simplifies the (tricky) question of equivalence of feedback loops.
- The invertibility assumption on  $K$  and the factorization condition on  $M$  are replaced by a (usually easily satisfied) well-posedness assumption on the feedback system.