Outline Fractional systems Time-domain simulation Class diagram Special sc 000 0000 0000 0000

Special scripts Ex

Examples 0000000000000

Prospectives

Object Oriented CRONE Toolbox for system identification and control

Rachid MALTI, Stéphane VICTOR, Patrick LANUSSE, Pierre MELCHIOR, and Alain OUSTALOUP

Journées de l'Automatique du GDR MACS

5 et 6 Octobre 2015 - Grenoble





Bordeaux, FRANCE

Outline	Fractional systems	Time-domain simulation	Class diagram	Special scripts	Examples	Prospectives
Outl	ine					

- From fractional derivatives to fractional systems
- 2 Time-domain simulation of fractional systems
- 3 Class diagram of the OO-CRONE toolbox
- 4 Special scripts
- 5 Examples
- 6 Prospectives General Information

Outline	Fractional systems	Time-domain simulation	Class diagram 0000	Special scripts	Examples 0000000000000	Prospectives
Out	line					

- 1 From fractional derivatives to fractional systems
- 2 Time-domain simulation of fractional systems
- 3 Class diagram of the OO-CRONE toolbox
- 4 Special scripts
- 5 Examples
- 6 Prospectives General Information

# Outline Fractional systems Time-domain simulation Class diagram Special scripts Examples 0000 Fractional derivatives and integrals

• Grünwald-Letnikov fractional derivatives

• 
$$\mathbf{D}^{\nu} x(t) = \lim_{h \to 0} \frac{1}{h^{\nu}} \sum_{k=0}^{\infty} (-1)^{k} \binom{k}{\nu} x(t-kh).$$
  
•  $\nu = 1 \Rightarrow \lim_{h \to 0} \frac{x(t-kh) - x(t)}{h}.$ 

- Fractional differential equations
  - $y(t) + a_1 \mathbf{D}^{\alpha_1} y(t) + \dots + a_N \mathbf{D}^{\alpha_N} y(t) = b_0 \mathbf{D}^{\beta_0} u(t) + \dots + b_M \mathbf{D}^{\beta_M} u(t)$ ,
- Laplace transform
  - $\mathscr{L} \{ \mathbf{D}^{\nu} x(t) \} = s^{\nu} X(s).$
- History of the CRONE Toolbox
  - Development started in the late 1990's as a standard non-OO toolbox,
  - Development of the OO-CRONE toolbox starting from 2004,
  - Free downloads from 2011.

Prospectives

# Fractional polynomials

Fractional systems

000

Fractional explicit polynomials (Cole-Cole transfer functions):

Time-domain simulation

Class diagram

Special scripts

Examples

Prospectives

$$p(s) = \sum_{i=0}^{L} c_i s^{\gamma_i}$$

Characterized by two linked sequences

$$[c_0, c_1, ..., c_L]$$
 and  $[\gamma_0, \gamma_1, ..., \gamma_L]$ .

 Fractional implicit polynomials (Havriliak-Negami transfer functions):

$$ilde{p}(s) = p(s)^eta = \left(\sum\limits_{i=0}^L c_i s^{\gamma_i}
ight)^eta$$

#### Characterized by

An explicit polynomial and a diff order  $\beta$ .

# Fractional polynomials

Fractional systems

000

Fractional explicit polynomials (Cole-Cole transfer functions):

Time-domain simulation

Class diagram

Special scripts

Examples

$$p(s) = \sum_{i=0}^{L} c_i s^{\gamma_i}$$

Characterized by two linked sequences

$$[c_0, c_1, ..., c_L]$$
 and  $[\gamma_0, \gamma_1, ..., \gamma_L]$ .

• Fractional implicit polynomials (Havriliak-Negami transfer functions):

$$\widetilde{p}(s) = p(s)^{\beta} = \left(\sum_{i=0}^{L} c_i s^{\gamma_i}\right)^{\beta},$$



Prospectives

#### Characterized by

An explicit polynomial and a diff order  $\beta$ .

## Fractional system representation

Fractional systems

000

• Fractional transfer function in a developed form:

$$H(s) = \frac{\sum\limits_{i=0}^{M} b_i s^{\beta_i}}{1 + \sum\limits_{j=1}^{N} a_j s^{\alpha_j}}$$

• Fractional transfer function in a factorized form:

$$H(s) = K \frac{\prod\limits_{i=0}^{l} (s^{\nu} + z_i)}{\prod\limits_{i=0}^{n} (s^{\nu} + p_i)}$$

• Fractional (or pseudo-) state space representation:

$$\mathbf{D}^{\nu}\mathbf{x}(t) = A\mathbf{x}(t) + B\mathbf{u}(t)$$
$$\mathbf{y}(t) = C\mathbf{x}(t) + D\mathbf{u}(t)$$



#### Frac\_tf

frac poly exp

Time-domain simulation

ion Class diagram

Special scripts

Examples 0000000000000 Prospectives

## Fractional system representation

Outline

Fractional systems

000

Fractional transfer function in a developed form:

Time-domain simulation

Class diagram

Special scripts

Examples

• Fractional transfer function in a factorized form:  $\prod_{i=1}^{m} (s^{\nu} + z_i)$ 

$$H(s) = K \frac{\prod\limits_{i=0}^{n} (s^{\nu} + z_i)}{\prod\limits_{j=0}^{n} (s^{\nu} + p_j)}$$

 $H(s) = \frac{\sum\limits_{i=0}^{M} b_i s^{\beta_i}}{1 + \sum\limits_{i=1}^{N} a_i s^{\alpha_j}}$ 

• Fractional (or pseudo-) state space representation:

 $\begin{aligned} \mathbf{D}^{\nu}\mathbf{x}(t) &= A\mathbf{x}(t) + B\mathbf{u}(t) \\ \mathbf{y}(t) &= C\mathbf{x}(t) + D\mathbf{u}(t) \end{aligned}$ 

Frac\_zpk Irac\_zpk Zero : cell Gala : cell comm\_order : double





Prospectives

## Fractional system representation

Outline

Fractional systems

000

Fractional transfer function in a developed form:

Time-domain simulation

Class diagram

Special scripts

Examples

 $H(s) = \frac{\sum_{i=0}^{M} b_i s^{\beta_i}}{1 + \sum_{j=1}^{N} a_j s^{\alpha_j}}$ • Fractional transfer function in a factorized form:

$$H(s) = K_{\frac{1=0}{n}(s^{\nu}+z_i)}^{\prod (s^{\nu}+z_i)}$$

• Fractional (or pseudo-) state space representation:

$$\begin{aligned} \mathbf{D}^{\nu}\mathbf{x}(t) &= A\mathbf{x}(t) + B\mathbf{u}(t) \\ \mathbf{y}(t) &= C\mathbf{x}(t) + D\mathbf{u}(t) \end{aligned}$$



comm order : double



Prospectives

Frac\_tf

frac poly exp

Outline	Fractional systems	Time-domain simulation	Class diagram 0000	Special scripts 0000	Examples 0000000000000	Prospectives
Out	line					

- 1 From fractional derivatives to fractional systems
- 2 Time-domain simulation of fractional systems
- 3 Class diagram of the OO-CRONE toolbox
- 4 Special scripts
- 5 Examples
- 6 Prospectives General Information

## Methods based on discrete-time models

Time-domain simulation

0000

Fractional systems

- Approximation of a fractional differentiator by its discrete-time equivalent: s<sup>ν</sup> → ψ(z<sup>-1</sup>)
- As a result a discrete-time transfer function is obtained:

Class diagram

Examples

$$\mathcal{H}(z^{-1}) = \mathcal{H}(\psi(z^{-1})) = rac{\sum\limits_{i=0}^{N} b_i \psi(z^{-1})^{eta_i}}{1 + \sum\limits_{j=1}^{N} a_j \psi(z^{-1})^{lpha_j}}$$

• The discretization operator  $\psi(z^{-1})$  of analogue circuits can be any of the usual operators. Euler's operator (Grünwald definition) is implemented in the CRONE toolbox:

$$\psi(z^{-1}) = \left(\frac{1-z^{-1}}{T_s}\right)^{\nu} = \left(\frac{1}{T_s}\right)^{\nu} \sum_{k=0}^{\infty} (-1)^k {\binom{\nu}{k} z^{-k}},$$

Characterized by

a sampling period  $T_s$ .

## Methods based on discrete-time models

Time-domain simulation

0000

Outline

Fractional systems

- Approximation of a fractional differentiator by its discrete-time equivalent: s<sup>ν</sup> → ψ(z<sup>-1</sup>)
- As a result a discrete-time transfer function is obtained:

Class diagram

Special scripts

Examples

Prospectives

$$\mathcal{H}(z^{-1}) = \mathcal{H}(\psi(z^{-1})) = rac{\sum\limits_{i=0}^{N} b_i \psi(z^{-1})^{eta_i}}{1 + \sum\limits_{j=1}^{N} a_j \psi(z^{-1})^{lpha_j}}$$

• The discretization operator  $\psi(z^{-1})$  of analogue circuits can be any of the usual operators. Euler's operator (Grünwald definition) is implemented in the CRONE toolbox:

$$\psi(z^{-1}) = \left(\frac{1-z^{-1}}{T_s}\right)^{\nu} = \left(\frac{1}{T_s}\right)^{\nu} \sum_{k=0}^{\infty} (-1)^k {\binom{\nu}{k}} z^{-k},$$

Characterized by

a sampling period  $T_s$ .

# Methods based on continuous-time models

Time-domain simulation

0000

Fractional systems

Based on the approximation of a fractional model by a rational continuous-time one in a given frequency band.

• Let 
$$s^{\gamma} = s^{\gamma}_{[\omega_A, \omega_B]} \quad \forall \omega \in [\omega_A, \omega_B] \text{ with } 0 < \gamma < 1$$

• Oustaloup's approximation:  $s_{[\omega_A,\omega_B]}^{\gamma} \approx \mathscr{A}_{\text{Oust}}^{(\gamma)} = C_{(\gamma)} \left(\frac{1+\frac{s}{\omega_h}}{1+\frac{s}{\omega_h}}\right)^{\prime}$ 

Class diagram

• 
$$\omega_b = \sigma^{-1} \omega_A$$
 and  $\omega_h = \sigma \omega_B$  ( $\sigma$  is usually set to 10)  
•  $C_{(\gamma)}$  is chosen to get a unit gain at  $\omega = 1$  rad s<sup>-1</sup>:  
•  $C_{(\gamma)} = \left| \frac{1+j\frac{1}{\omega_h}}{1+j\frac{1}{\omega_h}} \right|^{-\gamma} = \left( \frac{\omega_h}{\omega_b} \right)^{\gamma} \left( \frac{1+\omega_b^2}{1+\omega_h^2} \right)^{\frac{\gamma}{2}}$ 

• Trigeassou's variant:  $s_{[\omega_A,\omega_B]}^{\gamma} \approx \mathscr{A}_{\mathrm{Trig}}^{(\gamma)} = C_{(\gamma-1)} s \left( \frac{1 + \frac{s}{\omega_h}}{1 + \frac{s}{\omega_b}} \right)^{\gamma-1}$ 

Oustaloup's approximation  $\omega_A, \omega_B, N$ 

Trigeassou's variant

 $\omega_A, \omega_B, N$ 

Prospectives

# Outline Fractional systems Time-domain simulation Class diagram Special scripts Examples 000 000 000 0000 0000 0000 0000

 Oustaloup and Trigeassou approximate the irrational part by a recursive distribution of poles and zeros:

• 
$$\left(\frac{1+\frac{s}{\omega_h}}{1+\frac{s}{\omega_b}}\right)^{\gamma} \approx \prod_{k=1}^{N} \left(\frac{1+\frac{s}{\omega_k}}{1+\frac{s}{\omega'_k}}\right)$$
  
•  $\frac{\omega_{k+1}}{\omega_k} = \frac{\omega'_{k+1}}{\omega'_k} = \alpha\eta, \quad \frac{\omega_k}{\omega'_k} = \alpha, \quad \frac{\omega'_{k+1}}{\omega_k} = \eta, \quad \gamma = \frac{\log(\alpha)}{\log(\alpha) + \log(\eta)}$   
•  $\alpha = \left(\frac{\omega_h}{\omega_b}\right)^{\frac{\gamma}{N}}$  and  $\eta = \left(\frac{\omega_h}{\omega_b}\right)^{\frac{1-\gamma}{N}}$ 

• Rational TF, equivalent a fractional TF:

$$H(s) = \frac{\sum\limits_{i=0}^{M} b_i s^{\beta_i}}{1 + \sum\limits_{j=1}^{N} a_j s^{\alpha_j}} \approx \mathscr{H}(s) = \frac{\sum\limits_{i=0}^{M} b_i s^{\lfloor \beta_i \rfloor} \mathscr{A}^{(\beta_i - \lfloor \beta_i \rfloor)}}{1 + \sum\limits_{j=1}^{N} a_j s^{\lfloor \alpha_j \rfloor} \mathscr{A}^{(\alpha_j - \lfloor \alpha_j \rfloor)}},$$

where  $\mathscr{A}^{(\gamma)}$  is either of Oustaloup's or Trigeassou's approximation of the fractional operators  $s^{\gamma}$ , with  $0 < \gamma < 1$ .

Prospectives

 Outline
 Fractional systems
 Time-domain simulation
 Class diagram
 Special scripts
 Examples
 Prospectives

 Mathematical and a base of a mathematical and a mathmatical and a mathmatemathmatical and a mathmathmatical and a mat

## Methods based on continuous-time models



Figure : Approximation of ideal differentiators using Oustaloup's and Trigeassou's methods

 Outline
 Fractional systems
 Time-domain simulation
 Class diagram
 Special scripts
 Examples
 Prospectives

 Mothoods
 based
 op
 continuous
 time
 models

### Methods based on continuous-time models



Figure : Approximation of ideal differentiators using Oustaloup's and Trigeassou's methods

Outline	Fractional systems	Time-domain simulation	Class diagram	Special scripts 0000	Examples 0000000000000	Prospectives
Out	line					
	From fract	ional derivatives	to fractio	nal system	5	

- 2 Time-domain simulation of fractional systems
- 3 Class diagram of the OO-CRONE toolbox
- 4 Special scripts
- 5 Examples
- 6 Prospectives General Information





## Methods associated to the OO-CRONE toolbox

- General purpose methods
  - get, set used to access data (data encapsulation),
  - isnan, isempty, size, length, iscomplex for general purpose op,
  - horzcat, vertcat, subsref, subsasgn for MIMO system handling,
- Methods associated to operator overloading
  - The main operators  $(+, -, \times, . \times, /, \setminus, ', =, =, ...)$  are overloaded by rewritting plus, minus, uminus, mtimes, times, ldivide, rdivide, transpose, eq, ne, display scripts,
- Methods associated automatic control (many methods developed for fractional TF, some methods implemented for MIMO TF)
  - Frequency-domain simulation bode, nichols, nyquist,
  - Time-domain simulation Isim (with various options),
  - System identification oe, lssvf, ivsvf, srivcf, oosrivcf,
  - Stability isstable.



## A focus on isstable method in the frac\_tf-class

Based on Matignon's stability theorem :



Figure : Matignon's stability theorem

Hence,

$$F(s)=rac{1}{s+s^{0.5}+1}$$
must have all its  $s^{0.5}$ -poles in the sector defined by:  $|rg(s^{0.5})|>\pi/4$ 

# Outline Fractional systems Time-domain simulation Class diagram Special scripts Examples Prospectives 000 000 000 000 000 000 0000</t

## An open problem

However, due to floating point arithmetics, the following TF might be coded in computers instead of F(s):

$${\sf F}_\epsilon(s)=rac{1}{s+s^{0.5+\epsilon}+1}$$

 $F_{\epsilon}(s)$  is comm. of ordre  $\epsilon$ . Hence all the roots of the (with  $p = s^{\epsilon}$ ):

$$p^{\frac{1}{\epsilon}} + p^{\frac{0.5}{\epsilon}+1} + 1$$

needs to be evaluated, which is impossible if  $\epsilon$  is the machine- $\epsilon$ .

#### Problem formulation

- If F(s) = 1/(s+s^{0.5}+1) is stable with a certain margin, is it possible to conclude on the stability of F<sub>ε</sub>(s) = 1/(s+s^{0.5+ε}+1)?
- How to find that margin?

Outline	e Fractional systems	l ime-domain simulation	Class diagram	Special scripts	Examples 00000000000000	Prospectives
Ou	tline					

- 1 From fractional derivatives to fractional systems
- 2 Time-domain simulation of fractional systems
- 3 Class diagram of the OO-CRONE toolbox
- 4 Special scripts
- 5 Examples
- 6 Prospectives General Information

 Outline
 Fractional systems
 Time-domain simulation
 Class diagram
 Special scripts
 Examples
 Prosp

 000
 000
 000
 000
 000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000

# System Identification 1/2

The toolbox supports transfer function models of the following forms:

$$y(t_k) = \frac{B(\mathcal{D})}{A(\mathcal{D})}u(t_k) + \frac{1}{F(\mathcal{D})}e(t_k), \qquad (1)$$

• In the output error context, the following criterion is minimized

$$J = \sum_{k=1}^{k=K} (y(t_k) - y_m(t_k))^2$$
(2)

$$H(s) = rac{\sum\limits_{i=0}^{M}b_is^{eta_i}}{1+\sum\limits_{j=1}^{N}a_js^{lpha_j}}$$

$$egin{aligned} \mathcal{H}(s) &= rac{\sum\limits_{i=0}^m ilde{b}_i s^{i
u}}{1+\sum\limits_{j=1}^n ilde{a}_j s^{j
u}} \ 
u \in (0,2) \end{aligned}$$

Outline	Fractional systems	Time-domain simulation	Class diagram 0000	Special scripts ○●○○	Examples 00000000000000	Prospectives
Syst	em Identif	ication 2/2				

Sys. Id.	OE	ARX
oe	$\checkmark$	
lssvf		$\checkmark$
ivsvf		$\checkmark$
srivcf	$\checkmark$	
oosrivcf	$\checkmark$	1

Table : Methods for system identification using fractional models

Sys. Id. methods	Coefficients estimation	Commensurate order estimation	All order estimation
oe	$\checkmark$	$\checkmark$	1
lssvf	$\checkmark$	121124	de
ivsvf	$\checkmark$	and the second	
srivcf	1		22, 22 2 2
oosrivcf	$\checkmark$	$\checkmark$	$\checkmark$

Table : Coefficient and/or order estimation.

Special scripts Fractional systems Class diagram Examples 0000

## Crone Control System Design tools 1/2



#### Figure : Crone CSD – user interface.





Figure : Crone CSD – user interface.

Outline	e Fractional systems	Time-domain simulation	Class diagram	Special scripts 0000	Examples 00000000000000	Prospectives
Ou	tline					

- 1 From fractional derivatives to fractional systems
- 2 Time-domain simulation of fractional systems
- 3 Class diagram of the OO-CRONE toolbox
- 4 Special scripts
- 5 Examples
- 6 Prospectives General Information

 Outline
 Fractional systems
 Time-domain simulation
 Class diagram
 Special scripts
 Examples
 Prospectives

 000
 000
 000
 000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000
 0000<

## Example 1 – Mass-spring-fractor



Figure : Mechanical system including a fractor  $\nu \in [0 \ 1]$ .

Constitutive equation in time domain  $(x(t) = 0, f(t) = 0 \forall t < 0)$ :  $m\mathcal{D}^2 x(t) + c\mathcal{D}^{\nu} x(t) + kx(t) = f(t)$ 

In the  $\mathscr{L}$ aplace domain (with  $\omega_0 = \sqrt{\frac{k}{m}}, \zeta = \frac{ck^{\frac{\nu}{2}-1}}{2m^{\frac{\nu}{2}}}$ ):  $\frac{X(s)}{F(s)} = \frac{1}{ms^2 + cs^{\nu} + k} = \frac{1/k}{\left(\frac{s}{\omega_0}\right)^2 + 2\zeta \left(\frac{s}{\omega_0}\right)^{\nu} + 1}.$ 

28 / 46



Example 1 – Matlab code – Frequency domaine behaviour

$$\frac{X(s)}{F(s)} = \frac{1/k}{\left(\frac{s}{\omega_0}\right)^2 + 2\zeta \left(\frac{s}{\omega_0}\right)^\nu + 1}$$

m = 25Kg, k = 50N/m,  $\nu = 0.5$ , c = 110Kg/s<sup> $\nu$ </sup>.

```
1 m = 25; k = 50; c = 110; nu = 0.5; %Kg, N/m, kg/s^\nu
2 zeta = c * k^{(nu/2 - 1)/(2*m^{(nu/2)})}; w0 = sqrt(k/m)
3
  M = frac_tf(1/k, ...
      frac_poly_exp([1/w0^2 2*zeta/w0^nu 1], ...
4
    [2, nu, 0]), 10, [1e-3 1e2])
5
6 M_Oust = frac2int(M);
  set(M, 'sim', 'Trig'); M_Trig = frac2int(M);
7
8
   [G, Ph, w] = bode(M, [1e-3 1e2]);
9
  [GO, PhO, w] = bode(M_Oust, w);
10
11 [GT, PhT, w] = bode(M_Triq, w);
```

 Outline
 Fractional systems
 Time-domain simulation
 Class diagram
 Special scripts
 Examples
 Prospectives

 Example 1 – Frequency domain behaviour

$$\frac{X(s)}{F(s)} = \frac{1/k}{\left(\frac{s}{\omega_0}\right)^2 + 2\zeta \left(\frac{s}{\omega_0}\right)^\nu + 1}$$

•  $\omega_0 = 1.41, \zeta = 1.31$ 

- Oustaloup's approx and Trigeassou's variant
  - $[\omega_a, \omega_b] = [10^{-2}, 10^3]$ • N = 10



 Outline
 Fractional systems
 Time-domain simulation
 Class diagram
 Special scripts
 Examples
 Prospectives

 Example 1 – Matlab code – Time-domain simulation
 Class diagram
 Special scripts
 Sociologic code
 Prospectives

$$\frac{X(s)}{F(s)} = \frac{1/k}{\left(\frac{s}{\omega_0}\right)^2 + 2\zeta \left(\frac{s}{\omega_0}\right)^\nu + 1}$$

# Outline Fractional systems Time-domain simulation Class diagram Special scripts Examples Prospectives 000

$$\frac{X(s)}{F(s)} = \frac{1/k}{\left(\frac{s}{\omega_0}\right)^2 + 2\zeta \left(\frac{s}{\omega_0}\right)^\nu + 1}$$

•  $\omega_0 = 1.41, \zeta = 1.31$ 

 Oustaloup's approx and Trigeassou's variant

• 
$$[\omega_a, \omega_b] = [10^{-2}, 10^3]$$
  
•  $N = 10$ 



Fractional systems Time-domain simulation Class diagram Special scripts Examples Prospectives 

## Example 2 – Thermal diffusion



Figure : Thermal aluminium rod heated at one end.

#### Assumptions

- The rod is perfectly isolated,
- 2 the rod is considered as a semi-infinite homogeneous plane medium with conductivity  $\lambda$  and diffusivity  $\alpha$ ,
- at rest, the rod is at ambient temperature,
- Iosses on the surface where the thermal flux is applied are neglected.





Figure : Semi-infinite plannar medium

[Battaglia et al, 2001]

$$\begin{array}{l} \frac{\partial T(x,t)}{\partial t} = \alpha \frac{\partial^2 T(x,t)}{\partial x^2}, 0 < x < \infty, t > 0 \\ -\lambda \frac{\partial T(x,t)}{\partial x} = \varphi(t), \quad x = 0, \quad t > 0 \\ T(x,t) = 0, \quad 0 \le x < \infty, \quad t = 0 \end{array}$$

• Evaluating the Laplace transform:

$$\frac{\partial^{2} \overline{T}(x,s)}{\partial x^{2}} - \frac{s}{\alpha} \overline{T}(x,s) = 0,$$
  
where  $\overline{T}(x,s) = \mathcal{L} \{T(x,t)\}.$ 

• Solving with respect to x yields:

$$\bar{T}(x,s) = K_1(s) e^{-x\sqrt{\frac{s}{\alpha}}} + K_2(s) e^{x\sqrt{\frac{s}{\alpha}}}$$

 Taking into account limit conditions, the following transfer function is obtained:

$$H(x,s) = \frac{\overline{T}(x,s)}{\overline{\varphi}(s)} = \frac{\sqrt{\alpha}}{\lambda\sqrt{s}} e^{-x\sqrt{\frac{s}{\alpha}}}.$$

34 / 46

# Example 2 – Thermal diffusion – Physical modeling

P<sup>th</sup>-order Padé approximation of H(x, s), at  $x = x^*$ :

Time-domain simulation

$$H(x^*,s) \approx H_P(s) = \frac{\sqrt{\alpha}}{\lambda\sqrt{s}} \frac{\sum_{k=0}^{P} \frac{(2P-k)!}{k!(P-k)!} (-x^*\sqrt{\frac{s}{\alpha}})^k}{\sum_{k=0}^{P} \frac{(2P-k)!}{1!(P-k)!} (x^*\sqrt{\frac{s}{\alpha}})^k}.$$

k=0

Class diagram

Special scripts

The integrator  $H_0(s)$  and a first order order Padé approximation  $H_1(s)$ :

Fractional systems

$$egin{aligned} & H_0(s) = rac{4.21 imes 10^{-5}}{s^{0.5}}, \ & H_1(s) = rac{10^{-5}}{s^{0.5}} \left( rac{-2.11s^{0.5} + 8.43}{0.50s^{0.5} + 2.00} 
ight) \end{aligned}$$



Examples

Prospectives

Figure : Physical model H(x, s)and its Padé approximations  $H_0(s)$ and  $H_1(s)$ 



## Example 2 – System Identification from experimental data

- The aluminium rod is driven to a steady state by injecting a constant heat flux.
- a prbs signal is generated around the constant flux.

```
load('ThermalRodData.mat')
  data = iddata(y, u, Ts);
2
  sys init = frac tf(1, frac poly exp([1 1 1], ...
3
       [1.2 0.6 0]), 24, [1e-5 5e1]);
4
5
   sys_oe_coef = oe(sys_init, data,[],'coef');
   sys_oe_comm = oe(sys_oe_coef, data, [], 'comm');
6
   sys_oe_all = oe(sys_oe_comm, data,[],'all');
7
  figure, subplot(211), plot(t, y, 'b',...
8
       t,lsim(sys_oe_coef,u,t),'r--',...
9
       t,lsim(sys_oe_comm,u,t),'g-.',...
10
       t,lsim(sys_oe_all,u,t),'m')
11
```

Figure : Matlab script showing the use of oe routine (system identification) of the CRONE toolbox



## Example 2 – System Identification from experimental data



Figure : Comparison among the three outputs of the oe routine. Similar results are obtained with oosrivcf routine

Outline	Fractional systems	Time-domain simulation	Class diagram	Special scripts	Examples	Prospectives
					0000000000000000	

## Example 3 – MIMO systems

# $sys = \frac{1}{5s^{1.5}+1}, \quad [\omega_b, \omega_h] = [10^{-2}, 10^2] \Rightarrow [\omega_A, \omega_B] = [10^{-1}, 10^1], \ N = 4$

Are the approximations satisfactory in the frequency-domain?

-						
	000	0000	0000	0000	000000000000000000000000000000000000000	
Outline	Fractional systems	Time-domain simulation	Class diagram	Special scripts	Examples	Prospective

## Example 3 – MIMO systems

```
sys = \frac{1}{5s^{1.5}+1}, \quad [\omega_b, \omega_h] = [10^{-2}, 10^2] \Rightarrow [\omega_A, \omega_B] = [10^{-1}, 10^1], \ N = 4
```

Are the approximations satisfactory in the frequency-domain?

```
% Frequency plot -- bode --
  set(sys,'sim','Oust'); ApproxOust=frac2int(sys);
2
  set(sys,'sim','Trig'); ApproxTrig=frac2int(sys);
3
4
   [G, ph, w] = bode(sys, [1e-2 1e1]);
5
   [GOust, phOust] = bode (ApproxOust, w);
6
   [GTriq, phTriq] = bode (ApproxTriq, w);
7
  figure(2), subplot(211)
8
   semilogx(w, 10*log10(squeeze(GOust)), '--',...
9
       w, 10*loq10(squeeze(GTrig)), '-.', ...
10
      w, 10*log10(squeeze(G))), grid,
11
   subplot(212), semilogx(w, squeeze(phOust), w, ...
12
       squeeze(phTrig), w, squeeze(ph)), grid,
13
```

# Outline Fractional systems Time-domain simulation Class diagram Special scripts Examples Prospectives 000 000 000 000 000 0000</

## Example 3 – MIMO systems

$$sys = \frac{1}{5s^{1.5}+1}, \quad [\omega_b, \omega_h] = [10^{-2}, 10^2] \Rightarrow [\omega_A, \omega_B] = [10^{-1}, 10^1], \ N = 4$$

#### Are the approximations satisfactory in the frequency-domain?



Figure : Approximations using Oustaloup's and Trigeassou's methods in the frequency band  $[10^{-1}10^{1}]$  with N = 4

 Outline
 Fractional systems
 Time-domain simulation
 Class diagram
 Special scripts
 Examples
 Prospectives

 Overloading operators and MIMO time-response

```
% Example of operator overloading
   sys2 = (-sys^3 + 5 * sys)
2
3
    Frac_tf transfer function :
4
         (625 s^4.5 + 375 s^3 + 70 s^{1.5} + 4)
6
   (625 s^{6} + 500 s^{4} \cdot 5 + 150 s^{3} + 20 s^{1} \cdot 5 + 1)
7
8
 % MIMO example
9
  sysMIMO = [sys, sys; sys2, sys2]
10
   figure(3), lsim(sysMIMO, [u ; u], t);
11
12
  Frac tf from input 1 to output:
13
  #1 : Frac_tf transfer function :
14
15
         (1)
16
   (5 s^{1.5} + 1)
17
  #2 : Frac_tf transfer function :
18
```

1/46

Outline	Fractional systems	Time-domain simulation	Class diagram 0000	Special scripts 0000	Examples	Prospectives
_						

### Example 3

$$sys = \begin{pmatrix} \frac{1}{5s^{1.5}+1} & \frac{1}{5s^{1.5}+1} \\ -\left(\frac{1}{5s^{1.5}+1}\right)^3 + 5 \times \frac{1}{5s^{1.5}+1} & -\left(\frac{1}{5s^{1.5}+1}\right)^3 + 5 \times \frac{1}{5s^{1.5}+1} \end{pmatrix}$$

#### Time-domain simulation of a fractional MIMO system



Outline	Fractional systems	Time-domain simulation	Class diagram 0000	Special scripts 0000	Examples 0000000000000	Prospectives				
Outline										

- 1 From fractional derivatives to fractional systems
- 2 Time-domain simulation of fractional systems
- 3 Class diagram of the OO-CRONE toolbox
- 4 Special scripts
- 5 Examples
- 6 Prospectives General Information



Download

http://cronetoolbox.ims-bordeaux.fr

Any question, bug report, etc. A forum is provided.

#### Test functions

Every developed function is tested with multiple cases. All test functions are provided for the users.

Enjoy!



Any question, bug report, etc.

A forum is provided.

#### Test functions

Every developed function is tested with multiple cases. All test functions are provided for the users.

Outline	Fractional systems	Time-domain simulation	Class diagram 0000	Special scripts 0000	Examples 00000000000000	Prospectives					
Website – Free downloads											



#### Figure : http://cronetoolbox.ims-bordeaux.fr