



# **Fractional order PID control: better than the best issue and what's next**

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May 11, 2018. 11-12am, The Global **IFAC PID2018**, **Ghent**, **Belgium** 

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### Acknowledgements

- Karl Astrom model reference in control works
- IFAC PID2018 Organizing Committee Well done!
  - Clara, Antonio, Robin ...
- Other Invited Inspiring Speakers
- You all, for coming !





### Skip Ad in a fractional hour

### UCMERCED <sup>4</sup> MESALAB University of California, Merced



- The Research University of the Central Valley
- Centrally Located
  - Sacramento 2 hrs
  - San Fran. 2 hrs
  - Yosemite 1.5 hrs
  - -LA-4 hrs
- Surrounded by farmlands and sparsely populated





### UC Merced





- Established 2005
- 1<sup>st</sup> research university in 21<sup>st</sup> century in USA.
- 7,967 Undergraduates
- 592 Grads (mostly Ph.D)
- 233 faculty, 159 lecturers
- Strong Undergraduate Research Presence (HSI, MSI)

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2017 U.S. News and World Report Rankings

Campus	Public	National
UC Berkeley	1	20
UCLA	2	24
UC Santa Barbara	8	37
UC Irvine	9	39
UC Davis	10	44
UC San Diego	10	44
UC Santa Cruz	30	79
UC Riverside	56	118
UC Merced	78	152

https://www.universityofcalifornia.edu/news/6-uc-campuses-named-among-nation-s-top-10-public-universities

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#### w: mechatronics.ucmerced.edu UCMERCED Dr. YangQuan Chen, yqchen@ieee.org

Digital Contro

Systems

Mechanical

CAD

Computers

**MECHATRONICS** 

Mechanical

Systems

Control Electronics

Electro-

mechanics

Electronic

Systems

#### Mechatronics, Embedded Systems and Automation Lab

#### **Real solutions for sustainability!**

Established Aug. 2012 @ Castle, 4,500+ sq ft 6+2 Ph.D/10+ undergraduate researchers to MOTIVE 10+ visiting scholars || sponsored / Control Systems mentored many capstone teams

#### Education and **Outreach Activities:**

- Eng Service Learning(Sp14)
- AIAA Student Branch @UCM •
- Preview Days, Bobcat Day •
- CONSUMER PRODUCTS Robots-n-Ribs | MESABox! STEM-TRACKS • TEAM-E
- UAS4STEM. USDA/NIFA HSI: 2016-2020 •
- ME142 Mechatronics (take-home labs) •
- **ME280 Fractional Order Mechanics** •
- ME211 Nonlinear Control
- ME143 Unmanned Aerial Systems

#### **Research Areas of Excellence:**

(ISI H-index=45, Google H-index=70; i10-index=367)

- Unmanned Aerial Systems & UAV-based Personal Remote Sensing (PRS)
- Cyber-Physical Systems (CPS) AEROSPACE
  - **Mechatronics** 
    - **Applied Fractional Calculus** Modeling and Control of **Renewable Energy Systems**

#### **Projects Related to** San Joaquin Valley:

Energy [Solar/wind energy, Building efficiency (HVAC lighting), smart grids integration, NG pipelines]

Water (Water/soil salinity management, water sampling UAVs) Precision Ag/Environment (Crop dynamics, optimal harvesting, pest, methane sniffing/mapping, DH ...)

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### Outline

- Fractional calculus: What, Why and When
- Better than the best: Example 1 Modeling
- Better than the best: Example 2 Control
- Sample future chances:

- Networked control systems
- Nonlinearities with memory
- Human-in-the-loop model
- Cyber Physical Human Systems

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What is "Fractional Calculus"?

- Calculus: integration and differentiation.
- **"Fractional Calculus":** integration and differentiation of non-integer orders.
  - Orders can be real numbers (and even complex numbers!)
  - Orders are not constrained to be "integers" or even "fractionals"

### How this is possible? Why should I care?

### Any (good) consequences (to me)?

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... from integer to non-integer ...



$$\Gamma(x) = \int_{0}^{\infty} e^{-t} t^{x-1} dt, \qquad x > 0,$$
  
$$\Gamma(n+1) = 1 \cdot 2 \cdot 3 \cdot \ldots \cdot n = n!$$

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... from integer to non-integer ...



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### **Interpolation of operations**

$$f, \quad \frac{df}{dt}, \quad \frac{d^2f}{dt^2}, \quad \frac{d^3f}{dt^3}, \quad \dots$$

$$f, \quad \int f(t)dt, \quad \int dt \int f(t)dt, \quad \int dt \int dt \int dt \int f(t)dt, \quad \dots$$

$$\dots, \quad \frac{d^{-2}f}{dt^{-2}}, \quad \frac{d^{-1}f}{dt^{-1}}, \quad f, \quad \frac{df}{dt}, \quad \frac{d^2f}{dt^2}, \quad \dots$$

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### **Riemann–Liouville definition**



$$I^{\alpha}f(t) = \left(\frac{1}{t^{1-\alpha}}\right) * f(t) / \Gamma(\alpha)$$

$$\square D^{\alpha}f(t) = \frac{d}{dt} [I^{1-\alpha}f(t)] = \frac{d}{dt} [(\frac{1}{t^{\alpha}})^*f(t)] / \Gamma(1-\alpha)$$

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First Derivative:

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$$f'(a) = \lim_{h \to 0} \frac{f(a+h) - f(a)}{h}$$

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Slide credit: Igor Podlubny



-

+ 127 papers at PID12

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#### Slide-18 of 1024 Good Consequences





• pid12.ing.unibs.it/

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#### Good Consequences

Advances in Industrial Control

Concepción Alicia Monje YangQuan Chen Blas Manuel Vinagre Dingyü Xue Vicente Feliu

### Fractional-order Systems and Controls

**Fundamentals and Applications** 

2001-2010

Signals and Communication Technology

Hu Sheng YangQuan Chen Tianshuang Qiu

Fractional Processes and Fractional-Order Signal Processing

**Techniques and Applications** 

 $\underline{
 }$  Springer



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### Good Consequences



SPRINGER BRIEFS IN ELECTRICAL AND COMPUTER ENGINEERING CONTROL, AUTOMATION AND ROBOTICS

Zhuang Jiao · YangQuan Chen · Igor Podlubny

Distributed-Order Dynamic Systems Stability, Simulation, Applications and Perspectives YING LUO | YANGQUAN CHEN

### Fractional Order Motion Controls



2007-2012

2007-2012

Deringer

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Fudong Ge · YangQuan Chen Chunhai Kou

### Regional Analysis of Time-Fractional Diffusion Processes

2015-2018

🖄 Springer

DE GRUYTER

#### Kecai Cao, YangQuan Chen FRACTIONAL ORDER CROWD DYNAMICS

CYBER-HUMAN SYSTEM MODELING AND CONTROL

FRACTIONAL CALCULUS IN APPLIED SCIENCES AND ENGINEERING

#### 2010-2019

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### **Example:** $\sin(t)$



The animation shows the derivative operator oscillating between the antiderivative (a=-1) and the derivative (a=1) of the simple power function y=x continuously.



Slide credit: Igor Podlubny

http://en.wikipedia.org/wiki/Fractional\_calculus 05/11/2018

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"Fractional Order Thinking" or, "In Between Thinking"

• For example

- Between integers there are non-integers;
- Between logic 0 and logic 1, there is the "fuzzy logic";
- Between integer order splines, there are "fractional order splines"
- Between integer high order moments, there are noninteger order moments (e.g. FLOS)
- Between "integer dimensions", there are **fractal dimensions**
- Fractional Fourier transform (FrFT) in-between time-n-freq.
- Non-Integer order calculus (fractional order calculus abuse of terminology.) (FOC)

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#### Integer-Order Calculus

Fractional-Order Calculus

#### Slide credit: Richard L. Magin, ICCC12



Fractional Order Controls

• IO Controller + IO Plant

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- FO Controller + IO Plant
- FO Controller + FO Plant
- IO Controller + FO Plant



D. Xue and Y. Chen\*, "A Comparative Introduction of Four Fractional Order Controllers".
 Proc. of The 4th IEEE World Congress on Intelligent Control and Automation (WCICA02), June 10-14, 2002, Shanghai, China. pp. 3228-3235.
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### Fractional Calculus: a response to more advanced characterization of our more complex world at smaller scale



Slide credit: Igor Podlubny

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UCMERCED Rule of thumb for "Fractional Order Thinking"

- Self-similar
- Scale-free/Scaleinvariant
- Power law
- Long range dependence (LRD)
- $1/f^a$  noise

- Porous media
- Particulate
- Granular
- Lossy
- Anomaly
- Disorder
- Soil, tissue, electrodes, bio, nano, network, transport, diffusion, soft matters (biox) ...



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### UCMERCE Slide-30/1024 MESA LAB Modeling: heat transfer $\frac{\partial^2 y(x,t)}{\partial x^2} \quad = \quad k^2 \frac{\partial y(x,t)}{\partial t},$ X $(t > 0, \quad 0 < x < \infty) \frac{1}{y(0,t)}$ v(x,t)y(0,t) = m(t)Boundary condition (BC): y(x,0) = 0 Initial condition (IC) $\left|\lim_{x\to\infty} y(x,t)\right| < \infty$ Physical limit

Transfer function:

$$\begin{array}{lcl} \displaystyle \frac{\mathrm{d}^2 Y(x,s)}{\mathrm{d}x^2} &=& k^2 s Y(x,s) \\ Q(0,s) &=& M(s) \\ \displaystyle \lim_{s \to \infty} Y(x,s) \bigg| &<& \infty \end{array}$$

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$$Y(x,s) = A(s)e^{-kx\sqrt{s}} + B(s)e^{kx\sqrt{s}}$$

$$\begin{array}{lll} A(s) &=& Y(0,s) = M(s) \\ B(s) &=& 0 \end{array}$$

$$Y(x,s) = M(s)e^{-kx\sqrt{s}}$$
$$G(s) = \frac{Y(x,s)}{M(s)} = e^{-kx\sqrt{s}}$$

### think about transfer function $e^{-\sqrt{s}}$ !

#### Irrational Transfer Function.

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Taylor series expansion: polynomial of half order integrators s<sup>0.5</sup>!!

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Ideal physical plant model:

$$G_p(s) = e^{-\sqrt{s}}$$

First Order Plus Time Delay (FOPTD) Model:

$$G_{IO}(s) = \frac{K_1}{T_1 s + 1} e^{-L_1 s}$$

Time Delay with Single Fractional Pole Model:

All models are wrong but some are useful. George E. P. Box

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 $G_{FO}(s) = \frac{K_2}{T_2 s^{0.5} + 1} e^{-L_2 s}$ 

All models are wrong but some are dangerous ... Leonard A. Smith

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Step response of the "Ideal Plant"

$$y(0,t) = m(t) = u(t), M(s) = \frac{1}{s}$$
$$Y(x,s)|_{x=1} = G(x,s)|_{x=1}M(s) = G_p(s)M(s) = \frac{1}{s}e^{-\sqrt{s}}$$

So, "Reaction-Curve" or Step response of the "Ideal Plant"



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#### Magic code **NILT** to do

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 $y(t) = L^{-1}[\frac{1}{s}e^{-\sqrt{s}}]$ 

```
% step response of normalized 1D heat equation when x=1
clear all; close all; alpha=.5; Ts=0.1;
F = @(s) exp(-s.^alpha)./s;
%-----
alfa=0; M=1024; P=20; Er=1e-10; tm=M*Ts; wmax0=2*pi/Ts/2; L = M;
Taxis=[0:L-1]*Ts; n=1:L-1; n=n*Ts;
N=2*M; gd=2*P+1; t=linspace(0,tm,M); NT=2*tm*N/(N-2); omega=2*pi/NT;
c=alfa-log(Er)/NT; s=c-i*omega*(0:N+qd-1);
Fsc=feval(F,s); ft=fft(Fsc(1:N)); ft=ft(1:M);
q=Fsc(N+2:N+qd)./Fsc(N+1:N+qd-1); d=zeros(1,qd); e=d;
  d(1) = Fsc(N+1); d(2) = -q(1); z = exp(-i*omega*t);
  for r=2:2:qd-1; w=qd-r; e(1:w)=q(2:w+1)-q(1:w)+e(2:w+1); d(r+1)=e(1);
     if r > 2; q(1:w-1) = q(2:w) \cdot e(2:w) \cdot (q(1:w-1)); d(r) = -q(1);
     end
  end
  A2=zeros(1,M); B2=ones(1,M); A1=d(1)*B2; B1=B2;
  for n=2:qd
  A=A1+d(n)*z; B=B1+d(n)*z; B=B1+d(n)*z; B2=B1; B2=B1; A1=A; B1=B;
  end
ht = exp(c*t)/NT.*(2*real(ft+A./B)-Fsc(1));
%-----
figure;tt=0:(length(ht)-1);tt=tt*Ts;plot(tt,ht);
xlabel('time (sec.)');ylabel('temperature (C)');grid on
```

#### Application of numerical inverse Laplace transform algorithms in fractional calculus Journal of the Franklin Institute, Volume 348, Issue 2, March 2011, Pages 315-330 Hu Sheng, Yan Li, YangQuan Chen http://dx.doi.org/10.1016/j.jfranklin.2010.11.009 (Check ref [8])

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UCMERCED **So, let us do fitting!** I physical plant model:  $G_p(s) = e^{-\sqrt{s}}$ 

Ideal physical plant model:

First Order Plus Time Delay (FOPTD) Model:

$$G_{IO}(s) = \frac{K_1}{T_1 s + 1} e^{-L_1 s}$$

Time Delay with Single Fractional Pole Model:

$$G_{FO}(s) = \frac{K_2}{T_2 s^{0.5} + 1} e^{-L_2 s}$$

All models are wrong but some are useful. George E. P. Box

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Fitting code for  $G_{IO}(s) = \frac{K_1}{T_1 s + 1} e^{-L_1 s}$ 

% Ts: sampling period; ht: step response (from NILT numerical inverse % Laplace transform) % previously we got Ts and ht array (reaction curve) options=optimset('TolX',1e-10,'TolFun',1e-10); Tic; [x, FVAL, EXITFLAG] = fminsearch(@(x) fopdtfit(x, ht, Ts), [1,1,0], options); toc % May need to wait half minute K1=x(1);T1=x(2);L1=x(3);T=(0:length(ht)-1)\*Ts;if L1<0; L1=0; endsysfoptd=tf([K1],[T1,1],'iodelay',L1); y=step(sysfoptd,T);plot(T,ht,'r',t,y'k:');grid on; title(['FOPDT optimal fitting result J=',num2str(FVAL)]); xlabel('time (sec.)');ylabel('step response'); legend('ideal', 'FOPDT')

```
% fitting using FOPT model - integral of error square (ISE)
function [J]=foptdfit(x,y0,Ts);
K1=x(1);T1=x(2);L1=x(3);T=(0:length(y0)-1)*Ts;if L1<0; L1=0; end
sysfoptd=tf([K1],[T1,1],'iodelay',L1);
y=step(sysfoptd,T);
J = (y' - y0) * (y - y0') * Ts;
```

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Fitting code for 
$$G_{FO}(s) = \frac{K_2}{T_2 s^{0.5} + 1} e^{-L_2 s}$$

options=optimset('TolX',le-10,'TolFun',le-10); Tic;[x,FVAL,EXITFLAG] =fminsearch(@(x) tdwfpfit(x,ht,Ts),[1,2,0],options);toc % May need to wait 1000+ seconds! K1=x(1);T1=x(2);L1=x(3);Np=length(ht);T=(0:Np-1)\*Ts;if L1<0; L1=0; end y=mlf(0.5,1.5,-T.^0.5/T1);y=(K1/T1)\*(T.0.5) .\* y; Nstep=floor(L1/Ts); y1=zeros(size(y));y1(Nstep+1:Np)=y(1:Np-Nstep); y=y1;plot(T,ht,'r',t,y,'k:');grid on; title(['TDWFP optimal fitting zesult J=',num2str(FVAL)]); xlabel('time (sec.)');ylabel('step response'); legend('ideal', 'TDWFP model')

```
% fitting using TDVFP model - integral of error square (ISE)
function [J]=tdwfpTit(x,y0,Ts);
K1=x(1);T1=x(2);L1=x(3);Np=length(y0);T=(0:Np-1)*Ts;if L1<0; L1=0; end
y=mlf(0.5,1.5,-T.^0.5/T1);y=(K1/T1)*(T.^0.5) .* y;
Nstep=floor(L1/Ts);y1=zeros(size(y));y1(Nstep+1:Np)=y(1:Np-Nstep);
J=(y1-y0)*(y1-y0)'*Ts;
% get Igor Poblubny's MLF.m from
% www.mathworks.com/matlabcentral/fileexchange/8738-mittag-leffler-function
```

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### UCMERCED **Benefits of FOM**

- Captures (more) physics  $G_p(s) = e^{-\sqrt{s}} G_{FO}(s) = \frac{K_2}{T_2 s^{0.5} + 1} e^{-L_2 s}$
- Reaction curve fitting: Better than the best FOPDT model  $G_{IO}(s) = \frac{K_1}{T_1 s + 1} e^{-L_1 s}$ • Could be a nice starting point for better controller
  - design?
    - Reminder: Among all control tasks, 80% of them are for temperature controls that calls for  $\sqrt{s}$
    - Lots of process control papers may be re-written.

**Double check the "Reaction Curve" by** 

$$G_{FO}(s) = \frac{K}{T \sqrt{\alpha} 1} e^{-Ls}$$

https://www.mathworks.com/matlabcentral/fileexchange/52061-fractional-order-scanning

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Concepcin A. Monje, YangQuan Chen, Blas Vinagre, Dingyu Xue and Vicente Feliu (2010). "Fractional Order Systems and Controls - Fundamentals and Applications." Advanced Industrial Control Series, Springer-Verlag, www.springer.com/engineering/book/978-1-84996-334-3 (2010), 415 p. 223 ill.19 in color. https://www.mathworks.com/matlabcentral/fileexchange/60874-fotf-toolbox 05/11/2018 IFAC PID2018, Ghent, Belgium



### UCMERCED Slide-41/1024 Fractional order PID control

(**Ubiquitous**) 90% are PI/PID type in industry.  $u(t) = K_p(e(t) + T_i \mathcal{D}_t^{-\lambda} e(t) + \frac{1}{T_d} \mathcal{D}_t^{\mu} e(t)). \qquad (\mathcal{D}_t^{(*)} \equiv_0 \mathcal{D}_t^{(*)}).$  $\mu$ . LL A  $\mathbf{PI}$  $\lambda = 1$ 

Igor Podlubny. "Fractional-order systems and PI<sup>I</sup>D<sup>µ</sup>-controllers". IEEE Trans. Automatic Control,44(1): 208–214, 1999. YangQuan Chen, Dingyu Xue, and Huifang Dou. "Fractional Calculus and Biomimetic Control". IEEE Int. Conf. on Robotics and Biomimetics (RoBio04), August 22-25, 2004, Shengyang, China. 05/11/2018 IFAC PID2018, Ghent, Belgium

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### UCMERCED 43/29IOPID and FO-PI for FOPDT plants

Plant

$$P(s) = \frac{K}{Ts+1}e^{-Ls}$$

**IOPID** Controller

$$C(s) = K_p + \frac{K_i}{s} + K_d s$$

**FOPI** Controller

$$C(s) = K_p + \frac{K_i}{s^r}$$

The gain-phase margin tester

$$M_T(A,\phi) = Ae^{-j\phi}$$

A is the boundary of gain margin,  $\phi$  is the boundary of phase margin

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### Normalization of FOPDT

$$G(s) = \frac{1}{s+1} e^{-Ls}$$



Atherton, D.P. (2007). Feedback. *IEEE Control Systems*, 27(4), 17–18. http://ieeexplore.ieee.org/document/4272322/.

$$\mathcal{L}[x(at)] = \frac{1}{|a|} X(\frac{s}{a})$$

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The "flat phase" concept

 $\frac{d\angle G(s)}{ds}|_{s=j\omega_c}$ 

Y. Q. Chen and K. L. Moore, "*Relay Feedback Tuning of Robust PID Controllers With Iso-Damping Property*", IEEE Transactions on Systems, Man, and Cybernetics, Part B: Cybernetics, , Vol. 35. Issue: 1. 2005.

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# The "flat phase" design concept

The "flat phase" tuning rules

➤ Gain crossover frequency

$$|G(j\omega_c)| = |C(j\omega_c)P(j\omega_c)| = 0$$

### ➢ Phase margin

 $\angle[G(j\omega_c)] = Arg[C(j\omega_c)P(j\omega_c)] = -\pi + \phi_m$ 

> Robustness: "flat phase"  
$$\frac{d(\angle G(j\omega_c))}{d\omega}\Big|_{\omega=\omega_c} = 0$$



### UCMERCED 47/29The gain-phase margin tester

#### Definition: Gain-phase margin tester

 $M_T$  in figure below is a gain-phase master which provides information for plotting the boundaries of constant gain margin and phase margin in the parameter plane.



Figure: The feedback control system with the gain-phase margin tester



### Open loop

$$G(s) = M_T(A,\phi)C(s)P(s)$$



#### Property

Assuming  $\phi = 0$  for  $M_T$ , the controller parameters can be obtained satisfying a given gain margin A. Vice versa, assuming A = 1 for  $M_T$ , one can obtain the controller parameters for a given phase margin  $\phi$ . IFAC PID2018, Ghent, Belgium

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### Stability region of PID for FOPTD

Definition: IRB (Infinity root boundary):

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$$D(K_p, K_i, K_d, A, \phi; s = \infty) = 0$$

$$\Rightarrow K_d = \pm \frac{T}{AK}$$

Definition: RRB (Real root boundary):  $D(K_p, K_i, K_d, A, \phi; s = 0) = 0$  $\Rightarrow K_i = 0$ 

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# Stability region of PID for FOPTD

Definition: CRB (Complex root boundary):

$$D(K_p, K_i, K_d, A, \phi; s = j\omega) = 0$$

$$\Rightarrow \begin{cases} K_d = \frac{KAsin(\phi + \omega L)K_i - KA\omega K_p \cos(\phi + \omega L) - \omega}{KA\omega^2 \sin(\phi + \omega L)} \\ K_p = \frac{T\omega \sin(\phi + \omega L) - \cos(\phi + \omega L)}{KA} \\ K_i = \frac{\omega \sin(\phi + \omega L) - T\omega^2 \cos(\phi + \omega L)}{KA} + \omega^2 K_d \end{cases}$$



# UCMERCED 51/29 MEXALO Stability region of PID for FOPTD

Example



Figure: Stability region of Ki with respect to Kp with Kd = 0.5

Complete stability region of *Ki*, *Kp* and *Kd* 

# UCMERCED52/29MESALABStability region of PID for FOPTD

Example  $K_d = 0.5$  $\varphi_m = 50^{\circ}$ 160 140 120 0.5100 80 ЧЪ  $\mathbf{\nabla}$ 60 -0.5 40 100 20 50 10 5 0 - 20 -50 -5 Ķ 0 10 15 5 20 K, Kp

Figure: Stability region of *Ki* with respect to *Kp* with *Kd* = 0.5 and  $\varphi_m = 50^{\circ}$ 

Figure: Complete stability region of Ki, Kp and Kd and  $\varphi_m = 50^{\circ}$ 

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### Example: Achievable region for PID



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### Simulation



#### The PID controllers designed by different tuning methods

Ziegler-Nichols	The flat phase constraint
$K_{p} = \frac{1.2T}{KL}, K_{i} = \frac{K_{p}}{2L}, K_{d} \frac{K_{p}L}{L}$ $C(s) = 12 + \frac{60}{s} + 0.6s$	$C(s) = 4.71 + \frac{14.48}{s} + 0.19s$

# Simulation



5

5



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# Stability region for FO PI

The controller

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$$C(s) = K_p + \frac{K_i}{s^r}$$

the characteristic equation of the closed-loop system

$$D(K_p, K_i, A, \phi; s)$$
  
=  $s^r(Ts + 1) + Ae^{-j\phi}Ke^{-Ls}(K_ps^r + K_i)$ 



### RRB

$$D(K_p, K_i, K_d, A, \phi; s = 0) = 0$$

$$\Rightarrow K_i = 0$$

### CRB

$$D(K_p, K_i, K_d, A, \phi; s = j\omega) = 0$$

$$D(K_{p}, K_{i}, r, A, \phi; j\omega) = (j\omega)^{r}(jT\omega + 1) + Ae^{-j\phi}e^{-j\omega L}K(K_{p}(j\omega)^{r} + K_{i})$$

$$= \omega^{r}\cos\frac{r\pi}{2} - T\omega^{1+r}\sin\frac{r\pi}{2}$$

$$+ AK\cos(\phi + \omega L)(K_{i} + K_{p}\omega^{r}\cos r\pi 2) + AK\sin(\phi + \omega L)K_{p}\omega^{r}\sin\frac{r\pi}{2}$$

$$+ j(T\omega^{1+r}\cos\frac{r\pi}{2} + \omega^{r}\sin\frac{r\pi}{2} + AK\cos(\phi + \omega L)K_{p}\omega^{r}\sin\frac{r\pi}{2}$$

$$- AK\sin(\phi + \omega L)(K_{i} + K_{p}\omega^{r}\cos r\pi 2))$$

$$= 0, \qquad (12)$$

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### With plat phase constraint

$$\frac{\mathrm{d}\phi}{\mathrm{d}\omega} = \frac{\left(B_1^2 + B_2^2\right)(EF' - E'F) + \left(B_1'B_2 - B_1B_2'\right)(E^2 + F^2)}{(B_1E + B_2F)^2 + (B_1F - B_2E)^2} - L$$
  
= 0,

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# Stability region for FO PI



Figure: The relative stability curve and the flat phase stable point in the 3D parameter space

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### Example: Achievable region for FOPI



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### Recall: Achievable region for IOPID



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### Observations

• Flat phase ideal is useful – close to Bode Step idea.

• FO PI has larger achievable feasible region than IOPID

• When the relative delay is larger, fractional order control can help more



### Fig. 7 Asymptotic Bode diagram with Bode step.

JOURNAL OF GUIDANCE, CONTROL, AND DYNAMICS Vol. 25, No. 2, March-April 2002

### System Architecture Trades Using Bode-Step Control Design

05/11/2018

Boris J. Lurie,\* Ali Ghavimi,<sup>†</sup> Fred Y. Hadaegh,<sup>‡</sup> and Edward Mettler\*

Jet Propulsion Laboratory, California Institute of Technology, Pasadena, California 91109-8099



earlier loop design.

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### Outline

- Fractional calculus: What, Why and When
- Better than the best: Example 1 Modeling
- Better than the best: Example 2 Control
- Sample future chances:
  - Networked control systems
  - Nonlinearities with memory
  - Human-in-the-loop model
  - Cyber Physical Human Systems

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NCS – delay is random, time-varying



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Time variant delay sample



(a) Network delay samples

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### UCMERCED **PROBLEM**? running variance estimate is not convergent



(b) infinite or divergent variance IFAC PID2018, Ghent, Belgium

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Normal distribution N(0,1) Sample Variance





# MODELS IN LITERATURE (&IV)


### FO NETWORK DELAY DYNAMICS



••••• Self-similar processes



- Fractional calculus, delay dynamics and networked control systems
- <u>YangQuan Chen</u>
- <u>2010 3rd International Symposium on Resilient</u> <u>Control Systems</u> Year: 2010
- Pages: 58 63

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UCMERCED Fractional Order Control **Better and Ubiquitous?** 

- **u**·**biq**·**ui**·**tous** /yu'bikwitəs/
- –adjective existing or being everywhere, esp. at the same time; omnipresent:

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hystersis

Biomimetic Materials and Biomimetic Actuators

- EAP (electroactive polymers), a.k.a. artificial muscle
- ferroelectric and relaxor materials
- piezoceramic and piezopolymetric materials
- liquid crystal elastomers
- electro and magnetostrictive materials
- shape memory alloys/polymers
- intelligent gels etc.

However, little has been reported on the controls of actuators made with these biomimetic materials. Slide-78 of 1024



# Compensation of nonlinearity with memory

• e.g., hysteresis, backlash.

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• My Assertion: Fractional calculus may better help us.

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### A Hidden Evidence

IEEE TRANSACTIONS ON CONTROL SYSTEMS TECHNOLOGY, VOL. 9, NO. 1, JANUARY 2001

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### Phase Control Approach to Hysteresis Reduction

Juan Manuel Cruz-Hernández, Member, IEEE, and Vincent Hayward, Member, IEEE,

*Abstract*—This paper describes a method for the design of compensators able to reduce hysteresis in transducers, as well as two measures to quantify and compare controller performance. Rate independent hysteresis, as represented by the Preisach model of hysteresis, is seen as an input–output phase lag. The compensation is based on controllers derived from the "phaser," a unitary gain operator that shifts a periodic signal by a single phase angle. A "variable phaser" is shown to be able to handle minor hysteresis loops. Practical implementations of these controllers are given and discussed. Experimental results exemplify the use of these techniques.

*Index Terms*—Compensation, hysteresis, intelligent materials, phase control, piezoelectric transducers, smart materials, transducers.



Fig. 1. Hysteresis loop and branching.



Fig. 2. A black box representation of hysteresis.

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Fig. 10. Frequency response. (a) Ideal phaser. (b) Approximation.

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### UCMERCED Slide-81 of 1024 MEALAB "smart material" based Fractor<sup>TM</sup>







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Fig. 2. Schematic for a fractional order integrator.  $Z_F$  represents the Fractor<sup>TM</sup> element. The schematic symbol for the Fractor<sup>TM</sup> was designed to give the impression of a generalized Warburg impedance; a mixture of resistive and capacitive characteristics.

Gary W. Bohannan "**Analog Fractional Order Controller in a Temperature Control Application**". Proc. of the 2<sup>nd</sup> IFAC FDA06, July 19-21, 2006, Porto, Portugal.

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### Big Picture, or, the message for you to take home

 the big picture for the future is the intelligent control of biomimetic system using biomimetic materials with fractional order calculus embedded. In other words, it is definitely worth to have a look of the notion of ``*intelligent control of intelligent materials using intelligent materials*."

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  - Cyber Physical Human Systems

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### **Pioneering work**

- Tustin, A., The nature of the operator's response in manual control, and its implications for controller design, Journal of the Institute of Electrical Engineers-Part IIA: Automatic Regulators and Servo Mechanisms, vol. 94, no. 2, pp. 190-206, 1947.
- Craik, K. J. W., Theory of the human operator in control systems, British Journal of Psychology, General Section, vol. 38, no. 3, pp. 142-148, 1948.
- McRuer, D. T., Krendel, E. S., The human operator as a servo system element, Journal of the Franklin Institute, vol. 267, no. 6, pp. 511-536, 1959.

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## Human Operator Modeling

- <u>Human operator modeling based on fractional order calculus in the manual</u> <u>control system with second-order controlled element</u>
- Jiacai Huang; Yangquan Chen; Zhuo Li
- <u>The 27th Chinese Control and Decision Conference (2015 CCDC)</u> Year: 2015
- Pages: 4902 4906

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- Fractional order modeling of human operator behavior with second order controlled plant and experiment research
- Jiacai Huang; Yangquan Chen; Haibin Li; Xinxin Shi
- IEEE/CAA Journal of Automatica Sinica Year: 2016, Volume: 3, Issue: 3
- Pages: 271 280

#### https://www.youtube.com/watch?v=o8XoMMFdLyE&t=9s <sup>05/11/2018</sup> IFAC PID2018, Ghent, Belgium

# UCMERCED Slide-87 of 1024 Biomechatronics



Electronically controlled leg and hand prosthesis, neural prosthesis, retinal implants, assistive and rehabilitative robots ...

-- "Emerging Trends and Innovations in Biomechatronics" by Frost & Sullivan





Source: http://www-personal.umich.edu/~ferrisdp/NSF/research.htm IFAC PID2018, Ghent, Belgium

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### The Human-Automation Interaction Cycle



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### The Human-Automation Interaction Cycle



• Human-in-the-Loop

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### The Human-Automation Interaction Cycle



- for analysis
- Bio-feedback
- Emotional-feedback

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### Human-Automation Interaction

Human Over
 Automation

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- Metrics
  - Situational Awareness
  - Cognitive Load
- Legislative History
  - Humans act as the final safety level

- Automation
  Systems for
  Humans
  - Physiological Monitors
- State of Human Observer (SOHO)
- Next Level of Technology

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What is driver's role in driverless car?

Optimal role/function assignment?

Physiology-aware; Psychology-aware Situational Awareness Your car reminded you: *You forgot head check when you change lane* 

http://h-cps-i.sciencesconf.org/ 05/11/2018

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### UCMERCED Slide-96/1024 NSF CHS (cyber-human system)



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Cyber part				Physical part	
Modeling of evacuation		ensing (CCTV, Segways,)		Controlling of evacuation	
Fractional	Ordinary differential equations	Cyber-pedestrian system		Movement of each pedestrian	
	Partial differential equations			Smoothing fluids of crowds	
	Integral differential equations			Granular fluids of crowds	
	Coupling equations	Actuations (Segways, blocks	,···)	Actions based on games	

Kecai Cao, Yangquan Chen, Dan Stuart, and Dong Yue. **Cyber-physical modeling and control of crowd of** pedestrians: a review and new framework. Automatica *Sinica, IEEE/CAA Journal of*, 2(3):334–344, 2015. http://arxiv.org/abs/1506.05340.  $05/11/2\overline{0}18$ 



### New research monographs

• Kecai Cao and YangQuan Chen. "*Fractional Order Crowd Dynamics: Cyber Human System Modeling, and Control*" (De Gryuter Monograph Series "Fractional Calculus in Applied Sciences and Engineering"

https://www.degruyter.com/view/product/469813)

 Fudong Ge, YangQuan Chen and Chunhai Kou.
 "Regional Analysis of Time-Fractional Order Diffusion Processes" Springer

https://link.springer.com/book/10.1007%2F978-3-319-72896-4

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Fudong Ge · YangQuan Chen Chunhai Kou

### Regional Analysis of Time-Fractional Diffusion Processes

🖄 Springer

DE GRUYTER

#### Kecai Cao, YangQuan Chen FRACTIONAL ORDER CROWD DYNAMICS

CYBER-HUMAN SYSTEM MODELING AND CONTROL

FRACTIONAL CALCULUS IN APPLIED SCIENCES AND ENGINEERING

2019

2018

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UCMERCED "cyber-human systems" 4/9/16

- ieeeXplore: 2
- Sciencedirect: 1
- Google: 3750

- "cyber-physical systems" 4/9/16
- 2041
- 1318
- 450000

Dr. Chen's submission: "Cyber-Human Systems" (CHS) will be a hot topic in the next 10-20 years as human (individual, team, society/community), computer (fixed, mobile and surrounds), and environment (physical, mixed and virtual) fuse.



# Cyber-Physical Systems (CPS)

- New buzzword. New NSF thematic funding thrust after ITR (info technology research)
  - MAS-net was supported by ITR DDDAS program.
    - http://mechatronics.ece.usu.edu/mas-net/

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- http://mechatronics.ece.usu.edu/mas-net/dddas
- My Definition of CPS: <u>Computational thinking and integration of</u> <u>computation around the physical dynamic systems form the Cyber-</u> <u>Physical Systems (CPS) where sensing, decision, actuation,</u> <u>computation, networking, and physical processes are mixed.</u>
- Status: 9/11/08 Google = 5180 items; ieeeXplore= 21 items; umi.com=1 item; Amazon books=0
- Status: 5/27/09: Google = 15,700 items; ieeeXplore= 44 items; umi.com=3 item; Amazon books=1 item
- **Fact:** CSOIS has been doing Cyber-Physical Systems research since 2002.



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# UCMERCEDSlide-102/1024MESALABIn the next a few years...









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New robotics research from controlling crop dynamics to crowd dynamics ...

#### **MAS-net to CPS to CHS: Robots as Sensors and Actuators**



Figure: Stampede in Nigeria

#### Figure: Stampede in Shanghai

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### UCMERCED MESALAB UAV for Earthwork Construction











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#### Smartgeo.mines.edu

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### Conclusions

## Want to do better than the best? Want to be more optimal?

### **Go Fractional!**

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### Backup slides

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#### Wandering albatrosses

flight search patterns

G.M. Viswanathan, et al. *Nature* 381 (1996) 413–415.

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### MESALAB

### Long jumps, intermittence



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#### **Brownian motion**

Levy flights

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### Connection to FC via PDF

*"Fractional Calculus and Stable Probability Distributions"* (1998) by Rudolf Gorenflo, Francesco Mainardi http://arxiv.org/pdf/0704.0320.pdf

$$\begin{split} \frac{\partial u}{\partial t} &= D(\alpha) \frac{\partial^{\alpha} u}{\partial |x|^{\alpha}}, \quad -\infty < x < +\infty, \quad t \ge 0, \\ &\text{with} \quad u(x,0) = \delta(x) \quad 0 < \alpha \le 2 \\ \\ \frac{\partial^{2\beta} u}{\partial t^{2\beta}} &= D(\beta) \frac{\partial^2 u}{\partial x^2}, \quad x \ge 0, \quad t \ge 0, \\ &\text{with} \quad u(0,t) = \delta(t) \quad 0 < \beta < 1 \end{split}$$

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# Decision and Control in the Era of Big Data ?

- Yes, we must use fractional calculus!
  - Fractional order signals, systems, controls.
  - Fractional order data analytics

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**FODA:** Fractional Order Data Analytics

- First proposed by Prof. YangQuan Chen @Spring15.
- Metrics based on using fractional order signal processing techniques for quantifying the generating dynamics of observed or perceived variabilities.
  - Hurst parameter, fGn, fBm, ...

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- Fractional order integral, differentiation
- FLOM/FLOS (fractional order lower order moments/statistics)
- Alpha stable processes, Levy flights
- ARFIMA, GARMA (Gegenbauer), CTRW ... <sup>05/11/2018</sup> IFAC PID2018, Ghent, Belgium

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#### The Vegetation Spectrum in Detail



https://www.exelisvis.com/Learn/WhitepapersDetail/TabId/802/ArtMID/2627/ArticleID/13742/Vegetation-Analysis-Using-Vegetation-Indices-in-ENVI.aspx

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http://www.intechopen.com/books/responses-of-organisms-to-water-stress/water-stress-and-agriculture 05/11/2018 IFAC PID2018, Ghent, Belgium UCMERCED MESALAB Slide-114 of 1024 Optimal filtering in fractional order Fourier domain original signal distorted  $^{-4}$  in the ordinary Fourier domain <sup>4</sup>  $\frac{1}{10}$  in the 0.65th fractional domain  $\frac{4}{10}$ 0 <u>mm</u>m estimate by filtering in Fourier domain estimate by filtering in fractional domain 0 -2 -2 2 0 2

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Slide credit: HALDUN M. OZAKTAS

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Optimal filtering in fractional Fourier domain



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#### [IEEE/CAA Journal of Automatica Sinica]

Special Issues on Fractional Order Systems and Controls guest coedited by Profs. YangQuan Chen, Dingyu Xue and Antonio Visioli are published and available <u>here</u>. http://mechatronics.ucmerced.edu/jas-si-fosc

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