

# GRADUATE COURSE ON POLYNOMIAL METHODS FOR ROBUST CONTROL

Didier HENRION

[www.laas.fr/~henrion](http://www.laas.fr/~henrion)

[henrion@laas.fr](mailto:henrion@laas.fr)



Laboratoire d'Analyse et d'Architecture des Systèmes  
Centre National de la Recherche Scientifique  
Toulouse



Ústav Teorie Informace a Automatizace  
Akademie Věd České Republiky  
Praha

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# Course outline

## I Robust stability **analysis** (Part I)

I.1 General introduction - linear systems, polynomial methods and robust control

I.2 Single parameter uncertainty - eigenvalue criteria

I.3 Interval uncertainty - Kharitonov's theorem

## II Robust stability **analysis** (Part II)

II.1 Polytopic uncertainty - edge theorem

II.2 Multilinear and polynomial uncertainty - mapping theorem

## III Robust **design** and convex optimization

III.1 Robust pole placement - approximation of stability region

III.2 Rank-one robust stabilization - Youla-Kučera and Rantzer-Megretski parametrizations

III.3 Simultaneous stabilization - strong stabilization, Hermite criterion, open problems

## IV **New results** on robust analysis and design

IV.1 Robust stability analysis - Linear matrix inequalities and positive polynomial matrices

IV.2 Robust stability design - Numerical examples

## Course Outline

- I Robust stability analysis (Part I)
- II Robust stability analysis (Part II)
- III Robust design and convex optimization
- IV New results on robust analysis and design

## Scope of the course

<p>Systems</p> <ul style="list-style-type: none"><li>● linear</li><li>● non-linear</li></ul>	<p>Methods</p> <ul style="list-style-type: none"><li>● frequential</li><li>● state-space</li><li>● polynomial</li></ul>
<p>Control scheme</p> <ul style="list-style-type: none"><li>● adaptive</li><li>● stochastic</li><li>● robust</li></ul>	<p>Uncertainty</p> <ul style="list-style-type: none"><li>● non-parametric</li><li>● parametric</li></ul>

## Linear systems

Theory much better **developed** than for non-linear systems

Provides **background** for nonlinearists

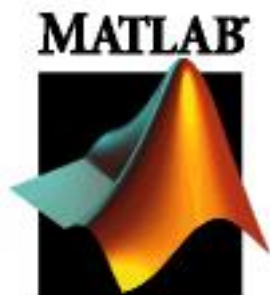
Availability of powerful **CACSD tools** to solve numerical linear algebra problems

(Old) reference books

- Kailath. Linear systems. Prentice Hall, 1980
- Chen. Linear system theory and design. HRW, 1984

## Computer tools used for the course

Matlab 6.0



[www.mathworks.com](http://www.mathworks.com)

Polynomial  
Toolbox 2.5



[www.polyx.cz](http://www.polyx.cz)

## Polynomial methods

Based on the algebra of **polynomials** and **polynomial matrices**, typically involve

- linear Diophantine equations
- quadratic spectral factorization

Pioneered in central Europe during the 70s mainly by Vladimír Kučera from the former Czechoslovak Academy of Sciences

Network funded by the European commission



[www.utia.cas.cz/europoly](http://www.utia.cas.cz/europoly)

Polynomial matrices also occur in Jan Willems' behavioral approach to systems theory

**Alternative** to state-space methods developed during the 60s most notably by Rudolf Kalman in the USA, rather based on

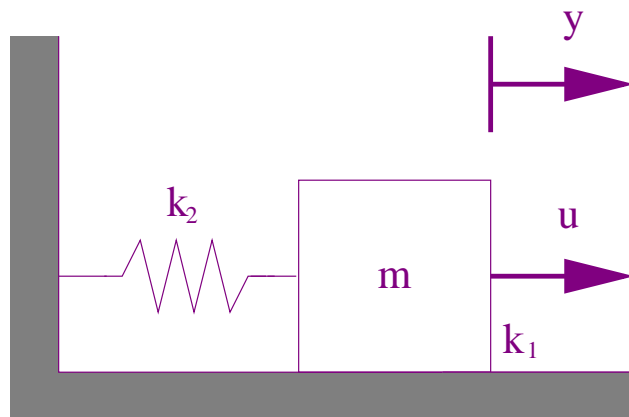
- linear Lyapunov equations
- quadratic Riccati equations

## Ratio of polynomials

A scalar transfer function can be viewed as the ratio of two **polynomials**

### Example

Consider the mechanical system



- $y$  displacement
- $k_1$  viscous friction coeff
- $m$  mass
- $u$  external force
- $k_2$  spring constant

Neglecting static and Coloumb frictions, we obtain the linear transfer function

$$G(s) = \frac{y(s)}{u(s)} = \frac{1}{ms^2 + k_1s + k_2}$$

## Ratio of polynomial matrices

Similarly, a MIMO transfer function can be viewed as the ratio of **polynomial matrices**

$$G(s) = N_R(s)D_R^{-1}(s) = D_L^{-1}(s)N_L(s)$$

the so-called matrix fraction description (MFD)

**Lightly damped structures** such as oil derricks, regional power models, earthquakes models, mechanical multi-body systems, damped gyroscopic systems are most naturally represented by second order polynomial MFDs

$$(D_0 + D_1s + D_2s^2)y(s) = N_0u(s)$$

### Example

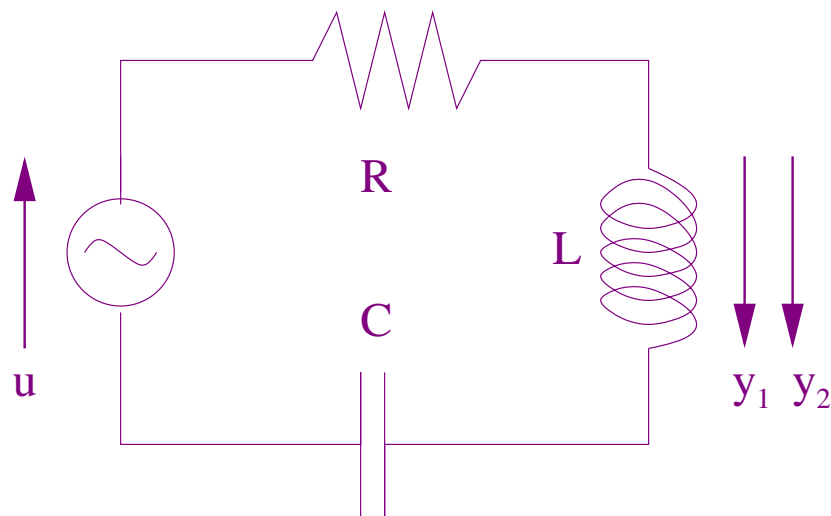
The (simplified) oscillations of a **wing in an air stream** is captured by properties of the quadratic polynomial matrix [Lancaster 1966]

$$D(s) = \begin{bmatrix} 121 & 18.9 & 15.9 \\ 0 & 2.7 & 0.145 \\ 11.9 & 3.64 & 15.5 \end{bmatrix} + \begin{bmatrix} 7.66 & 2.45 & 2.1 \\ 0.23 & 1.04 & 0.223 \\ 0.6 & 0.756 & 0.658 \end{bmatrix} s + \begin{bmatrix} 17.6 & 1.28 & 2.89 \\ 1.28 & 0.824 & 0.413 \\ 2.89 & 0.413 & 0.725 \end{bmatrix} s^2$$

## First-order polynomial MFD

### Example

### RCL network



- $y_1$  voltage through inductor
- $y_2$  current through inductor
- $u$  voltage

Applying Kirchoff's laws and Laplace transform we get

$$\begin{bmatrix} 1 & -Ls \\ Cs & 1 + RCs \end{bmatrix} \begin{bmatrix} y_1(s) \\ y_2(s) \end{bmatrix} = \begin{bmatrix} 0 \\ Cs \end{bmatrix} u(s)$$

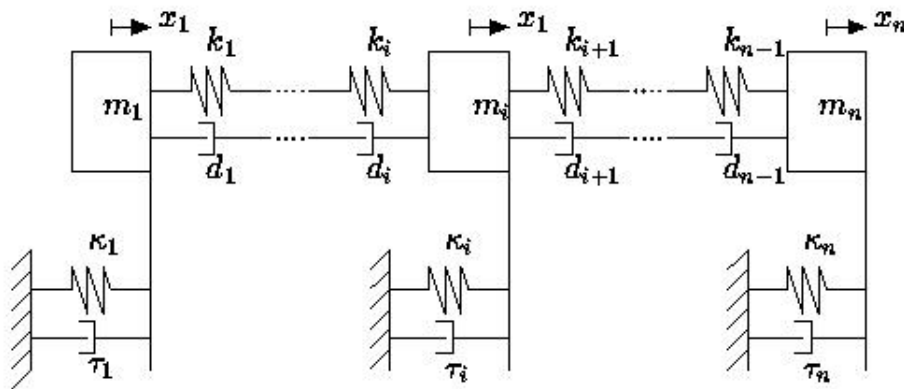
and thus the first-order left system MFD

$$G(s) = \begin{bmatrix} 1 & -Ls \\ Cs & 1 + RCs \end{bmatrix}^{-1} \begin{bmatrix} 0 \\ Cs \end{bmatrix}.$$



## Second-order polynomial MFD

### Example mass-spring system



Vibration of system governed by 2nd-order differential equation  $M\ddot{x} + C\dot{x} + Kx = 0$  where e.g.  $n = 250$ ,  $m_i = 1$ ,  $\kappa_i = 5$ ,  $\tau_i = 10$  except  $\kappa_1 = \kappa_n = 10$  and  $\tau_1 = \tau_n = 20$

Quadratic matrix polynomial

$$D(s) = Ms^2 + Cs + K$$

with

$$M = I$$

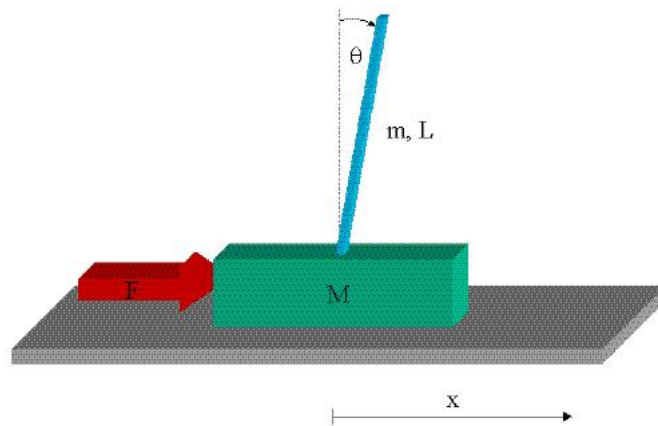
$$C = \text{tridiag}(-10, 30, -10)$$

$$K = \text{tridiag}(-5, 15, -5).$$

## Another second-order polynomial MFD

### Example

Inverted pendulum on a cart



Linearization around the upper vertical position yields the left polynomial MFD

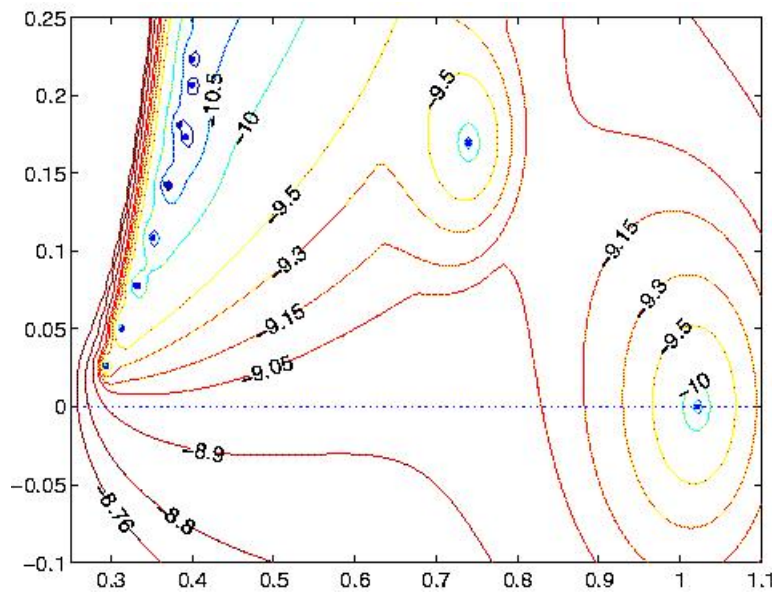
$$\begin{bmatrix} (M + m)s^2 + bs & lms^2 \\ lms^2 & (J + l^2m)s^2 + ks - lmg \end{bmatrix} \begin{bmatrix} x(s) \\ \phi(s) \end{bmatrix} = \begin{bmatrix} 1 \\ 0 \end{bmatrix} f(s)$$

With  $J = mL^2/12$ ,  $l = L/2$  and  $g = 9.8$ ,  $M = 2$ ,  $m = 0.35$ ,  $l = 0.7$ ,  $b = 4$ ,  $k = 1$ , we obtain the denominator polynomial matrix

$$D(s) = \begin{bmatrix} 5s + 3s^2 & 0.35s^2 \\ 0.35s^2 & -3.4 + s + 0.16s^2 \end{bmatrix}$$

## More examples of polynomial MFDs

Higher degree polynomial matrices can also be found in [aero-acoustics](#) (3rd degree) or in the study of the spatial stability of the Orr-Sommerfeld equation for plane Poiseuille flow in [fluid mechanics](#) (4rd degree)



Pseudospectra of Orr-Sommerfeld equation

For more info see Nick Higham's homepage at [www.ma.man.ac.uk/~higham](http://www.ma.man.ac.uk/~higham)

## Uncertainty

When modeling systems we face several **sources** of uncertainty, including

- non-parametric (unstructured) uncertainty
  - unmodeled dynamics
  - truncated high frequency modes
  - non-linearities
  - effects of linearization, time-variation..
- **parametric** (structured) uncertainty
  - physical parameters vary within given bounds
  - interval uncertainty ( $l_\infty$ )
  - ellipsoidal uncertainty ( $l_2$ )
  - $l_1$  uncertainty

How can we **overcome** uncertainty ?

- model predictive control
- adaptive control
- **robust control**

## Robustness

We seek a control law valid over the whole range of admissible uncertainty



- off-line
- simple
- cheap
- secure

Basically we will study two classes of problems

Robust stability **analysis**  
Parts I, II & IV of this course

Robust controller **design**  
Parts III & IV of this course

## Course material

Information on the course can be found at

[www.laas.fr/~henrion/courses/polyrobust.html](http://www.laas.fr/~henrion/courses/polyrobust.html)

Most of the material of the first two parts of the course (**robust stability analysis**) is taken from the textbooks

- J. Ackermann. Robust control: systems with uncertain physical parameters. Springer, 1993
- B. R. Barmish. New tools for robustness of linear systems. MacMillan, 1994
- S. P. Bhattacharyya, H. Chapellat, L. H. Keel. Robust control - The parametric approach. Prentice Hall, 1995

The third part (**robust design**) describes recent results published from 1992 to 1999 in

- IEEE Transactions on Automatic Control
- IFAC Automatica
- System and Control Letters
- International Journal of Control
- SIAM Journal on Control and Optimization

The last part of the course contains mostly new, previously unpublished material