



Matrix Rational H^2 Approximation: a State-Space Approach using Schur Parameters

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Introduction

We present a method to compute a **stable** rational L^2 -approximation of specified order n to a given **multivariable** transfer function.

- it works for **multivariable** systems,
- it uses a nice **parametrization of stable allpass systems**, which
 - takes into account the **stability constraint**
 - ensures identifiability
 - is **well-conditioned**
- it uses a **recursive search on the degree** which improves the chances to reach the global minimum.

The L^2 -criterion in state-space form

- $F(z) = \mathcal{C}(zI_N - \mathcal{A})^{-1}\mathcal{B} + \mathcal{D}$, $m \times p$ given transfer function
- $H(z) = \gamma(zI_n - A)^{-1}B + \mathcal{D}$, approximant at order n
(A, B) input-normal pair: $AA^* + BB^* = I$.

L^2 -norm of the error $F - H$:

$$J(A, B) = \|F\|^2 - \text{Tr}(\gamma\gamma^*),$$

where

$$\gamma = \mathcal{C}W,$$

and W solution to the Lyapunov equation:

$$AWA^* + BB^* = W.$$

Optimization set: stable-allpass systems

The two following sets (equivalence classes) are diffeomorphic:

- input-normal pairs (A, B)
- stable allpass functions $G(z) = D + C(zI_n - A)^{-1}B$
up to a left constant unitary factor

$$\begin{bmatrix} D & C \\ B & A \end{bmatrix} \text{ unitary matrix.}$$

Alpay, Baratchart, Gombani [1];

Parametrization issue

Desirable properties:

- ensures **identifiability**
- a small perturbation of the parameters **preserves the stability and the order** of the system?
- allows for the use of **differential tools**.

→ Differentiable manifold.

Atlas of charts or overlapping canonical forms :

a collection of **local parametrizations** with compatibility conditions
(**changes of charts are smooth**).

Atlases of charts

Two families can be found in the literature

1. from a tangential Schur algorithm:

$$G_n(1/\bar{w})u = v, \|v\| < 1, \quad G_n \xrightarrow{LFT} G_{n-1}$$

$$G_n, \dots, G_k \xrightarrow{(w_k, u_k, v_k)} G_{k-1}, \dots, G_0.$$

Alpay, Baratchart, Gombani [1]; Fulcheri, Olivi [2]

2. from state-space representations

Hanzon, Ober [3]

A parametrization that combines the two approaches:

Peeters, Hanzon, Olivi [4]

Encoding stable-allpass systems

A $p \times p$ stable allpass systems of degree n is encoded by

- w_1, w_2, \dots, w_n points of the unit circle,
- u_1, u_2, \dots, u_n unit complex p -vectors,
- v_1, v_2, \dots, v_n complex p -vectors, $\|v_i\| < 1$.

The w_i 's and the u_i 's define the chart while the v_i 's are the Schur parameters of the system in the chart. In a given chart, a system is perfectly determined by its Schur parameters (identifiability).

Encoding stable-allpass systems (2)

The stable allpass system encoded in that way has **unitary realization matrix**

$$\begin{bmatrix} D_n & C_n \\ B_n & A_n \end{bmatrix}$$

computed by induction

$$\begin{bmatrix} D_k & C_k \\ B_k & A_k \end{bmatrix} = \begin{bmatrix} V_k & 0 \\ 0 & I_{k-1} \end{bmatrix} \begin{bmatrix} 1 & 0 & 0 \\ 0 & D_{k-1} & C_{k-1} \\ 0 & B_{k-1} & A_{k-1} \end{bmatrix} \begin{bmatrix} U_k^* & 0 \\ 0 & I_{k-1} \end{bmatrix},$$

where A_k is $k \times k$, D_k is $p \times p$, and $D_0 = I_p$.

→ very nice numerical behavior

Encoding stable-allpass systems (3)

U_k and V_k are the $(p + 1) \times (p + 1)$ unitary matrices:

$$U_k = \begin{bmatrix} \xi_k u_k & I_p - (1 + \eta_k w_k) u_k u_k^* \\ \eta_k \overline{w_k} & \xi_k u_k^* \end{bmatrix}$$

$$V_k = \begin{bmatrix} \xi_k v_k & I_p - (1 - \eta_k) \frac{v_k v_k^*}{\|v_k\|^2} \\ \eta_k & -\xi_k v_k^* \end{bmatrix}$$

$$\xi_k = \frac{\sqrt{1 - |w_k|^2}}{\sqrt{1 - |w_k|^2 \|v_k\|^2}}, \quad \eta_k = \frac{\sqrt{1 - \|v_k\|^2}}{\sqrt{1 - |w_k|^2 \|v_k\|^2}}$$

Main steps of the algorithm

- finding an adapted chart:
realization in Schur form (A lower triangular)

$$A = \begin{bmatrix} w_n & 0 & \cdots & 0 \\ \vdots & \ddots & \ddots & \vdots \\ * & \cdots & w_1 & 0 \end{bmatrix}, \quad B = \begin{bmatrix} \sqrt{1 - |w_n|^2} u_n^* \\ \vdots \end{bmatrix}$$

$\rightarrow v_1 = v_2 = \dots v_n = 0$ (Potapov factorization)

- optimization over the manifold
- recursive search on the degree (optional):
minimum of degree $k \rightarrow$ initial point of degree $k + 1$ (error preserved)

The RARL2 software

This software computes a **stable** rational L^2 -approximation of specified order n to a **multivariable** transfer function given in one of the following forms:

- a **realization**
- a finite number of **Fourier coefficients**
- some **pointwise values** on the unit circle.

It has been implemented using standard MATLAB subroutines. The optimizer of the toolkit OPTIM is used to find a local minimum, given by a realization, of the nonlinear L^2 -criterion.

<http://www-sop.inria.fr/miaou/Martine.Olivi/me.html>

Automobile gas turbine

```
Command Window
File Edit View Web Window Help

a =
-0.83 -0.85 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00
0.17 0.15 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00
0.00 0.00 -0.84 -0.93 -0.07 0.00 0.00 0.00 0.00 0.00 0.00 0.00
0.00 0.00 0.16 0.07 -0.07 0.00 0.00 0.00 0.00 0.00 0.00 0.00
0.00 0.00 0.16 1.07 0.93 0.00 0.00 0.00 0.00 0.00 0.00 0.00
0.00 0.00 0.00 0.00 0.00 -0.85 -0.96 -0.09 0.00 0.00 0.00 0.00
0.00 0.00 0.00 0.00 0.00 0.15 0.04 -0.09 0.00 0.00 0.00 0.00
0.00 0.00 0.00 0.00 0.00 0.15 1.04 0.91 0.00 0.00 0.00 0.00
0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 -0.14 -0.63 -0.10 -0.00
0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.86 0.37 -0.10 -0.00
0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.86 1.37 0.90 -0.00
0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.86 1.37 1.90 1.00

b =
0.00 0.00
1.04 4.15
0.00 0.00
0.00 0.00
-1.79 2.68
0.00 0.00
0.00 0.00
1.04 4.15
0.00 0.00
0.00 0.00
0.00 0.00
-1.79 2.68

c =
0.05 0.13 -0.03 -2.20 -0.16 0.00 0.00 0.00 0.00 0.00 0.00 0.00
0.00 0.00 0.00 0.00 0.00 1.21 0.68 0.12 -2.54 1.79 0.61 0.03

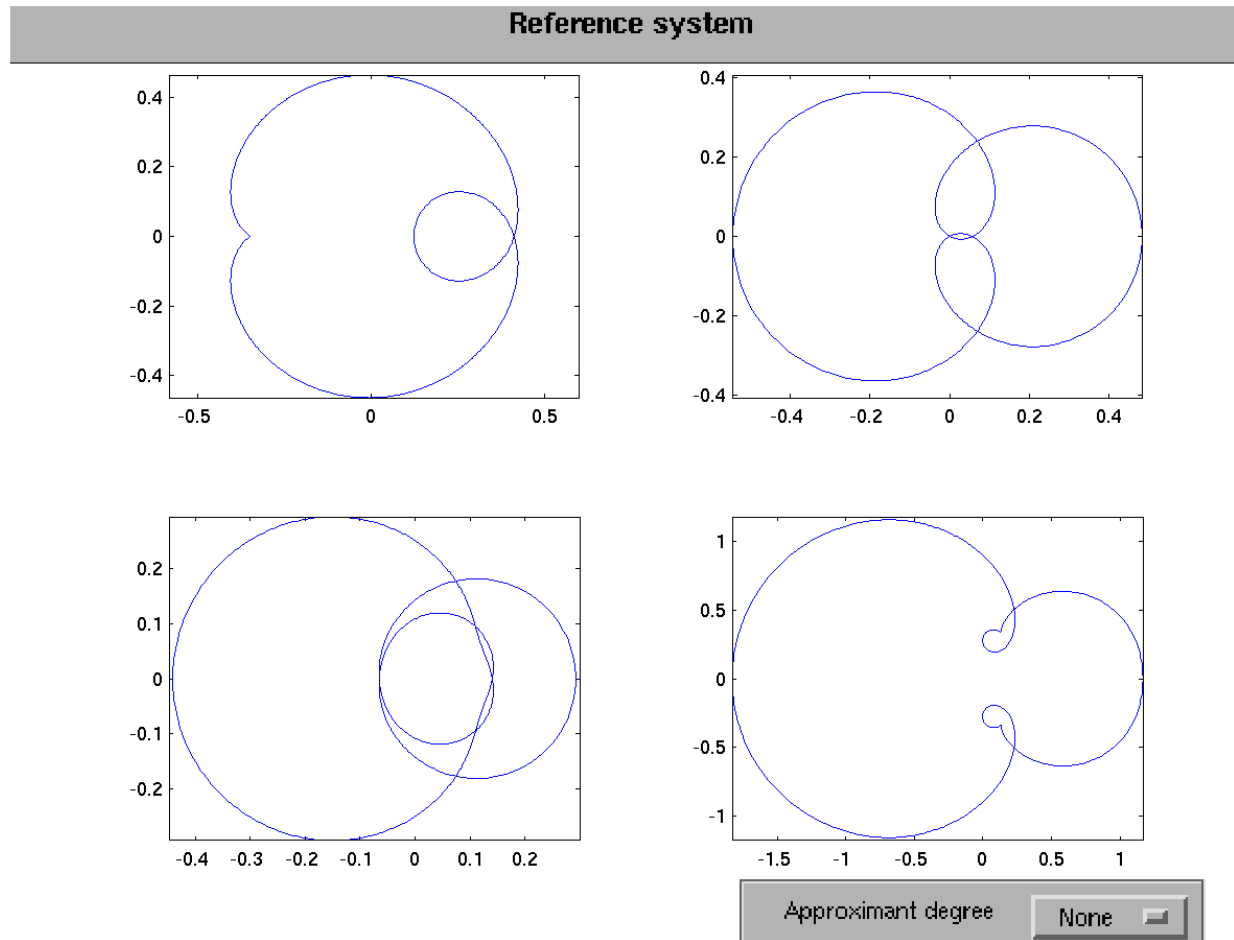
d =
0.00 0.00
0.00 0.00

-- Degree 0 -- Local minimum: 1 J=1.0000000
-- Degree 1 -- Start with 4 initial points
5.4171990e-01 ... 5.4171990e-01 ... 5.4171990e-01 ... 5.4171990e-01 ...
-- Degree 1 -- Found 1 local minimum -- Best relative error = 0.5417199
-- Degree 2 -- Start with 4 initial points
3.8800619e-01 ... 3.8731359e-01 ... 4.4607851e-01 ...

Ready
```

Hung, MacFarlane [6]; Glover [5]; Yan, Lam [7]

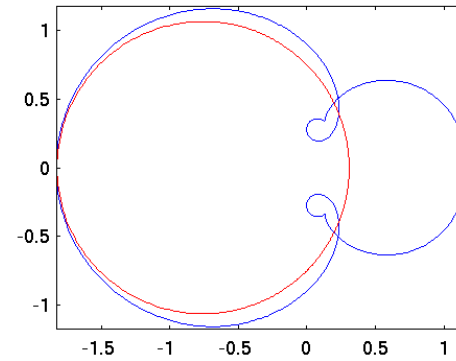
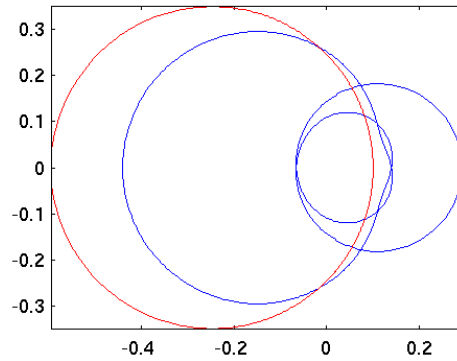
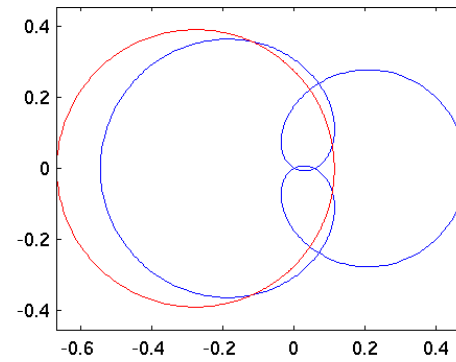
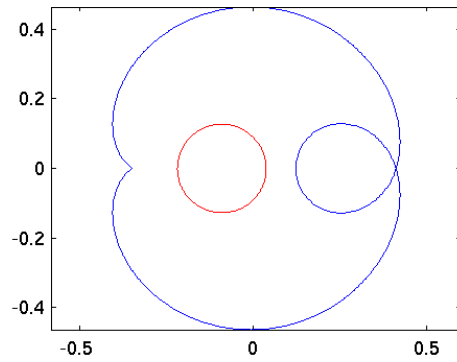
Nyquist diagrams



2×2 ; order 12.

Approximants: order 1

Degree 1 - 1 minimum - Best J=0.541720

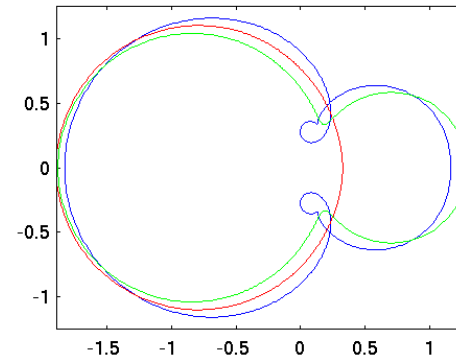
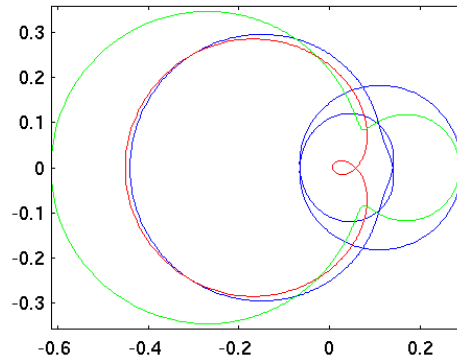
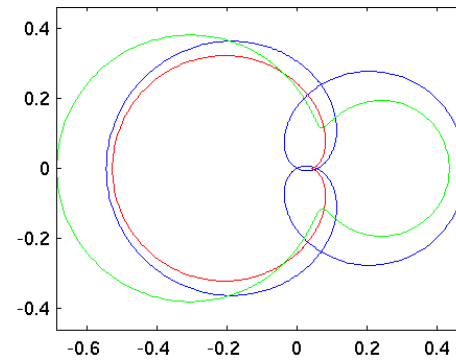
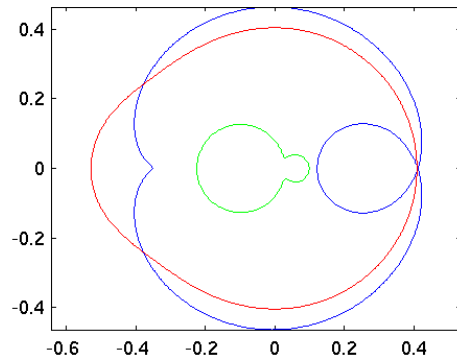


Approximant degree

1

Approximants: order 2

Degree 2 - 2 minima - Best J=0.383171

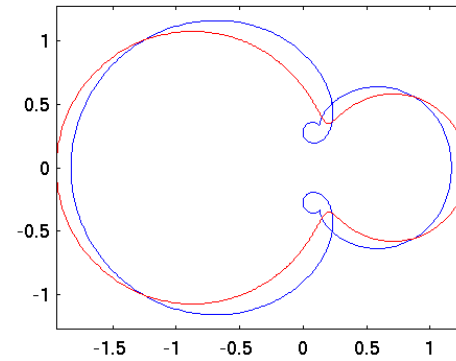
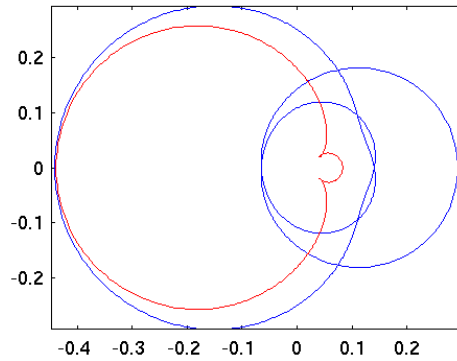
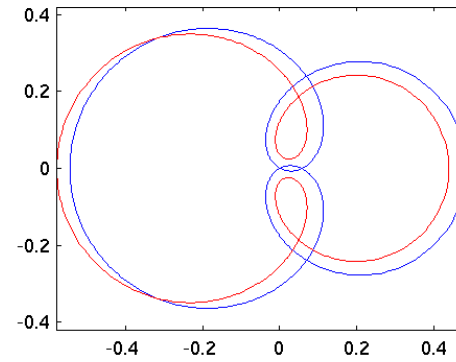
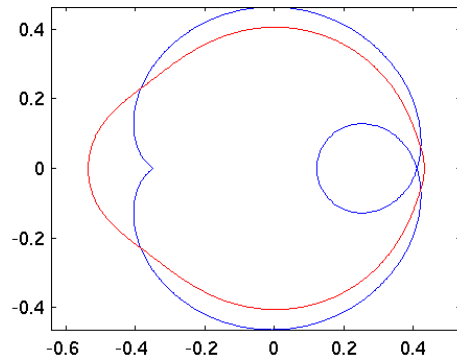


Approximant degree

2

Approximants: order 3

Degree 3 - 1 minimum - Best J=0.225433

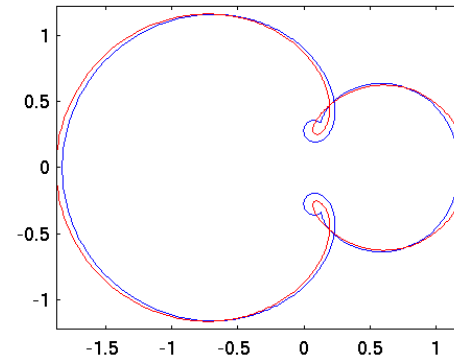
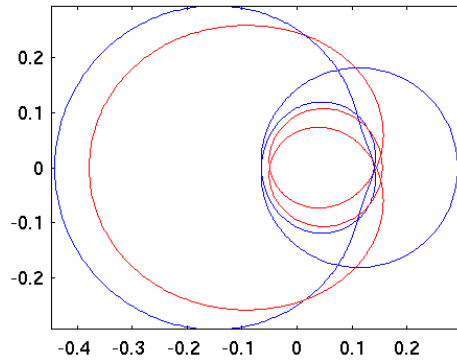
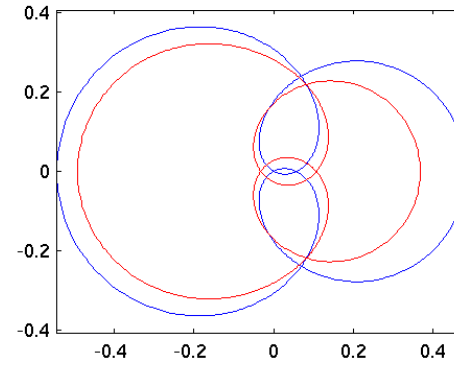
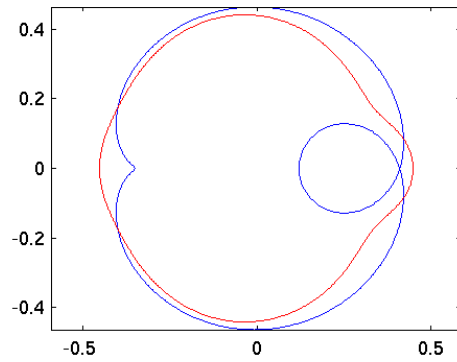


Approximant degree

3

Approximants: order 4

Degree 4 - 1 minimum - Best J=0.134999

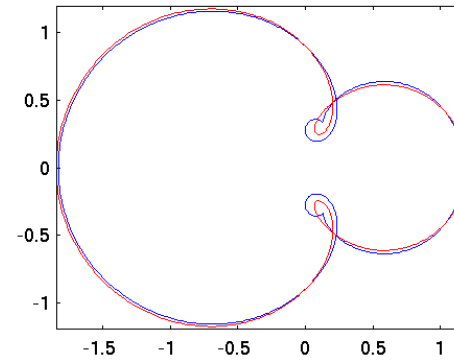
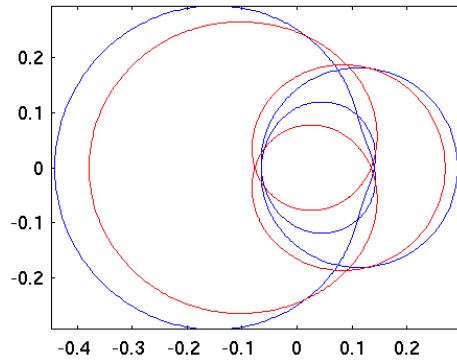
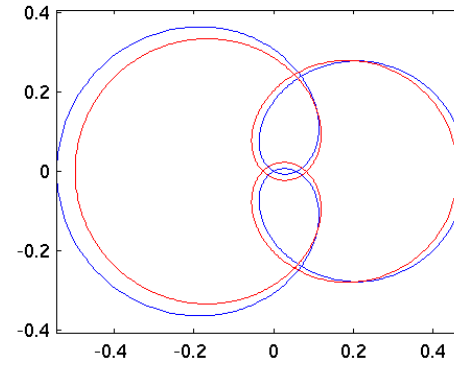
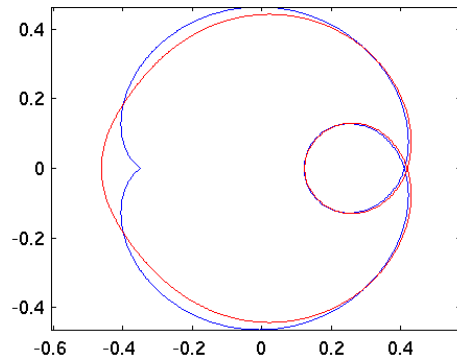


Approximant degree

4

Approximants: order 5

Degree 5 - 1 minimum - Best J=0.078272

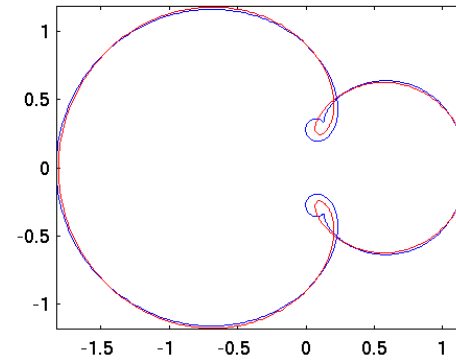
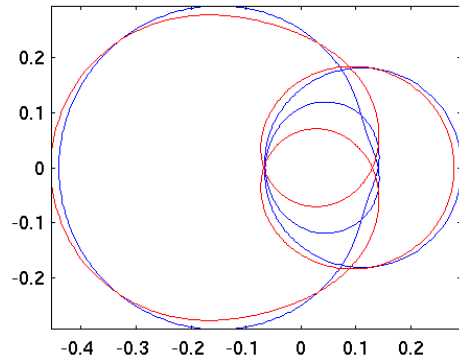
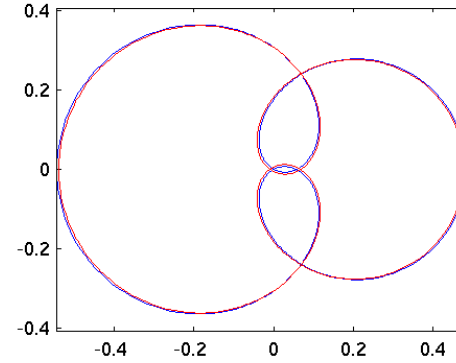
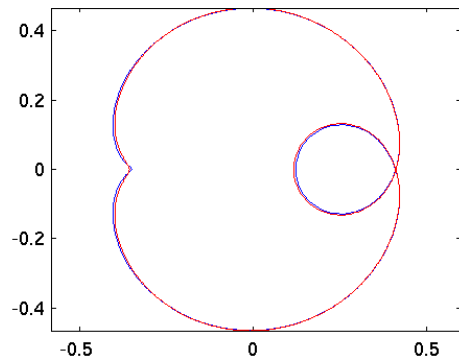


Approximant degree

5

Approximants: order 6

Degree 6 - 1 minimum - Best $J=0.052608$

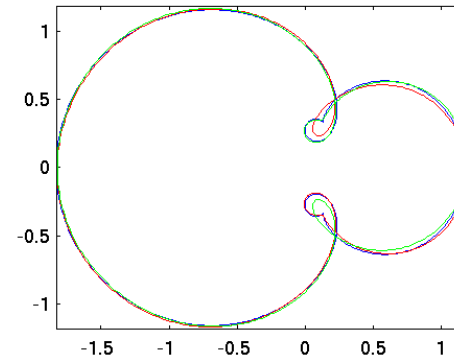
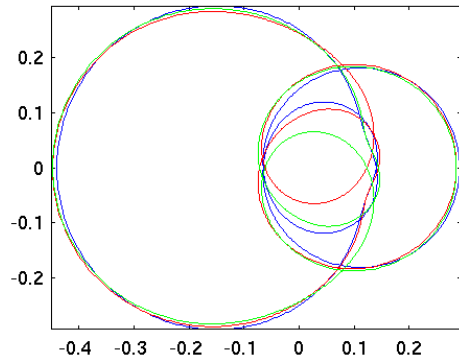
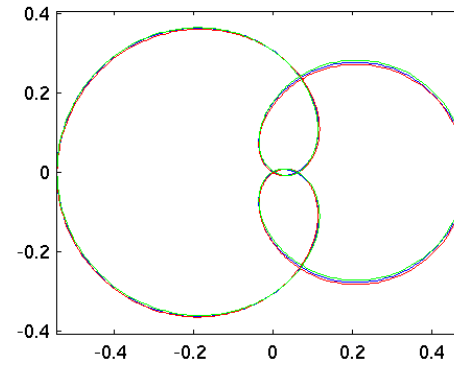
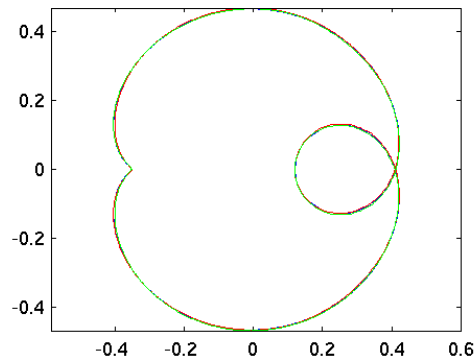


Approximant degree

6

Approximants: order 7

Degree 7 - 2 minima - Best J=0.037284

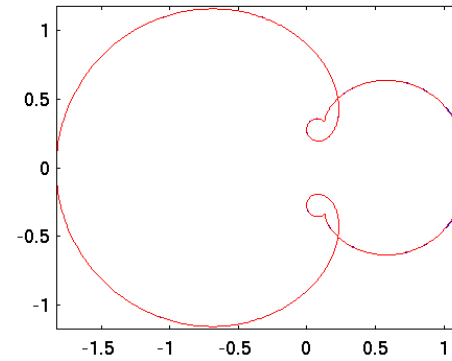
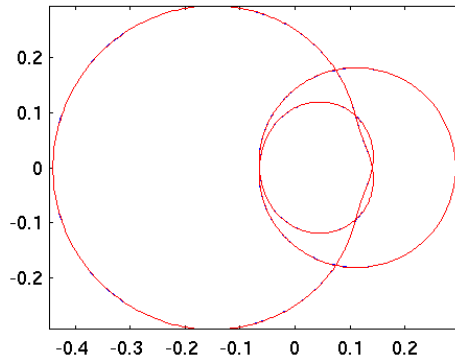
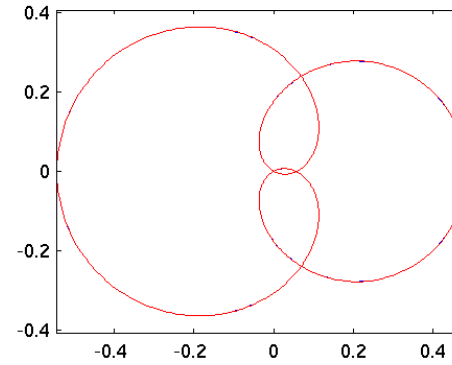
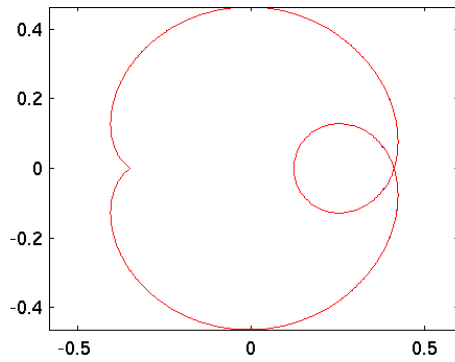


Approximant degree

7

Approximants: order 8

Degree 8 - 1 minimum - Best J=0.000409



Approximant degree

8

Hyperfrequency Filter

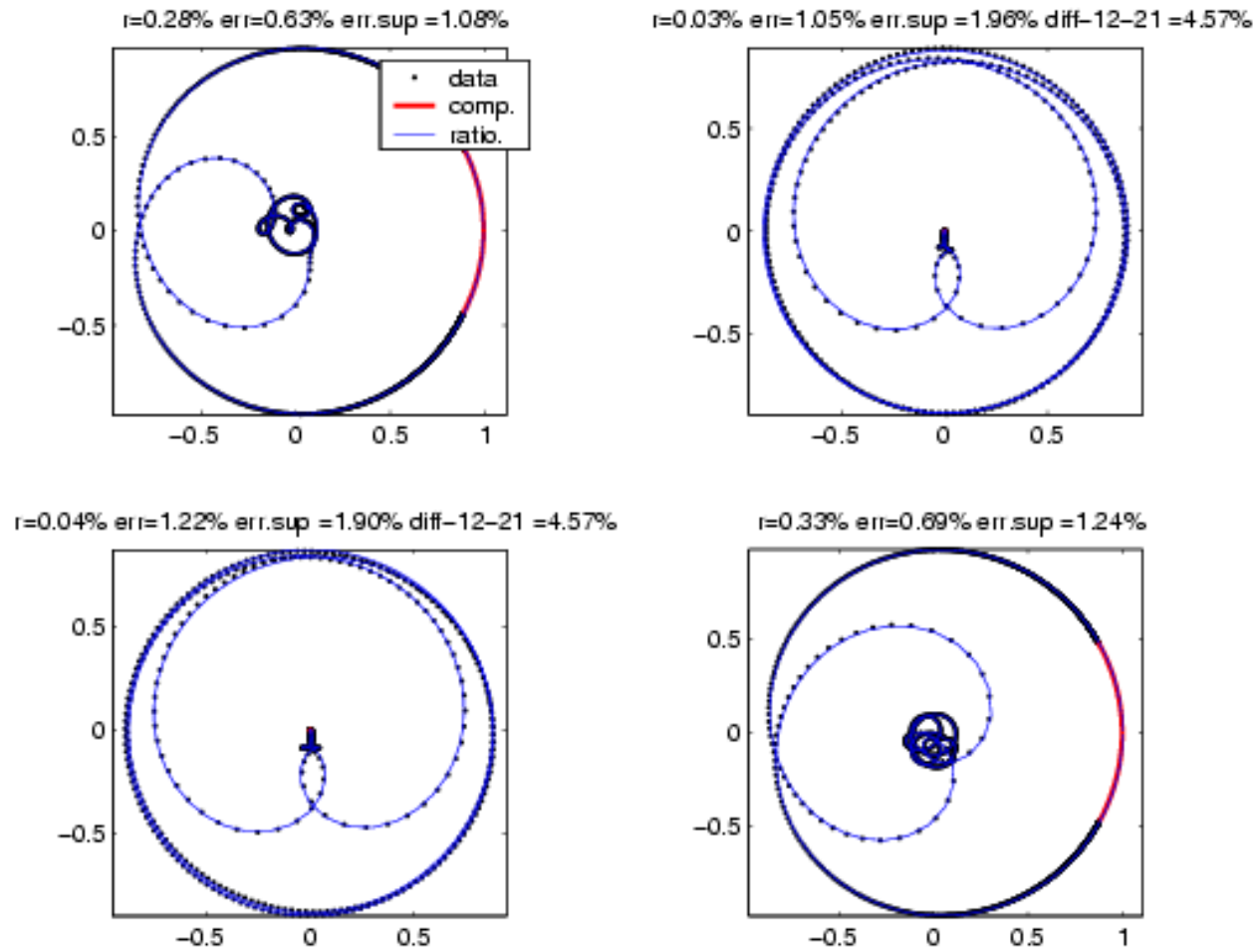
The problem: find a **8th order** model of a **MIMO (2 × 2)** hyperfrequency filter, from **experimental pointwise values in some range of frequencies** provided by the CNES (French space agency).

First stage (interpolation/completion): compute a **stable matrix transfer function of high order** which approximates these data, given by a great number **(800)** of **Fourier coefficients**.

PRESTO-HF: software by **F. Seyfert**;

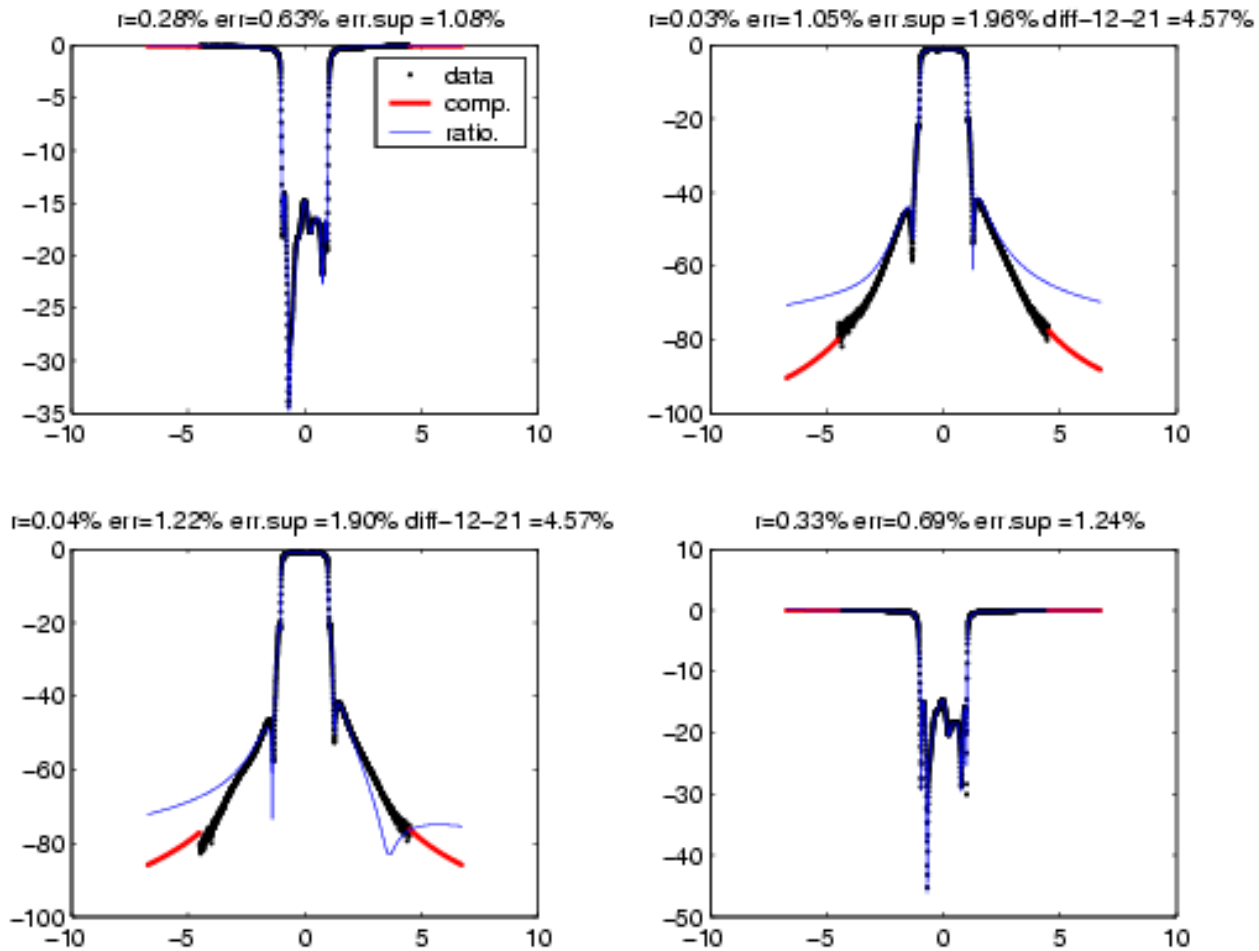
HYPERION: software by **J. Grimm**.

Data and approximant at order 8



Nyquist diagrams

Data and approximant at order 8



Bode diagrams

References

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- [3] B. HANZON AND R.J. OBER, [Overlapping block-balanced canonical forms for various classes of linear systems](#), Linear Algebra and its Applications, 281 (1998), pp. 171-225.
- [4] R.L.M. PEETERS, B. HANZON AND M. OLIVI, [Balanced realizations of discrete-time stable all-pass systems and the tangential Schur algorithm](#), in Proceedings of the ECC99, Karlsruhe, Germany, August 31-September 3.

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