

# A New Algorithm for Computing Certified Numerical Approximations of the Roots of a Zero-dimensional System

Stef Graillat, Philippe Trébuchet

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Finding the common solutions to a polynomial system

$$\left\{ \begin{array}{l} f_1(x_1, \dots, x_n) = 0, \\ f_2(x_1, \dots, x_n) = 0, \\ \vdots \\ f_s(x_1, \dots, x_n) = 0, \end{array} \right.$$

with  $f_i \in \mathbb{C}[x_1, \dots, x_n]$  or in algebraic terms, finding the variety  $V$  of the ideal  $I = \langle f_1, \dots, f_s \rangle$

We assume that  $V$  is finite ( $I$  is 0-dimensional)

# Outline of the talk

- ① The univariate case
- ② Brief review of the different approaches
- ③ The multivariate case
- ④ Implementation and numerical experiments

# The univariate case

Let  $f(x) = f_d x^d + \dots + f_1 x + f_0$  and define  $A = \mathbb{C}[x]/\langle f \rangle$

The matrix of the **multiplication operator**

$$\begin{aligned} M_x : A &\rightarrow A \\ a &\mapsto ax \end{aligned}$$

in the basis  $(1, x, \dots, x^{d-1})$  is

$$M_x = \begin{pmatrix} 0 & \cdots & 0 & -f_0/f_d \\ 1 & \ddots & \vdots & \vdots \\ & \ddots & 0 & \vdots \\ 0 & & 1 & -f_{d-1}/f_d \end{pmatrix}$$

The **eigenvalues** of  $M_x^T$  are the **roots**  $\zeta_1, \dots, \zeta_d$  of  $f$

# The univariate case (cont'd)

The **eigenvectors** of

$$M_x^T = \begin{pmatrix} 0 & \cdots & 0 & -f_0/f_d \\ 1 & \ddots & \vdots & \vdots \\ & \ddots & 0 & \vdots \\ 0 & & 1 & -f_{d-1}/f_d \end{pmatrix}^T$$

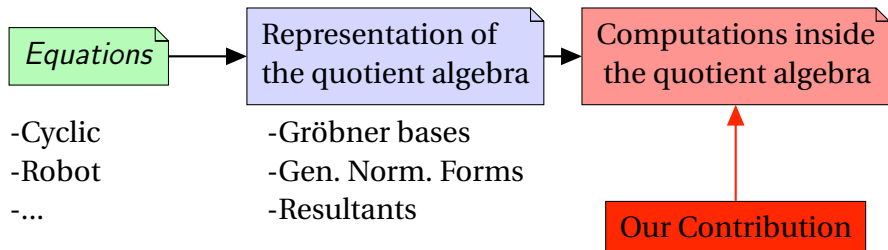
associated to the **eigenvalue**  $\zeta_i$  is  $(1, \zeta_i, \dots, \zeta_i^{d-1})$

The **geometric multiplicity** of eigenvalue  $\zeta_i$  is always **one** for all  $i$

If one works in the dual of  $A$ , the vector  $(1, \zeta_i, \dots, \zeta_i^{d-1})$  can be considered as the evaluation operation at the zero  $\zeta_i$  since

$$(1, \zeta_i, \dots, \zeta_i^{d-1}) \cdot (a_0, a_1, \dots, a_{d-1})^T = \sum_{i=0}^{d-1} a_i \zeta_i^i$$

# Algebraic Methods



# Different methods

- 1 Rational Univariate Representation (RUR) [Rouillier] : a symbolic representation of the roots
- 2 Homotopic continuation method [Vershelde, Sommese]
- 3 Eigenvalue computation [Corless, Gianni, Trager,...] : simultaneous Schur decomposition of the multiplication matrices
- 4 Eigenvalue/Eigenvector computation [Moller, Stetter] : use either eigenvalue or eigenvector to recover informations on the roots

↪ **Contributions** :

- use of the structure of the eigenvector to speed up the algorithm
- use of certified numerical algorithms instead of symbolic ones

# Multivariate case

Let  $f_1, \dots, f_s \in \mathbb{C}[x_1, \dots, x_n]$  and define  $A = \mathbb{C}[x] / \langle f_1, \dots, f_s \rangle$

Let  $B$  a monomial basis of  $A$

The matrix of the multiplication operator  $M_i$  is defined by

$$\begin{aligned} M_i : A &\rightarrow A \\ a &\mapsto x_i a \end{aligned}$$

## Theorem 1 (Corless/Gianni/Trager 96)

*The matrices  $M_1, \dots, M_n$  commute. So there exists a unitary matrix  $V$  such that  $V^* M_i V = U_i$  is upper triangular for all  $i$  (Schur decomposition). The zeros are*

$$\zeta_j = [u_{jj}^1, u_{jj}^2, \dots, u_{jj}^s].$$



## Theorem 2 (Stieckelberger)

*The common eigenvectors to all the transposed multiplication operators, are the evaluation at the root :*

$$\begin{aligned} 1_{\zeta_j} : A &\rightarrow \mathbb{C} \\ p &\mapsto p(\zeta_j) \end{aligned}$$

One can restrict to the multiplication by one variable.

## Algorithm 1 (Undernum, Moller & Tenberg)

INPUT :  $lm = (M_1, \dots, M_n)$  the dual multiplication operators  
 $i$  an integer index

$lv$  a list a vectors expressed on the canonical basis

OUTPUT : A numerical approximation of a common eigenvector to all the  $M_i$ .

- $Sol = []$
- Compute  $M$ , the matrix of the restriction of  $M_i$  on the vector space spanned by the vectors of  $lv$ .
- For each eigenvalue  $v$  of  $M$  do
  - if the eigenspace associated to  $v$  has dimension 1 then
    - Let  $e$  be the eigenvector of the eigenspace.
    - Let  $M_{lv}$  be the matrix whose columns are the vectors of  $lv$ .
    - $e' = M_{lv}e$
    - $Sol = Sol \cup \{e'\}$
  - else
    - Let  $le$  denote the list of eigenvectors associated to  $v$ .
    - $Sol = Sol \cup \text{Undernum}(lm, i + 1, le)$
- Return  $Sol$

## Algorithm 2 (Symbonum, Moller & Tenberg)

INPUT :  $M_1, \dots, M_n$  the  $n$  transposed multiplication operators

OUTPUT : A numerical approximation of the roots of the system  $f_1, \dots, f_s$

- $Res = []$
- Let  $C$  be the list of the vectors of the canonical basis.
- $Tmp\_sol = \text{Undernum}([M_1, \dots, M_n], 1, C)$
- For each  $v$  in  $Tmp\_sol$  do
  - $tmpres = []$
  - for  $i$  from 1 to  $n$  do
    - $tmpres = tmpres \cup \text{DotProd}(\text{Row}(1, M_i), v / v[1])$
  - $Res = Res \cup tmpres$
- return  $Res$

# A numerical algorithm

**Aim** : having a numerical version of this algorithm

**Problems & drawbacks** :

- no certification on what is computed
- numerically speaking, the eigenvectors are not well defined
- the algorithm requires the computation of the multiplication operators by all variables

# Example

System :  $X^2 = 0, Y^2 = 0$

Monomial basis :  $B = \{1, x, y, xy\}$

$$M_x = \begin{pmatrix} 0 & 0 & 0 & 0 \\ 1 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 \\ 0 & 0 & 1 & 0 \end{pmatrix} \rightsquigarrow M_x^T = \begin{pmatrix} 0 & 1 & 0 & 0 \\ 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 \\ 0 & 0 & 0 & 0 \end{pmatrix}$$

$$\text{eigenvectors : } \begin{pmatrix} 1 \\ 0 \\ 0 \\ 0 \end{pmatrix}, \begin{pmatrix} 0 \\ 0 \\ 1 \\ 0 \end{pmatrix}$$

Need to examine the action of  $M_y^T$  on this 2-dimensional space !

# Numerical observations

- certified error bounds for eigenvalues and eigenvectors [Rump]
  - Use of **interval arithmetic** and **self-validating methods**
- works only with nonderogatory eigenvalue but

## Theorem 3 (Rump)

*For  $A \in M_n(\mathbb{C})$ , let an eigenvalue  $\lambda \in \text{Spec}(A)$  (Spec denotes the spectrum) be given with algebraic multiplicity  $m$  and let  $y \neq 0$ , be a vector of  $\mathbb{C}^n$  such that  $Ay = \lambda y$ , i.e.  $y$  is an eigenvector associated to  $\lambda$ . Then for all  $\epsilon > 0$  there exists  $\tilde{A}$  such that  $\|A - \tilde{A}\|_\infty \leq \epsilon$  and the following properties hold :*

- $\lambda \in \text{Spec}(\tilde{A})$ .
- $\lambda$  is of algebraic multiplicity  $m$ .
- $\lambda$  is of geometric multiplicity one.
- $\tilde{A}y = \lambda y$ .

# Numerical observations (cont'd)

- certified error bounds for eigenvalues and eigenvectors [Rump]
  - compute in general an enclosure of a basis of a **full invariant subspace** and not an enclosure for only eigenvectors
  - but eigenvectors belongs to the full invariant subspace
  - the use of the **structure** of the eigenvectors makes it possible to recover them from the full invariant subspace
  - use of fast QR-multishift routine (LAPACK) to compute eigenelements
  - certification can be done once at the end of the algorithm

# Clusterization

Need to group together eigenvalues that are very closed

Consider an eigenvalue  $\alpha$ , and  $v$  and  $u$  be its associated left eigenvector and right eigenvector :  $Au = \alpha u$  and  $v^T A = \alpha v^T$ .

The **reciprocal condition number** of  $\alpha$  is

$$\text{rcond}_\alpha = \frac{|v^* u|}{\|v\| \cdot \|u\|},$$

$\alpha_i$  and  $\alpha_j$  are grouped together if

$$|\alpha_i - \alpha_j| \leq \max\left(\frac{\text{prec}}{\text{rcond}_{\alpha_i}}, \frac{\text{prec}}{\text{rcond}_{\alpha_j}}\right)$$



# Structure of the eigenvectors

## Theorem 4

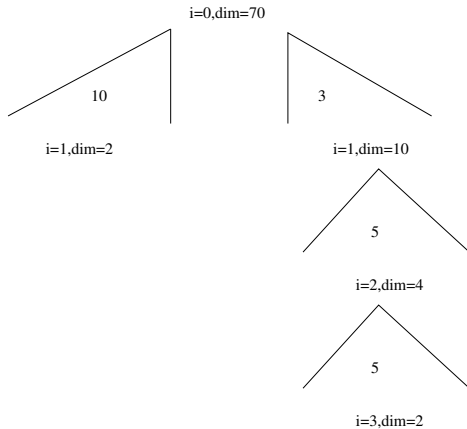
Let  $\alpha_1, \dots, \alpha_k$  be eigenvalues of respectively  $M_{x_1}^T, \dots, M_{x_k}^T$ . Consider the vector space

$$E = \text{Eig}(M_{x_1}^T, \alpha_1) \cap \text{Eig}(M_{x_2}^T, \alpha_2) \cap \dots \cap \text{Eig}(M_{x_k}^T, \alpha_k)$$

where  $\text{Eig}(M_{x_i}^T, \alpha_i)$  denotes the full invariant subspace of the matrix  $M_{x_i}^T$  associated to the eigenvalue  $\alpha_i$ . Let  $m$  be a monomial of the monomial basis  $B$  such that  $m = x_1^{d_1} \dots x_k^{d_k}$ . Then the common eigenvectors to all the transposed multiplication operators that belong to  $E$  are such that : the coordinate of  $m$  in these vectors is  $\alpha_1^{d_1} \dots \alpha_k^{d_k}$ .

→ this gives constraints on the **eigenvectors**

# Example on cyclic5



# Implementation

Implementation in C++ (2500 lines)

The implementation is divided into three main components :

- the routine to compute the normal form of the quotient algebra
- the routine for performing the numerical root computing
- the routine to certify the clusters of the first matrix chosen

Use of a generic BLAS and LAPACK library with GMP and Boost (for interval)

# Timings

Laptop Intel Core 2 Duo 8400 with 4 Go running on Linux 2.6.26

Name	arith	Nb. sol.	Time (s)	Prec
cyclic5	double	70	2	1e-15
cyclic5	long double	70	3	1e-16
cyclic5	mpf_class	70	103.84	<1e-50
katsura6	double	64	0.3	1e-10
katsura6	long double	64	0.91	1e-16
katsura6	mpf_class	64	33.91	1e-40
katsura7	double	128	3.8	1e-10
katsura7	long double	128	7.3	1e-16
katsura7	mpf_class	128	515	1e-43
katsura8	double	256	96	1e-4
katsura8	long double	256	127	1e-10
katsura8	mpf_class	256	> 1h	1e-10
fabrice24	double	40	0.07	1e-8
fabrice24	long double	40	0.14	1e-11
fabrice24	mpf_class	40	9	1e-41

double = 64 bits, long double = 80 bits, mpf = 200 bits

# Conclusion and future work

Algorithm with **two steps** :

- a first numerical computation that is currently not certified
- a second step that is a verification of the numerical computations

The main improvements of this algorithm are

- the use of **certified numerical computation**
- the use of **duality**
- the use of the **structure of the evaluation operators** to avoid some recursive calls

**Future work** :

- parallelization of recursive calls (OpenMP)
- algebraic multiplicity of the clusters
- better use of the structure of the representation of the quotient algebra

Thank you for your attention