

# Certified numerical tools for computing the topology of projected curves

Rémi Imbach, Guillaume Moroz and Marc Pouget



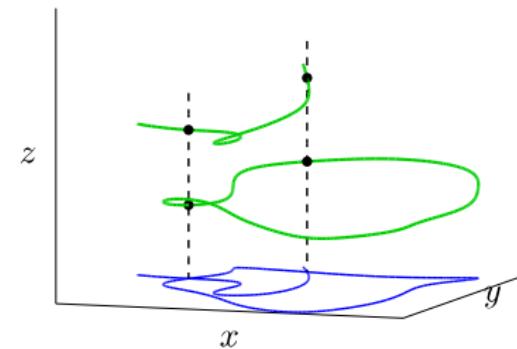
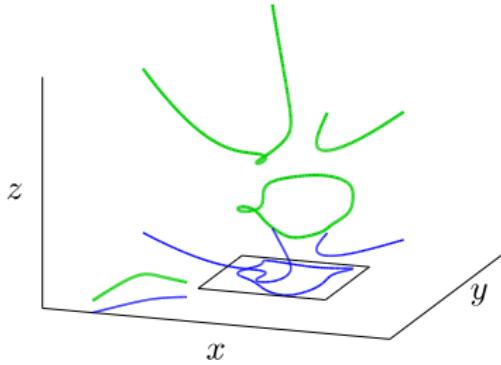
# Projection and Apparent Contour

$P, Q$  two (polynomial or analytic) maps  $\mathbb{R}^3 \rightarrow \mathbb{R}$

Curve defined as the intersection of two surfaces:

$$\mathcal{C} : \begin{cases} P(x, y, z) = 0 \\ Q(x, y, z) = 0 \end{cases}, (x, y, z) \in \mathbb{R}^3$$

Projection in the plane:  $\pi_{(x,y)}(\mathcal{C})$



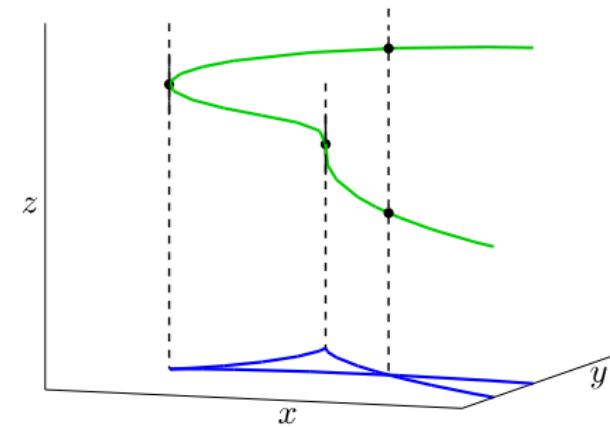
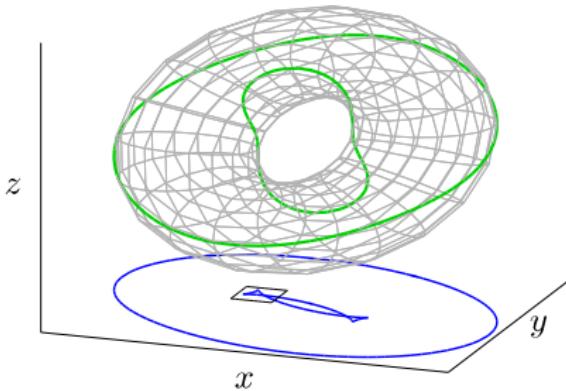
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Apparent contour:  $\pi_{(x,y)}(\mathcal{C})$

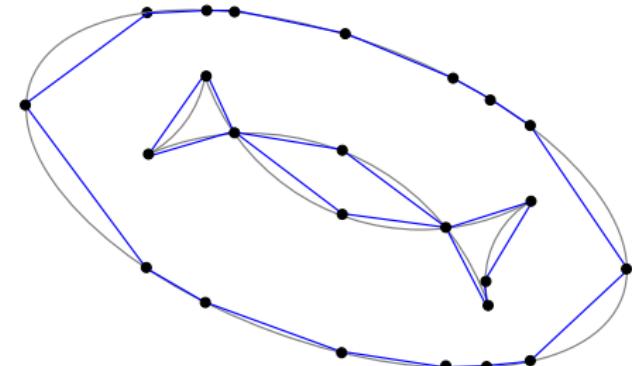
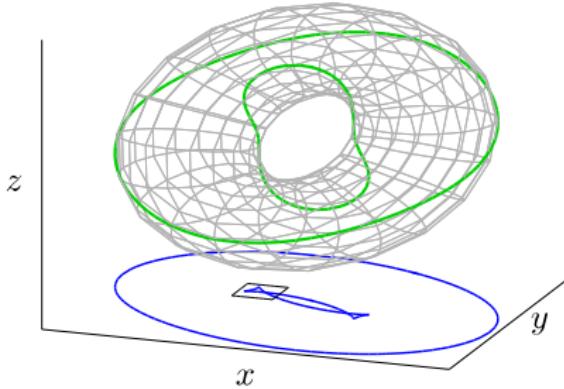


# Computing the topology of a real plane curve $\mathcal{B}$

$$\mathcal{B} = \{(x, y) \in \mathbb{R}^2 \mid \exists z \in \mathbb{R} \text{ s.t. } (x, y, z) \in \mathcal{C}\}$$

Goal: with numerical approaches, compute

- exact topology
- approximated geometry

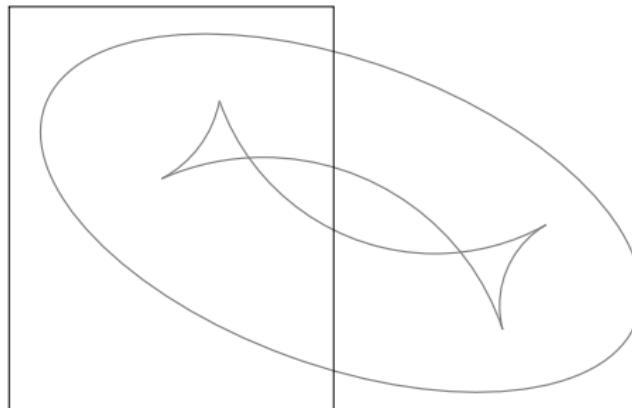


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## A general framework

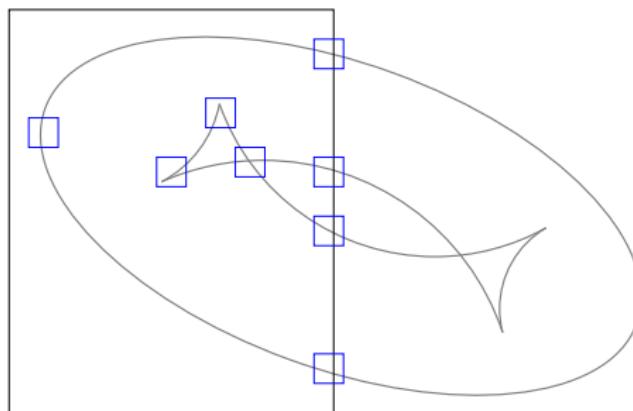
- ① Restrict to a compact  $\mathbf{B}_0$
- ② Isolate in boxes:
  - boundary points
  - $x$ -critical points
  - singularities
- ③ Compute topology around singularities
- ④ Connect boxes

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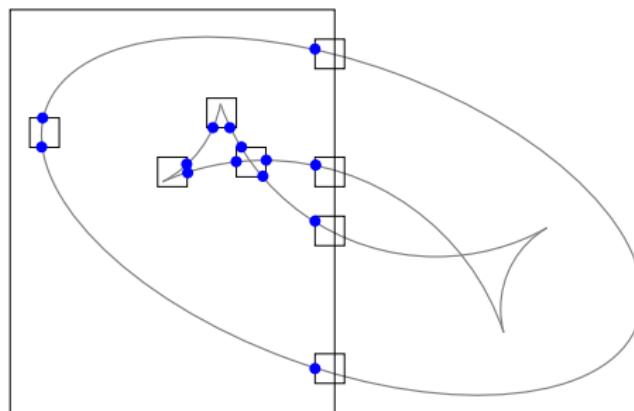
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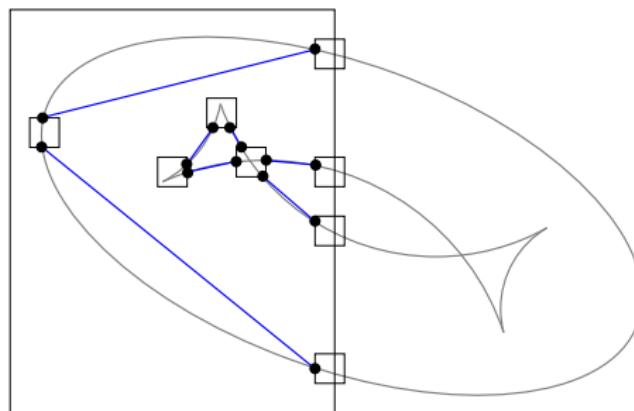
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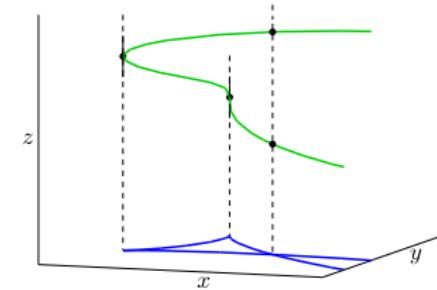
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# Computing the topology of a real plane curve $\mathcal{B}$

Characterization and isolation of nodes and cusps:

- Resultant approaches
- Geometric approach



## ① Isolate in boxes:

- boundary points
- $x$ -critical points
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Certified numerical tools:

- 0-dim solver: branch and bound solver

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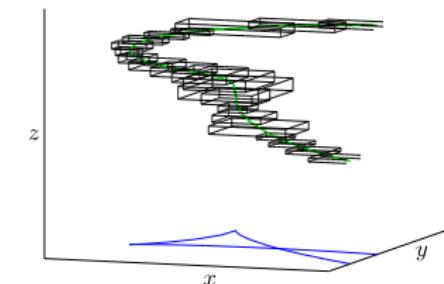
- Resultant approaches
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Enclosing  $\mathcal{C}$  in a sequence of boxes:

- Restrict the domain where singularities are sought
- Compute topology

Certified numerical tools:

- 0-dim solver: branch and bound solver
- 1-dim solver: certified path tracker



## ① Isolate in boxes:

- boundary points
- $x$ -critical points
- **singularities**

## ② Compute topology around singularities

## ③ Connect boxes

## Isolating singularities

$$\mathcal{B} = \{(x, y) \in \mathbb{R}^2 \mid r(x, y) = 0\},$$

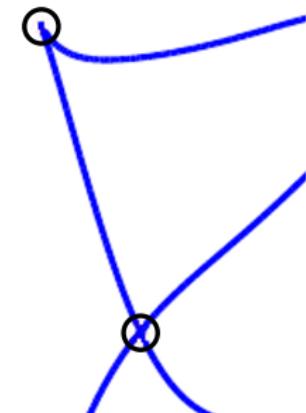
Singularities of  $\mathcal{B}$  are the solutions of:

$$(S) \begin{cases} r(x, y) = 0 \\ r_x(x, y) = 0 \\ r_y(x, y) = 0 \end{cases}$$

... that is over-determined

... that has solutions of multiplicity 2

symbolic approaches: Gröbner Basis, RUR



## Isolating singularities of apparent contours

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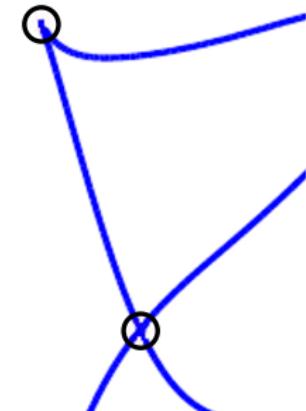
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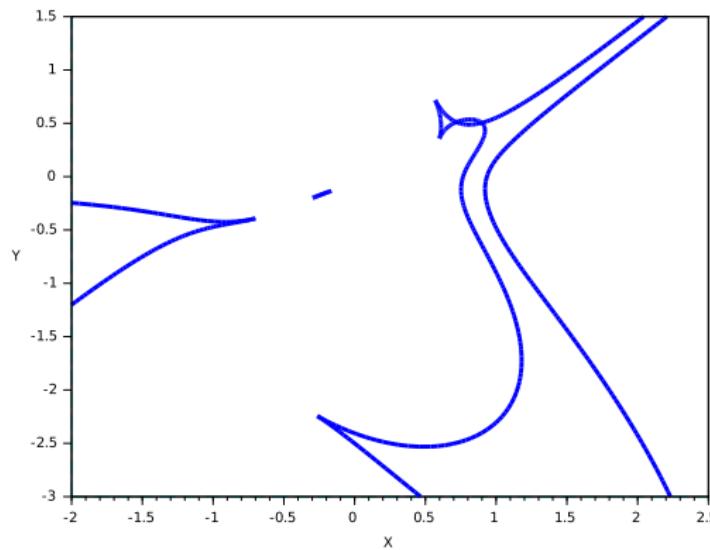
# Example

$P$ , degree 6, bit-size 8, 84 monomials

$$\begin{aligned} P = & 158x^6 - 186x^5y + 205x^5z - 160x^4y^2 + 105x^4yz + 116x^4z^2 - 69x^3y^3 - 161x^3y^2z - 8x^3yz^2 + 107x^3z^3 + \\ & 144x^2y^4 - 193x^2y^3z + 130x^2y^2z^2 + x^2yz^3 + 47x^2z^4 + 165xy^5 - 220xy^4z - 21xy^3z^2 + 50xy^2z^3 - 130xyz^4 - 77xz^5 + \\ & 66y^6 - 55y^5z + 219y^4z^2 - 30y^3z^3 - 162y^2z^4 - 182yz^5 - 145z^6 + 105x^5 + 241x^4y - 177x^4z - 127x^3y^2 - 97x^3yz + \\ & 223x^3z^2 - 46x^2y^3 - 213x^2y^2z + 39x^2yz^2 + 191x^2z^3 + 65xy^4 - 105xy^3z - 248xy^2z^2 + 158xyz^3 - 183xz^4 + 48y^5 - \\ & 240y^4z + 235y^3z^2 + 194y^2z^3 - 45yz^4 + 159z^5 - 81x^4 - 230x^3y - 247x^3z - 38x^2y^2 + 106x^2yz + 184x^2z^2 + 49xy^3 - \\ & 197xy^2z - 182xyz^2 - 223xz^3 - 205y^4 - 225y^3z - 14y^2z^2 - 17yz^3 + 73z^4 - 234x^3 - 82x^2y + 179x^2z + 46xy^2 - 222xyz - \\ & 95xz^2 + 139y^3 + 168y^2z + 8yz^2 + 156z^3 + 159x^2 - 147xy - 22xz - 104y^2 + 181yz + 26z^2 - 90x + 250y + 19z + 19 \end{aligned}$$

# Example

$P$ , degree 6, bit-size 8, 84 monomials



# Example

$P$ ,      degree 6,      bit-size 8,      84 monomials  
 $r$ ,      degree 30,      bit-size 111,      496 monomials

$$\begin{aligned}
 \text{Res}(P, P_z, z) = & 25378517513821930985374726185 x^{30} - 195028956698484982176266264460 x^{29} y + \\
 & 669460660893860813921604554100 x^{28} y^2 - 631323116304152251056202148000 x^{27} y^3 - \\
 & 1028704563680432990245022354280 x^{26} y^4 + 45977970156051179086240080820 x^{25} y^5 + \\
 & 3554469553406371293751987742270 x^{24} y^6 + 3711031010928440039666656612920 x^{23} y^7 - \\
 & 5634442800184514383998916600260 x^{22} y^8 - 11658591855069381144706595841060 x^{21} y^9 - \\
 & 4387874939266072948066332459470 x^{20} y^{10} + 16408843461038228420223023180230 x^{19} y^{11} + \\
 & 23700165794251777062304009772915 x^{18} y^{12} + 4316324180997748865901800201620 x^{17} y^{13} - \\
 & 24929137305247653219088728498740 x^{16} y^{14} - 33372908351021778030492119654810 x^{15} y^{15} - \\
 & 9633448028150975870147511674570 x^{14} y^{16} + 20500155431790235158403374001190 x^{13} y^{17} + \\
 & 31668089060759309350684716458350 x^{12} y^{18} + 16544278550218652616250018398520 x^{11} y^{19} - \\
 & 5014730522275651771719575652535 x^{10} y^{20} - 16590111614945163714073974823320 x^9 y^{21} - \\
 & 13546083341149182083464535866425 x^8 y^{22} - 4754759946941791724566012110130 x^7 y^{23} + \\
 & 130721884117387069735758825 x^6 y^{24} + 3898998021968250822246999603270 x^5 y^{25} +
 \end{aligned}$$

## Isolating singularities of apparent contours

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degree of $P$	6	7	8	9
(S) with RSCube*	32s	254s	1898s	9346s

\* F. Rouillier

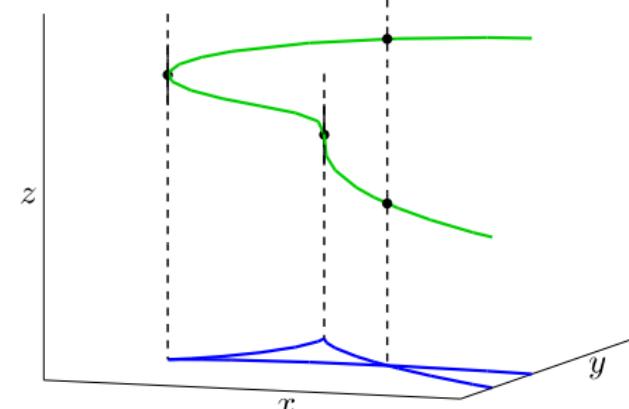
## Sub-resultant based deflation system

$(\alpha, \beta)$  node of  $\mathcal{B}$

$\iff P(\alpha, \beta, z)$  and  $P_z(\alpha, \beta, z)$  have two common roots  $z_0, z_1$

$(\alpha, \beta)$  cusp of  $\mathcal{B}$

$\iff P(\alpha, \beta, z)$  and  $P_z(\alpha, \beta, z)$  have a double root  $z_0$   
 $(\Rightarrow P_{zz}(\alpha, \beta, z_0) = 0)$



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$P(\alpha, \beta, z), P_z(\alpha, \beta, z)$  have a gcd of degree 2

## Sub-resultant based deflation system

Sub-resultant chain of  $P, P_z, z$ :

$$S^0 =$$

$$\text{Res}(P, P_z, z)(x, y) = r(x, y)$$

$$S^1 =$$

$$s_{11}(x, y)z + s_{10}(x, y)$$

$$S^2 = s_{22}(x, y)z^2 + s_{21}(x, y)z + s_{20}(x, y)$$

$$\dots = \dots$$

where  $s_{l,k} = \det(A)$ ,  $A \in \mathcal{M}_{(m+n-l) \times (m+n-l)}(\mathbb{Q}[x, y])$

**Proposition**  $P(\alpha, \beta, z), P_z(\alpha, \beta, z)$  have a gcd of degree 2 iff  $r(\alpha, \beta) = s_{11}(\alpha, \beta) = s_{10}(\alpha, \beta) = 0$  and  $s_{22}(\alpha, \beta) \neq 0$ .

## Sub-resultant based deflation system

$$(\mathcal{S}_2) \left\{ \begin{array}{l} s_{10}(x, y) = 0 \\ s_{11}(x, y) = 0 \quad \text{s.t.} \quad s_{22}(x, y) \neq 0 \\ r(x, y) = 0 \end{array} \right.$$

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**Remark** Under genericity assumptions on  $P$ , one has:  
if  $(x, y)$  is s.t.  $s_{11}(x, y) = s_{10}(x, y) = 0$  then  
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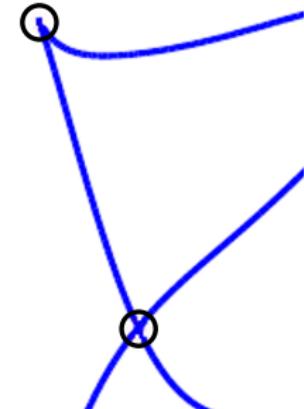
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Singularities of  $\mathcal{B}$  are the regular solutions of:

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... where  $s_{10}, s_{11}, s_{22}$  are coefficients in the subresultant chain.



# Example

$P$ , degree 6, bit-size 8, 84 monomials  
 $r$ , degree 30, bit-size 111, 496 monomials  
 $s_{11}, s_{10}$ , degree 20, bit-size 90, 231 monomials

$$\begin{aligned}
 s_{11} = & -140117848627008812531220 x^{20} - 610153133593349354171040 x^{19}y + 39516518923021733844070 x^{18}y^2 + \\
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 & 20482823881470123106468370 x^{10}y^{10} + 11024860229216130931420010 x^9y^{11} - \\
 & 1126962434297495978162860 x^8y^{12} - 12884485324685747664432680 x^7y^{13} - \\
 & 9059725287074848327234580 x^6y^{14} - 4941320817429025658253850 x^5y^{15} + 2122391146412348698406760 x^4y^{16} + \\
 & 2384112136850068775369540 x^3y^{17} + 2363347796938811648578260 x^2y^{18} + 735933941537801203166720 xy^{19} + \\
 & 293011939904302120871210 y^{20} + 693411445688541987909840 x^{19} + 4819667434476299196422270 x^{18}y - \\
 & 854531603999857310010090 x^{17}y^2 - 4588903065796097271527060 x^{16}y^3 - 12454540077632985887041990 x^{15}y^4 - \\
 & 19038809918580772113933260 x^{14}y^5 - 5255594134400598288192960 x^{13}y^6 + 1174005266404773044076220 x^{12}y^7 + \\
 & 39658021585466235582243720 x^{11}y^8 + 49141822061980186469013340 x^{10}y^9 + \\
 & 5125150511200301256660000 x^{9}y^{10} - 11669318785950916496923050 x^8y^{11} -
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( $\mathcal{S}$ ) with RSCube*	32s	254s	1898s	9346s
( $\mathcal{S}_2$ ) with RSCube	15s	105s	620s	3 300s
( $\mathcal{S}_2$ ) with Bertini	1005s	$\geq 3000s$	$\geq 3000s$	$\geq 3000s$

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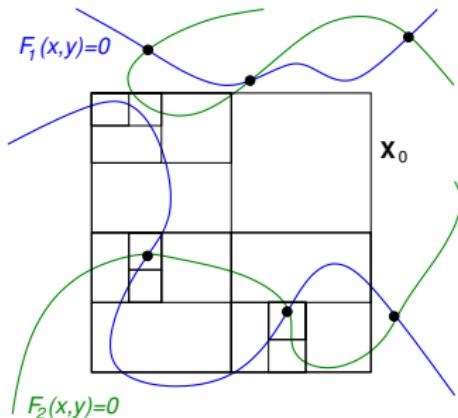
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[IMP16] Rémi Imbach, Guillaume Moroz, and Marc Pouget.

A certified numerical algorithm for the topology of resultant  
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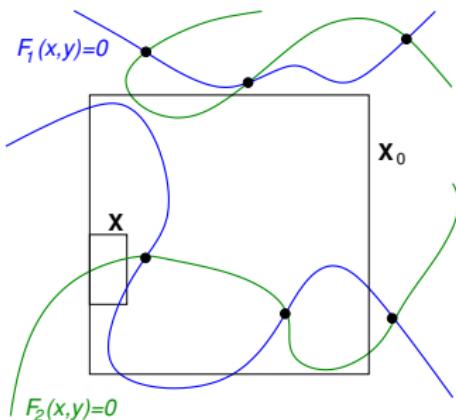
*Journal of Symbolic Computation*, 2016.

# A branch and bound solver for systems of large polynomials



[Neu90] A. Neumaier.  
*Interval methods for systems of equations.*  
Cambridge University Press, 1990.

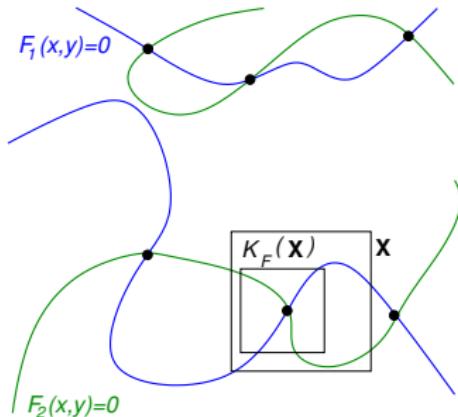
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Interval extension  $\square F$  of  $F$ :  
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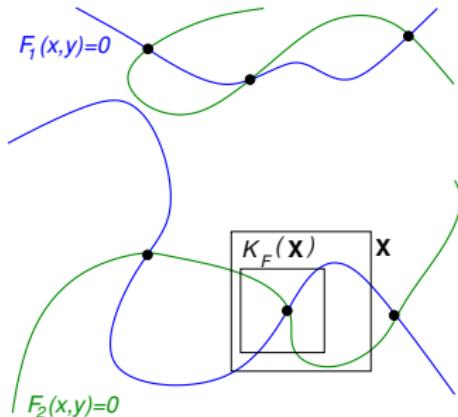
- Interval Gauss-Seidel
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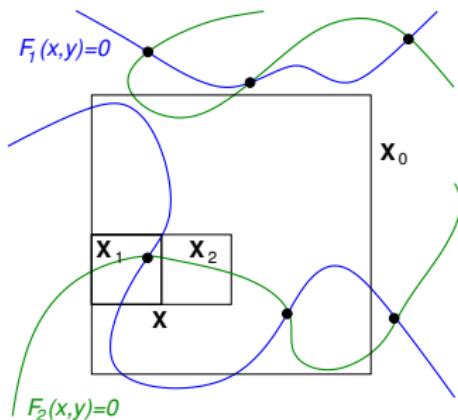
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# A branch and bound solver for systems of large polynomials



Interval extension  $\square F$  of  $F$ :

$0 \notin \square F(\mathbf{X}) \Rightarrow$  no solution in  $\mathbf{X}$

Interval newton operators  $K_F(\mathbf{X})$ :

$K_F(\mathbf{X}) \subset \text{int}(\mathbf{X}) \Rightarrow \exists! \text{ solution in } \mathbf{X}$

- Interval Gauss-Seidel
- Krawczyk  $K_F(\mathbf{X})$
- ...

Inclusion monotonicity:

$$\mathbf{X} = \mathbf{X}_1 \cup \mathbf{X}_2 \Rightarrow \square F(\mathbf{X}_1) \cup \square F(\mathbf{X}_2) \subseteq \square F(\mathbf{X})$$

[Neu90] A. Neumaier.

*Interval methods for systems of equations.*

Cambridge University Press, 1990.

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$$s11 = -140117848627008812531220 x^{20} - 610153133593349354171040 x^{19} y +$$

$$39516518923021733844070 x^{18} y^2 + 3342883727033466620154170 x^{17} y^3 +$$

$$2891274355142589403901890 x^{16} y^4 + 112794729750527524649840 x^{15} y^5 -$$

$$11340692490521298700125220 x^{14} y^6 - 11062911106388945165447000 x^{13} y^7 -$$

$$2946445042372334921153850 x^{12} y^8 + 12890641493062475757808370 x^{11} y^9 +$$

$$20482823881470123106468370 x^{10} y^{10} + 11024860229216130931420010 x^9 y^{11} -$$

$$1126962434297495978162860 x^8 y^{12} - 12884485324685747664432680 x^7 y^{13} -$$

$$9059725287074848327234580 x^6 y^{14} - 4941320817429025658253850 x^5 y^{15} +$$

$$2122391146412348698406760 x^4 y^{16} + 2384112136850068775369540 x^3 y^{17} +$$

$$2363347796938811648578260 x^2 y^{18} + 735933941537801203166720 x y^{19} +$$

$$293011939904302120871210 y^{20} + 693411445688541987909840 x^{19} +$$

$$4819667434476299196422270 x^{18} y - 854531603999857310010090 x^{17} y^2 -$$

$$4588903065796097271527060 x^{16} y^3 - 12454540077632985887041990 x^{15} y^4 -$$

$$19038809918580772113933260 x^{14} y^5 - 5255594134400598288192960 x^{13} y^6 +$$

$$1174005266404773044076220 x^{12} y^7 + 39658021585466235582243720 x^{11} y^8 +$$

$$49141822061980186469013340 x^{10} y^9 + 51251450511200391856666690 x^9 y^{10} +$$

$$116508137835016022000 x^8 y^{11} - 20018672226988080 x^7 y^{12} -$$

# Evaluating large multivariate polynomials

Quickly: multivariate Horner scheme

Sharply:  $\square F$  can be implemented by:

$^0F$ : Horner form, linearly convergent toward  $F$

$^1F$ : centered eval. at order 1, quadratically convergent toward  $F$

$^2F$ : centered eval. at order 2, at least quadratically convergent toward  $F$

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Pols	random				
$d, \sigma$	32, 32	64, 64	128, 128		
$^0F$	1 188	1 503	1 730		
$^1F$	1 054	1 293	1 432		
$^2F$	747	966	952		

Nb of explored boxes and times in s., systems of 2 pols in 2 unknowns

[Neu90] A. Neumaier.

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$^0F$	1 188	0.17s	1 503	0.77s	1 730	3.8s
$^1F$	1 054	0.11s	1 293	0.67s	1 432	3.2s
$^2F$	747	0.09s	966	0.44s	952	1.9s

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Pols	random				disc deg 8	
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## Adapting arithmetic precision

Arithmetic precision is doubled if

Criteria of [Rev03]:  $\{\mathbf{X}_1, \mathbf{X}_2\} = \text{bisect}(\mathbf{X})$ ,  $w(\mathbf{X})$ : width of  $\mathbf{X}$

(c1) the width of  $\mathbf{X}$  is near the actual machine  $\epsilon$ :

$$w(\mathbf{X}_1) \geq w(\mathbf{X}) \text{ or } w(\mathbf{X}_2) \geq w(\mathbf{X})$$

(c2)  $\square F(\mathbf{X})$  is no more inclusion monotonic

$$\square F(\mathbf{X}_1) \cup \square F(\mathbf{X}_2) \not\subseteq \square F(\mathbf{X})$$

[Rev03] N. Revol.

Interval newton iteration in multiple precision for the univariate case.

*Numerical Algorithms*, 34(2-4):417–426, 2003.

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Heuristic criterion for krawczyk operator:

$w(\mathbf{X})$  : width of  $\mathbf{X}$

$$K_F(\mathbf{X}) = \mathbf{P} - J_F(\mathbf{P})^{-1}F(\mathbf{P}) + \square J_F(\dots), \text{ where } \mathbf{P} \text{ is a point in } \mathbf{X}$$

Certificate of existence and uniqueness only if  $K_F(\mathbf{X}) \subset \text{int}(\mathbf{X})$

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$$\Rightarrow w(K_F(\mathbf{X})) = \underbrace{w(\mathbf{P} - J_F(\mathbf{P})^{-1}F(\mathbf{P}))}_{\leq \epsilon} + w(\square J_F(\dots))$$

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$$(c3) \quad w(\mathbf{P} - J_F(\mathbf{P})^{-1} F(\mathbf{P})) \geq w(\mathbf{X})$$

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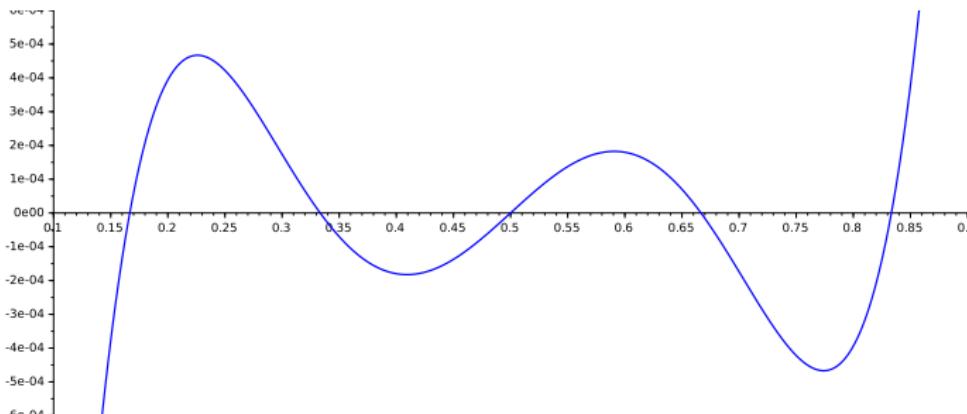
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$$F(X) = (X - \frac{1}{6}) \cdots (X - \frac{5}{6})$$

mantissa: 15 bits  
machine  $\epsilon: \simeq 10^{-4}$

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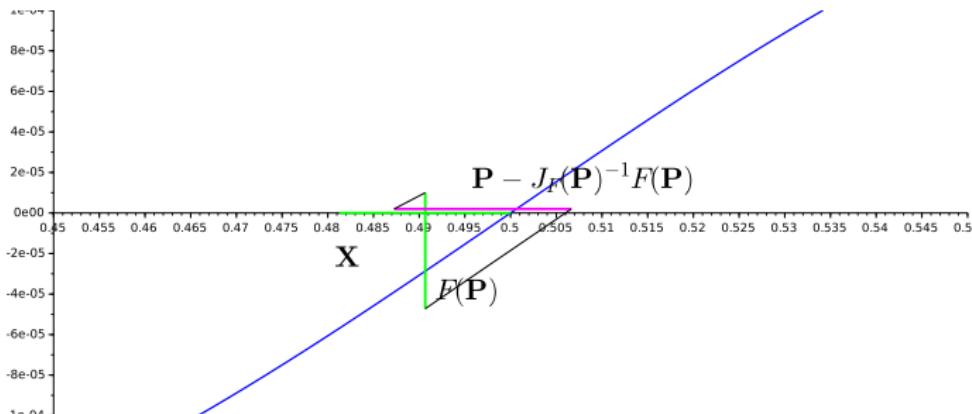
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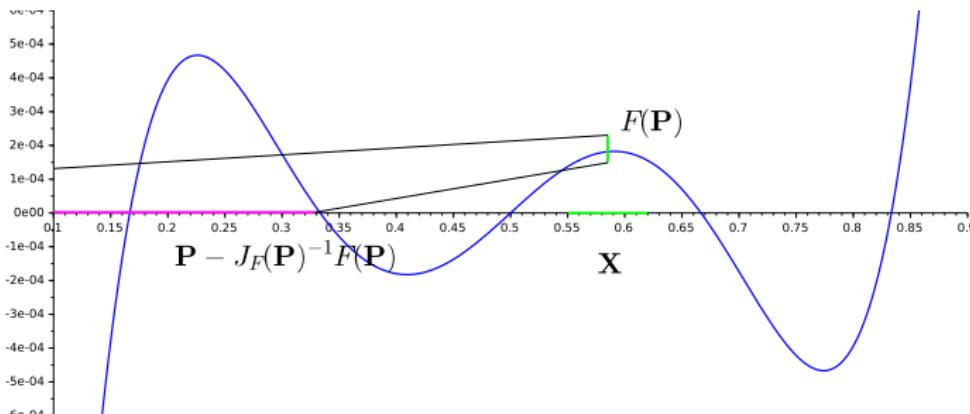
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$$W_N(X) = (X - \frac{1}{N+1}) \dots (X - \frac{N}{N+1})$$

	$W_{20}(X)$ on $[0, 1]$			disc. deg 8 on $[-1, 1] \times [-1, 1]$		
	prec		t. in s.	prec		t. in s.
	53	106		53	106	
(c2)	519 983	129 297	$\simeq 8$	874 620	30 697	$\simeq 400$
(c3)	308 941	202 123	$\simeq 10$	723 146	3 013	$\simeq 207$

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## Results:

Datas: Random dense polynomials of degree  $d$ , bit-size 8

0-dim solver: multi-precision subdivision solver, c++/cython/sage  
IA libraries: BOOST for double precision, MPFI otherwise

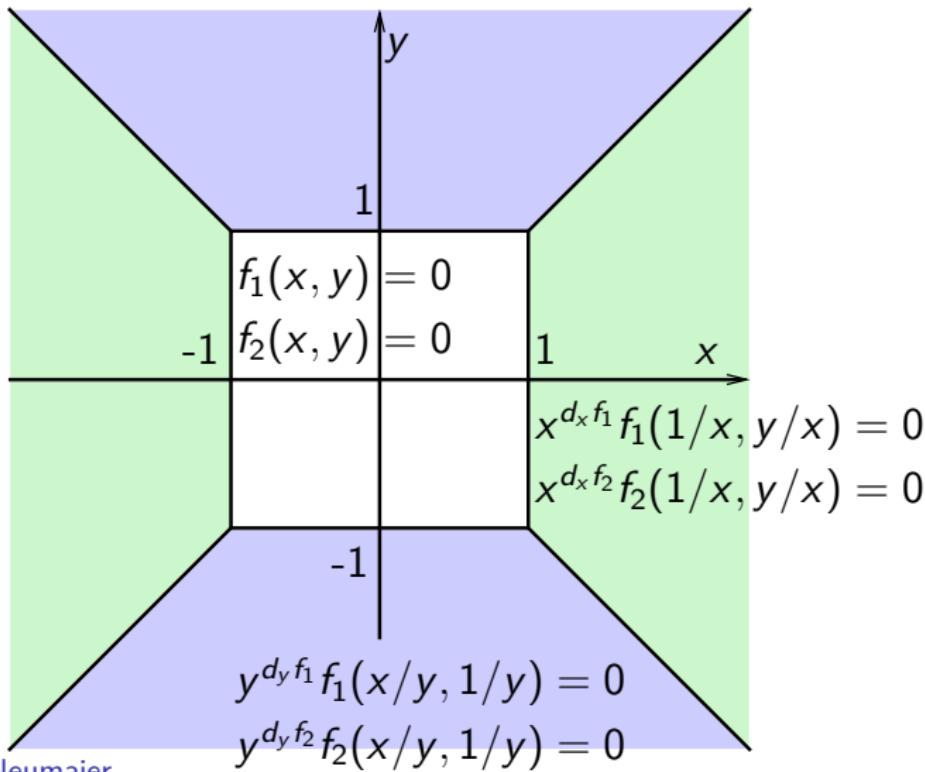
[Imb16] Rémi Imbach.

A Subdivision Solver for Systems of Large Dense Polynomials.  
Technical Report 476, INRIA Nancy, March 2016.

Numerical results: Isolating singularities of an apparent contour

system	$\mathcal{S}_2$ , RSCube	$\mathcal{S}_2$ , subd.	
domain	$\mathbb{R}^2$	$[-1, 1] \times [-1, 1]$	
$d$			
6	15	0.5	
7	105	4.44	
8	620	37.9	
9	3300	23.2	

means on 5 examples of sequential times.

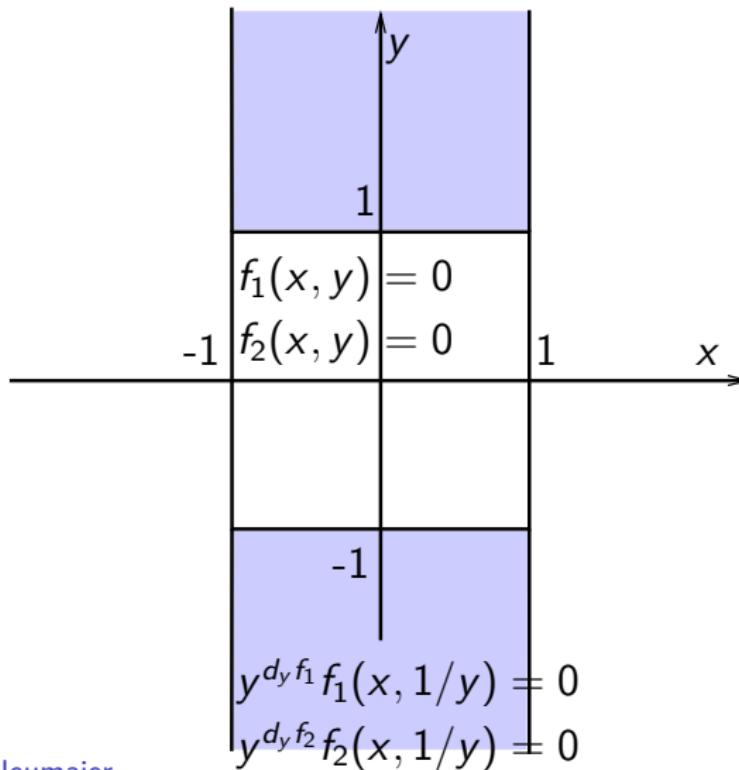


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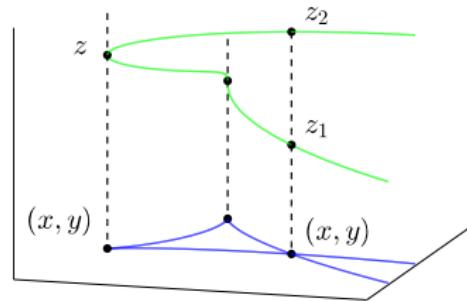
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means on 5 examples of sequential times.

## Characterizing singularities:

$$\mathcal{B} = \{(x, y) \in \mathbb{R}^2 \mid \exists z \in \mathbb{R} \text{ s.t. } (x, y, z) \in \mathcal{C}\}$$



**Lemma 1:**  $(x, y)$  is a node of  $\mathcal{B} \Leftrightarrow (x, y, z_1, z_2)$  satisfies:

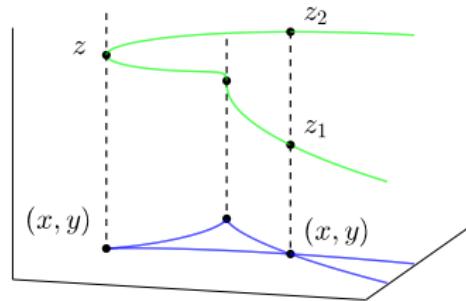
$$P(x, y, z_1) = Q(x, y, z_1) = P(x, y, z_2) = Q(x, y, z_2) = 0$$

**Lemma 2:**  $(x, y)$  is a cusp of  $\mathcal{B} \Leftrightarrow (x, y, z)$  satisfies:

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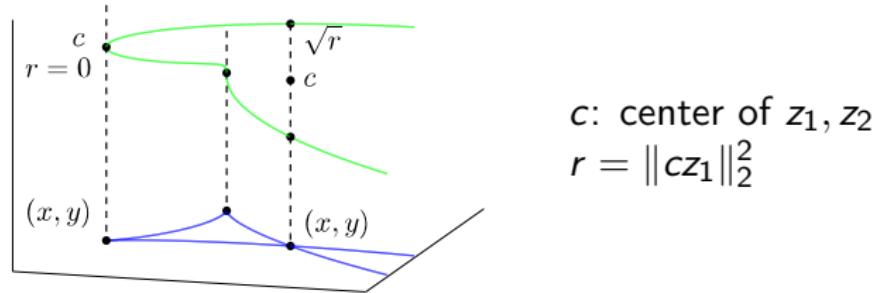
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$$P(x, y, z) = P_z(x, y, z) = P_{zz}(x, y, z) = 0$$

## Characterizing singularities: the Ball system

$$\mathcal{B} = \{(x, y) \in \mathbb{R}^2 \mid \exists z \in \mathbb{R} \text{ s.t. } (x, y, z) \in \mathcal{C}\}$$

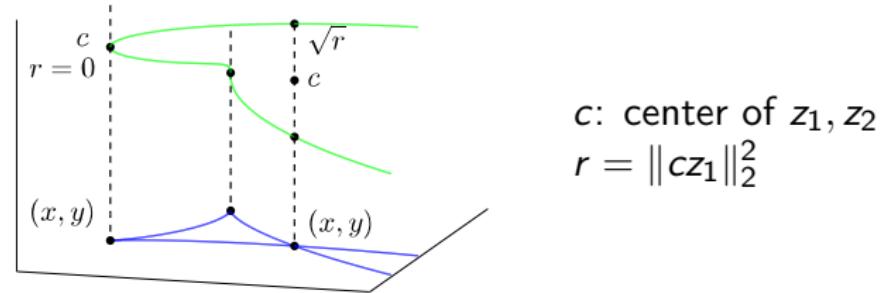


Singularities of  $\mathcal{B}$  are exactly the real solutions of:

$$(S_4) \left\{ \begin{array}{lcl} \frac{1}{2}(P(x, y, c + \sqrt{r}) + P(x, y, c - \sqrt{r})) & = 0 \\ \frac{1}{2\sqrt{r}}(P(x, y, c + \sqrt{r}) - P(x, y, c - \sqrt{r})) & = 0 \\ \frac{1}{2}(Q(x, y, c + \sqrt{r}) + Q(x, y, c - \sqrt{r})) & = 0 \\ \frac{1}{2\sqrt{r}}(Q(x, y, c + \sqrt{r}) - Q(x, y, c - \sqrt{r})) & = 0 \end{array} \right.$$

# Characterizing singularities: the Ball system

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Singularities of  $\mathcal{B}$  are exactly the real solutions of:  
when  $r \rightarrow 0$

$$(S_4) \left\{ \begin{array}{lcl} P(x, y, c) & = 0 \\ P_z(x, y, c) & = 0 \\ Q(x, y, c) & = 0 \\ Q_z(x, y, c) & = 0 \end{array} \right.$$

# Characterizing singularities: the Ball system

[IMP15] Rémi Imbach, Guillaume Moroz, and Marc Pouget.

Numeric and certified isolation of the singularities of the projection of a smooth space curve.

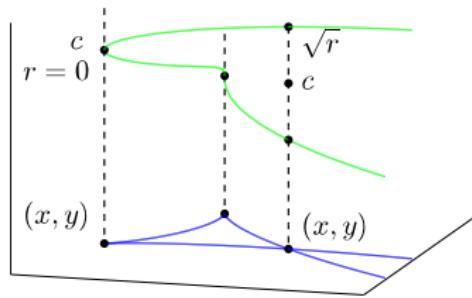
In *Proceedings of the 6th International Conference on Mathematical Aspects of Computer and Information Sciences*, MACIS'15, 2015.

**Lemma 4.** Under some genericity assumptions, all the solutions of  $\mathcal{S}_4$  in  $\mathbb{R}^2 \times \mathbb{R} \times \mathbb{R}^+$  are regular.

**Lemma 3.** Singularities of  $\mathcal{B}$  are exactly the real solutions of:

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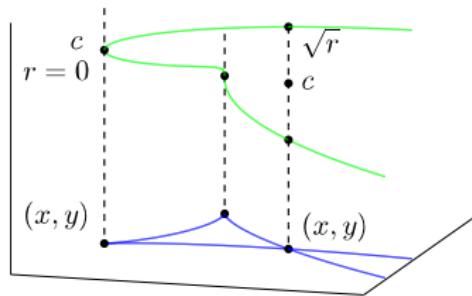
# Isolating singularities: solving the Ball system



Finding the singularities of  $\mathcal{B}$  in  $\mathbf{B}_0 = (\mathbf{x}_0, \mathbf{y}_0)$ :

↔ solving the ball system on  $\mathbf{B}_0 \times \mathbb{R} \times \mathbb{R}^+$

# Isolating singularities: solving the Ball system

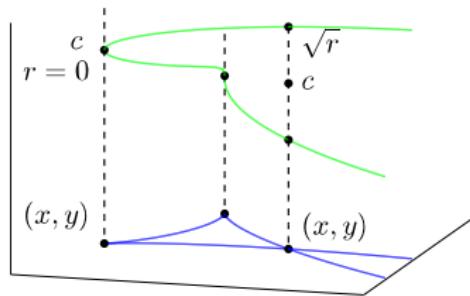


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↔ 3 systems solving on  $\mathbf{B}_0 \times [-1, 1] \times [0, 1]$

# Isolating singularities: solving the Ball system



Finding the singularities of  $\mathcal{B}$  in  $\mathbf{B}_0 = (\mathbf{x}_0, \mathbf{y}_0)$ :

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$\rightsquigarrow$  3 systems solving on  $\mathbf{B}_0 \times [-1, 1] \times [0, 1]$

Finding the singularities of  $\mathcal{B}$  in  $\mathbf{B} = \mathbb{R}^2$ :

$\rightsquigarrow$  5 systems solving on  $[-1, 1]^2 \times [-1, 1] \times [0, 1]$

## Results:

Datas: Random dense polynomials of degree  $d$ , bit-size 8

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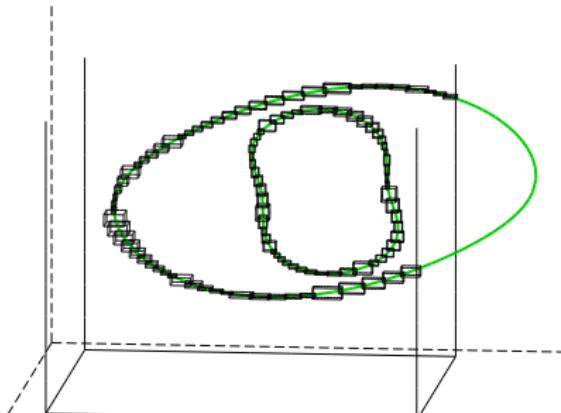
system domain $d$	$\mathcal{S}_2$ , RSCube $\mathbb{R}^2$	$\mathcal{S}_2$ , subd. $[-1, 1] \times [-1, 1]$	$\mathbb{R}^2$	$\mathcal{S}_4$ , subd. $[-1, 1] \times [-1, 1]$	$\mathbb{R}^2$
6	15	0.5	1.35	8.4	11.3
7	105	4.44	21.9	43.8	54.2
8	620	37.9	57.7	70.2	99.2
9	3300	23.2	54.7	45.6	95.1

means on 5 examples of sequential times.

## Computing the topology of $\mathcal{B}$ : a geometric approach

Enclose  $\mathcal{C}$ : find a sequence  $\{\mathbf{C}_k\}_{1 \leq k \leq I}$  such that

- $\mathcal{C} \subset \bigcup_k \mathbf{C}_k$ ,
- in each  $\mathbf{C}_k$ ,  $\mathcal{C} \cap \mathbf{C}_k$  is diffeomorphic to a close segment,
- each  $\mathbf{C}_k$  has width less than  $\eta$ .

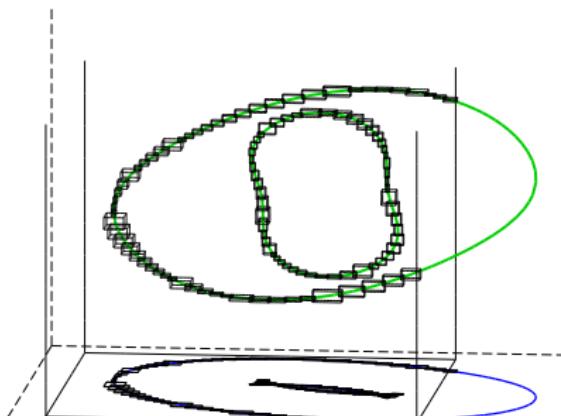


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Enclose  $\mathcal{C}$ :

$$\{\mathbf{C}_k\}_{1 \leq k \leq l} = \{(\mathbf{x}_k, \mathbf{y}_k, \mathbf{z}_k)\}_{1 \leq k \leq l}$$

→ Enclose  $\mathcal{B}$ : each  $B \in \mathcal{B}$  is in a  $\mathbf{B}_k = \pi_{(x,y)}(\mathbf{C}_k)$



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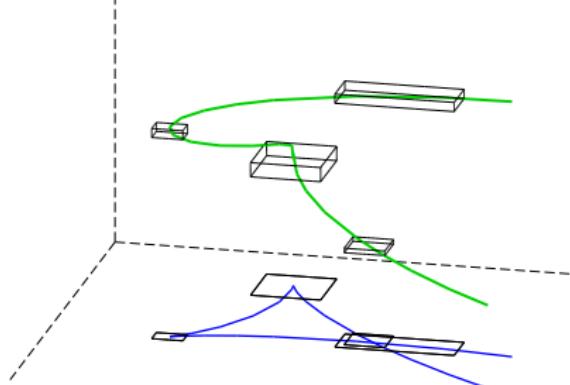
Enclose  $\mathcal{B}$ :

$$\{\mathbf{B}_k\}_{1 \leq k \leq l} = \{(\mathbf{x}_k, \mathbf{y}_k)\}_{1 \leq k \leq l}$$

→ Isolate singularities:

- each cusp is in a  $\mathbf{B}_k$
- each node is in a  $\mathbf{B}_{ij} = \mathbf{B}_i \cap \mathbf{B}_j$

→ Singularities are in  $\bigcup_k \mathbf{B}_k \cup \bigcup_{i,j} \mathbf{B}_{ij}$



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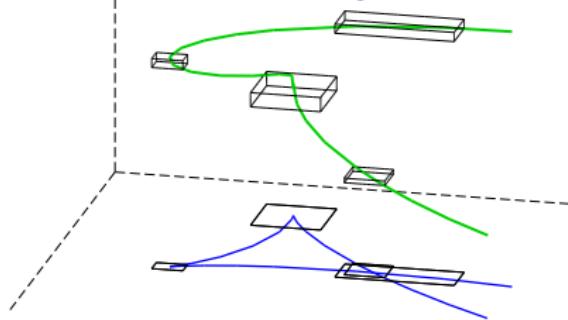
$$\mathbf{D}_k = (\mathbf{x}_k, \mathbf{y}_k, \mathbf{z}_k, [0, (\frac{w(z_k)}{2})^2])$$

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Enclose  $\mathcal{B}$ :

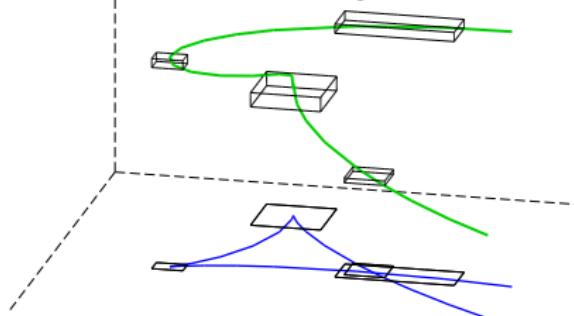
$$\{\mathbf{B}_k\}_{1 \leq k \leq l} = \{(\mathbf{x}_k, \mathbf{y}_k)\}_{1 \leq k \leq l}$$

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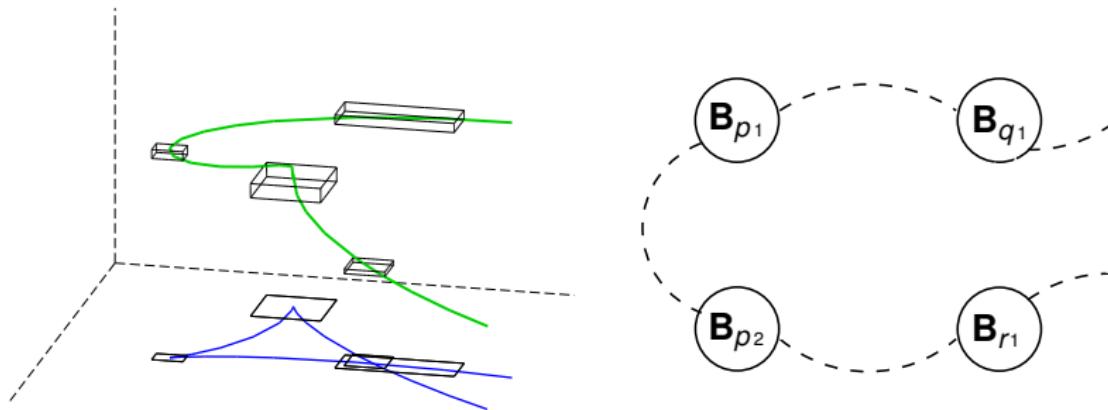
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→ Compute a graph:

- $\mathcal{G}_{\mathcal{B}} = (\{\mathbf{B}_k\}_{1 \leq k \leq l}, \{(\mathbf{B}_k, \mathbf{B}_{k+1})\}_{1 \leq k < l})$



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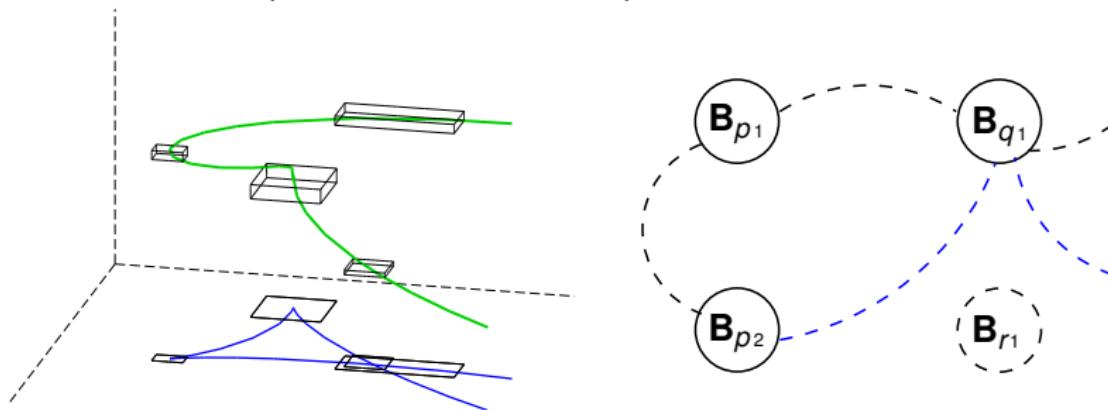
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→ Compute a graph:

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- for each  $\mathbf{B}_{q_1 r_1} \in \mathcal{L}_n$ : identify  $\mathbf{B}_{q_1}$  and  $\mathbf{B}_{r_1}$



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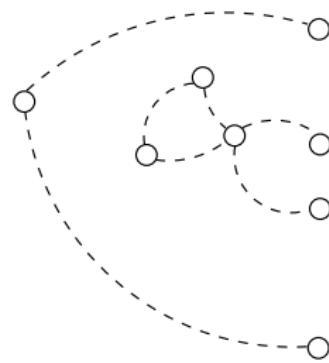
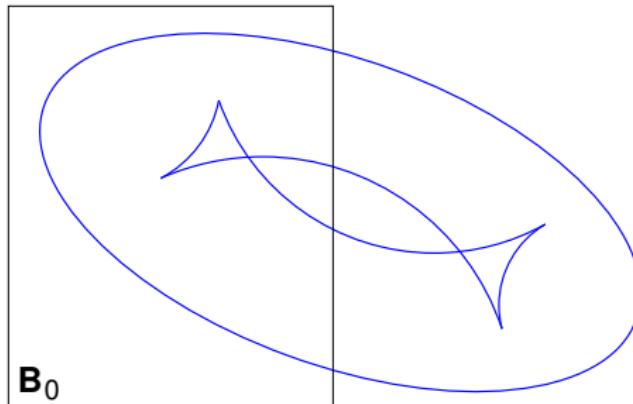
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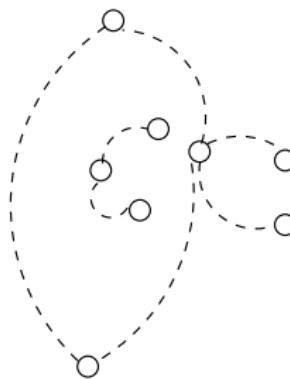
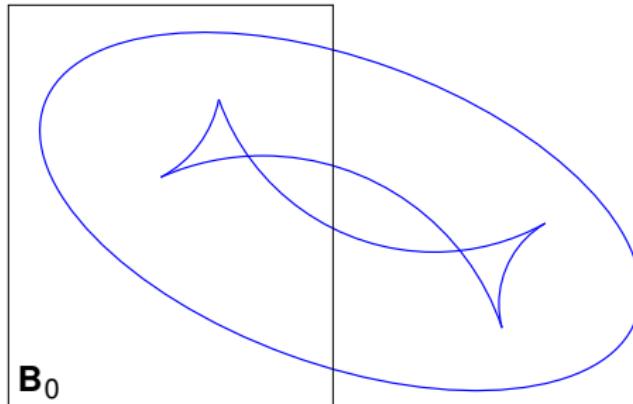
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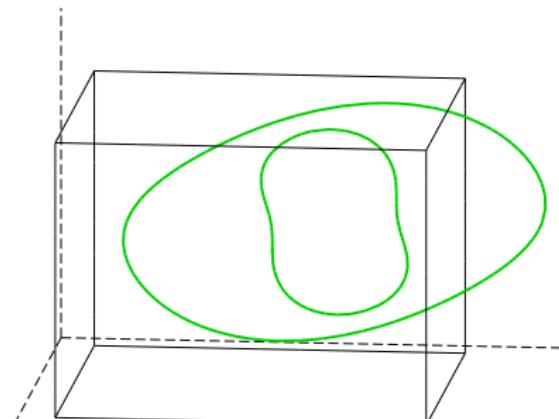


## Certified numerical tools: 1-dim solver

$F : \mathbb{R}^3 \rightarrow \mathbb{R}^2$ ,  $\mathbf{C}_0$  a box of  $\mathbb{R}^3$

$\mathcal{C} = \{C \in \mathbf{C}_0 | F(C) = 0\}$  is a smooth curve of  $\mathbb{R}^3$

$\mathcal{C}^1, \dots, \mathcal{C}^m$ : connected components of  $\mathcal{C}$



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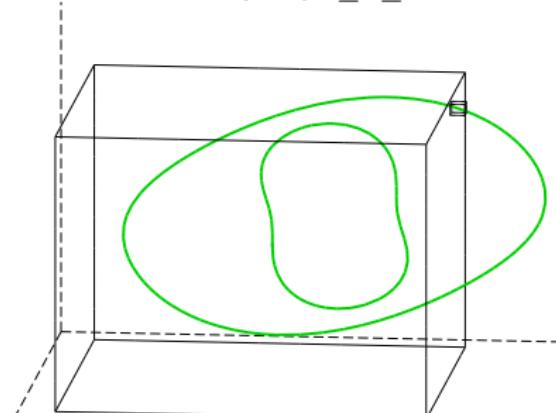
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Certified path-tracker:

**Input:**  $F : \mathbb{R}^3 \rightarrow \mathbb{R}^2$ ,  $\mathbf{C}_0$  box of  $\mathbb{R}^3$ ,  $\epsilon \in \mathbb{R}_*^+$

An initial box  $\mathbf{C} \in \mathcal{C}^i$

**Output:** a sequence of boxes  $\{\mathbf{C}_k\}_{1 \leq k \leq I}$  enclosing  $\mathcal{C}^i$ .



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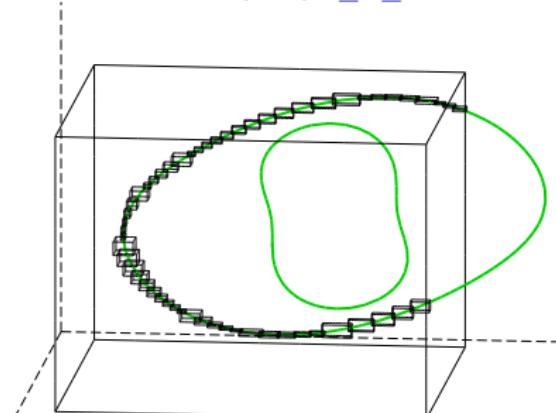
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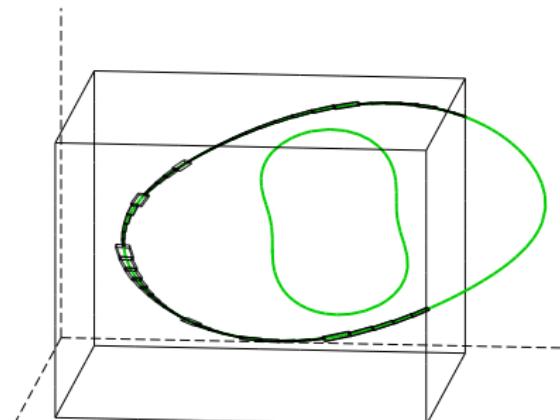
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# Certified numerical tools: 1-dim solver

[MGGJ13] B. Martin, A. Goldsztejn, L. Granvilliers, and C. Jermann.  
Certified parallelotope continuation for one-manifolds.  
*SIAM Journal on Numerical Analysis*, 51(6):3373–3401, 2013.



## Certified numerical tools: 1-dim solver

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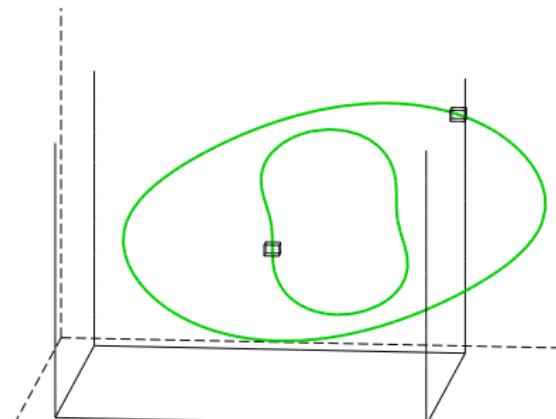
$\mathcal{C} = \{C \in \mathbf{B}_0 \times \mathbb{R} | F(X) = 0\}$  is a smooth curve of  $\mathbb{R}^3$

$\mathcal{C}^1, \dots, \mathcal{C}^m$ : connected components of  $\mathcal{C}$

**Assumption (A1)**:  $\mathcal{C}$  is compact over  $\mathbf{B}_0$

(A1) holds for generic polynomials  $P, Q$

Finding one point on each connected component

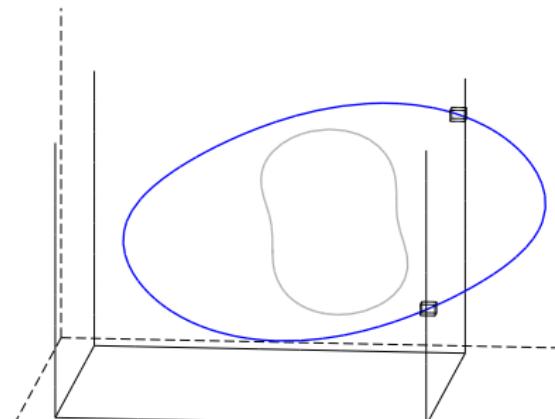


# Finding one point on each connected component

Assumption (A1):  $\mathcal{C}$  is compact over  $\mathbf{B}_0$

**Lemma:** If (A1) holds,  $\mathcal{C}^k$  is

- either diffeomorphic to  $[0, 1]$   
⇒ has 2 intersections with  $\partial\mathbf{B}_0 \times \mathbb{R}$
- or diffeomorphic to a circle  
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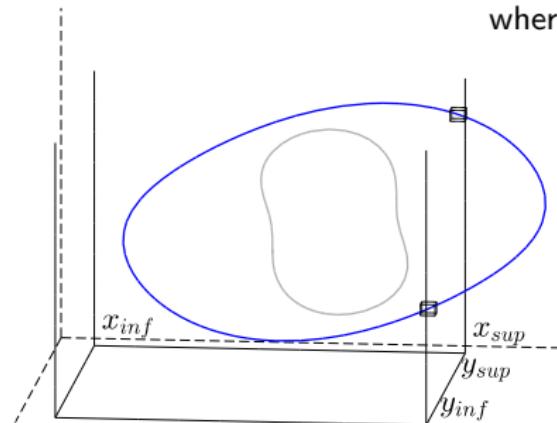
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$\mathcal{C} \cap (\partial\mathbf{B}_0 \times \mathbb{R})$  are the solutions of the 4 systems:

$$\begin{cases} P(x = a, y, z) = 0 \\ Q(x = a, y, z) = 0 \end{cases}$$

$$\begin{cases} P(x, y = b, z) = 0 \\ Q(x, y = b, z) = 0 \end{cases}$$

where  $a \in \{x_{inf}, x_{sup}\}$ ,  
 $b \in \{y_{inf}, y_{sup}\}$

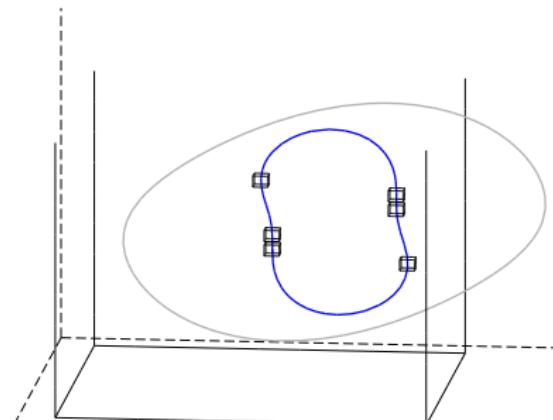


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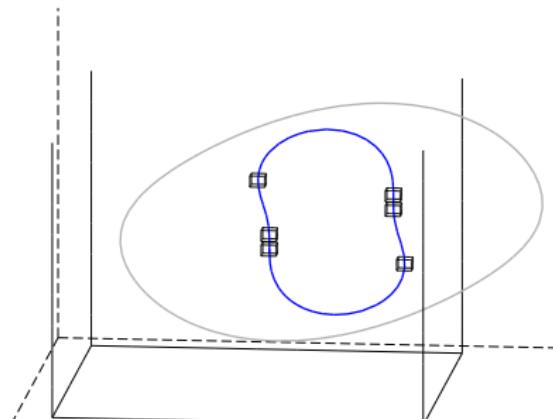
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- or diffeomorphic to a circle  
 $\Rightarrow$  has at least two  $x$ -critical points

$x$ -critical points of  $\mathcal{C}$  are the solutions of the system:

$$\left\{ \begin{array}{c|cc|c} & P(x, y, z) & = 0 \\ & Q(x, y, z) & = 0 \\ \hline P_y & P_z & | & (x, y, z) \\ Q_y & Q_z & | & = 0 \end{array} \right.$$



## Results:

Datas: Random dense polynomials of degree  $d$ , bit-size 8

0-dim solver: multi-precision subdivision solver, c++/cython/sage

Path tracker: prototype in python/cython

[MGGJ13] B. Martin, A. Goldsztejn, L. Granvilliers, and C. Jermann.

Certified parallelotope continuation for one-manifolds.

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Numerical results: Isolating singularities of an apparent contour

system domain $d$	$\mathcal{S}_2$ , RS Cube $\mathbb{R}^2$	$\mathcal{S}_2$ , subd. $[-1, 1] \times [-1, 1]$	$\mathcal{S}_4$ , subd. $[-1, 1] \times [-1, 1]$	with $\mathcal{C}$ $[-1, 1] \times [-1, 1]$
6	15	0.5	8.4	2.36
7	105	4.44	43.8	4.13
8	620	37.9	70.2	5.91
9	3300	23.2	45.6	5.30

means on 5 examples of sequential times.