

# Symbolic numeric methods for certified computation

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January 8, 2003

## Long time ago

$\mathbb{Z}$  : Addition, subtraction as geometric operations.

$\mathbb{Q}$  : Ratio of numbers. Thalès and the pyramids (-620-546).

The multiplication is commutative (Pappus theorem).

**!!** *all is number* (commensurable) for the Pythagore's school (-585-400).

**??** *No, dare to say* Hippase de Métaponte, *not*  $\sqrt{2}$ .

$\mathbb{R}$  : *It's not a problem, says Dedekind, the missing numbers are those which are inbetween.*

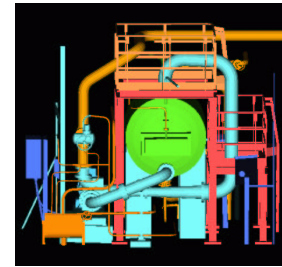
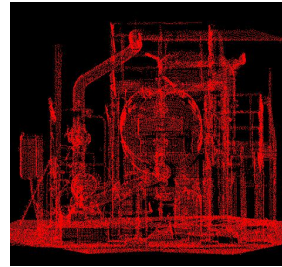
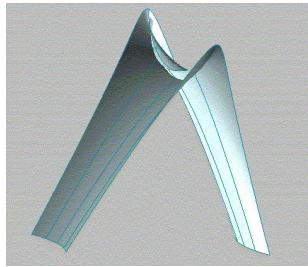
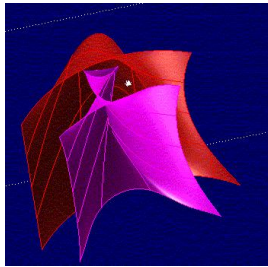
$\overline{\mathbb{Q}}$  : *Yes, but  $\sqrt{2}$  is special, says Galois.*

**But today ?**

Today, we are able to do  $10^{10}$  floating point operations per second on a computer.

But dealing with algebraic numbers and solutions of polynomial equations is still critical in many situations.

# In CAD



## Constructions

- Intersection points of curves, surfaces.
- Approximation of intersection curves. Arrangements of patches.
- Offsets, filets, drafts, medial axis.  
⇒ **fast solvers, control of the error, refinement procedures.**

## Detections

- Self-intersection, singularities, ray-tracing.
- Geometric approximation with simpler objects.  
⇒ **fast testers, isolation/subdivision/exclusion tools.**

## Predicats

- Sorting points on a curve.
- Connectivity. Topological coherence.
- Geometric predicates on constructed points, curves, . . .

⇒ **fast tests ( $\mu$ s), filtering technics, datastructure for algebraic numbers.**

## Representations

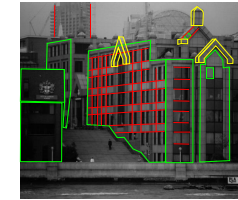
- Parametrised/implicit.
- Approximation of shape.
- Model reduction.

⇒ **global resultant methods, semi-algebraic geometry, multilevel, multiscale bases.**

# Modelisation from images

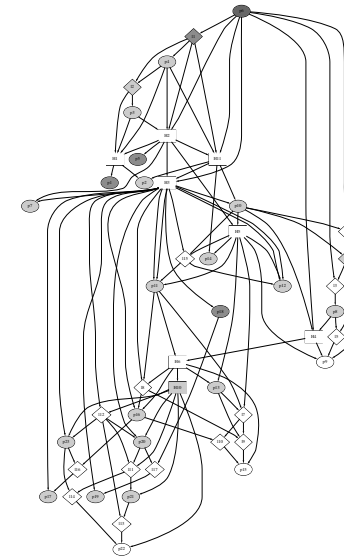
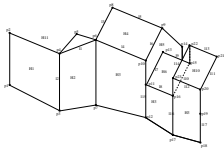


Extraction of points, lines, planes, . . .



**Symbolic** treatment of the geometric constraints.

- **algebra**, rewriting, simplification.
- **proof, automatic** discovering of properties.

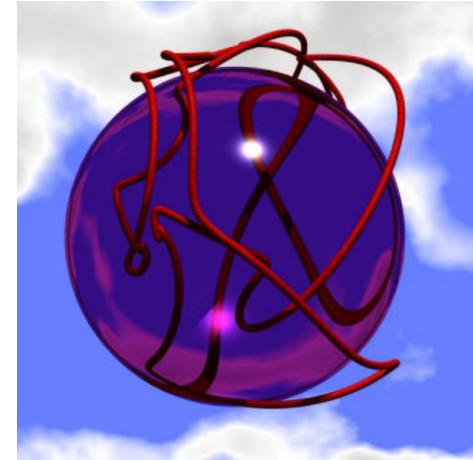
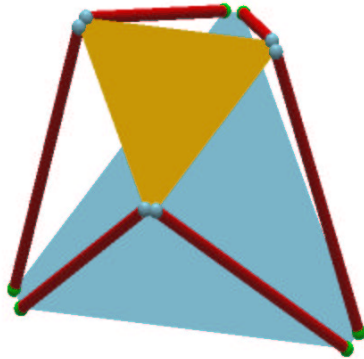


**Numerical**  
ajustment  
the 3D model.

of



# A robotic problem



**Equations:**  $\|RY_i + T - X_i\|^2 - d_i^2 = 0, i = 1, \dots, 6,$

$$R = \frac{1}{a^2 + b^2 + c^2 + d^2} \begin{bmatrix} a^2 - b^2 - c^2 + d^2 & 2ab - 2cd & 2ac + 2bd \\ 2ab + 2cd & -a^2 + b^2 - c^2 + d^2 & 2bc - 2ad \\ 2ac - 2bd & 2ad + 2bc & -a^2 - b^2 + c^2 + d^2 \end{bmatrix}, T = \begin{bmatrix} u/z \\ v/z \\ w/z \end{bmatrix}$$

**Solutions:** Generically 40 solutions: [RV93], [M94], [L93].

$$I_{\mathbb{P}^3 \times \mathbb{P}^3} = \mathbf{P}_2^1 \cap \mathbf{Q}_2^8 \cap \mathbf{Q}_1^{20} \cap \mathbf{Q}_0^{40} \cap \underbrace{\mathbf{Q}_{-1,1}^{2 \times 12} \cap \mathbf{Q}_{1,-1}^{10} \cap \mathbf{Q}_{-1}^1}_{\text{imbedded components}}$$

**Solvers:** fast and accurate; used intensively for several values of  $d_i$  and same geometry of the platform; avoid singularities.



# Solving

# Equations with approximate coefficients

- We consider the **neighbourhood** of a given system.
- Family of systems depending on parameters, of the same “shape”.
- Around a **regular** value of the parameters,
  - **continuity** of the solution set.
  - **continuity** of the algebraic structure.
- At a **singular** value of the parameters, all sort of bad things may happen.

## How to proceed ?

- Analyse the class of systems that we have to solve.
- Apply tuned methods for generic systems of this class.

# Solvers

- **Analytic solvers:** exploit the value of  $f$  and its derivatives.

Newton like methods, Minimisation methods, Weierstrass method.

- **Homotopic solvers:** deform a system with known roots into the system to solve.

Projective, toric, flat, deformation.

- **Subdivision solvers:** use an exclusion criterion to isolate the roots.

Taylor exclusion function, interval arithmetic, Descartes rule.

- **Algebraic solvers:** exploit the known relation between the unknowns.

Gröbner basis, normal form computations. Reduction to univariate or eigenvalue problems.

- **Geometric solvers:** project the problem onto a smaller subspace.

Resultant-based methods. Reduction to univariate or eigenvalue problems.

# Subdivision

## Subdivision solver

□ **Bernstein basis:**  $f(x) = \sum_{i=0}^d b_i B_d^i(x)$ , where  $B_d^i(x) = \binom{d}{i} x^i (1-x)^{d-i}$ .

$\mathbf{b} = [b_i]_{i=0, \dots, d}$  are called the **control coefficients**.

- $f(0) = b_0, f(1) = b_d,$

- $f'(x) = \sum_{i=0}^{d-1} \Delta(\mathbf{b})_i B_{d-1}^i(x)$  where  $\Delta(\mathbf{b})_i = b_{i+1} - b_i.$

□ **Subdivision by De Casteljau algorithm:**

$$b_i^0 = b_i, \quad i = 0, \dots, d,$$

$$b_i^r(t) = (1-t) b_i^{r-1}(t) + t b_{i+1}^{r-1}(t), \quad i = 0, \dots, d-r.$$

- The control coefficients  $\mathbf{b}^-(t) = (b_0^0(t), b_0^1(t), \dots, b_0^d(t))$  and  $\mathbf{b}^+(t) = (b_0^d(t), b_1^{d-1}(t), \dots, b_d^0(t))$  describe  $f$  on  $[0, t]$  and  $[t, 1]$ .

- For  $t = \frac{1}{2}$ ,  $b_i^r = \frac{1}{2}(b_i^{r-1} + b_{i+1}^{r-1}).$ ; use of adapted arithmetic.

- Number of arithmetic operations bounded by  $\mathcal{O}(d^2)$ , memory space  $\mathcal{O}(d)$ . Indeed, asymptotic complexity  $\mathcal{O}(d \log(d)).$

## □ Isolation of real roots

**Proposition: (Descartes rule)**  $\#\{f(x) = 0; x \in [0, 1]\} = V(\mathbf{b}) - 2p, p \in \mathbb{N}.$

---

**Algorithm: isolation of the roots of  $f$  on the interval  $[a, b]$**

INPUT: A representation  $(\mathbf{b}, [a, b])$  associate with  $f$  and  $\epsilon$ .

- If  $V(\mathbf{b}) > 1$  and  $|b - a| > \epsilon$ , subdivide;
- If  $V(\mathbf{b}) = 0$ , remove the interval.
- If  $V(\mathbf{b}) = 1$ , output interval containing one and only one root.
- If  $|b - a| \leq \epsilon$  and  $V(\mathbf{b}) > 0$  output the interval and the multiplicity.

OUTPUT: list of isolating intervals in  $[a, b]$  for the real roots of  $f$  or the  $\epsilon$ -multiple root.

- Multiple roots (and their multiplicity) computed within a precision  $\epsilon$ .
- $x := t/(1 - t)$  : Uspensky method.
- Complexity:  $\mathcal{O}(\frac{1}{2}d(d + 1) r \left( \lceil \log_2 \left( \frac{1 + \sqrt{3}}{2s} \right) \rceil - \log_2(r) + 4 \right))$  [MVY02+]
- Natural extension to B-splines.

# Benchmarks

Pentium III 933Mhz.

The number of equations per s. (C++ with 64-bit floats;  $\epsilon = 0.000001$ ):

degree	8	9	12	16	18	20
	25 000	20-22 000	12-13 000	7.5-8 000	5.9-6.2 000	5.4 000

Equations per s. (precision bits vs. degree;  $\epsilon = 0.000001$ ) using GMP library:

	16	20	30	40	60	80	100
128-bit	96	62.5	25.4	12.5	–	–	–
192-bit	83.3	53.2	21.5	10.8	4.0	–	–
256-bit	73.5	47.2	18.9	9.5	3.6	1.8	–
384-bit	60.2	37.7	15.2	7.6	2.9	1.4	0.8
512-bit	51	31.2	12.2	6.1	2.3	1.2	0.7

Compare favorably with other efficient solvers (Aberth method, `mpsolve`).

# Algebraic method



# The quotient algebra $\mathcal{A}$

- The polynomial ring  $R = \mathbb{K}[x_1, \dots, x_n]$ .
- The equations  $f_1 = 0, \dots, f_m = 0$  to solve, with  $f_i \in R$ .
- The ideal  $I = (f_1, \dots, f_m) = \{\sum_i h_i f_i; h_i \in R\}$ .
- The quotient algebra  $\mathcal{A} = R/I$  of polynomials modulo  $I$ :  $a \equiv a'$  iff  $a - a' \in I$ .  
(cf. polynomial functions on the set of solutions.)
- **How to represent and exploit effectively the structure of  $\mathcal{A}$  ?**
  - **A basis for  $\mathcal{A}$ .**
  - **The multiplicative tables.**

# Multiplication operators

We assume that  $\mathcal{Z}(I) = \{\zeta_1, \dots, \zeta_d\} \Leftrightarrow \mathcal{A}$  of finite dimension  $D$  over  $\mathbb{K}$ .

$$\begin{array}{ccc} M_a : \mathcal{A} & \rightarrow & \mathcal{A} \\ u & \mapsto & a u \end{array} \quad \begin{array}{ccc} M_a^\dagger : \widehat{\mathcal{A}} & \rightarrow & \widehat{\mathcal{A}} \\ \Lambda & \mapsto & a \cdot \Lambda = \Lambda \circ M_a \end{array}$$

**Theorem:**

- **The eigenvalues of  $M_a$  are  $\{a(\zeta_1), \dots, a(\zeta_d)\}$ .**
- **The eigenvectors of all  $(M_a^\dagger)_{a \in \mathcal{A}}$  are (up to a scalar)  $\mathbf{1}_{\zeta_i} : p \mapsto p(\zeta_i)$ .**

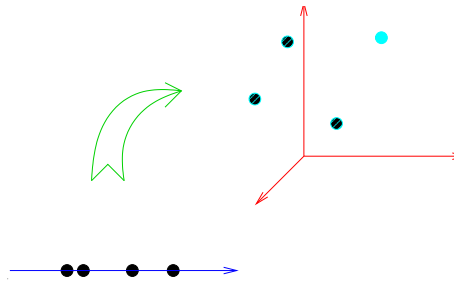
**Theorem: In a basis of  $\mathcal{A}$ , all the matrices  $M_a$  ( $a \in \mathcal{A}$ ) are of the form**

$$M_a = \begin{bmatrix} N_a^1 & & \mathbf{0} \\ & \ddots & \\ \mathbf{0} & & N_a^d \end{bmatrix} \quad \text{with } N_a^i = \begin{bmatrix} a(\zeta_i) & & \star \\ & \ddots & \\ \mathbf{0} & & a(\zeta_i) \end{bmatrix}$$

**Corollary: (Chow form)**

$$\Delta(\mathbf{u}) = \det(u_0 + u_1 M_{x_1} + \dots + u_n M_{x_n}) = \prod_{\zeta \in \mathcal{Z}(I)} (u_0 + u_1 \zeta_1 + \dots + u_n \zeta_n)^{\mu_\zeta}.$$

# Rational Univariate Representation of the roots



## Algorithm: Rational Univariate Representation.

1. Compute a multiple of the Chow form  $\Delta(\mathbf{u})$  and its square free part  $d(\mathbf{u})$ .
2. Choose a generic  $t \in \mathbb{K}^{n+1}$  and compute the first coefficients of

$$d(t + u) = d_0(u_0) + u_1 d_1(u_0) + \cdots + u_n d_n(u_0) + \cdots$$

3. A non minimal rational univariate representation of the roots is given by  $\zeta_1 = \frac{d_1(u_0)}{d'_0(u_0)}, \dots,$   
 $\zeta_n = \frac{d_n(u_0)}{d'_0(u_0)}, d_0(u_0) = 0.$
4. Factorize  $d_0(u_0)$  and keep the good factors for a minimal representation.

**Remark:**  $t$  is generic iff  $\gcd(d_0(u_0), d'_0(u_0)) = 1$ .

# Normal form computation

Compute the projection of  $\mathbb{K}[\mathbf{x}]$  onto a vector space  $B$ , modulo the ideal  $I = (f_1, \dots, f_m)$ .

⇒ Grobner basis [CLO92, F99].

Compatibility with a monomial ordering but numerical instability.

⇒ Generalisation [M99, MT00, MT02].

No monomial ordering required. Linear algebra *with column pivoting* ; better numerical behavior of the basis.

Linear algebra on sparse matrices. Generic Sparse LU decomposition.

# Application in Geometry

## Solving by subdivision methods

**Rectangular patches:**  $f(x, y) = \sum_{i=0}^{d_1} \sum_{j=0}^{d_2} b_{j,i} B_{d_1}^i(x) B_{d_2}^j(y)$  associated with the box  $[0, 1] \times [0, 1]$ .

- **Subdivision** by row or by column, similar to the univariate case.
- Arithmetic **complexity** of a subdivision bounded by  $\mathcal{O}(d^3)$  ( $d = \max(d_1, d_2)$ ), memory space  $\mathcal{O}(d^2)$ .

**Triangular patches:**  $f(x, y) = \sum_{i+j+k=d} b_{i,j,k} \frac{d!}{i!j!k!} x^i y^j (1-x-y)^k$  associated with the representation on the 2d **simplex**.

- Subdivision at a **new point**. Arithmetic complexity  $\mathcal{O}(d^3)$ , memory space  $\mathcal{O}(d^2)$ .
- Combined with **Delaunay triangulations**.
- Extension to A-patches.

# Approximating an implicit curve

## Algorithm: Representation of the implicit curve $f(x, y) = 0$

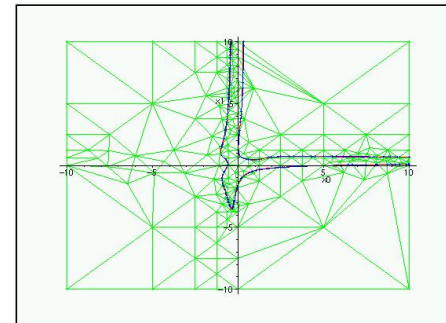
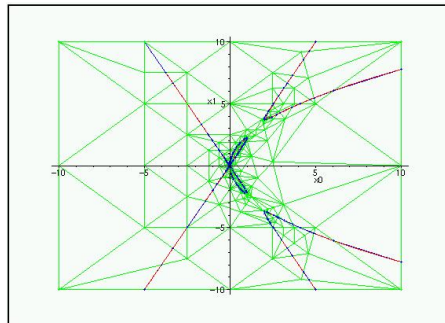
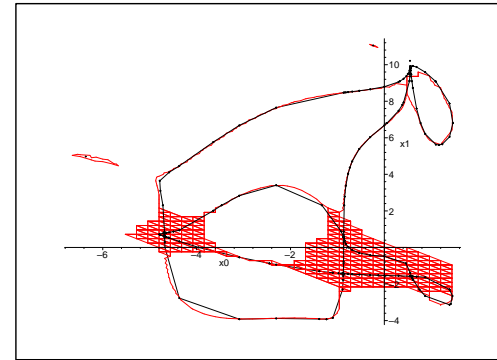
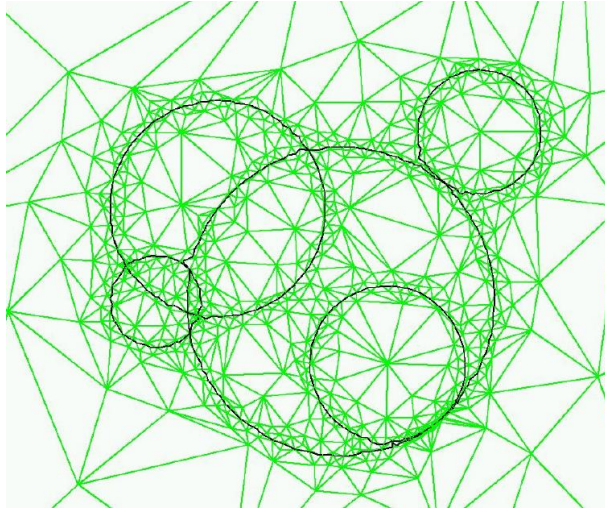
INPUT: A triangular representation of  $f$   $L := ((A, B, C), \mathbf{b})$  and a precision  $\epsilon$ .

- If at least one of the triangle edges is bigger than  $\epsilon$ , split the triangle and insert the new triangles in  $L$ :
    - when the number of sign changes of some row (column or diagonal) is  $\geq 2$ ,
    - or when the coefficients of  $f'_x$  (or  $f'_y, f'_z$ ) have not the same sign.
  - Remove the triangle from  $L$  if the coefficients of  $f$  have the same sign.
  - Save it
    - when all the edges of the triangle are smaller than  $\epsilon$ ,
    - or when the total number of sign changes on the border sides is 2 and  $f'_x$  or  $f'_y, f'_z$ , has a constant sign. Isolate the roots.
- OUTPUT: A list of segments approximating the curve  $f(x, y) = 0$ .

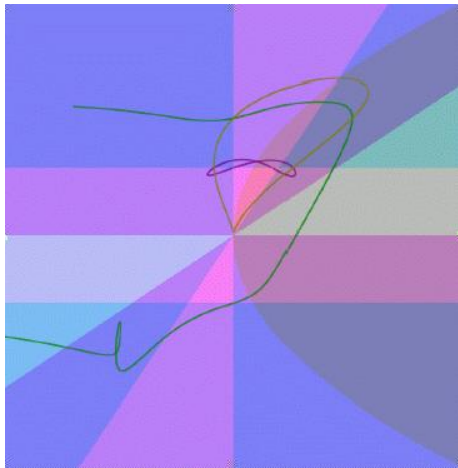
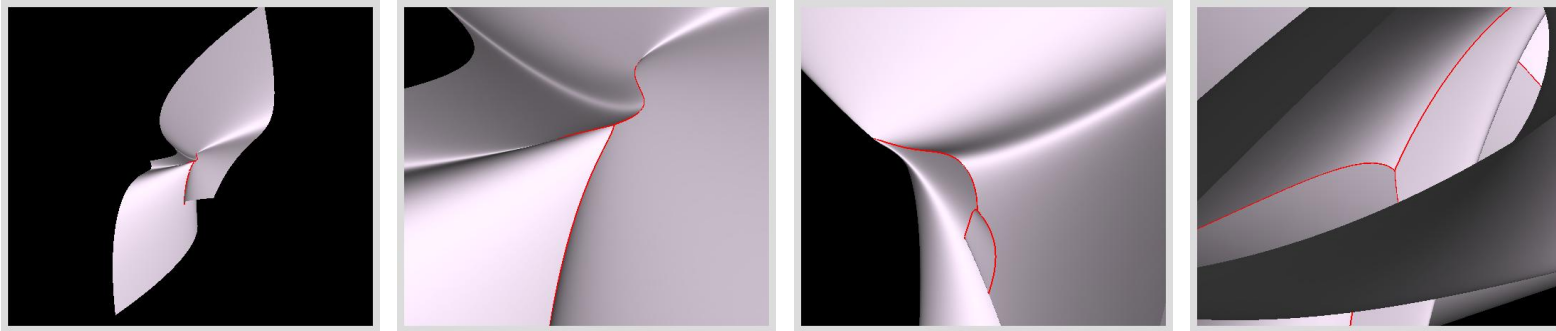
- Insertion of the circumcenter (barycenter), in order to break the *bad triangle*.
- No specific directions/axes used.
- New edges are constructed, no tangency problem.
- Number of triangles related to the complexe local feature size.
- Application to the intersection of curves, surfaces.



# Examples



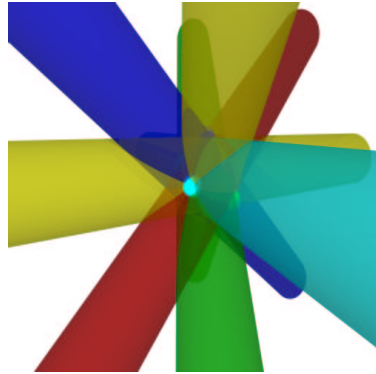
# Self-intersection points



- Sample the surface.
- Segment it according to diff. information.
- Bound the regions with the same coding.
- Intersection the image of these regions by subdivision.

(3, 3)	Sampling	Segmentation	Intersections
1000 × 1000	0.15 s	0.02s	0.5 s

## Cylinders through 4 and 5 points

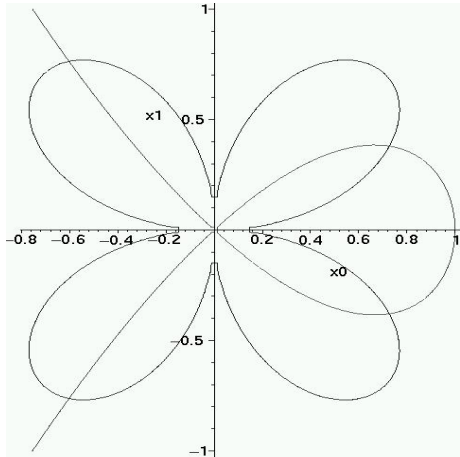


- Cylinders through 4 points: curve of degree 3.
- Cylinders through 5 points:  $6 = 3 \times 3 - 3$ .
- Cylinders through 4 points and fixed radius:  $12 = 3 \times 4$ .
- Line tangent to 4 unit balls: 12.
- Cylinders through 4 points and extremal radius:  $18 = 3 \times 10 - 3 \times 4$ .

<i>Problem</i>	<i>time</i>	$\max( f_i )$
Cylinders through 5 points	0.03s	$5 \cdot 10^{-9}$
Parallel cylinders through $2 \times 4$ points	0.03s	$5 \cdot 10^{-9}$
Cylinders through 4 points, extremal radius	2.9s	$10^{-6}$

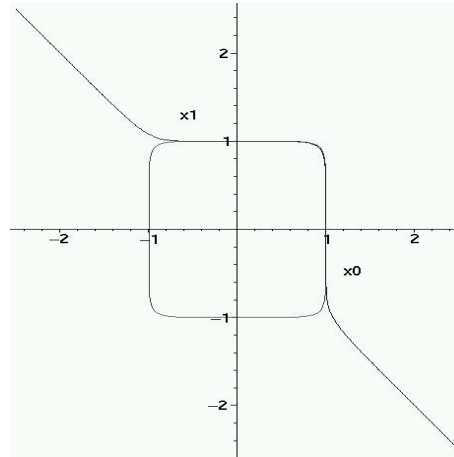
Computations performed on an Intel PII 400 128 Mo of Ram

# Comparison



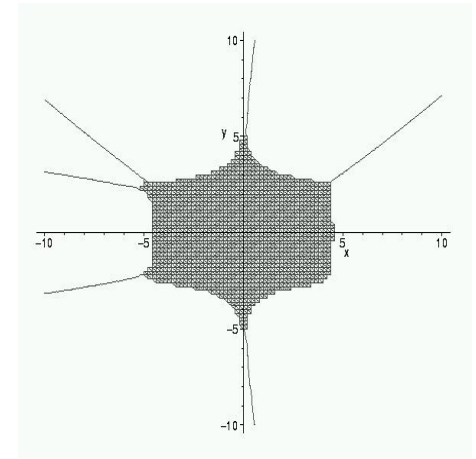
$$f_1 = x^6 + 3x^4y^2 + 3x^2y^4 + y^6 - 4x^2y^2$$

$$f_2 = y^2 - x^2 + x^3$$



$$f_1 = x^9 + y^9 - 1$$

$$f_2 = x^{10} + y^{10} - 1$$



$$f = y^2 - 2y(x^{10} + 0.5x^9y^2 - \frac{1}{8}x^8y^4 + \frac{1}{16}x^7y^6 - \frac{5}{128}x^6y^8 + \frac{7}{256}x^5y^{10} - \frac{21}{1024}x^4y^{12} + \frac{23}{2048}x^3y^{14} - \frac{429}{32768}x^2y^{16} + \frac{715}{65536}xy^{18} - \frac{2431}{262144}y^{20}) + x^{20} + x^{19}y^2$$

• Resultant in  $x_1$

Example	Degree of the variables			Evaluation	Time	Number of real roots
	Function	$x_0$	$x_1$			
10	$f_1, f_2$	6,3	6,2	$10^{-9}$	0.07	5
11	$f_1, f_2$	9,10	9,10	$10^{-2}$	0.63	2
15	$f_1, f_2$	6,4	6,4			4

• Resultant + Univariate solving

Example	Evaluation	Time	Number of real roots
10	$10^{-16}$	0.084	5
11	$10^{-15}$	3.489	2
15	$10^{-9}$	0.151	4

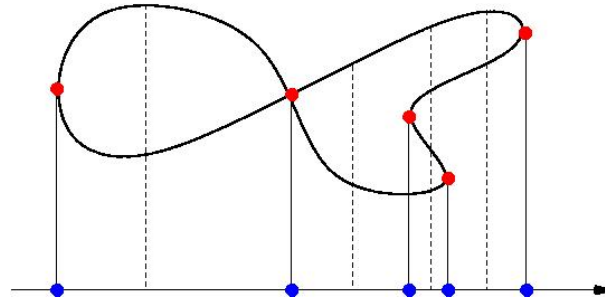
• Subdivision

Example	$\varepsilon$	Evaluation	Number of intervals	Time	Number of real roots
10	$10^{-5}$	$10^{-5}$	5	0.030	5
11	$10^{-5}$	$10^{-4}$	770	79.188	2
15	$10^{-5}$	$10^{-4}$	4	0.016	4

• Normal form

Example	Time / $\gamma$		Evaluation	Number of real roots
	<i>dinvlex</i>	<i>mac</i>		
10	0.01	0.01	$10^{-6}$	5
11	0.03	0.05	$10^{-2}$	2
15	0.02	0.01	$10^{-6}$	4

# Curves



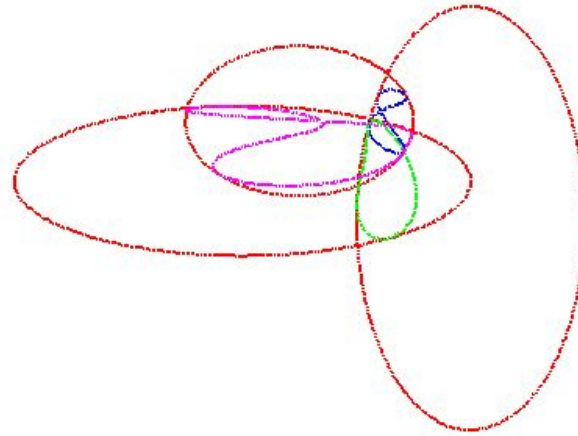
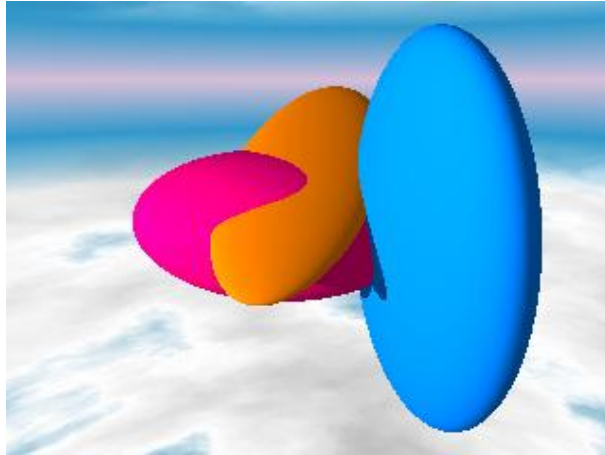
## Algorithm: Topology of an implicit curve

- *Compute the critical value for the projection along the  $y$ -abscisses.*
- *Above each point, compute the  $y$ -value, with their multiplicity.*
- *Between two critical points, compute the number of branches.*
- *Connect the points between two consecutive levels by  $y$ -order, the multi-branches being at **the** multiple point.*

⇒ Rational representation of the singular  $y$  in terms of the  $x$ .

⇒ Descartes rule to detect the multiple point among the regular ones.

# Surfaces



## Algorithm: Topology of an implicit surface

- *Project onto the plane.*
- *Compute the arrangement of the contour, singularity curves in the plane.*
- *Take a point inside each cell and compute the number of sheets above.*
- *Connect the regular sheets along the border of the contour, singular curves.*

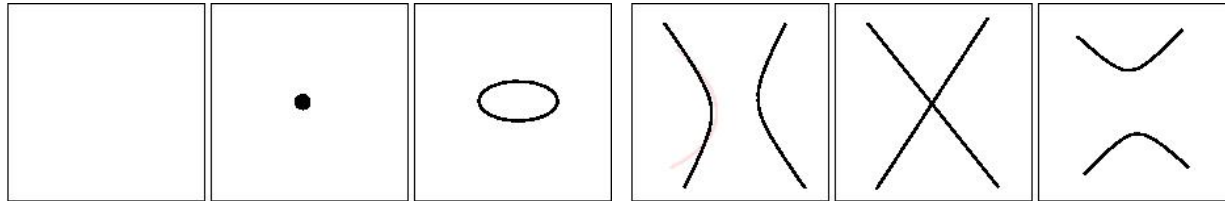
⇒ Tangent curves in the projection.

⇒ Degree, numeric problems inflated by projection.

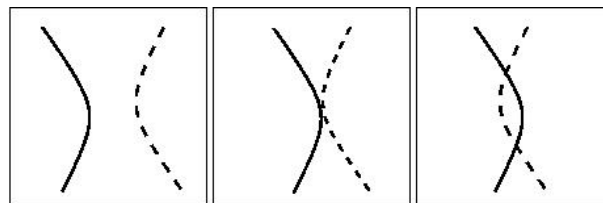
## Arrangement of quadrics $Q_1, \dots, Q_n$

Analyse the changes of topology of a section moving in the  $z$ -direction.

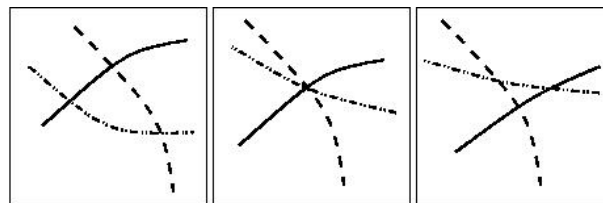
**(a)**  $Q_{i_1} = 0, \partial_x(Q_{i_1}) = 0, \partial_y(Q_{i_1}) = 0.$



**(b)**  $Q_{i_1} = 0, Q_{i_2} = 0, (\nabla Q_{i_1} \wedge \nabla Q_{i_2})_z = 0.$



**(c)**  $Q_{i_1} = 0, Q_{i_2} = 0, Q_{i_3} = 0.$





**Arrangement** = collection of cells of dimension 0,1,2,3 determined by sign conditions and adjacency relations.

**Example: For a circle of equation**  $p(x, y) = x^2 + y^2 - 1$ ,  
 $(\mathfrak{E}, p \geq 0)$ ,  $(C, p = 0)$ ,  $(\mathfrak{I}, p \leq 0)$  &  $C \prec \mathfrak{I}, C \prec \mathfrak{E}$ .

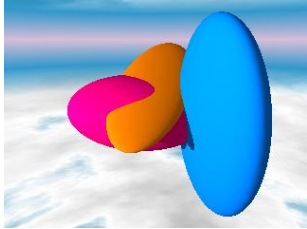
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### Algorithm: Arrangement of quadrics

- *Compute the intersection points corresponding to the events (a), (b), (c).*
- *Sort them according to the  $z$ -abscissae, by increasing order.*
- *Compute the lowest arrangement of the conics.*
- *For each event, determine the cell to which the new critical point belongs and modify the arrangement of the neighbour cells accordingly.*
- *Connect in the different levels, the cells with the same sign conditions.*

⇒ Evaluation of sign conditions of rational quantities of  $z$ .

# Example



$$272x^2 + 96xy + 192xz + 32y^2 + 64yz + 64z^2 - 571.2x - 142.4y - 252.8z + 323.64 = 0$$

$$128x^2 + 1152y^2 - 1024yz + 256z^2 - 144x - 886.4y + 358.4z + 220.12 = 0$$

$$64x^2 + 256y^2 + 128z^2 - 64x - 288y - 160z + 143 = 0$$

(a)  $3 \times 2$  real solutions (0.01s):

(b)  $3 \times 8 = 24$  complex solutions;  $3 \times 2$  real (0.06s):

(c) 8 complex solutions; 2 real (0.02s):

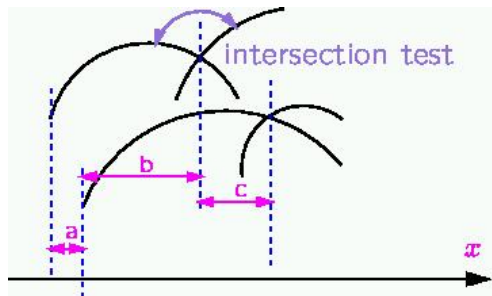
- (a) [0.825000, 0.700000, 0.287500] C1
- (a) [0.562500, 0.544649, 0.359835] C1, C2
- (a) [0.500000, 0.562500, 0.448223] C1, C2, C3
- (b) [0.498552, 0.561349, 0.448234] C1, C2, C3, C23
- (b) [0.687835, 0.570199, 0.508852] C1, C2, C3, C23, C13
- (b) [0.677133, 0.617014, 0.519616] C1, C2, C3, C23, C13, C12
- (c) [0.676862, 0.612181, 0.521687] C1, C2, C3, C23, C13, C12, C123
- (c) [0.638126, 0.657542, 0.685372] C1, C2, C3, C23, C13, C12
- (b) [0.534420, 0.666721, 0.719519] C1, C2, C3, C13, C12
- (b) [0.662072, 0.686211, 0.723158] C1, C2, C3, C13
- (b) [0.627783, 0.558545, 0.776837] C1, C2, C3
- (a) [0.500000, 0.562500, 0.801777] C1, C2
- (a) [0.562500, 0.780351, 0.890165] C1
- (a) [0.675000, 0.300000, 0.912500]

# Dealing with algebraic numbers

represented

- by an **equation** and an **isolation interval**,
  - recursively, by equations with algebraic coefficients, and signs of polynomials at roots,
  - by a **numerical approximation** and a way to **refine** it  
(evaluation of arithmetic DAG [LEDA, CORE], numerical procedure, . . . ).
- ⇒ inequality test is certified.
- ⇒ equality requires **separation bound**.

# Predicates on geometric objects



- Resultant formulations, in terms of a translation parameter.
- Sign of polynomials, of degree atmost 12.
- Filtering technics.

		circle arcs		
		$\mu S$	polynomial	polynomial
		first Interval + L_real	static +semi-static +Interval +GMP	static +semi-static +Interv. first +GMP
left right		2.48	0.36	0.36
		67	24.3	6.8
		2170	129	128