

# Determining the Real Roots of Real Polynomials

Kurt Mehlhorn  
Michael Sagraloff



March 2015

# Overview

---

- The problem: Isolating Roots of Real Polynomials
- How I got interested in the problem: [Computational geometry for curves and surfaces.](#)
- The state of the art.
- The Descartes method.
- The new algorithm.
- Summary.
- M. Sagraloff and KM: Computing Real Roots of Real Polynomials – An Efficient Method Based on Descartes' Rule of Signs and Newton Iteration, J. Symbolic Computation, 2015
- KM, M. Sagraloff and P. Wang: From Approximate Factorization to Root Isolation with Application to Cylindrical Algebraic Decomposition, J. Symbolic Computation, 2015.

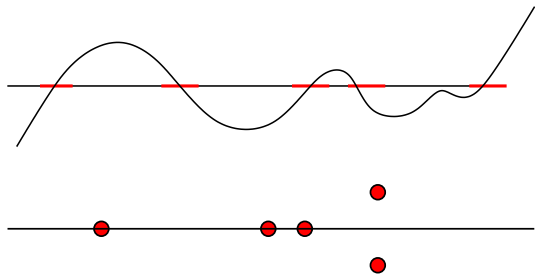
[Warning: Some of my statements will be incorrect for the sake of simplicity of the presentation.](#)

[Slides and papers are available on my homepage.](#)



## The Real Root Isolation Problem

Given a polynomial with real coefficients (a real polynomial) determine its real roots, i.e., compute isolating intervals for its real roots. An interval is **isolating** if it contains exactly one root.



A polynomial with 5 real roots; isolating intervals are shown in red.

A polynomial of degree  $n$  has  $n$  complex roots. For a real polynomial, the complex roots come in pairs.

# Motivation: Nonlinear Computational Geometry

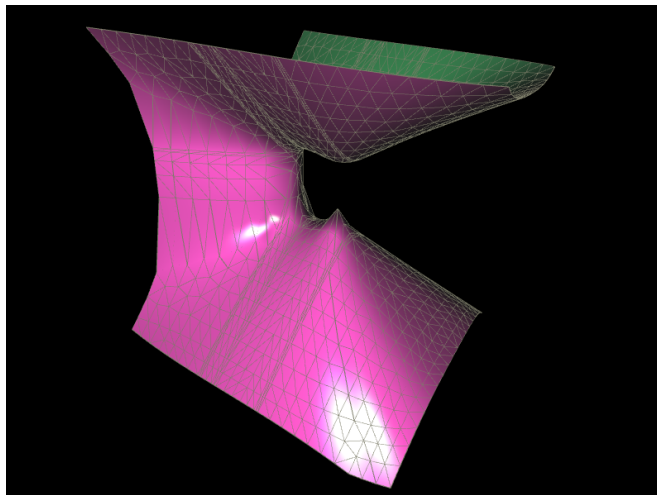


an arrangement of four  
curves of degree 6

picture, courtesy of Mi-  
chael Kerber



**Motivation:**  $-z^4 + z^3 + y^4 + y^2 - x^3 + x^2 = 0$



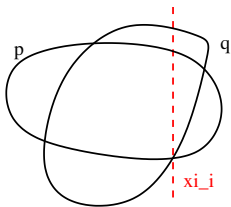
Courtesy of Eric Berberich, Pawel Emilianenko, Michael Kerber,  
and Michael Sagraloff: EXACUS



# A Glimpse at the Arrangement Computation

How to intersect the curves  $p(x, y) = 0$  and  $q(x, y) = 0$ ?

- eliminate  $y$  and obtain a polynomial  $R(x)$  of degree  $d = \deg(p) \cdot \deg(q)$  compute resultant
- compute the real zeros  $\xi_1, \xi_2, \dots$  of  $R(x)$
- analyse the situation at  $x = \xi_i$ :
  - this amounts to computing the real zeros of  $p(\xi_i, y)$  and  $q(\xi_i, y)$



Key task: compute the real roots of a univariate polynomial with real coefficients

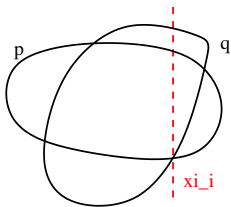
We want an algorithm that

- works for polynomials with real coefficients,
- is exact, and
- handles “easy cases” fast.

# A Glimpse at the Arrangement Computation

How to intersect the curves  $p(x, y) = 0$  and  $q(x, y) = 0$ ?

- eliminate  $y$  and obtain a polynomial  $R(x)$  of degree  $d = \deg(p) \cdot \deg(q)$  compute resultant
- compute the real zeros  $\xi_1, \xi_2, \dots$  of  $R(x)$
- analyse the situation at  $x = \xi_i$ :
  - this amounts to computing the real zeros of  $p(\xi_i, y)$  and  $q(\xi_i, y)$



Key task: compute the real roots of a univariate polynomial with real coefficients

We want an algorithm that

- works for polynomials with real coefficients,
- is exact, and
- handles “easy cases” fast.

## All complex roots

- **Numerical methods**: usually fast, no global convergence proof.
- **Splitting circle method**: Schönhage (82), Pan (02), computes approximate factorization; almost optimal; not implemented yet.
- Root isolation with same complexity, M/Sagraloff/Wang (03/05), Pan/Tsigaridas(03)

## Real roots or real roots restricted to an interval

- Subdivision methods: Descartes' Method, Sturm Sequences, Continued Fractions,
- Simple, however, worst-case running time much worse than Pan.
- Excellent implementations, e.g., F. Rouillier's algorithm RS.
- RS is the solver in MAPLE
- **Today**: A variant of Descartes, simple and competitive with Pan in the worst-case. First experiments are promising (Kobel, Rouillier, Sagraloff).





# A Hard Example: Mignotte Polynomials

Mignotte polynomial,  $p(x) = x^n - 2(ax - 1)^2$ ,  $a \geq 2$  integral

- Three real roots.
- Let  $\tau = \log |a|$ . Two of the roots have distance  $\approx 2^{-\Omega(\tau n)}$ .
  - polynomial is positive at  $x = 1/a$ .
  - $p(x)$  is negative for  $x = 1/a \pm h$ , where  $h = (1/a)^{(n+2)/2}$ .

$$p(1/a \pm h) = (1/a \pm h)^n - 2a^2 h^2 < 1/a^n - a^2 h^2 < 0.$$

- $a \approx 2^{20}$ ,  $n = 20$ , distance  $2^{-200}$ .

## Remarks

- Mignotte polynomials have worst-case root separation among polynomials with integer coefficients.
- Let  $\text{sep}(p)$  be the smallest distance between two roots. Then  $\text{sep}(p) \geq 2^{-n\tau}$ .



# A Hard Example: Mignotte Polynomials

Mignotte polynomial,  $p(x) = x^n - 2(ax - 1)^2$ ,  $a \geq 2$  integral

- Three real roots.
- Let  $\tau = \log |a|$ . Two of the roots have distance  $\approx 2^{-\Omega(\tau n)}$ .
  - polynomial is positive at  $x = 1/a$ .
  - $p(x)$  is negative for  $x = 1/a \pm h$ , where  $h = (1/a)^{(n+2)/2}$ .

$$p(1/a \pm h) = (1/a \pm h)^n - 2a^2 h^2 < 1/a^n - a^2 h^2 < 0.$$

- $a \approx 2^{20}$ ,  $n = 20$ , distance  $2^{-200}$ .

## Remarks

- Mignotte polynomials have worst-case root separation among polynomials with integer coefficients.
- Let  $\text{sep}(p)$  be the smallest distance between two roots. Then  $\text{sep}(p) \geq 2^{-n\tau}$ .



## The Descartes Method for Real Root Isolation

- Descartes proved the underlying theorem: Descartes' rule of sign.
- Algorithm is due to Collins/Akritas (76) and Lane/Riesenfeld(81).



## Number of Sign Changes

$p = \sum_{0 \leq i \leq n} p_i x^i$  with  $p_n \neq 0 \neq p_0$ . Let  $v(p)$  be the number of sign changes in coefficient sequence, e.g.,  $v(-3, 0, -2, 2, -1) = 2$ .

## Theorem (Descartes' Rule of Sign)

- Number of real zeros of  $p$  in  $(0, \infty)$  is at most  $v(p)$ .
- Both numbers have the same parity.
- $v_I(p)$  for interval  $I = (a, b)$ ; consider  $(b-x)^n \cdot p(\frac{x-a}{b-x})$ .

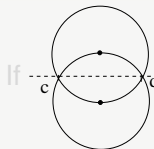
## Corollary

$v_I(p) = 0 \Rightarrow$  no root

$v_I(p) = 1 \Rightarrow$  exactly one root

$w(I) \leq \text{sep}(p)/4 \implies v_I(p) \leq 1$ .

## Partial Converse (Landau, Obreshkoff)



If  $[c, d]$  contains at most one root, then  $v_I(p) \leq 1$ .



## Number of Sign Changes

$p = \sum_{0 \leq i \leq n} p_i x^i$  with  $p_n \neq 0 \neq p_0$ . Let  $v(p)$  be the number of sign changes in coefficient sequence, e.g.,  $v(-3, 0, -2, 2, -1) = 2$ .

## Theorem (Descartes' Rule of Sign)

- Number of real zeros of  $p$  in  $(0, \infty)$  is at most  $v(p)$ .
- Both numbers have the same parity.
- $v_I(p)$  for interval  $I = (a, b)$ ; consider  $(b-x)^n \cdot p(\frac{x-a}{b-x})$ .

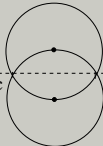
## Corollary

$v_I(p) = 0 \Rightarrow$  no root

$v_I(p) = 1 \Rightarrow$  exactly one root

$w(I) \leq \text{sep}(p)/4 \implies v_I(p) \leq 1$ .

## Partial Converse (Landau, Obreshkoff)

If  contains at most one root, then  $v_I(p) \leq 1$ .



## Descartes Method: isolate roots of $p(x)$ in $I = (c, d)$

- Compute  $v_I(p)$ ;
- If  $v_I = 0$  return;
- If  $v_I = 1$ , return and report  $(c, d)$  as an isolating interval
- Let  $m = (c + d)/2$ . (more generally  $m = \alpha c + (1 - \alpha)d$ )
  - If  $p(m) = 0$  report  $[m, m]$  as an isolating interval.
  - Recurse on both sub-intervals.

## To isolate all real roots

Start with  $(-M, +M)$ , where  $M = \max_i 2 \cdot |p_i| / |p_n|$ .

## Subadditivity of Sign Variations

$$V_{(c,m)} + V_{(m,d)} \leq V_{(c,d)}.$$



## Descartes Method: isolate roots of $p(x)$ in $I = (c, d)$

- Compute  $v_I(p)$ ;
- If  $v_I = 0$  return;
- If  $v_I = 1$ , return and report  $(c, d)$  as an isolating interval
- Let  $m = (c + d)/2$ . (more generally  $m = \alpha c + (1 - \alpha)d$ )
  - If  $p(m) = 0$  report  $[m, m]$  as an isolating interval.
  - Recurse on both sub-intervals.

## To isolate all real roots

Start with  $(-M, +M)$ , where  $M = \max_i 2 \cdot |p_i| / |p_n|$ .

## Subadditivity of Sign Variations

$$V_{(c,m)} + V_{(m,d)} \leq V_{(c,d)}.$$



## Analysis of Descartes Method

- Assume nonzero coeffs are in  $[1, 2^\tau]$  in absolute value.
- Start with  $[-M, +M]$ , where  $M = 2 \cdot 2^\tau$ .
- Alg stops at intervals of length  $\approx \text{sep}(p)$ , maybe earlier.
- Depth of the recursion tree is  $\leq \tau + \log 1 / \text{sep}(p)$ .
- Width of the recursion tree is  $\leq n$ , because of subadditivity.
- Number of nodes in the tree is  $n(\tau + \log 1 / \text{sep}(p))$ .
- $n$  arithmetic ops/node for computing  $v_l$  and for evaluating  $p(m)$ .
- Assume integer coeffs:
  - $\log 1 / \text{sep}(p) = O(n\tau)$ . Thus depth =  $O(n\tau)$  and # nodes =  $O(n^2\tau)$ .
  - Numbers grow by  $n$  bits in every node of the recursion tree and hence grow to  $\tau + n^2\tau$  bits.
  - Number of bit operations:  $O(n^2\tau \cdot n \cdot n^2\tau) = O(n^5\tau^2)$ .
- We are now in the year 2005.





## Two Questions

### Can we handle real coefficients, e.g., $\sqrt{2}$ , $\pi$ , $\ln 2$ ?

We assume them to be given by oracles that can be asked for arbitrary good approximations.

Coefficients are potentially infinite bitstreams.

How can we handle polynomials with bitstream coefficients?

### Can we improve complexity so that it matches Pan's?

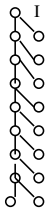
For a polynomial with integer coefficients bounded by  $2^\tau$  in absolute values

- Descartes method uses  $O(n^5 \tau^2)$  bit operations, but
- Pan's alg uses only  $\tilde{O}(n^2 \tau)$  bit operations to isolate all roots.



# Analysis of Descartes Method Revisited

- Depth of recursion tree is  $\leq \tau + \log 1 / \text{sep}(p)$ .
- Width of recursion tree is  $\leq n$ , because of subadditivity.
- Number of nodes in tree is  $n^2 \tau$ .
- $n$  arithmetic ops/node for computing  $v_l$  and for evaluating  $p(m)$ .
- Assume integer coeffs:
  - $\log 1 / \text{sep}(p) = O(n\tau)$ , depth =  $n\tau$ , # nodes =  $O(n^2 \tau)$
  - Numbers grow by  $n$  bits in every node of the recursion tree.
  - So numbers grow to  $\tau + n^2 \tau$  bits.
  - Number of bit operations:  $O(n^2 \tau \cdot n \cdot n^2 \tau) = O(n^5 \tau^2)$ .
- Potential for improvement:
  - Why precision  $n^2 \tau$  if  $\log 1 / \text{sep}(p) = O(n\tau)$ ?
  - Tree has only  $n$  nodes where both children have non-zero sign variations. Can we traverse long chains faster? (ideally, with a logarithmic number of iterations)
  - # of bit operations would reduce to  $\tilde{O}(n \cdot n \cdot n\tau)$ .



# Algorithm ANewDsc

Approximate Newton Descartes

A New Descartes



## Approximate Coefficients

We represent coefficients by intervals; these interval can be refined as needed.

Arithmetic becomes interval arithmetic, i.e.

$$[a, b] + [c, d] = [a + c, b + d] \text{ and}$$

$$[a, b] \cdot [c, d] = [\min(ac, ad, bc, bd), \dots].$$

Polynomials become interval polynomials.

Descartes becomes Interval-Descartes (Johnson-Krandick), but what is the sign of an interval and how does one compute sign changes?

# Sign Variations in Sequences of Intervals

## Set of potential sign variations in a sequence of intervals

$$v(\left([2, 3], [-1, 1]\right)) = \{0, 1\},$$

$$v(\left([2, 3], [-1, 1], [2, 3]\right)) = \{0, 2\},$$

$$v(\left([2, 3], [-1, 1], [-2, -1]\right)) = \{1\}.$$

We now have  $\tilde{v}_I$  instead of  $v_I$ .

## Capabilities needed for the Descartes method

1. For all nodes in the recursion tree: Does the Descartes test yield 0, 1, or at least 2 sign variations?
2. For internal nodes of the recursion tree: Does the polynomial vanish at the split point?

With an interval polynomial, making either decision may be impossible and hence the approach seems doomed.



### Careful Choice of Subdivision Point

Choose  $2n$  equidistant points in middle part of  $[c, d]$ ; call them  $M$

“Evaluate”  $p(x)$  on all of them and choose  $m \in M$  such that  $|p(m)| \geq \max_{x \in M} |p(x)|/2$ .

Then  $p(m) \neq 0$  for all subdivision points.

Details:

- Precision required for the computation is determined by  $|p(m)|$ . Double precision until  $p(m)$  can be computed up to factor two.
- Evaluation of  $2n$  equidistant points does not cost more than evaluation on a single point (Kobel/Sagraloff).
- We can estimate  $p(m)$  from below because a polynomial can be small only close to one of its roots (Smith bound).



## Interval Descartes Method: Isolate roots of $p(x)$ in $I = (c, d)$

- Compute  $\tilde{v}_I(p)$ ;
- If  $\tilde{v}_I = \{0\}$  return;
- If  $\tilde{v}_I = \{1\}$ , return and report  $(c, d)$  as an isolating interval
- Choose a good midpoint, namely,  $m \in M$  with

$$|p(m)| \geq \max_{x \in M} |p(x)|/2,$$

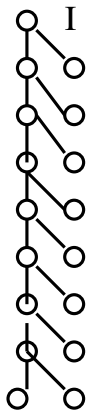
where  $M$  is a nice set of  $2n$  points in the middle part of  $I$ .

- Recurse on both sub-intervals.

## Amazing fact (Eigenwillig et al)

Recursion depth is essentially the same as for exact Descartes, more precisely,  $+O(1)$ . Proof hinges crucially on the fact that we choose midpoints where the polynomial is large.





### The shape of the recursion tree

Tree may have depth  $O(n\tau)$ , but only  $O(n)$  nodes where both children are subdivided further.

There must be long chains, say length  $L$ , where we split off an interval with no sign change, i.e., we have a **tiny interval of length  $2^{-L}|I|$**  containing all roots in  $I$ .



### Bisection versus Newton

Bisection converges linearly, i.e., one additional correct bit per iteration.

Newton converges quadratically, i.e., number of correct bits doubles per iteration.

Can we use Newton-iteration to traverse chains of length  $L$  in  $\log L$  steps?



## Clusters of roots (a bit of wishful thinking)

I

The red interval contains  $k$  roots. If red interval is small enough, we may treat the  $k$  roots as a  $k$ -fold root.

Newton iteration for a  $k$ -fold root: 
$$x_{n+1} = x_n - k \frac{p(x_n)}{p'(x_n)}.$$

Problem: We do not know  $k$ .

In interval  $(c, d)$ , we tentatively use  $x_n = c$  and  $x_n = d$ , equate the two values for  $x_{n+1}$  and solve for  $k$ , i.e.,

$$c - \hat{k} \frac{p(c)}{p'(c)} \stackrel{!}{=} d - \hat{k} \frac{p(d)}{p'(d)}.$$

Let  $\xi = c - \hat{k}p(c)/p'(c)$  and consider an interval  $[c', d']$  around  $\xi$ . If  $[c, c']$  and  $[d', d]$  have zero sign-changes, continue with  $[c', d']$  else use bisection, i.e., continue with  $[c, m]$  and  $[m, d]$ .



## Clusters of roots: The situation



Let  $\xi = c - \hat{k}p(c)/p'(c)$  and consider an interval  $[c', d']$  around  $\xi$ .  
If  $[c, c']$  and  $[d', d]$  have zero sign-changes, continue with  
 $I' = [c', d']$   
else use bisection, i.e., continue with  $[c, m]$  and  $[m, d]$

## Clusters of roots: The situation



Let  $\xi = c - \hat{k}p(c)/p'(c)$  and consider an interval  $[c', d']$  around  $\xi$ .  
If  $[c, c']$  and  $[d', d]$  have zero sign-changes, continue with  
 $I' = [c', d']$  and level of aggressiveness  $N_{I'}^2$  (Success).

else use bisection, i.e., continue with  $[c, m]$  and  $[m, d]$  and level of aggressiveness  $\max(4, \sqrt{N_I})$ .

## Quadratic Interval Refinement (Abott)

Each interval  $I$  has a level of aggressiveness  $N_I$ .

We choose  $[c', d']$  such that  $d' - c' = w(I)/N_I$ .

## Clusters of roots: The situation



Let  $\xi = c - \hat{k}p(c)/p'(c)$  and consider an interval  $[c', d']$  around  $\xi$ . If  $[c, c']$  and  $[d', d]$  have zero sign-changes, continue with  $I' = [c', d']$  and level of aggressiveness  $N_I^2$  (Success).

else use bisection, i.e., continue with  $[c, m]$  and  $[m, d]$  and level of aggressiveness  $\max(4, \sqrt{N_I})$ .

## Success Lemma

If red interval is tiny with respect to black interval, circumcircle of  $I'$  contains  $k$  roots, enlarged circumcircle of  $I$  contains no other roots, and aggressiveness is not too high, we have success.

Consequence for chain traversal.

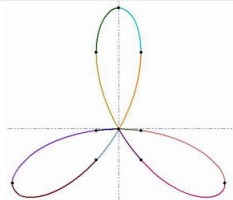
## Algorithm ANewDsc for Real Root Isolation

- has a worst-case complexity similar to Pan's alg and a much better observed complexity,
- can be asked to isolate roots in an interval,
- is simple enough to be implemented (Kobel/Sagraloff/Rouillier)
  - for integer polynomials: for simple cases, same speed as Rouillier's RS, for difficult cases, much faster.
  - for polynomials with bitstream coefficients: to be done.

## Curve Topology Computation (MSW)

Determine topology of zero-set of a polynomial of degree  $n$  in two variables.

Dependency on  $n$  reduces from  $n^{10}$  to  $n^6$ .



$$y^4 - y^3 + 2x^2y^2 + 3x^2y + x^4 = 0.$$