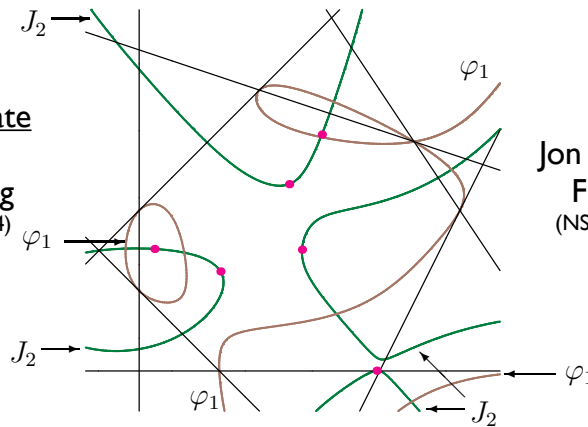


Khovanskii-Rolle continuation for real solutions of polynomial systems

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BIRS

Randomization, Relaxation, & Complexity

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Motivation

Problem: Approximate all **real** roots of a zero-dimensional polynomial system.

Solution: There are many options, but all have problems.

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One option: Homotopy continuation.

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Today's method: Numerical (mostly non-homotopy) method with complexity depending on the number of **real** roots.

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Question: Given polynomial system

$$f : \mathbb{R}^N \rightarrow \mathbb{R}^N$$

with support

$$W = \cup_{i=1}^N \text{supp}(f_i)$$

having $N+L+1$ monomials, how many solutions are there?

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Remark: Homotopy methods rely on these sorts of bounds.
(stick around for the next two talks)

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The ratio of this by Bihan-Sottile's bound is constant!
(Come to Corben Rusek's talk at 5:15....)

Motivation

Maurice: We need methods that depend on complexity over the reals. (People who have systems they need to solve feel similarly.)

The proof of the 2007 Bihan-Sottile paper indicates a clear numerical method.

This talk: Khovanskii-Rolle continuation. Features:

- (mostly non-homotopy) numerical method
- finds all solutions on the real torus
- complexity (of some sort) is bounded above by a constant multiple of the number of real solutions
- the actual computational cost is often better than complexity bound

Timings (more motivation)

- Example 1:

$$\begin{aligned} cd &= \frac{1}{2}be^2 + 2a^{-1}b^{-1}e - 1 & cd^{-1}e^{-1} &= \frac{1}{2}(1 + \frac{1}{4}be^2 - a^{-1}b^{-1}e) \\ bc^{-1}e^{-2} &= \frac{1}{4}(6 - \frac{1}{4}be^2 - 3a^{-1}b^{-1}e) & bc^{-2}e &= \frac{1}{2}(8 - \frac{3}{4}be^2 - 2a^{-1}b^{-1}e) \\ ab^{-1} &= 3 - \frac{1}{2}be^2 + a^{-1}b^{-1}e, \end{aligned}$$

102 complex solutions, 10 real solutions
KhRo took 1.4 seconds, Bertini took 9 sec (on one processor).

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- Example 2:

$$\begin{aligned} 10500 - tu^{492} - 3500t^{-1}u^{463}v^5w^5 &= 0 \\ 10500 - t - 3500t^{-1}u^{691}v^5w^5 &= 0 \\ 14000 - 2t + tu^{492} - 3500v &= 0 \\ 14000 + 2t - tu^{492} - 3500w &= 0. \end{aligned}$$

7663 complex solutions, 6 real solutions

KhRo took 23 sec, PHCpack took 39.3 min (on one processor). Notice the degrees....

Gameplan

1. **Background on proof of Bihan-Sottile bound**
2. Proof \rightarrow Algorithm
3. Example (pretty pictures)
4. A word about complexity
5. Further plans

Background: 2 main techniques

Gale Duality

A polynomial system with $N+L+1$ monomials has a dual system of “master functions” defined in the complement of a hyperplane arrangement AND there is a bijection between the solutions (under a technical condition).

(see Bihan-Sottile).

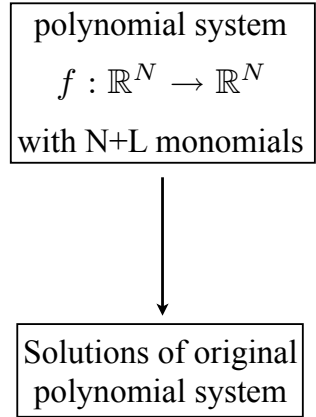
Khovanskii-Rolle Theorem

Given a curve C defined by a set of polynomials, the solutions on C of another polynomial are interspersed with solutions of an appropriately defined Jacobian determinant.

(see Khovanskii's *Fewnomials*).

Each idea has an important implication for us.

Background: Gale duality (high level)



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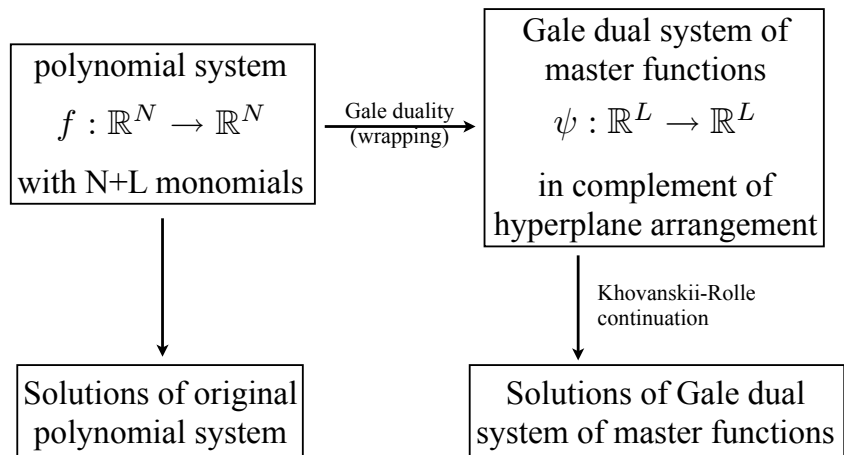
polynomial system
 $f : \mathbb{R}^N \rightarrow \mathbb{R}^N$
with $N+L$ monomials

Gale duality
(wrapping)

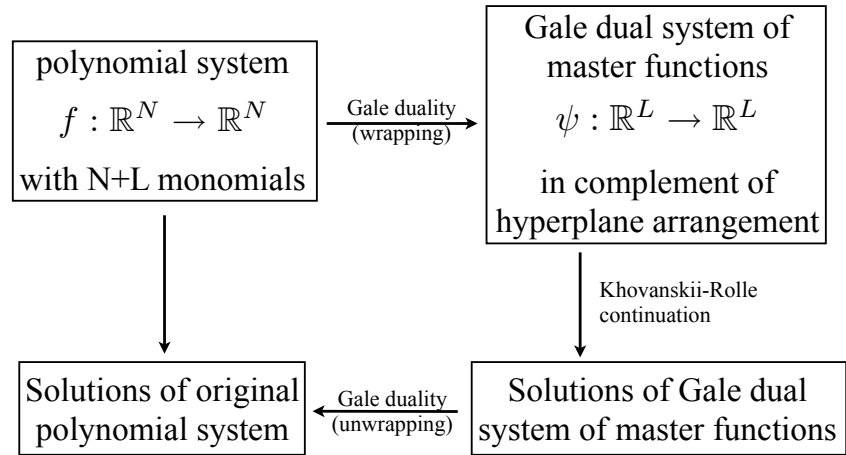
Gale dual system of
master functions
 $\psi : \mathbb{R}^L \rightarrow \mathbb{R}^L$
in complement of
hyperplane arrangement

Solutions of original
polynomial system

Background: Gale duality (high level)



Background: Gale duality (high level)



Background: Gale duality (low level)

The details are picky but not impossible...see the paper (or I can show you on paper later).

Bottom line: We want to find the solutions of the master functions defined in the complement of a hyperplane arrangement.

Matt Niemerg and I are nearly done with software for both the wrapping and the unwrapping. We will release the code once we have finished and tested it.

Background: Khovanskii-Rolle theorem

Given master functions

$$\psi : \mathbb{R}^L \rightarrow \mathbb{R}^L$$

For $j = L, L-1, \dots, 1$, define:

$$J_j := \text{Jac}(\psi_1, \dots, \psi_j, J_{j+1}, \dots, J_L)$$

and let

$$C_j := V(\psi_1, \dots, \psi_{j-1}, J_{j+1}, \dots, J_L),$$

curves in the complement of a hyperplane arrangement.

Khovanskii-Rolle says that solutions of ψ_j on C_j are separated by solutions of J_j .

Background: Bates-Bihan-Sottile proof

Thanks to Gale duality, to count the positive solutions of a system of polynomials, we can instead count the number of solutions of a system of master functions in the positive chamber.

Consequence of Khovanskii-Rolle:

$$|V(\psi_1, \dots, \psi_L)| \leq \flat(C_L) + \dots + \flat(C_1) + |V(J_1, \dots, J_L)|$$

where $\flat(C)$ is the number of unbounded components of C .

Also (from Bihan-Sottile):

1. $|V(J_1, \dots, J_L)| \leq 2^{\binom{L}{2}} N^L$
2. $\flat(C_j) \leq \frac{1}{2} 2^{\binom{L-j}{2}} n^{N-L} \binom{N+L+1}{j} \cdot 2^j \leq 2^{\binom{k}{2}} n^k \cdot \frac{2^{2j-1}}{j!}$

Putting this together gives the latest bound.

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Proof \rightarrow Algorithm

Where is the algorithm?

Rather than counting arcs and intersections, we move along them and watch for solutions:

- Solve J_L, J_{L-1}, \dots, J_1 and find all points where the arcs given by vanishing of all J_j except J_1 intersect the boundary of the chamber.
- Traverse each arc twice, looking for solutions of ψ_1 (or the current master function of interest):
 - Move one direction from boundary points
 - Move two directions from interior points
 - Security: Know how many times we reach each point
 - Move on to the next master function and J_j

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An example

- The initial (Laurent) polynomials (after Gaussian elimination):

$$\begin{aligned} cd &= \frac{1}{2}be^2 + 2a^{-1}b^{-1}e - 1 & cd^{-1}e^{-1} &= \frac{1}{2}(1 + \frac{1}{4}be^2 - a^{-1}b^{-1}e) \\ bc^{-1}e^{-2} &= \frac{1}{4}(6 - \frac{1}{4}be^2 - 3a^{-1}b^{-1}e) & bc^{-2}e &= \frac{1}{2}(8 - \frac{3}{4}be^2 - 2a^{-1}b^{-1}e) \\ ab^{-1} &= 3 - \frac{1}{2}be^2 + a^{-1}b^{-1}e, \end{aligned}$$

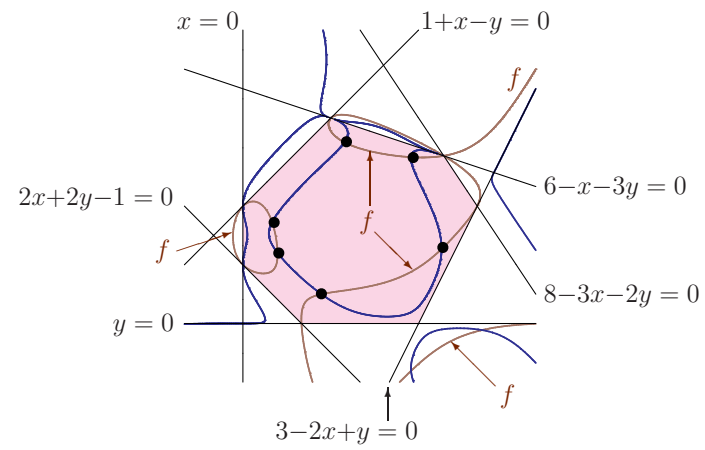
Notice that $N = 5$ and $L = 2$.

- Master functions (just two, in two variables):

$$f := (2x+2y-1)(1+x-y)(8-3x-2y)^2 - 8yx^2(6-x-3y)^2(3-2x+y),$$

$$g := y(2x+2y-1)^6(1+x-y)^6(8-3x-2y)^7(3-2x+y) - 32768x^3(6-x-3y)^2.$$

Solutions of the master functions:



Thanks to Frank for all the images from now on!

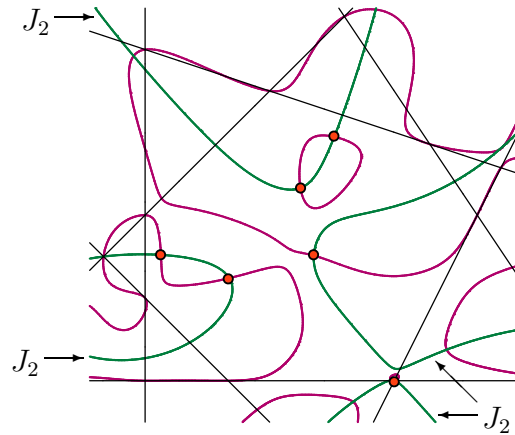
Preparation for KR continuation

- Form the Jacobian determinants

$$\begin{aligned} J_2 = J(\mathbf{f}, \mathbf{g}), \quad J_2 &= -168x^5 - 1376x^4y + 480x^3y^2 - 536x^2y^3 - 1096xy^4 + 456y^5 + 1666x^4 + 2826x^3y \\ &\quad + 3098x^2y^2 + 6904xy^3 - 1638y^4 - 3485x^3 - 3721x^2y - 15318xy^2 - 1836y^3 \\ J_1 = J(\mathbf{f}, J_2). \quad &\quad + 1854x^2 + 8442xy + 9486y^2 - 192x - 6540y + 720. \\ J_1 &= 10080x^{10} - 168192x^9y - 611328x^8y^2 - \dots + 27648x + 2825280y. \end{aligned}$$

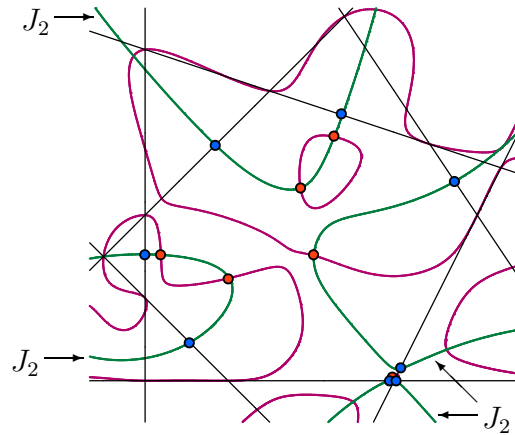
- Key properties:
 1. The solutions of $\mathbf{f} = \mathbf{g} = 0$ are separated by those of $\mathbf{f} = J_2 = 0$ on the curve $\mathbf{f} = 0$.
 2. The solutions of $\mathbf{f} = J_2 = 0$ are separated by those of $J_1 = J_2 = 0$ on the curve $J_2 = 0$.

The curves for J_1 and J_2 :



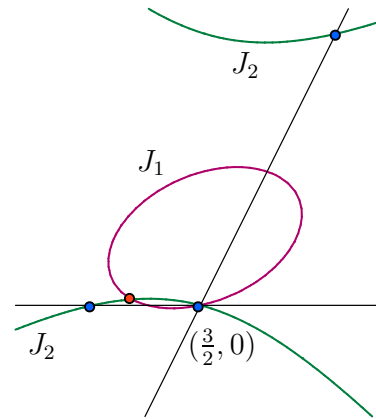
We find the solutions of $J_1 = J_2 = 0$ with continuation.
There are 6 of these.

The curves for J_1 and J_2 :



We also find all points where J_2 meets the boundary.
There are 8 of these points.

The bottom right corner:

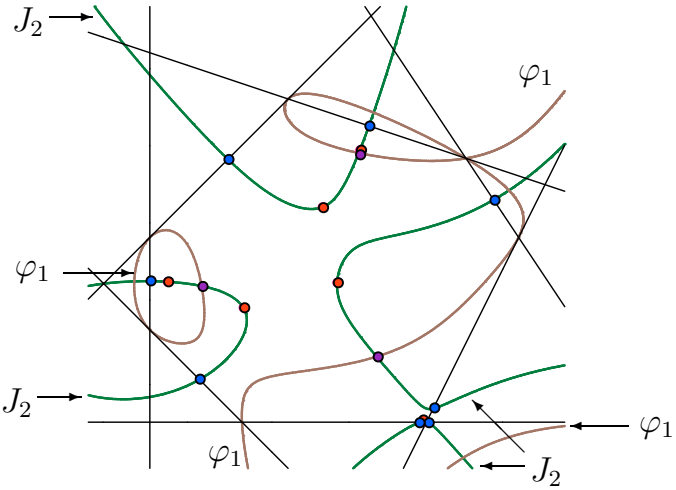


Step I

Since any two solutions of $f = J_2 = 0$ along the curve $J_2 = 0$ are separated by solutions of $J_1 = J_2 = 0$, we will find all solutions of $f = J_2 = 0$ by tracking

1. each way from the solutions of $J_1 = J_2 = 0$ AND
2. into the polytope from the points at which J_2 reaches the boundary.

Moving from red and blue to purple along green curve
(replacing a Jacobian with a master function):



Safety from the Khovanskii-Rolle theorem

- Since any two solutions of $f = J_2 = 0$ along the curve $J_2 = 0$ are separated by solutions of $J_1 = J_2 = 0$:
 1. we will find all solutions of $f = J_2 = 0$ exactly twice, and
 2. we can watch the behavior along each arc we trace to help make sure that each arc is traced the appropriate number of times.
- Who cares? We do, because we don't have the usual guarantees of homotopy continuation.

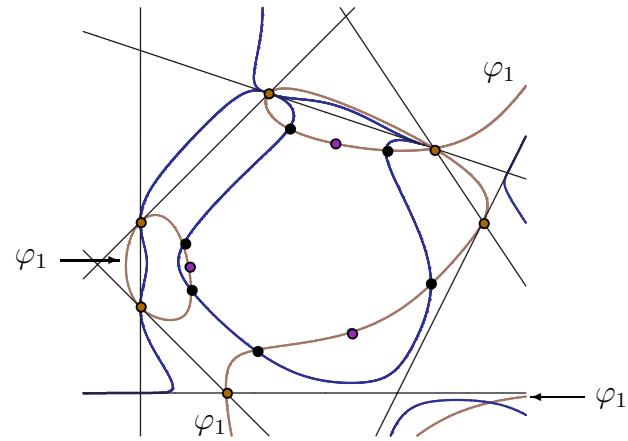
Step 2 (last step for this example)

Now we move along the curve $f = 0$

- in two directions from each solution of $f = J_2 = 0$ and
- in one direction from each point at which f reaches the boundary

to find all points at which $\mathbf{f} = \mathbf{g} = \mathbf{0}$ (the solutions we wanted in the first place!).

Moving from purple and brown to **black** along brown:



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Complexity

Question: What is the complexity of this method?

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- Upper bound on # arcs to follow (often fewer),
- # polynomial systems to solve, and
- Bézout number of each,

then the total number of paths/arcs to follow is less than twice the Bihan-Sottile bound!

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(The complexity of curve-tracing/path-following is unknown in general.)

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Further plans

- Generalize algorithm to $L > 2$.
- Increase numerical security.
- Extend software (KhRo - see Frank's website) to $L > 2$.
- Add Gale duality pre- and post-processing to KhRo.
- Parallelize.
- Applications.

Thanks!

For more details, please see “Khovanskii-Rolle continuation for real solutions,” arXiv:0908.4579

(Ask me about $SI(AG)^2$ if you don't know about it.)