Homotopies for positive dimensional solution components of polynomial systems

Jan Verschelde

Department of Math, Stat & CS University of Illinois at Chicago Chicago, IL 60607-7045, USA *e-mail:* jan@math.uic.edu *web:* www.math.uic.edu/~jan

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Outline of Lecture

- 1. Numerical Algebraic Geometry Dictionary
- 2. Homotopies to compute Witness Points
- 3. Factorization with Monodromy and Linear Traces
- 4. Software and Applications

Joint Work with A.J. Sommese and C.W. Wampler

- A.J. Sommese and C.W. Wampler: Numerical algebraic geometry. In The Mathematics of Numerical Analysis, ed. by J. Renegar et al., volume 32 of Lectures in Applied Mathematics, 749–763, AMS, 1996.
- A.J. Sommese and JV: Numerical homotopies to compute generic points on positive dimensional algebraic sets. *Journal of Complexity* 16(3):572–602, 2000.
- A.J. Sommese, JV and C.W. Wampler: Numerical decomposition of the solution sets of polynomial systems into irreducible components. SIAM J. Numer. Anal. 38(6):2022–2046, 2001.
- A.J. Sommese, JV and C.W. Wampler: Using monodromy to decompose solution sets of polynomial systems into irreducible components. In Application of Algebraic Geometry to Coding Theory, Physics and Computation, ed. by C. Ciliberto et al., Proceedings of a NATO Conference, February 25 March 1, 2001, Eilat, Israel. Pages 297–315, Kluwer AP.
- A.J. Sommese, JV and C.W. Wampler: Symmetric functions applied to decomposing solution sets of polynomial systems. SIAM J. Numer. Anal. 40(6):2026–2046, 2002.
- A.J. Sommese, JV and C.W. Wampler: Numerical irreducible decomposition using PHCpack. In Algebra, Geometry, and Software Systems, edited by M. Joswig and N. Takayama, pages 109–130, Springer-Verlag, 2003.

Solution sets to polynomial systems

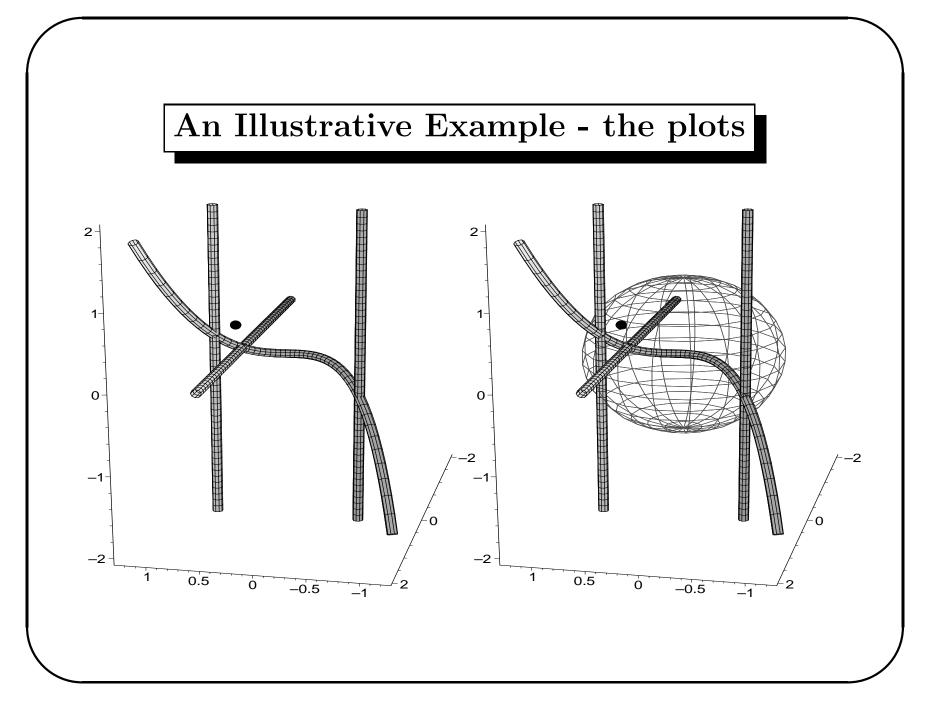
Polynomial in One Variable	System of Polynomials	
one equation, one variable	n equations, N variables	
solutions are points	points, lines, surfaces,	
multiple roots	sets with multiplicity	
Factorization: $\prod_{i} (x - a_i)^{\mu_i}$	Irreducible Decomposition	
Numerical Representation		
set of points	set of witness sets	

An Illustrative Example

$$f(x, y, z) = \begin{cases} (y - x^2)(x^2 + y^2 + z^2 - 1)(x - 0.5) = 0\\ (z - x^3)(x^2 + y^2 + z^2 - 1)(y - 0.5) = 0\\ (y - x^2)(z - x^3)(x^2 + y^2 + z^2 - 1)(z - 0.5) = 0 \end{cases}$$

Irreducible decomposition of $Z = f^{-1}(\mathbf{0})$ is

 $Z = Z_2 \cup Z_1 \cup Z_0 = \{Z_{21}\} \cup \{Z_{11} \cup Z_{12} \cup Z_{13} \cup Z_{14}\} \cup \{Z_{01}\}$ with 1. Z_{21} is the sphere $x^2 + y^2 + z^2 - 1 = 0$, 2. Z_{11} is the line $(x = 0.5, z = 0.5^3)$, 3. Z_{12} is the line $(x = \sqrt{0.5}, y = 0.5)$, 4. Z_{13} is the line $(x = -\sqrt{0.5}, y = 0.5)$, 5. Z_{14} is the twisted cubic $(y - x^2 = 0, z - x^3 = 0)$, 6. Z_{01} is the point (x = 0.5, y = 0.5, z = 0.5).



Witness Sets

- A witness point is a solution of a polynomial system which lies on a set of generic hyperplanes.
 - The <u>number of generic hyperplanes</u> used to isolate a point from a solution component

equals the **dimension** of the solution component.

• The <u>number of witness points</u> on one component cut out by the same set of generic hyperplanes

equals the **degree** of the solution component.

A witness set for a k-dimensional solution component consists of k random hyperplanes and a set of isolated solutions of the system cut with those hyperplanes.

Membership Test

Does the point **z** belong to a component?

- Given: a point in space $\mathbf{z} \in \mathbb{C}^N$; a system $f(\mathbf{x}) = \mathbf{0}$; and a witness set W, W = (Z, L): for all $\mathbf{w} \in Z : f(\mathbf{w}) = \mathbf{0}$ and $L(\mathbf{w}) = \mathbf{0}$.
- 1. Let $L_{\mathbf{z}}$ be a set of hyperplanes through \mathbf{z} , and define

$$H(\mathbf{x},t) = \begin{cases} f(\mathbf{x}) = \mathbf{0} \\ L_{\mathbf{z}}(\mathbf{x})t + L(\mathbf{x})(1-t) = \mathbf{0} \end{cases}$$

Trace all paths starting at w ∈ Z, for t from 0 to 1.
 The test (z, 1) ∈ H⁻¹(0)? answers the question above.

Numerical Algebraic Geometry Dictionary				
Algebraic Geometry	example in 3-space	Numerical Analysis		
variety	collection of points, algebraic curves, and algebraic surfaces	 polynomial system + union of witness sets, see below for the definition of a witness set 		
irreducible variety	a single point, or a single curve, or a single surface	polynomial system + witness set + probability-one membership test		
generic point on an irreducible variety	random point on an algebraic curve or surface	point in witness set; a witness point is a solution of polynomial system on the variety and on a random slice whose codimension is the dimension of the variet		
pure dimensional variety	one or more points, or one or more curves, or one or more surfaces	polynomial system + set of witness sets of same dimension + probability-one membership tests		
irreducible lecomposition of a variety	several pieces of different dimensions	polynomial system + array of sets of witness sets and probability-one membership tests		

Randomization and Embedding

Overconstrained systems, e.g.: $f = (f_1, f_2, \dots, f_5)$, with $\mathbf{x} = (x_1, x_2, x_3)$.

randomization: choose random complex numbers a_{ij} :

$$\begin{cases} f_1(\mathbf{x}) + a_{11}f_4(\mathbf{x}) + a_{12}f_5(\mathbf{x}) = 0\\ f_2(\mathbf{x}) + a_{21}f_4(\mathbf{x}) + a_{22}f_5(\mathbf{x}) = 0\\ f_3(\mathbf{x}) + a_{31}f_4(\mathbf{x}) + a_{32}f_5(\mathbf{x}) = 0 \end{cases}$$

embedding: z_1 and z_2 are slack variables ($a_{ij} \in \mathbb{C}$ again at random):

$$f_{1}(\mathbf{x}) + a_{11}z_{1} + a_{12}z_{2} = 0$$

$$f_{2}(\mathbf{x}) + a_{21}z_{1} + a_{22}z_{2} = 0$$

$$f_{3}(\mathbf{x}) + a_{31}z_{1} + a_{32}z_{2} = 0$$

$$f_{4}(\mathbf{x}) + a_{41}z_{1} + a_{42}z_{2} = 0$$

$$f_{5}(\mathbf{x}) + a_{51}z_{1} + a_{52}z_{2} = 0$$

Embedding with Slack Variables

The cyclic 4-roots system defines 2 quadrics in \mathbb{C}^4 :

$$\begin{cases} \begin{cases} x_1 + x_2 + x_3 + x_4 + \gamma_1 z = 0\\ x_1 x_2 + x_2 x_3 + x_3 x_4 + x_4 x_1 + \gamma_2 z = 0\\ x_1 x_2 x_3 + x_2 x_3 x_4 + x_3 x_4 x_1 + x_4 x_1 x_2 + \gamma_3 z = 0\\ x_1 x_2 x_3 x_4 - 1 + \gamma_4 z = 0\\ a_0 + a_1 x_1 + a_2 x_2 + a_3 x_3 + a_4 x_4 + z = 0 \end{cases}$$

Original system : 4 equations in x_1, x_2, x_3 , and x_4 .
Cut with random hyperplane to find isolated points.

Slack variable z with random γ_i , i = 1, 2, 3, 4: square system.

Solve embedded system to find 4 = 2+2 witness points as isolated solutions with z = 0.

A cascade of embeddings

dimension one:

0

0

0

0

0

dimension two:

dimension zero:

$$f_{1}(\mathbf{x}) + a_{11}z_{1} = 0$$

$$f_{2}(\mathbf{x}) + a_{21}z_{1} = 0$$

$$f_{3}(\mathbf{x}) + a_{31}z_{1} = 0$$

$$z_{1} = 0$$

$$z_{2} = 0$$

A cascade of homotopies

Denote \mathcal{E}_i as an embedding of $f(\mathbf{x}) = \mathbf{0}$ with *i* random hyperplanes and *i* slack variables $\mathbf{z} = (z_1, z_2, \dots, z_i)$.

Theorem (Sommese - Verschelde):

- 1. Solutions with $(z_1, z_2, ..., z_i) = \mathbf{0}$ contain deg W generic points on every *i*-dimensional component W of $f(\mathbf{x}) = \mathbf{0}$.
- 2. Solutions with $(z_1, z_2, \ldots, z_i) \neq \mathbf{0}$ are regular; and solution paths defined by

$$h_i(\mathbf{x}, \mathbf{z}, t) = (1 - t)\mathcal{E}_i(\mathbf{x}, \mathbf{z}) + t \begin{pmatrix} \mathcal{E}_{i-1}(\mathbf{x}, \mathbf{z}) \\ z_i \end{pmatrix} = \mathbf{0}$$

starting at t = 0 with all solutions with $z_i \neq 0$ reach at t = 1 all isolated solutions of $\mathcal{E}_{i-1}(\mathbf{x}, \mathbf{z}) = \mathbf{0}$.

A refined version of Bézout's theorem

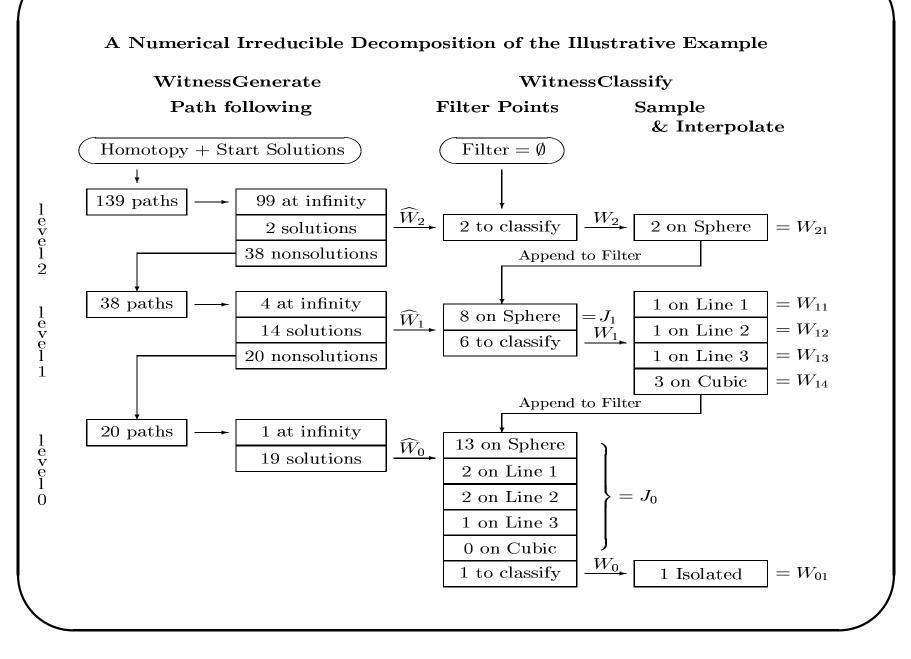
The linear equations added to $f(\mathbf{x}) = \mathbf{0}$ in the cascade of homotopies do not increase the total degree.

Let $f = (f_1, f_2, \dots, f_n)$ be a system of *n* polynomial equations in *N* variables, $\mathbf{x} = (x_1, x_2, \dots, x_N)$.

Bézout bound:
$$\prod_{i=1}^{n} \deg(f_i) \ge \sum_{j=0}^{N} \mu_j \deg(W_j),$$

where W_j is a *j*-dimensional solution component of $f(\mathbf{x}) = \mathbf{0}$ of multiplicity μ_j .

Note: j = 0 gives the "classical" theorem of Bézout.



Solving Systems Incrementally

- Extrinsic and Intrinsic Deformations
 - **extrinsic :** defined by explicit equations
 - intrinsic : following the actual geometry
- Diagonal Homotopies
 - \rightarrow to intersect pure dimensional solution sets
- Intersecting with Hypersurfaces

adding the polynomial equations one after the other we arrive at an incremental polynomial system solver.

Extrinsic Homotopy Deformations

 $f(\mathbf{x}) = \mathbf{0}$ has k-dimensional solution components. We cut with k hyperplanes to find isolated solutions = witness sets:

$$a_{i0} + \sum_{j=1}^{n} a_{ij} x_j = 0, \quad i = 1, 2, \dots, k, \quad a_{ij} \in \mathbb{C}$$
 random

Sample
$$\begin{cases} f(\mathbf{x}) + \gamma \mathbf{z} = 0 & \mathbf{z} = slack\\ a_{i0}(t) + \sum_{j=1}^{n} a_{ij}(t) x_j = 0 & moving \end{cases}$$

#witness points =
$$\sum_{\substack{C \subseteq f^{-1}(0) \\ \dim(C) = k}} \deg(C)$$

Intrinsic Homotopy Deformations

 $f(\mathbf{x}) = \mathbf{0}$ has k-dimensional solution components. We cut with a random affine (n - k)-plane to find witness points :

$$\mathbf{x}(\lambda) = \mathbf{b} + \sum_{i=1}^{n-k} \lambda_i \mathbf{v}_i \in \mathbb{C}^n$$

The vectors \mathbf{b} and \mathbf{v}_i are choosen at random.

Sample
$$f\left(\mathbf{x}(\lambda,t) = \mathbf{b}(t) + \sum_{i=1}^{n-k} \lambda_i \mathbf{v}_i(t)\right) = \mathbf{0}$$

Points on the moving (n-k)-plane are determined by n-kindependent variables λ_i , i = 1, 2, ..., n-k.

Intersecting Hypersurfaces Extrinsicially

$$f_1(\mathbf{x}) = 0 \quad \mathbf{x} \in \mathbb{C}^n$$

 $L_1(\mathbf{x}) = \mathbf{0}_{n-1 \text{ hyperplanes}}$

$$f_2(\mathbf{y}) = 0 \quad \mathbf{y} \in \mathbb{C}^n$$

 $L_2(\mathbf{y}) = \mathbf{0}_{n-1 \text{ hyperplanes}}$

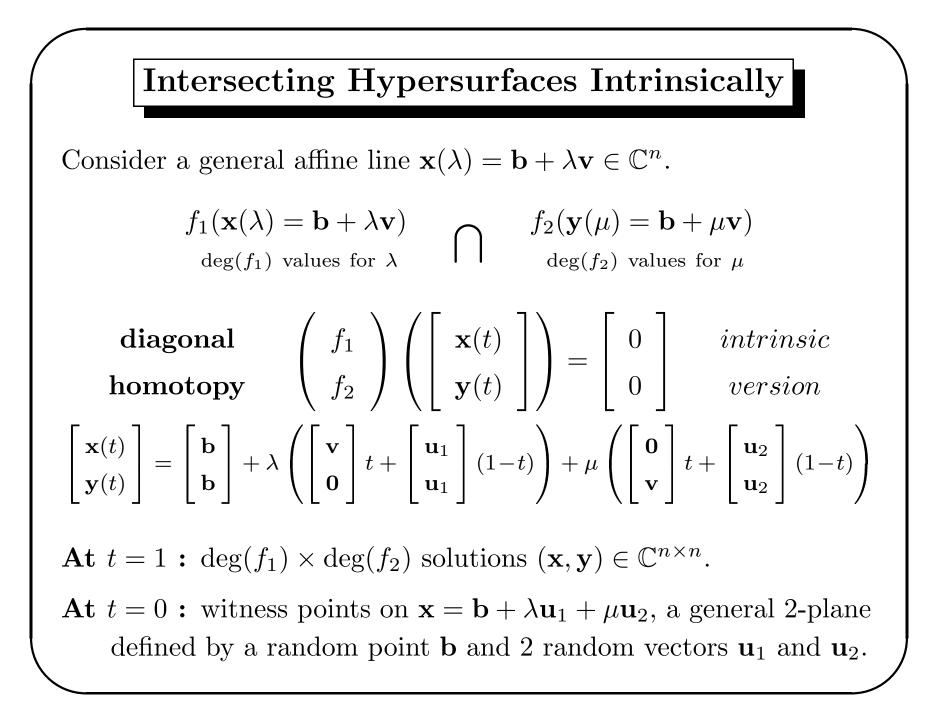
diagonal homotopy

extrinsic version

$$\begin{cases} f_1(\mathbf{x}) = 0 \\ f_2(\mathbf{y}) = 0 \\ L_1(\mathbf{x}) = \mathbf{0} \\ L_2(\mathbf{y}) = \mathbf{0} \end{cases} t + \begin{pmatrix} f_1(\mathbf{x}) = 0 \\ f_2(\mathbf{y}) = 0 \\ \mathbf{x} - \mathbf{y} = \mathbf{0} \\ M(\mathbf{y}) = \mathbf{0} \end{pmatrix} (1 - t) = \mathbf{0}$$

At t = 1: deg $(f_1) \times deg(f_2)$ solutions $(\mathbf{x}, \mathbf{y}) \in \mathbb{C}^{n \times n}$.

At t = 0: witness points $(\mathbf{x} = \mathbf{y} \in \mathbb{C}^n)$ on $f_1^{-1}(0) \cap f_2^{-1}(0)$ cut out by n - 2 hyperplanes M.



Intersecting with Hypersurfaces

Let $f(\mathbf{x}) = \mathbf{0}$ have k-dimensional solution components described by witness points on a general (n - k)-dimensional affine plane, i.e.:

$$f\left(\mathbf{x}(\lambda) = \mathbf{b} + \sum_{i=1}^{n-k} \lambda_i \mathbf{v}_i\right) = \mathbf{0}.$$

Let $g(\mathbf{x}) = 0$ be a hypersurface with witness points on a general affine line, i.e.:

$$g(\mathbf{x}(\mu) = \mathbf{b} + \mu \mathbf{w}) = 0.$$

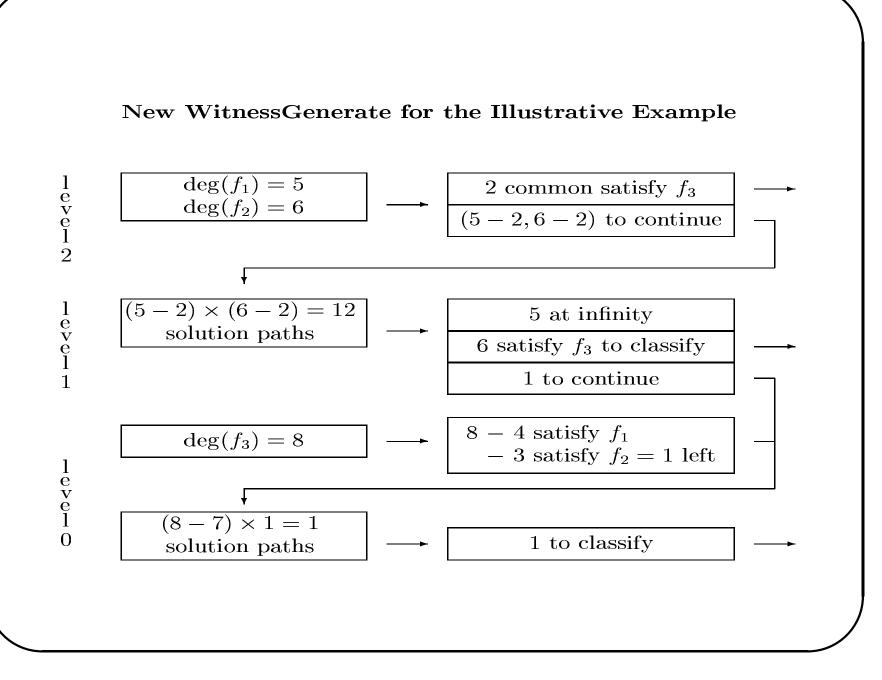
Assuming $g(\mathbf{x}) = 0$ properly cuts one degree of freedom from $f^{-1}(\mathbf{0})$, we want to find witness points on all (k-1)-dimensional components of $f^{-1}(\mathbf{0}) \cap g^{-1}(0)$.

Computing Nonsingular Solutions Incrementally

Suppose (f_1, f_2, \ldots, f_k) defines the system $f(\mathbf{x}) = \mathbf{0}, \mathbf{x} \in \mathbb{C}^n$, whose solution set is pure dimensional of multiplicity one for all $k = 1, 2, \ldots, N \leq n$, i.e.: we find only nonsingular roots if we slice the solution set of $f(\mathbf{x}) = \mathbf{0}$ with a generic linear space of dimension n - k.

Main loop in the solver :

for k = 2, 3, ..., N - 1 do use a diagonal homotopy to intersect $(f_1, f_2, ..., f_k)^{-1}(\mathbf{0})$ with $f_{k+1}(\mathbf{x}) = 0$, to find witness points on all (n - k - 1)-dimensional solution components.



Factoring Solution Components

Input: $f(\mathbf{x}) = \mathbf{0}$ polynomial system with a positive dimensional solution component, represented by witness set.

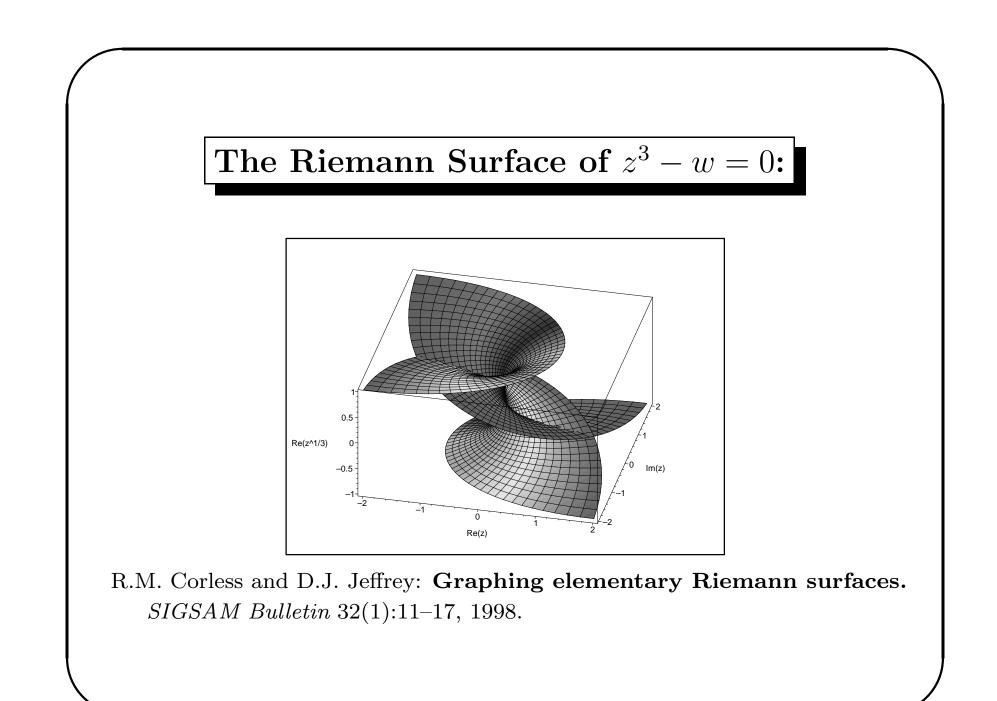
 $coefficients \ of \ f \ known \ approximately, \ work \ with \ limited \ precision$ $\underline{Wanted:} \ decompose \ the \ component \ into \ irreducible \ factors, \\ for \ each \ factor, \ give \ its \ degree \ and \ multiplicity.$

Related to numerical factorization of multivariate polynomials:

E. Kaltofen: Challenges of symbolic computation: my favorite open problems. J. Symbolic Computation 29(6): 891–919, 2000.

Related Work

- Y. Huang, W. Wu, H.J. Stetter, and L. Zhi: Pseudofactors of multivariate polynomials. In *Proceedings of ISSAC 2000*, ed. by C. Traverso, pages 161–168, ACM 2000.
- R.M. Corless, M.W. Giesbrecht, M. van Hoeij, I.S. Kotsireas and S.M. Watt: Towards factoring bivariate approximate polynomials. In *Proceedings of ISSAC 2001*, ed. by B. Mourrain, pages 85–92, ACM 2001.
- A. Galligo and D. Rupprecht: Semi-numerical determination of irreducible branches of a reduced space curve. In *Proceedings of ISSAC 2001*, ed. by B. Mourrain, pages 137–142, ACM 2001.
- A. Galligo and D. Rupprecht: Irreducible decomposition of curves. J. Symbolic Computation 33(5):661–677, 2002.
- T. Sasaki: Approximate multivariate polynomial factorization based on zero-sum relations. In Proceedings of ISSAC 2001, ed. by B. Mourrain, pages 284–291, ACM 2001.
- R.M. Corless, A. Galligo, I.S. Kotsireas, and S.M. Watt: A geometric-numeric algorithm for absolute factorization of multivariate polynomials. In *Proceedings of ISSAC 2002*, ed. by T. Mora, pages 37–45, ACM 2002.
- E. Kaltofen and J. May: On approximate irreducibility of polynomials in several variables. To appear in *Proceedings of ISSAC 2003*.



Monodromy to Decompose Solution Components

Given: a system $f(\mathbf{x}) = \mathbf{0}$; and W = (Z, L):

for all $\mathbf{w} \in Z : f(\mathbf{w}) = \mathbf{0}$ and $L(\mathbf{w}) = \mathbf{0}$.

Wanted: partition of Z so that all points in a subset of Z lie on the same irreducible factor.

Example: does f(x, y) = xy - 1 = 0 factor?

Consider
$$H(x, y, \theta) = \begin{cases} xy - 1 = 0 \\ x + y = 4e^{i\theta} \end{cases}$$
 for $\theta \in [0, 2\pi]$.

For $\theta = 0$, we start with two real solutions. When $\theta > 0$, the solutions turn complex, real again at $\theta = \pi$, then complex until at $\theta = 2\pi$. Back at $\theta = 2\pi$, we have again two real solutions, but their order is permuted \Rightarrow irreducible.

Connecting Witness Points

1. For two sets of hyperplanes K and L, and a random $\gamma \in \mathbb{C}$

$$H(\mathbf{x}, t, K, L, \gamma) = \begin{cases} f(\mathbf{x}) = \mathbf{0} \\ \gamma K(\mathbf{x})(1-t) + L(\mathbf{x})t = \mathbf{0} \end{cases}$$

We start paths at t = 0 and end at t = 1.

- For α ∈ C, trace the paths defined by H(x, t, K, L, α) = 0.
 For β ∈ C, trace the paths defined by H(x, t, L, K, β) = 0.
 Compare start points of first path tracking with end points of second path tracking. Points which are permuted belong to the same irreducible factor.
- 3. Repeat the loop with other hyperplanes.

Linear Traces

Consider
$$f(x, y(x)) = (y - y_1(x))(y - y_2(x))(y - y_3(x))$$

= $y^3 - t_1(x)y^2 + t_2(x)y - t_3(x)$

We are interested in the linear trace: $t_1(x) = c_1 x + c_0$.

Sample the cubic at $x = x_0$ and $x = x_1$. The samples are $\{(x_0, y_{00}), (x_0, y_{01}), (x_0, y_{02})\}$ and $\{(x_1, y_{10}), (x_1, y_{11}), (x_1, y_{12})\}$.

Solve
$$\begin{cases} y_{00} + y_{01} + y_{02} = c_1 x_0 + c_0 \\ y_{10} + y_{11} + y_{12} = c_1 x_1 + c_0 \end{cases}$$
 to find c_0, c_1 .

With t_1 we can predict the sum of the y's for a fixed choice of x. For example, samples at $x = x_2$ are $\{(x_2, y_{20}), (x_2, y_{21}), (x_2, y_{22})\}$. Then, $t_1(x_2) = c_1x_2 + c_0 = y_{20} + y_{21} + y_{22}$.

Validation of Breakup with Linear Trace

Do we have enough witness points on a factor?

- We may not have enough monodromy loops to connect all witness points on the same irreducible component.
- For a k-dimensional solution component, it suffices to consider a curve on the component cut out by k - 1 random hyperplanes. The factorization of the curve tells the decomposition of the solution component.
- We have enough witness points on the curve if the value at the linear trace can predict the sum of one coordinate of all points in the set.

Notice: Instead of monodromy, we may enumerate all possible factors and use linear traces to certify. While the complexity of this enumeration is exponential, it works well for low degrees.

Software Tools in PHCpack

In computing a numerical irreducible decomposition of a given polynomial system, we typically run through the following steps:

1.	Embed (phc -c)	add $\#$ random hyperplanes = top dimension,
		add slack variables to make the system square
2.	Solve (phc -b)	solve the system constructed above
3.	${f Witness Generate}$	apply a sequence of homotopies to compute
	(phc - c)	witness point sets on all solution components
4.	${f Witness Classify}$	filter junk from witness point sets
	(phc - f)	factor components into irreducible components
Especially step 2 is a computational bottleneck		

Numerical Elimination Methods

- Elimination = Projection
 - 1. slice component with hyperplanes
 - 2. drop coordinates from samples
 - 3. interpolate at projected samples

• An example: the twisted cubic
$$\begin{cases} y - x^2 = 0\\ z - x^3 = 0 \end{cases}$$

- 1. general slice ax + by + cz + d = 0, random $a, b, c, d \in \mathbb{C}$, twisted cubic projects to a cubic in the plane.
- 2. slice restricted to $\mathbb{C}[x, y]$, set c = 0, find $y x^2 = 0$
- 3. slice restricted to $\mathbb{C}[x, z]$, set b = 0, find $z x^3 = 0$

Application: Spatial Six Positions

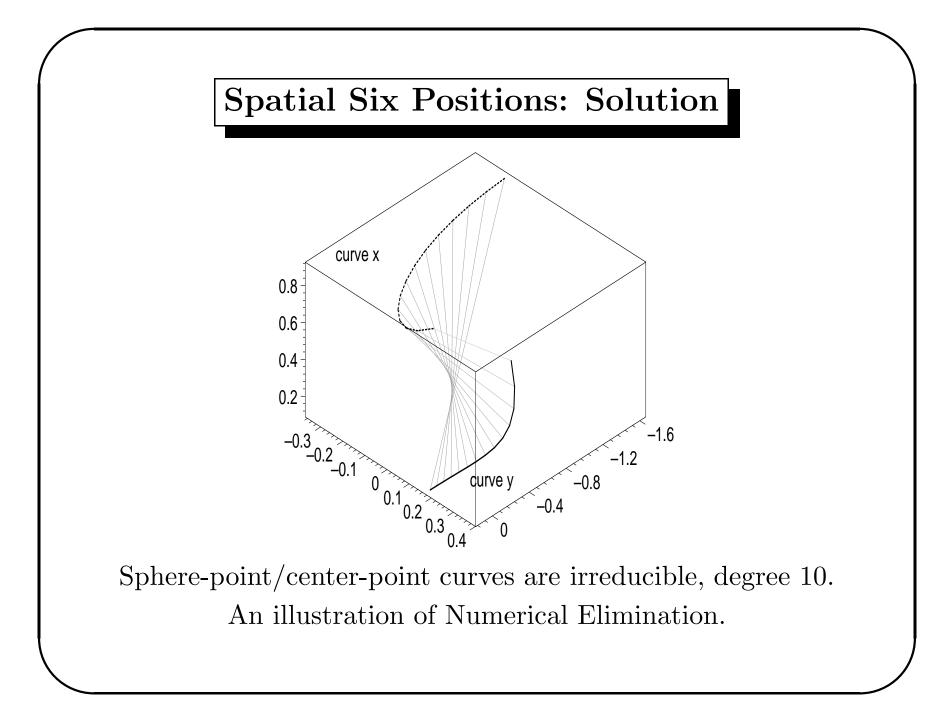
Planar Body Guidance (Burmester 1874)

- 5 positions determine 6 circle-point/center-point pairs
- 4 positions give cubic circle-point & center-point curves

Spatial Body Guidance (Shoenflies 1886)

- 7 positions determine 20 sphere-point/center-point pairs
- 6 positions give 10th-degree sphere-point & center-point curves

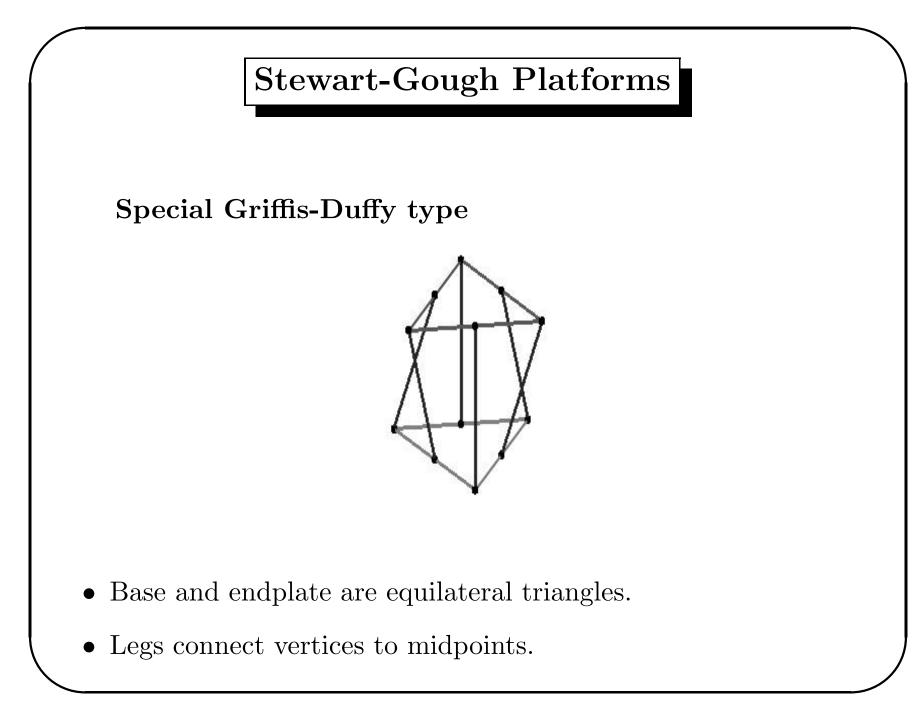
Question: Can we confirm this result using continuation?



Witness Points

for the Spatial Burmester Problem

- The input polynomial system consists of five quadrics in six unknowns (**x**, **y**).
- The new incremental solver computes 20 witness points in 7s 181ms on Pentium III 1Ghz Windows 2000 PC.
- Projection onto \mathbf{x} or \mathbf{y} reduces the degree from 20 to 10.



Results of Husty and Karger

Self-motions of Griffis-Duffy type parallel manipulators. In Proc. 2000 IEEE Int. Conf. Robotics and Automation (CDROM), 2000.

The special Griffis-Duffy platforms *move*:

- Case 1: Plates not equal, legs not equal.
 - Curve is degree 20 in Euler parameters.
 - Curve is degree 40 in position.
- Case 2: Plates congruent, legs all equal.
 - Factors are degrees (4+4) + 6 + 2 = 16 in Euler parameters.
 - Factors are degrees (8+8) + 12 + 4 = 32 in position.

Question: Can we confirm these results numerically?

Components of Griffis-Duffy Platforms

Solution components by degree

Husty & Karger		S	VW	
Euler	Position	Study	Position	
General Case				
20	40	28	40	
Le	Legs equal, Plates equal			
		6	8	
4	8	6	8	
4	8	6	8	
6	12	6	12	
2	4	4	4	
16	32	28	40	

Griffis-Duffy Platforms: Factorization

Case A: One irreducible component of degree 28 (general case).

Case B: Five irreducible components of degrees 6, 6, 6, 6, and 4.

user cpu on 800Mhz	Case A	Case B
witness points	$1 \mathrm{m} \ 12 \mathrm{s} \ 480 \mathrm{ms}$	
monodromy breakup	$33s \ 430ms$	$27\mathrm{s}~630\mathrm{ms}$
Newton interpolation	$1h \ 19m \ 13s \ 110ms$	2m 34s 50ms

32 decimal places used to interpolate polynomial of degree 28

linear trace	4s 750ms	$4s \ 320ms$
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Linear traces replace Newton interpolation:

 \Rightarrow time to factor independent of geometry!

