Subdivision Approximation for Curves and Integral Analysis

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Joint work with M.Burr, S.Choi, B.Galehouse, F.Krahmer, V.Sharma

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ABSTRACT

Geometric operations on curves and surfaces can be based on algebraic techniques (e.g., cylindrical algebraic decomposition, resultants) or on numerical/geometric techniques (e.g., subdivision methods, marching cubes). The latter techniques have adaptive complexity but are usually incomplete. To achieve completeness, hybrid techniques which combine numerical with algebraic techniques are usually used. In this talk, we focus on purely numerical techniques.

Vegter-Plantinga gave the first numerical subdivision algorithm that is guaranteed to compute isotopic approximations for implicit curves and surfaces that are non-singular. The computational model is non-algebraic, using only evaluation functions and the interval evaluation of functions and their derivatives. We show how to achieve isotopic approximation of implicit curves with isolated singularities within the Vegter-Plantinga model.

The complexity analysis of adaptive algorithms is an major challenge. We shall consider the 1-D version of their algorithm: this amounts to real root isolation. We introduce general framework and a novel integral formula for the complexity of EVAL, a version of their root isolation algorithm. We also show that for the benchmark problem where the input polynomial f is a integer polynomial of degree d with L-bit coefficient size, EVAL has $O(d^2L)$ complexity.

Our analysis technique might be called "continuous amortization argument", and exploits an evaluation-form of the Mahler-Davenport type bounds.

PART I. Introduction

TWO APPROACHES

- * Algebraic Approach
- * Numerical/Geometric Approach

• PROS and CONS

- * ALGEBRAIC: robust and complete BUT inefficent, hard-to-implement, non-local
- * GEOMETRIC: fast, simple-to-implement, local BUT incomplete and non-robust
- * HYBRID METHOD: e.g., subdivision WITH algebraic primitives

• SUBDIVISION METHODs in Geometric Approaches

- * STRONG FORM: Snyder, Mourrain
- * WEAK FORM: Vegter-Plantinga (see below)

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* Correct, Robust, Efficient

• (A) ADAPTIVE METHODS

- * Fast on typical or non-degenerate inputs
- * THIS TALK: subdivision method

• (B) PURELY NUMERICAL METHODS

- * No manipulation of algebraic numbers, resultants, root isolation
- * ADVANTAGES: simpler, applies to non-algebraic geometry
- * THIS TALK: purely numerical subdivision

• (C) COMPLETE METHODS

- * AVOID Assumptions on Inputs
- * E.g., non-singularity, Morseness, general position
- * THIS TALK: isolated singularities

- * Need intrinsic measures: E.g., condition numbers, precision-sensitivity
- * THIS TALK: integral analysis

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 - * How can we detect tangential intersection?
 - * Adaptive Application of Geometric Separation Bounds
- Near-Optimal Analysis of Descartes' Method [ISSAC'06]
 - * Amortized Analysis what does it mean?
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 - * The Vegter-Plantinga computational model
- PART III: One-Dimensional Case
 - * I.e., root isolation in presence of multiple roots

• PART IV: Integral Complexity Analysis

- * Continuous amortization arguments
- * Integral Analysis for non-singular 1-D
- PART V: Complete subdivision algorithm
 - * Extension of Vegter-Plantinga to singular curves

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PART II. PROBLEM AND REVIEW

- Meshing of Implicit Curve
 - * GIVEN: $f: \mathbb{R}^n \to \mathbb{R}$ and $\varepsilon > 0$
 - * COMPUTE: a polygonal approximation \widetilde{S} for the surface S: f = 0.
 - * WHERE: \widetilde{S} is isotopic to S, and $d(\widetilde{S}, S) \leq \varepsilon$.
- The Vegter-Plantinga Computational Model
 - * (1) [Like Marching Cube] Evaluate sign of f(x) for $x \in \mathbb{F}^n \subseteq \mathbb{R}^n$
 - * (2) [Interval Arithmetic] Evaluate interval versions of f and its derivatives
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Interval Arithmetic

- Let $[a,b] = I \subseteq \mathbb{R}$ be a (closed) interval
 - * Width: w(I) = b a.
 - * Midpoint: m(I) = (a + b)/2.

For S ⊆ ℝ, let □S denote the set of all intervals contained in S
* n-Boxes: B ∈ □ℝⁿ
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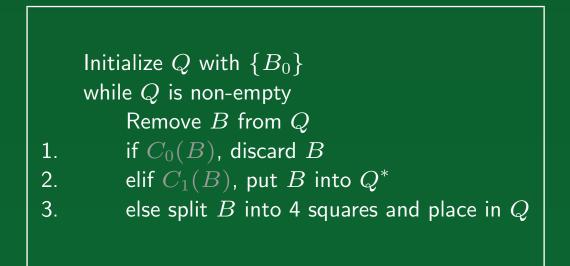
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- Assume S: f = 0 is a non-singular curve
 - \ast Begin with any square box B_0
 - \ast We want to approximate $S\cap B_0$
- TWO TESTS
 - $* C_0(B): 0 \not\in \Box f(B)$
 - * $C_1(B)$: $0 \not\in (\Box f_x(B))^2 + (\Box f_y(B)^2)$
- STEP 1: MAIN LOOP

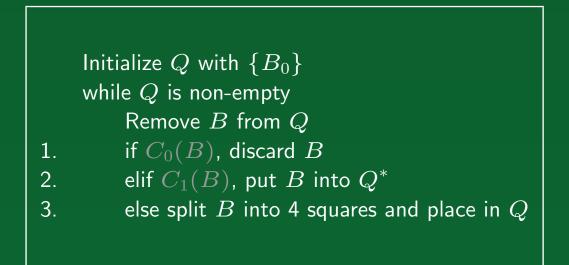


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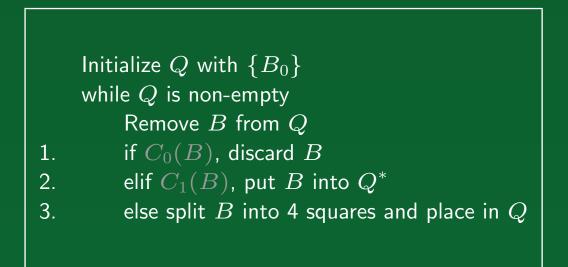


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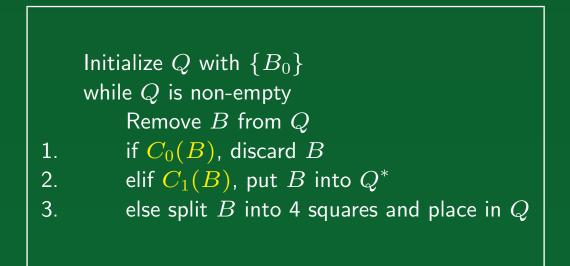
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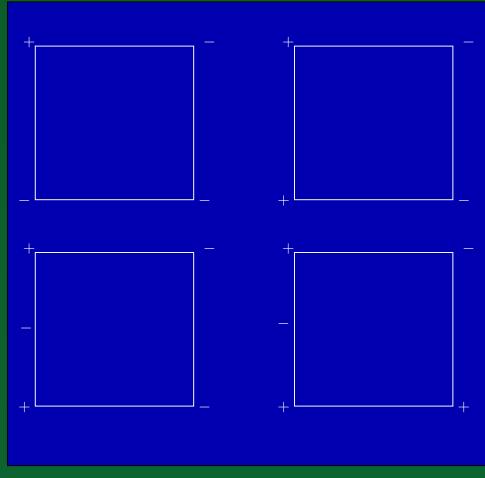
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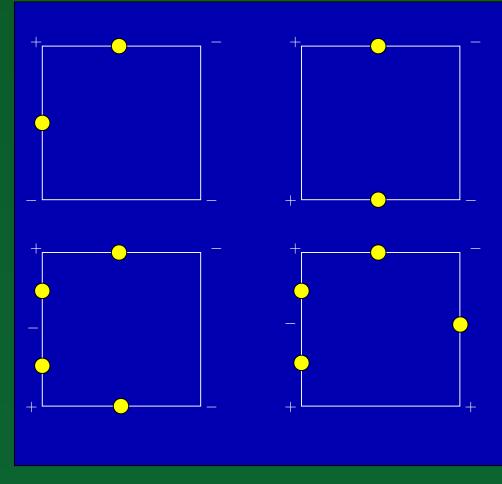
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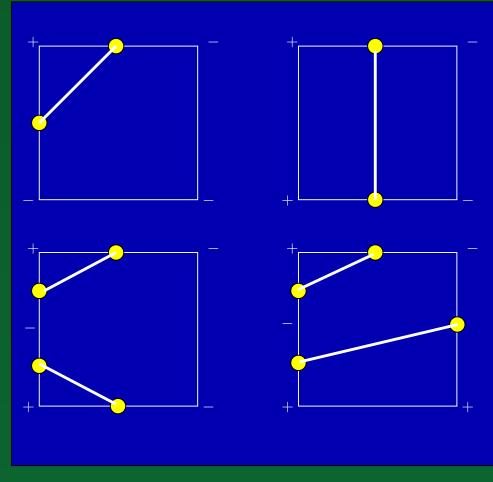
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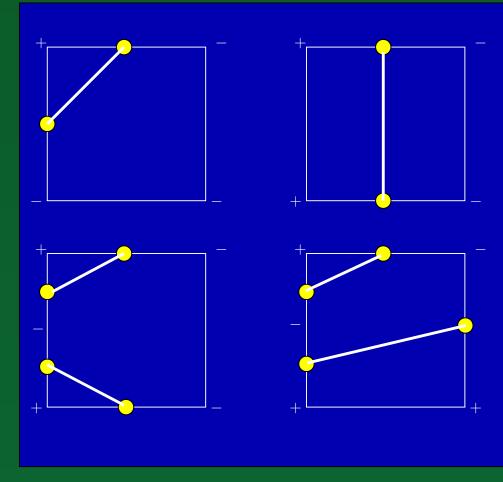
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 \ast Insert Vertices and Connect to get G

- * Assume $S \subseteq B_0$
- * Then the output graph G is isotopic to $B_0\cap S$
- "Weak Subdivision": the topology on the boundary of boxes are not guaranteed!



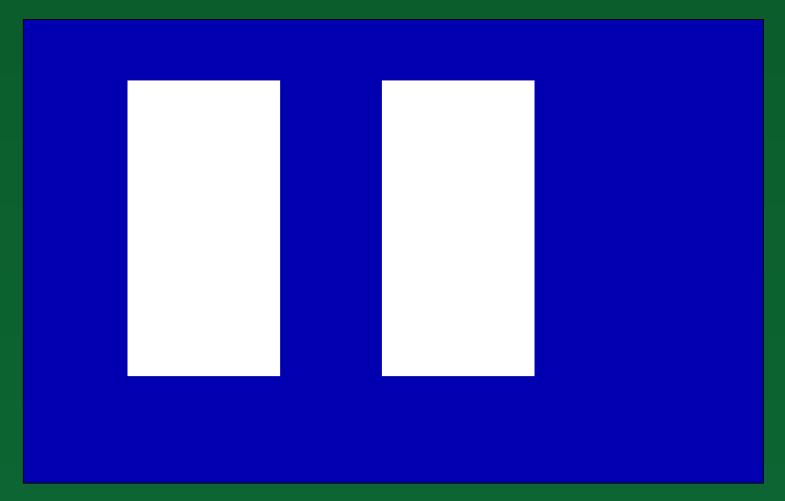
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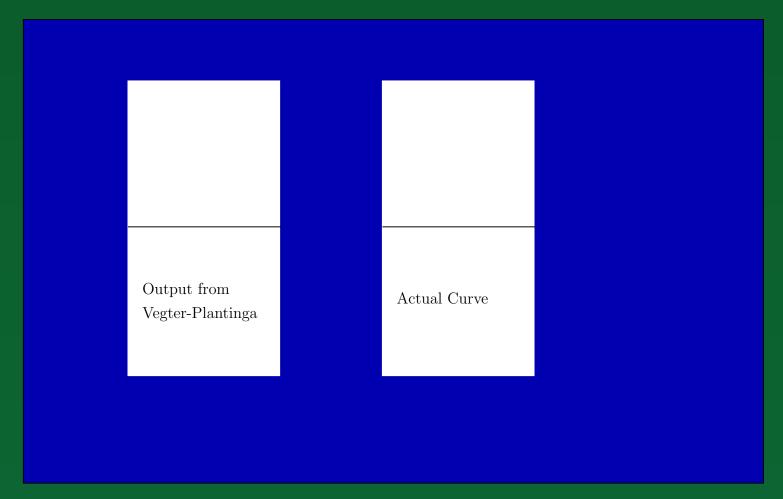
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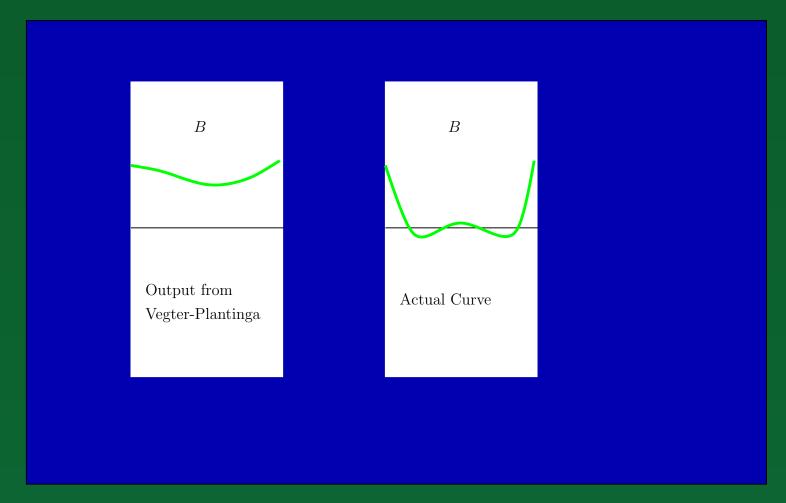
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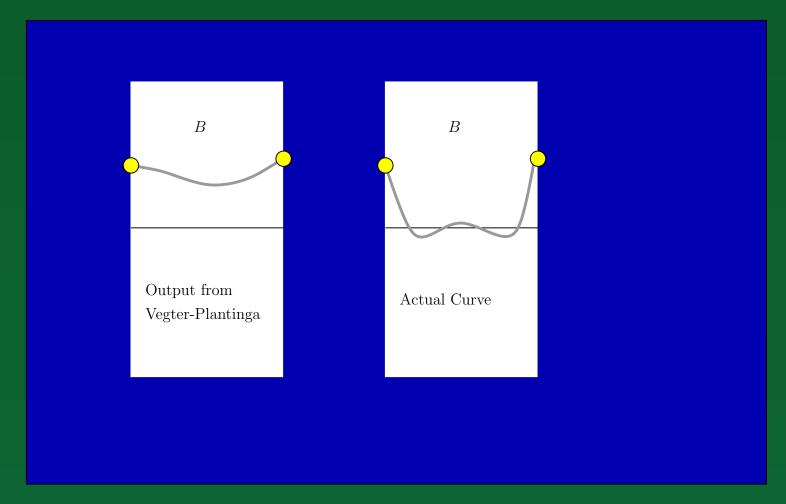
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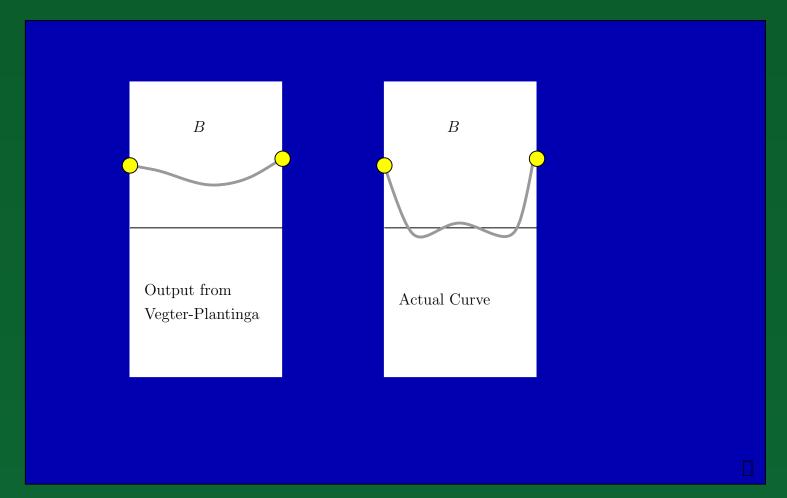
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- * How to confirm singularities in the in the Vegter-Plantinga Model?
- Meshing curves is a 2-D problem
 - * The 1-D analogue is Root Isolation!
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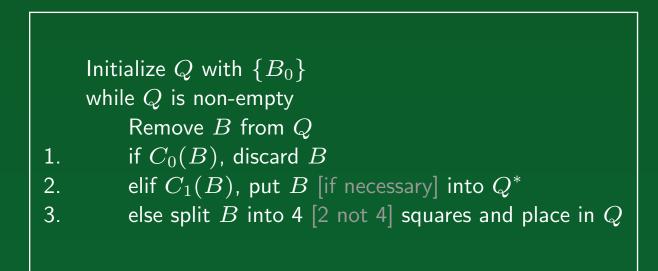
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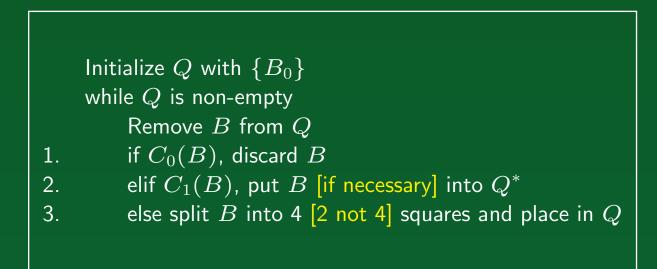
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PART III. THE SINGULAR CASE IN 1-D

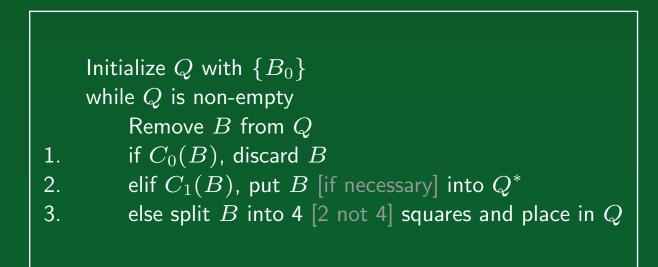
The Algorithm EVAL EVAL: an adaptation of Vegter-Plantinga to 1-D * STEP 1: MAIN LOOP



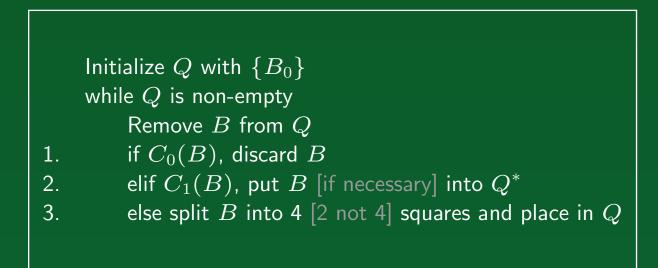
- STEP 2: Process Q^*
 - * NOTE: $C_1(B)$ says " $0 \not\in \Box f'(B)$ "
 - * Output B = [a, b] iff $f(a)f(b) \le 0$.
- Bolzano Theorem: if f(a)f(b) < 0, then f(c) = 0 for some a < c < b* Other Evaluation Methods: based on Newton operator



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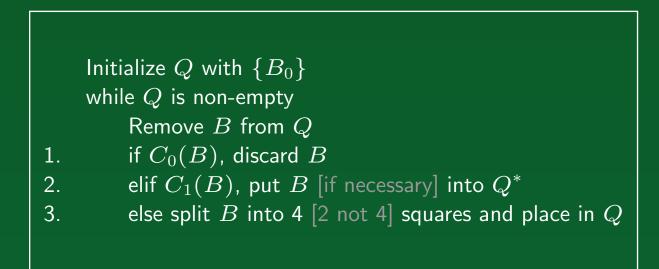


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- Bolzano Theorem: if f(a)f(b) < 0, then f(c) = 0 for some a < c < b* Other Evaluation Methods: based on Newton operator

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- We need various bounds:
 - \ast K_I : Lipschitz constant for f over I
 - * $\Delta(f,g)$: Separation bound for zeros of f and g
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- ALSO: let $\Delta(f) \equiv \Delta(f, f')$, $EV(f) \equiv EV(f, f')$
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```
ROOTISOL Input: F : \mathbb{R} \to \mathbb{R}, and interval I_0
Output: A list F of isolating intervals
    Initialize Q to I_0.
    while Q \neq \emptyset
         I = [a, b] \leftarrow Q.remove().
        if |I| > BOUND
             if the midpoint of I, m = (a + b), is a root of F
                  if midpoint of I is also a root of F', put [m, m] into L (singular).
                  else put [m, m] into L (nonsingular)
             Split I in two equal halves, and put them in Q.
         else
             if (F'(a)F'(b) < 0)
                  if |f(a)| \leq EV(F, F')/3, put I into L (singular).
1.
2.
                  else Discard I.
             else % Thus, F'(a)F'(b) > 0
                  if (f(a)f(b) < 0)
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Generalizing the 1-D Solution?

- What we learned from the 1-D case:
 - * Need Separation Bounds: $\Delta(f), \Delta(f'), \Delta(f, f')$
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PART IV. COMPLEXITY ANALYSIS OF EVAL

• 3 Subdivision Methods for Isolating real zeros

STURM > DESCARTES > BOLZANO

- PRIMITIVES (decreasing complexity):
 - * Sturm Query: Exact number of roots in I
 - * Descartes/Bernstein Query: Rule of Sign
 - * Bolzano Queries: $C_0(I)$ and $C_1(I)$

• WHAT IS THE SIZE OF THE SEARCH TREE?

- * Sturm Tree: O(dL) [Davenport'86]
- * Descartes Tree: O(dL) [Eigenwillig-Sharma-Y'06]
- * Bolzano Tree: O(dL) for optimal $\Box f$ [Burr-Sharma-Y'07]

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BASIC LEMMA

- * Let $a \in J$ and $0 \in \Box f(J)$
- * Then $w(J) \geq |f(a)|/K_J$

• Let $g : \mathbb{R} \to \mathbb{R}$ be continuous.

- * An interval J is large (relative to g) if for all $a \in J$, $w(J) \ge g(a)$.
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• A subdivision P of I is a partition

- * obtained from $P = \{I\}$ by performing repeated bisections of intervals $J \in P$
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* The Subdivision P of I at the end of STEP 1 of EVAL has size $\max\{1, \int_I \frac{2da}{g(a)}\}$.

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- Local Lipschitz Constants, K_a for any $a \in I$. * LEMMA: The function $g_1(a) = \max\{\frac{|f(a)|}{K_a}, \frac{|f'(a)|}{K'_a}\}$ is a stopping function
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• BENCHMARK PROBLEM: let f(x) an integer polynomial of degree d and the logarithmic height is $L = \lg ||f||$

 \ast What is the complexity of isolating all the roots of f?

* We know that O(dL) is optimal (assuming $L \ge \log d$)

• Consider ideal case: $R := \int_a^b \frac{da}{g_*(a)} := \int_a^b \min\left\{ \left| \frac{|f'(a)|}{f(a)} \right|, \left| \frac{|f''(a)|}{f'(a)} \right| \right\} da.$ * THEOREM: R = O(dL)

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 - * Let lead(h) = b and β_1, \ldots, β_k be complex zeros of h.
 - * Then $\prod_i |f(\beta_i)| \leq (m+1) \|f\|^k (M(h)/b)^m$
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- \ast Current proof assumes f', f'' relatively prime
- Ideas: need "gamma function" $\gamma(x) = \gamma_f(x) = \max_{i \ge 2} \left(\frac{|f^{(i)}(x)|}{i!|f'(x)|} \right)^{1/(i-1)}$. * Roughly, $1/\gamma(x)$ is the radius of Newton convergence

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$$G(a) := \min \left\{ \frac{1}{2\gamma(a)}, \frac{|f(a)|}{2d|f'(a)|} \right\}$$
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Conceptual algorithm

- * STAGE 1: keep splitting intervals J in a subdivision of I until one of:
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 - \ast Current proof assumes f', f'' relatively prime
- Ideas: need "gamma function" $\gamma(x) = \gamma_f(x) = \max_{i \ge 2} \left(\frac{|f^{(i)}(x)|}{i!|f'(x)|} \right)^{1/(i-1)}$. * Roughly, $1/\gamma(x)$ is the radius of Newton convergence

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PART V. Isotopic Approximation of Singular Curves

• Let $f \in \mathbb{Z}[X_1, \ldots, X_n]$.

- \ast WANTED: generalization for n>1
- THEOREM: Let $f_1, \ldots, f_m \in \mathbb{Z}[X_1, \ldots, X_n]$ be non-constant. * IF $GCD(f_1, \ldots, f_m) = 1$
 - * THEN $Zero(f_1, \ldots, f_m) \subseteq \mathbb{C}^n$ has dimension at most n-2.
 - * FURTHER, the dimension n-2 can be achieved
- COROLLARY: Let $f \in \mathbb{Z}[X_1, \ldots, X_n]$ be squarefree.
 - * The singularities of the surface f = 0 has dimension at most n 2.
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- STEP 1: CONSTRUCT $F = f^2 + f_x^2 + f_y^2$ * So: F(p) = 0 iff p is a singular point of f = 0
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 - * The Function $F-arepsilon_1$ is non-singular
 - * The curve of $\{F = \varepsilon_1\}$ can be solved by Vegter-Plantinga!

- * Bounded singular regions contains a unique singular point of f=0
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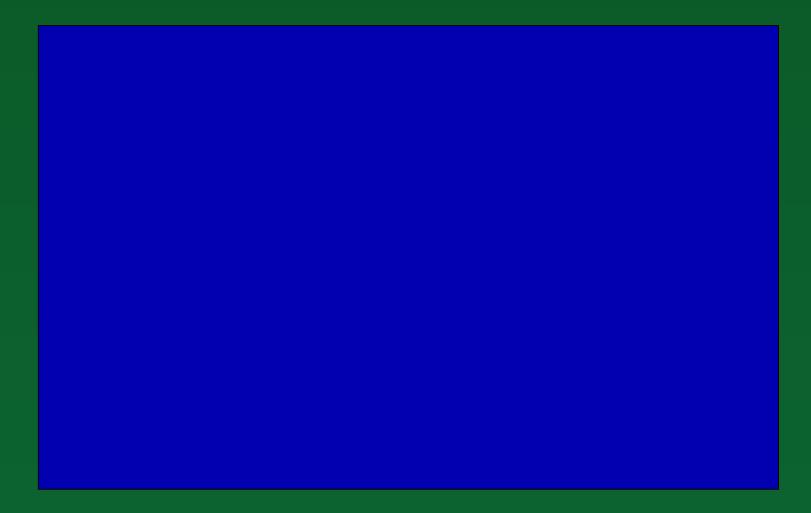
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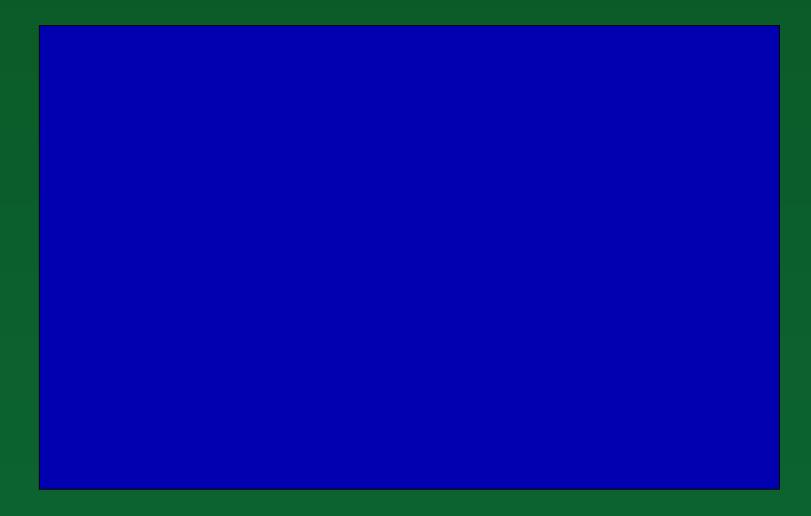
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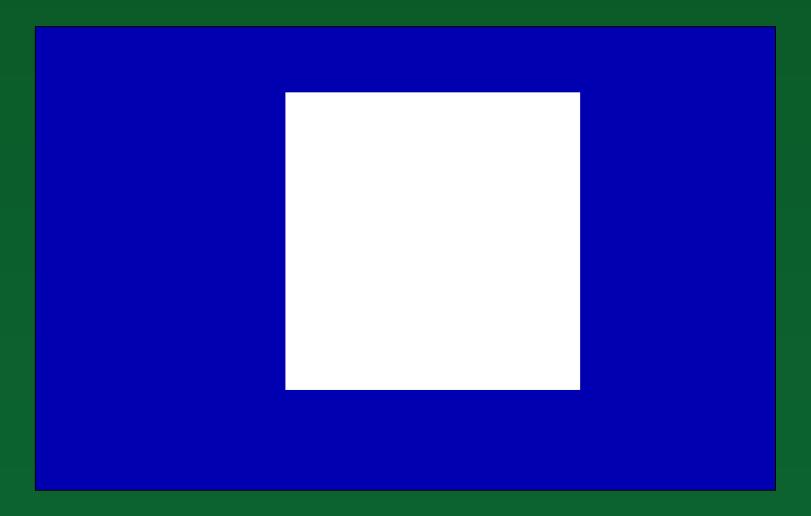
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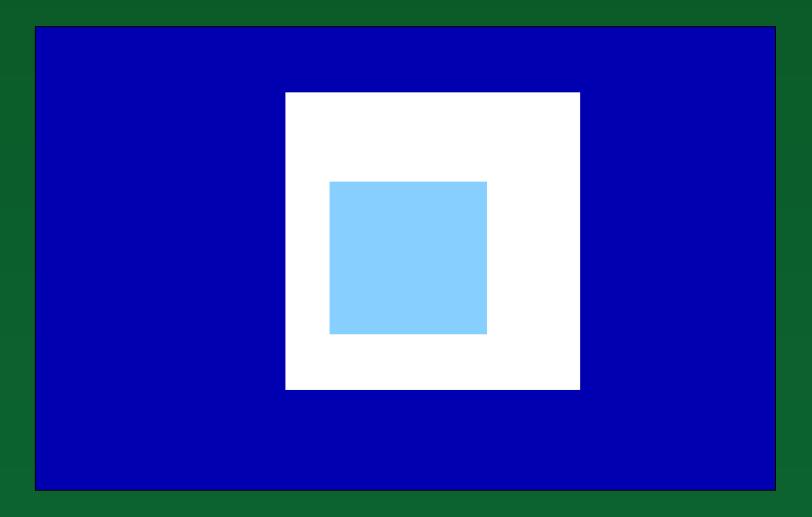
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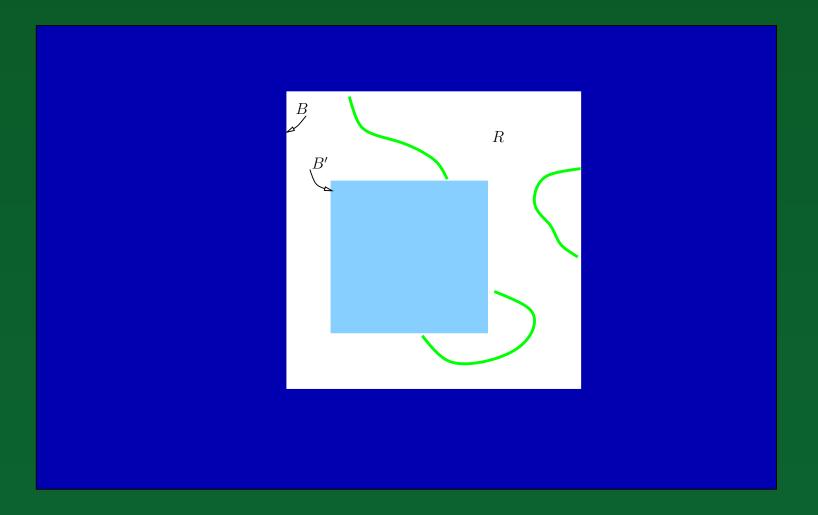


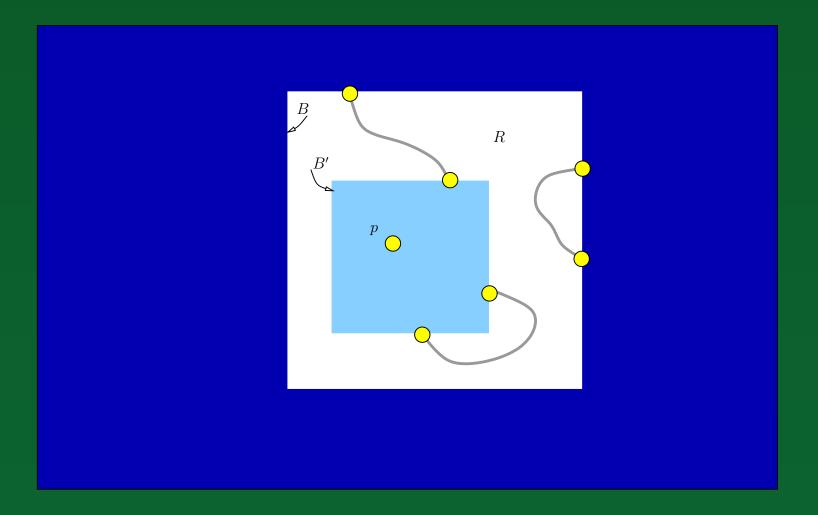




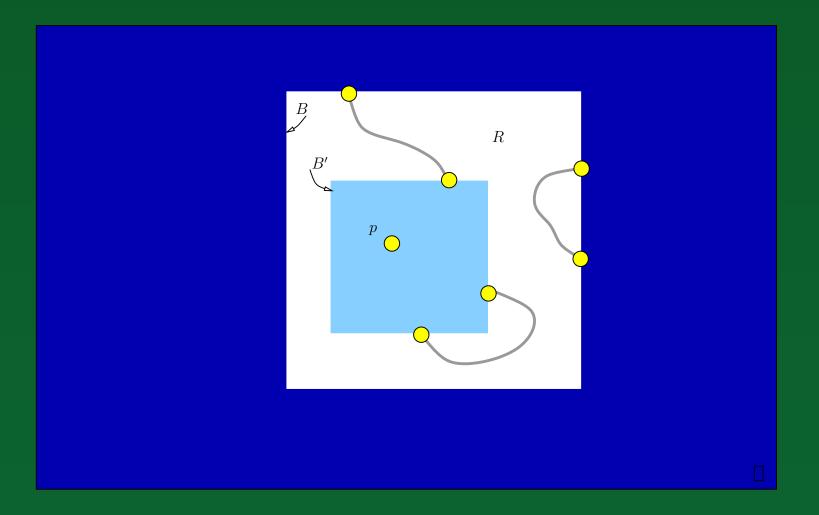


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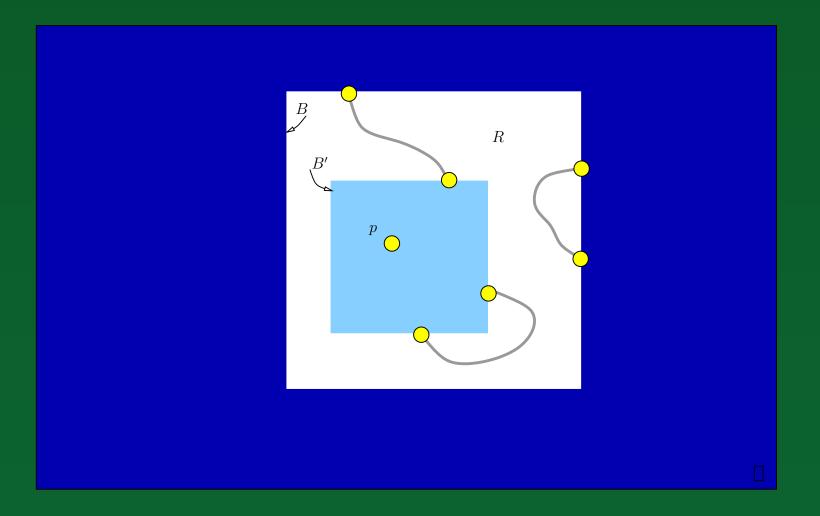
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- * Simpler algorithms
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- * Generality not restricted to algebraic case
- * Algorithm uses, but is decoupled from, root bounds
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 - * (1) Achieve completeness via purely numerical means
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END of TALK

Thanks for Listening!

FURTHER INFORMATION

 "Complete Subdivision Algorithms I: Intersection of Bezier Curves" * SoCG'06, C.Yap

- "Complete Subdivision Algorithms II: Isotopic Meshing of Singular Algebraic Curves"
 * M.Burr, S.W.Choi, B.Galehouse and C.Yap
- "Evaluation-based Root Isolation"
 - * M.Burr, V.Sharma, C.Yap
- "Integral Analysis of Evaluation-based Root Isolation"
 * M.Burr, F.Krahmer, C.Yap

