

ISSAC'04

## Tutorial

### Cylindrical Algebraic Decomposition

Christopher W. Brown

U.S. Naval Academy

<http://www.cs.usna.edu/~wcbrown>

Work supported in part by the National Science Foundation grant CCR-0306440.

# Preface

**Goal:** To compute symbolically with semi-algebraic sets in practice.

**Definition:** The *semi-algebraic sets* in  $\mathbb{R}^n$  are defined recursively by:

1. the set of points satisfying  $p \sigma 0$ , where  $p \in \mathbb{R}[x_1, \dots, x_n]$  and  $\sigma \in \{=, \neq, <, \leq, >, \geq\}$ , is semi-algebraic
2. the complement of a semi-algebraic set, and the union or intersection of finitely many semi-algebraic sets are semi-algebraic.

# Preface

Semi-algebraic sets are usually represented by *Tarski Formulas*.

**Definition:** A *Tarski Formula* is boolean combination of polynomial equalities and inequalities.

Tarski formulas map directly to the definition of semi-algebraic sets:

$$x_1 \neq 0 \wedge x_2^2 - 4x_1x_3 > 0 \quad \longrightarrow \quad x_1 \neq 0 \cap x_2^2 - 4x_1x_3 > 0$$

$$x_1^2 + x_2^2 - 1 \leq 0 \implies x_1 + x_2 \geq 0 \quad \longrightarrow \quad \overline{x_1^2 + x_2^2 - 1 \leq 0} \cup x_1 + x_2 \geq 0$$

So we may view semi-algebraic sets from the standpoint of *geometry* or of *logic*. One viewpoint: the *objects* are geometric, the *representations* are logical.

# Introduction

What is “Cylindrical Algebraic Decomposition”?

*Cylindrical Algebraic Decomposition* (CAD) provides an *explicit* representation for semi-algebraic sets, in which many operations and queries can be carried out easily.

# Tutorial Outline

- *Motivate*
- *Develop intuition*
- *Present CAD fundamentals more rigorously*
- *Present what you need to use and adapt CAD effectively*
- *Analyze some case studies*

# Problems

1. An application from epidemiology
2. Triangles and Euclidean geometry
3. The role of Rolle's theorem

# An Epidemiological Problem

- Andreas Weber and colleagues have applied symbolic tools to epidemiological models.
- We consider the SEIT model, used to model tuberculosis in *van den Dreissche & Watmough, 2002*.
- Uses system of ODEs to model movement of disease through population. Model contains many parameters.
- Question: For what parameters is there an *endemic equalibirum*, i.e. an equilibrium that doesn't have the disease dying out.

# An Epidemiological Model

$$S' = d - dS - \beta_1 IS$$

$$E' = \beta_1 IS + \beta_2 IT - (d + \nu + r_1)E + (1 - q)r_2 I$$

$$I' = \nu E - (d + r_2)I$$

$$T' = -dT + r_1 E + qr_2 I - \beta_2 TI$$

$S$  susceptibles

$E$  exposed (not yet infectious)

$I$  infectious

$T$  under treatment

$\beta_1, \beta_2$  transmission parameters for  $S$  and  $T$

$d$  birth and death rate (assumed equal)

$\nu$  rate of change from exposed to infectious

$r_1, r_2$  treatment rates for  $E$  and  $I$

$q$  fraction of infectious successfully treated

## Endemic equilibrium

- an endemic equilibrium satisfies  $0 = S', E', I', T'$  and  $0 < S, E, I, T$
- for what parameter values is there a solution satisfying  $0 < S, E, I, T$  for:

$$0 = d - dS - \beta_1 IS$$

$$0 = \beta_1 IS + \beta_2 IT - (d + \nu + r_1)E + (1 - q)r_2 I$$

$$0 = \nu E - (d + r_2)I$$

$$0 = -dT + r_1 E + qr_2 I - \beta_2 TI$$

assuming all parameters positive?

## Endemic equilibrium problem

- It's easy to solve for  $E, I$  and  $T$  in terms of  $S$  three of the equations. Substituting the results into the fourth gives  $P = 0$ , where

$$P = -\nu S^2 \beta_1^2 + \beta_1 \nu S^2 \beta_2 + d \beta_1 S r_2 - d^2 \beta_2 S + d^2 \beta_1 S + \beta_1 S r_1 r_2 - d \nu S \beta_2 \\ + \nu \beta_1 S q r_2 - d \beta_2 r_2 S + d \nu S \beta_1 - \beta_1 S \nu \beta_2 + \beta_1 S r_1 d + \beta_2 d^2 + \nu \beta_2 d + \beta_2 d r_2$$

- The condition  $0 < S, E, I, T$  is easily seen to be equivalent to  $0 < S < 1$ .
- So there is an endemic equilibrium for any assignment of positive parameter values for which there is a real value  $S$  such that  $P(S) = 0 \wedge 0 < S < 1$ , i.e.

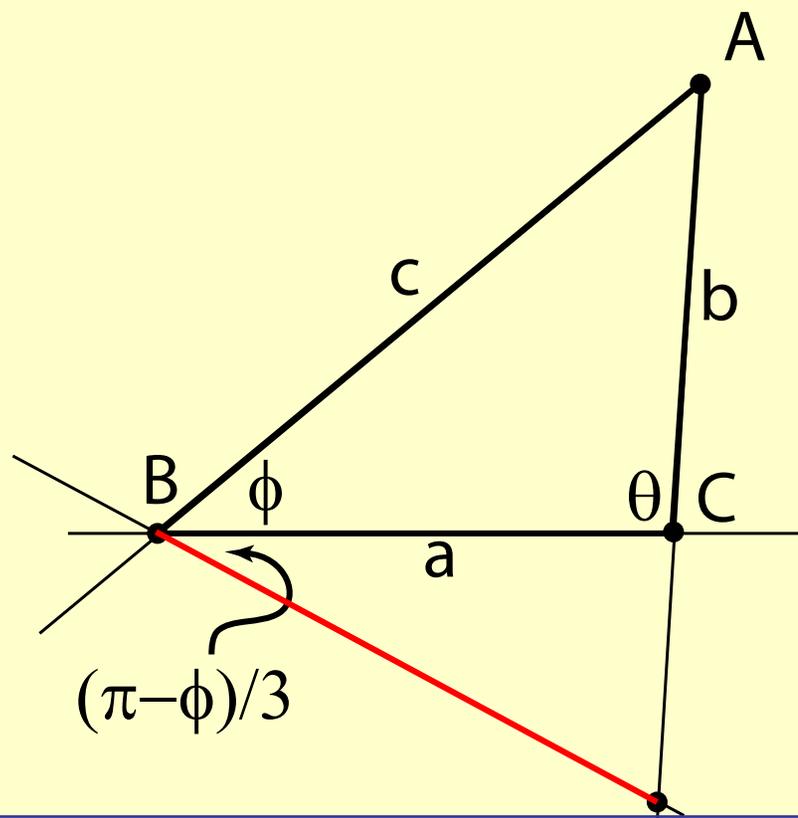
$$\exists S [P(S) = 0 \wedge 0 < S < 1]$$

## External Trisector

Given triangle  $ABC$ , consider the “external trisector of  $B$  with respect to  $A$ ” as defined in the figure.

Clearly, the trisectors exist if and only if  $(\pi - \phi)/3 < \theta$ .

**Problem:** Characterize the existence of the external trisector of  $B$  with respect to  $A$  in terms of the side lengths  $a$ ,  $b$ ,  $c$ .



## Converting from angles to side lengths

Using standard trig identities we see that  $(\pi - \phi)/3 < \theta$  is equivalent to

$$\cos \theta \leq \cos \frac{\pi}{3} \vee \cos \theta > \cos \frac{\pi}{3} \wedge \cos \phi < -4 \cos^3 \theta + 3 \cos \theta$$

Using the law of cosines to describe  $\cos \theta$  and  $\cos \phi$  in terms of the side lengths  $a$ ,  $b$  and  $c$ , and clearing denominators, we get

$$a^2 + b^2 - c^2 < ab \vee a^2 + b^2 - c^2 \geq ab \wedge -c(a^2 + b^2 - c^2)^3 + 3a^2b^2c(a^2 + b^2 - c^2)$$

# The External Trisector Problem

In the triangle with side lengths  $a, b, c$ , the external trisector of  $B$  w.r.t.  $A$  exists if and only if:

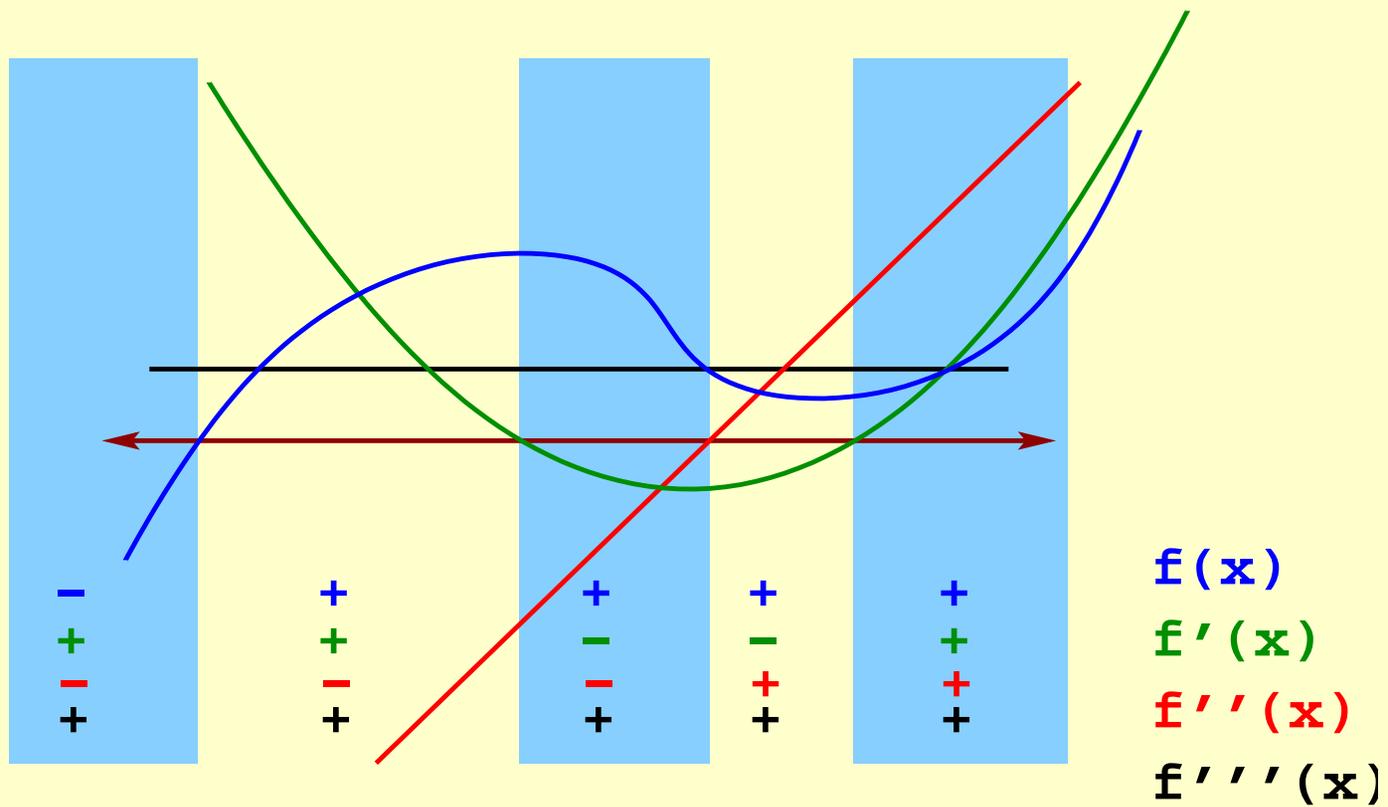
$$a^2 + b^2 - c^2 < ab \vee a^2 + b^2 - c^2 \geq ab \wedge -c (a^2 + b^2 - c^2)^3 + 3a^2 b^2 c (a^2 + b^2 - c^2)$$

**Problem:** Is there a simpler characterization?

# Rolle's Theorem

- Background: from Bruce Anderson's PhD thesis, with Moss Sweedler, Cornell, 1992.
- Rolle's theorem: between any two zeros of  $f(x)$  there is a zero of  $f'(x)$ .
- Generically: from  $x = -\infty$  to  $x = +\infty$  the signs of  $f$  and  $f'$  can be  $\begin{array}{l} f \text{ } + - - + \dots \\ f' \text{ } - - + + \dots \end{array}$ , but cannot be  $\begin{array}{l} f \text{ } + - + \dots \\ f' \text{ } - - - \dots \end{array}$  according to Rolle's theorem.

## Sequence of “Sign-Stacks”



## Sign-stack sequence restrictions

Consider the sign-stack sequence of a generic, monic, univariate polynomial.

1. *monic* implies: the bottom entry is always  $+$ , the first sign-stack is alternating  $+$ 's and  $-$ 's, and the last sign-stack is all  $+$ 's
2. *generic* implies: consecutive sign-stacks differ in only one entry
3. *Rolle's theorem* implies: from one sign-sequence to the next, an entry may only be changed to equal the entry below it

A sequence satisfying these requirements is called *legal*.

## “Rolle’s Theorem Problem”

**Problem:** is every legal sign-stack sequence realizable by a polynomial?

There are lots of legal sign-stack sequences!

degree of $f$	1	2	3	4	5	6	7
# legal sequences	1	2	6	42	1000	114650	77740200

Questions?