Sums of
Squares
Caitlin A.
Lownes

Introduction
Main Idea
Hit and Run
Choosing a direction

Finding the endpoints

Fraction of Nonnegative Polynomials which are Sums of Squares

Caitlin A. Lownes

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$$
\text { July 26, } 2011
$$

## Introduction

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- A polynomial $f \in \mathbb{R}\left[x_{1}, \ldots, x_{n}\right]$ is a sum of squares polynomial (SOS) if $f=\sum_{i=1}^{k} p_{i}^{2}$ for some polynomials $p_{i}$.


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- Parrilo created an algorithm to optimize SOS polynomials in polynomial time via semidefinite programming. Polynomial optimization has applications in many areas such as electrical engineering.


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- Parrilo created an algorithm to optimize SOS polynomials in polynomial time via semidefinite programming.
Polynomial optimization has applications in many areas such as electrical engineering.
- All SOS polynomials are nonnegative. How many nonnegative polynomials are SOS?


## Previous work

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- Hilbert showed that all nonnegative univariate polynomials, quadratic forms, and ternary quartics are sums of squares. For all other cases, there exist nonnegative polynomials which are not SOS.


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- Hilbert showed that all nonnegative univariate polynomials, quadratic forms, and ternary quartics are sums of squares. For all other cases, there exist nonnegative polynomials which are not SOS.
- For nonnegative polynomials of fixed degree, previous results by Blekherman show that the fraction of nonnegative polynomials that are SOS approaches zero as the number of variables increases.


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■ Hilbert showed that all nonnegative univariate polynomials, quadratic forms, and ternary quartics are sums of squares. For all other cases, there exist nonnegative polynomials which are not SOS.

- For nonnegative polynomials of fixed degree, previous results by Blekherman show that the fraction of nonnegative polynomials that are SOS approaches zero as the number of variables increases.
■ What about polynomials in few variables of low degree?


## Cone of Polynomials

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- Focus on bivariate polynomials $f(x, y), \operatorname{deg}_{y}(f)$ and $\operatorname{deg}_{x}(f)$ at most 4:

$$
\begin{gathered}
f(x, y)=c_{1}+c_{2} x+c_{3} x^{2}+c_{4} x^{3}+c_{5} x^{4}+c_{6} y+c_{7} x y+ \\
c_{8} x^{2} y+c_{9} x^{3} y+c_{10} x^{4} y+c_{11} y^{2}+c_{12} x y^{2}+c_{13} x^{2} y^{2}+ \\
c_{14} x^{3} y^{2}+c_{15} x^{4} y^{2}+c_{16} y^{3}+c_{17} x y^{3}+c_{18} x^{2} y^{3}+c_{19} x^{3} y^{3}+ \\
c_{20} x^{4} y^{3}+c_{21} y^{4}+c_{22} x y^{4}+c_{23} x^{2} y^{4}+c_{24} x^{3} y^{4}+c_{25} x^{4} y^{4}
\end{gathered}
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\end{gathered}
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- The set of nonnegative polynomials of this type form a 25 dimensional cone, and the set of sums of squares of polynomials form a cone inside.


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\end{gathered}
$$

■ The set of nonnegative polynomials of this type form a 25 dimensional cone, and the set of sums of squares of polynomials form a cone inside.

- Intersect the cones with the hyperplane of polynomials

$$
\int_{S^{1} \times S^{1}} f \mathrm{~d} \mu=1 .
$$

## Main Idea

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- 24 dimensional convex body of sum of squares polynomials inside convex body of nonnegative polynomials.


## Main Idea

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- 24 dimensional convex body of sum of squares polynomials inside convex body of nonnegative polynomials.
■ Find ratio of the volumes to find the fraction.


## Hit and Run

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Figure: Hit and Run algorithm

## Choosing a direction

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- Begin with a polynomial $f$ in the convex body.


## Choosing a direction

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- Begin with a polynomial $f$ in the convex body.
- Choose a direction $v$ uniformly from the space of polynomials

$$
\int_{S^{1} \times S^{1}} g \mathrm{~d} \mu=0 .
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$$
\int_{S^{1} \times S^{1}} g \mathrm{~d} \mu=0 .
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■ Then,

$$
\int_{S^{1} \times S^{1}}(f+t \cdot v) \mathrm{d} \mu=1 .
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- Begin with a polynomial $f$ in the convex body.

■ Choose a direction $v$ uniformly from the space of polynomials

$$
\int_{S^{1} \times S^{1}} g \mathrm{~d} \mu=0 .
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■ Then,

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\int_{S^{1} \times S^{1}}(f+t \cdot v) \mathrm{d} \mu=1
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■ How do we find the values of $t$ at the endpoints?

## The support $A$ of a polynomial

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## A-discriminant

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■ Given a polynomial $h\left(x_{1}, \ldots, x_{n}\right)$ with support $A$, the $A$-discriminant $\Delta_{A}(h)$ is an irreducible polynomial in the coefficients of $h$ which vanishes when $h$ has a degenerate root (i.e. $\frac{\partial h}{\partial x_{i}}=0$ for all $i$ ).

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- Simple example:

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f(x)=a x^{2}+b x+c, \Delta_{A}(f)=b^{2}-4 a c
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- Simple example:

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f(x)=a x^{2}+b x+c, \Delta_{A}(f)=b^{2}-4 a c
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- A nonnegative polynomial $h$ is on the boundary of our cone when $\Delta_{A}(h)=0$. However, $\Delta_{A}$ is not easy to compute!


## Finding the values of $t$

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- The resultant of polynomials $h_{1}, \ldots, h_{k}$ is an irreducible polynomial in the coefficients of $h_{1}, \ldots, h_{k}$ which vanishes when $h_{1}, \ldots, h_{k}$ have a common root.


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■ The resultant of polynomials $h_{1}, \ldots, h_{k}$ is an irreducible polynomial in the coefficients of $h_{1}, \ldots, h_{k}$ which vanishes when $h_{1}, \ldots, h_{k}$ have a common root.

- The principal $A$-determinant $E_{A}$ is the following resultant:

$$
E_{A}(h)=\operatorname{Res}_{(A, A, A)}\left(h, x \frac{\partial h}{\partial x}, y \frac{\partial h}{\partial y}\right)
$$

When $h$ is bivariate, we know how to compute this resultant.

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When $h$ is bivariate, we know how to compute this resultant.

- $E_{A}$ is a multiple of the $A$-discriminant:

$$
E_{A}(h)=\left(\Delta_{A}(h)\right)\left(\Delta_{-} \Delta_{-} \Delta_{\mid} \Delta_{\mid} \Delta^{2} . \Delta . \Delta . \Delta .\right)
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$$

- To find the values of $t$ at the endpoints, find the roots of $\Delta_{A}(f+t \cdot v)$ closest to 0 !

