

# Optimal Bound on the Combinatorial Complexity of Approximating Polytopes

**Rahul Arya** – University of California, Berkeley

**Sunil Arya** – Hong Kong University of Science and Technology

**Guilherme da Fonseca** – Aix-Marseille Université and LIS

**David Mount** – University of Maryland, College Park

SODA 2020

Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

Construction

ECC

Difficulties

Stratification

New Insights

Overview

Volume Bound

Polar

Volume Bound

Layer Thickness

Construction

Closing

Conclusions

Bibliography

# Introduction

## Preliminaries

### Introduction

### Complexity

### Main Result

### Vertices

### Caps

### Witness-Collector

### Macbeath Regions

## Construction

### ECC

### Difficulties

### Stratification

## New Insights

### Overview

### Volume Bound

### Polar

### Volume Bound

### Layer Thickness

### Construction

## Closing

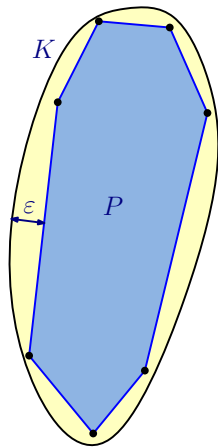
### Conclusions

### Bibliography

## Convex Approximation:

- Given a convex body  $K$  in  $\mathbb{R}^d$  and parameter  $\varepsilon > 0$ , compute a polytope  $P$  of **low combinatorial complexity** that  $\varepsilon$ -approximates  $K$

- $\varepsilon$ -approximate: **Hausdorff distance**  $\leq \varepsilon \cdot \text{diam}(K)$
- Assume w.l.o.g. that  $K$  is **fat** and  $\text{diam}(K) = 1$
- Dimension  $d$  is a constant



# Combinatorial Complexity

Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

Construction

ECC

Difficulties

Stratification

New Insights

Overview

Volume Bound

Polar

Volume Bound

Layer Thickness

Construction

Closing

Conclusions

Bibliography

- **Combinatorial complexity:**

Sum of the number of  $k$ -faces  $k = 0, \dots, d-1$

- Can  $\varepsilon$ -approximate with:

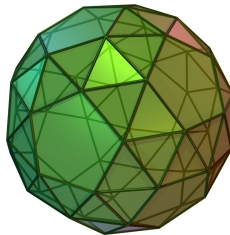
- $O(1/\varepsilon^{(d-1)/2})$  **facets** [Dudley 1974]

- $O(1/\varepsilon^{(d-1)/2})$  **vertices** [Bronshteyn & Ivanov 1974]

Both bounds are **tight**

No known construction achieves both **simultaneously**

- A polytope with  $n$  vertices (facets) can have combinatorial complexity  $\Theta(n^{\lfloor d/2 \rfloor})$
- Dudley's and Bronshteyn-Ivanov's constructions may suffer much higher combinatorial complexity



# Main Result

Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

Construction

ECC

Difficulties

Stratification

New Insights

Overview

Volume Bound

Polar

Volume Bound

Layer Thickness

Construction

Closing

Conclusions

Bibliography

**Question:** Is it possible to  $\varepsilon$ -approximate any convex body by a convex polytope of total combinatorial complexity  $O(1/\varepsilon^{(d-1)/2})$ ?

**Earlier Results:**

- Yes, but the polyhedron might be **nonconvex** [Erickson 2003]
- Yes, but the **curvature** must be bounded [Clarkson 2006]
- Well, almost:  $O\left(\left(\frac{1}{\varepsilon} \log \frac{1}{\varepsilon}\right)^{\frac{d-1}{2}}\right)$  [AFM 2017]

**Main Result:**

Can  $\varepsilon$ -approximate any convex body with total combinatorial complexity  $O\left(\frac{1}{\varepsilon}\right)^{\frac{d-1}{2}}$

# Bronshteyn and Ivanov's Approximation

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

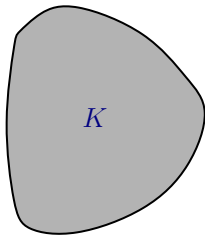
Layer Thickness

Construction

## Closing

Conclusions

Bibliography



- 1 Surround  $K$  by a sphere of radius 2
- 2 Distribute points on the sphere with distance  $\sim \sqrt{\varepsilon}$
- 3 Take the nearest neighbor on  $K$  for each point
- 4 Make  $P$  the **convex hull** of the points

Bronshteyn and Ivanov, 1974:

A convex body  $K$  of diameter 1 can be  $\varepsilon$ -approximated by a polytope  $P$  with  $O(1/\varepsilon^{(d-1)/2})$  **vertices**.

# Bronshteyn and Ivanov's Approximation

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

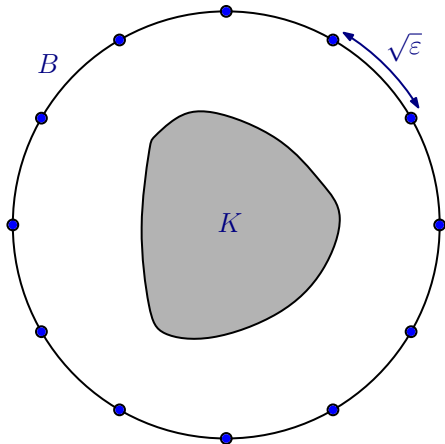
Layer Thickness

Construction

## Closing

Conclusions

Bibliography



- 1 Surround  $K$  by a sphere of radius 2
- 2 Distribute points on the sphere with distance  $\sim \sqrt{\epsilon}$
- 3 Take the nearest neighbor on  $K$  for each point
- 4 Make  $P$  the **convex hull** of the points

Bronshteyn and Ivanov, 1974:

A convex body  $K$  of diameter 1 can be  $\epsilon$ -approximated by a polytope  $P$  with  $O(1/\epsilon^{(d-1)/2})$  **vertices**.

# Bronshteyn and Ivanov's Approximation

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

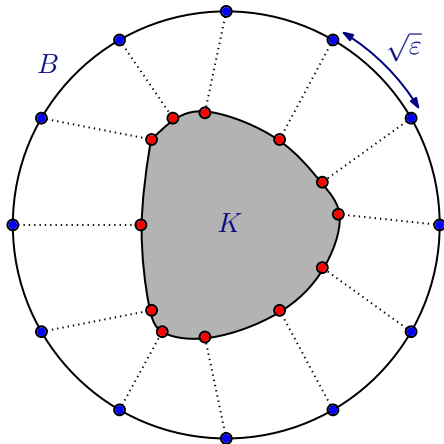
Layer Thickness

Construction

## Closing

Conclusions

Bibliography



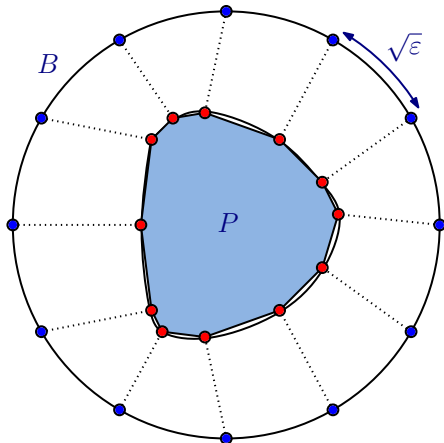
- 1 Surround  $K$  by a sphere of radius 2
- 2 Distribute points on the sphere with distance  $\sim \sqrt{\epsilon}$
- 3 Take the nearest neighbor on  $K$  for each point
- 4 Make  $P$  the **convex hull** of the points

Bronshteyn and Ivanov, 1974:

A convex body  $K$  of diameter 1 can be  $\epsilon$ -approximated by a polytope  $P$  with  $O(1/\epsilon^{(d-1)/2})$  **vertices**.

# Bronshteyn and Ivanov's Approximation

- Preliminaries
- Introduction
- Complexity
- Main Result
- Vertices**
- Caps
- Witness-Collector
- Macbeath Regions
- Construction
- ECC
- Difficulties
- Stratification
- New Insights
- Overview
- Volume Bound
- Polar
- Volume Bound
- Layer Thickness
- Construction
- Closing
- Conclusions
- Bibliography



- 1 Surround  $K$  by a sphere of radius 2
- 2 Distribute points on the sphere with distance  $\sim \sqrt{\epsilon}$
- 3 Take the nearest neighbor on  $K$  for each point
- 4 Make  $P$  the **convex hull** of the points

Bronshteyn and Ivanov, 1974:

A convex body  $K$  of diameter 1 can be  $\epsilon$ -approximated by a polytope  $P$  with  $O(1/\epsilon^{(d-1)/2})$  **vertices**.



# Approximating by Hitting Caps

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

Layer Thickness

Construction

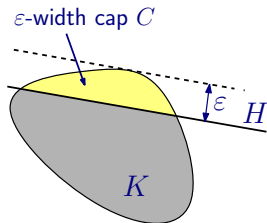
## Closing

Conclusions

Bibliography

Convex approximation is a **covering problem**

- **Cap**: intersection of  $K$  and a halfspace  $H$
- **Width**: measured perpendicular to  $H$



## Hitting Caps

If a point set  $S \subset K$  is a **hitting set** for all  $\epsilon$ -width caps, then  $\text{conv}(S)$  is an  $\epsilon$ -approximation to  $K$

- Bronshteyn & Ivanov:  $|S| = O(1/\epsilon^{(d-1)/2})$  possible
- Total complexity may be much larger
- To bound the total complexity, we need more **structure**

# Approximating by Hitting Caps

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

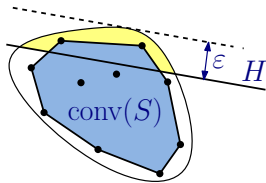
Layer Thickness

Construction

## Closing

Conclusions

Bibliography



Convex approximation is a **covering problem**

- **Cap**: intersection of  $K$  and a halfspace  $H$
- **Width**: measured perpendicular to  $H$

## Hitting Caps

If a point set  $S \subset K$  is a **hitting set** for all  $\epsilon$ -width caps, then  $\text{conv}(S)$  is an  $\epsilon$ -approximation to  $K$

- Bronshteyn & Ivanov:  $|S| = O(1/\epsilon^{(d-1)/2})$  possible
- Total complexity may be much larger
- To bound the total complexity, we need more **structure**

# Approximating by Hitting Caps

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

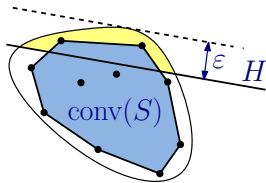
Layer Thickness

Construction

## Closing

Conclusions

Bibliography



Convex approximation is a **covering problem**

- **Cap**: intersection of  $K$  and a halfspace  $H$
- **Width**: measured perpendicular to  $H$

## Hitting Caps

If a point set  $S \subset K$  is a **hitting set** for all  $\epsilon$ -width caps, then  $\text{conv}(S)$  is an  $\epsilon$ -approximation to  $K$

- Bronshteyn & Ivanov:  $|S| = O(1/\epsilon^{(d-1)/2})$  possible
- Total complexity may be much larger
- To bound the total complexity, we need more **structure**

# The Witness-Collector Method

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

Layer Thickness

Construction

## Closing

Conclusions

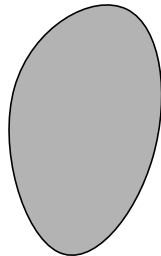
Bibliography

We identify two sets of regions:

- $\mathcal{W}$ : witnesses
- $\mathcal{C}$ : collectors, one per witness

such that:

- (1) Each witness contributes **one point** to  $S$
- (2) Any halfspace  $H$  is either:
  - **Deep**: contains a witness, or
  - **Shallow**:  $H \cap K$  is contained within a collector
- (3) Each collector contains  $O(1)$  points of  $S$



Witness-Collector Complexity Bound [Devillers et al. 2013]

Given a set of witnesses and collectors satisfying the above properties, the combinatorial complexity of the  $\text{conv}(S)$  is  $O(|\mathcal{C}|)$ .

# The Witness-Collector Method

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

Layer Thickness

Construction

## Closing

Conclusions

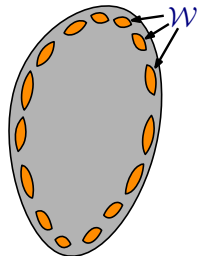
Bibliography

We identify two sets of regions:

- $\mathcal{W}$ : witnesses
- $\mathcal{C}$ : collectors, one per witness

such that:

- (1) Each witness contributes **one point** to  $S$
- (2) Any halfspace  $H$  is either:
  - **Deep**: contains a witness, or
  - **Shallow**:  $H \cap K$  is contained within a collector
- (3) Each collector contains  $O(1)$  points of  $S$



Witness-Collector Complexity Bound [Devillers et al. 2013]

Given a set of witnesses and collectors satisfying the above properties, the combinatorial complexity of the  $\text{conv}(S)$  is  $O(|\mathcal{C}|)$ .

# The Witness-Collector Method

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

Layer Thickness

Construction

## Closing

Conclusions

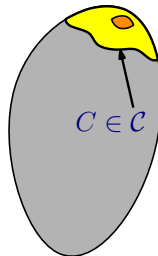
Bibliography

We identify two sets of regions:

- $\mathcal{W}$ : witnesses
- $\mathcal{C}$ : collectors, one per witness

such that:

- (1) Each witness contributes **one point** to  $S$
- (2) Any halfspace  $H$  is either:
  - **Deep**: contains a witness, or
  - **Shallow**:  $H \cap K$  is contained within a collector
- (3) Each collector contains  $O(1)$  points of  $S$



Witness-Collector Complexity Bound [Devillers et al. 2013]

Given a set of witnesses and collectors satisfying the above properties, the combinatorial complexity of the  $\text{conv}(S)$  is  $O(|\mathcal{C}|)$ .

# The Witness-Collector Method

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

Construction

ECC

Difficulties

Stratification

New Insights

Overview

Volume Bound

Polar

Volume Bound

Layer Thickness

Construction

Closing

Conclusions

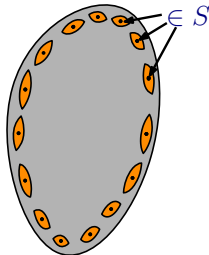
Bibliography

We identify two sets of regions:

- $\mathcal{W}$ : witnesses
- $\mathcal{C}$ : collectors, one per witness

such that:

- (1) Each witness contributes **one point** to  $S$
- (2) Any halfspace  $H$  is either:
  - **Deep**: contains a witness, or
  - **Shallow**:  $H \cap K$  is contained within a collector
- (3) Each collector contains  $O(1)$  points of  $S$



Witness-Collector Complexity Bound [Devillers et al. 2013]

Given a set of witnesses and collectors satisfying the above properties, the combinatorial complexity of the  $\text{conv}(S)$  is  $O(|\mathcal{C}|)$ .

# The Witness-Collector Method

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

Layer Thickness

Construction

## Closing

Conclusions

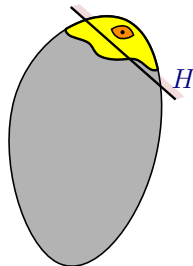
Bibliography

We identify two sets of regions:

- $\mathcal{W}$ : witnesses
- $\mathcal{C}$ : collectors, one per witness

such that:

- (1) Each witness contributes **one point** to  $S$
- (2) Any halfspace  $H$  is either:
  - **Deep**: contains a witness, or
  - **Shallow**:  $H \cap K$  is contained within a collector
- (3) Each collector contains  $O(1)$  points of  $S$



Witness-Collector Complexity Bound [Devillers et al. 2013]

Given a set of witnesses and collectors satisfying the above properties, the combinatorial complexity of the  $\text{conv}(S)$  is  $O(|\mathcal{C}|)$ .



# The Witness-Collector Method

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

Layer Thickness

Construction

## Closing

Conclusions

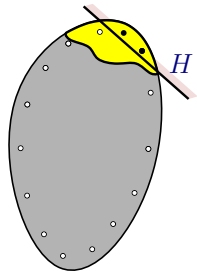
Bibliography

We identify two sets of regions:

- $\mathcal{W}$ : witnesses
- $\mathcal{C}$ : collectors, one per witness

such that:

- (1) Each witness contributes **one point** to  $S$
- (2) Any halfspace  $H$  is either:
  - **Deep**: contains a witness, or
  - **Shallow**:  $H \cap K$  is contained within a collector
- (3) Each collector contains  $O(1)$  points of  $S$



Witness-Collector Complexity Bound [Devillers et al. 2013]

Given a set of witnesses and collectors satisfying the above properties, the combinatorial complexity of the  $\text{conv}(S)$  is  $O(|\mathcal{C}|)$ .

# The Witness-Collector Method

## Preliminaries

### Introduction

### Complexity

### Main Result

### Vertices

### Caps

### Witness-Collector

### Macbeath Regions

## Construction

### ECC

### Difficulties

### Stratification

## New Insights

### Overview

### Volume Bound

### Polar

### Volume Bound

### Layer Thickness

### Construction

## Closing

### Conclusions

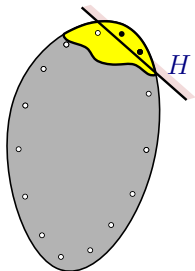
### Bibliography

We identify two sets of regions:

- $\mathcal{W}$ : witnesses
- $\mathcal{C}$ : collectors, one per witness

such that:

- (1) Each witness contributes **one point** to  $S$
- (2) Any halfspace  $H$  is either:
  - **Deep**: contains a witness, or
  - **Shallow**:  $H \cap K$  is contained within a collector
- (3) Each collector contains  $O(1)$  points of  $S$



Witness-Collector Complexity Bound [Devillers et al. 2013]

Given a set of witnesses and collectors satisfying the above properties, the combinatorial complexity of the  $\text{conv}(S)$  is  $O(|\mathcal{C}|)$ .

# The Witness-Collector Method

## Preliminaries

### Introduction

### Complexity

### Main Result

### Vertices

### Caps

### Witness-Collector

### Macbeath Regions

## Construction

### ECC

### Difficulties

### Stratification

## New Insights

### Overview

### Volume Bound

### Polar

### Volume Bound

### Layer Thickness

### Construction

## Closing

### Conclusions

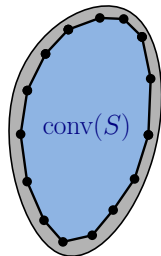
### Bibliography

We identify two sets of regions:

- $\mathcal{W}$ : witnesses
- $\mathcal{C}$ : collectors, one per witness

such that:

- (1) Each witness contributes **one point** to  $S$
- (2) Any halfspace  $H$  is either:
  - **Deep**: contains a witness, or
  - **Shallow**:  $H \cap K$  is contained within a collector
- (3) Each collector contains  $O(1)$  points of  $S$



## Witness-Collector Complexity Bound [Devillers et al. 2013]

Given a set of witnesses and collectors satisfying the above properties, the combinatorial complexity of the  $\text{conv}(S)$  is  $O(|\mathcal{C}|)$ .

# Witness-Collector Properties

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

Layer Thickness

Construction

## Closing

Conclusions

Bibliography

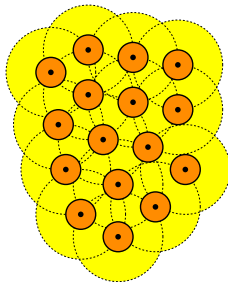
## Desirable properties:

- **Packing:** Witnesses are disjoint (for packing arguments)
- **Covering:** Collectors cover  $K$ 's boundary
- **Similarity:** Small expansion of witness covers its collector
- **Locality:** If two potential witnesses overlap, a constant factor expansion of one encloses the other

How about  $\varepsilon$ -caps (and their expansions)?

Unfortunately, caps are **not local**

$\Rightarrow$  No constant expansion of  $W_1$  will contain  $W_2$



# Witness-Collector Properties

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

Layer Thickness

Construction

## Closing

Conclusions

Bibliography

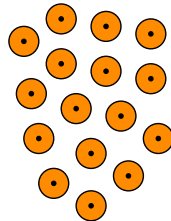
Desirable properties:

- **Packing:** Witnesses are disjoint (for packing arguments)
- **Covering:** Collectors cover  $K$ 's boundary
- **Similarity:** Small expansion of witness covers its collector
- **Locality:** If two potential witnesses overlap, a constant factor expansion of one encloses the other

How about  $\varepsilon$ -caps (and their expansions)?

Unfortunately, caps are **not local**

$\Rightarrow$  No constant expansion of  $W_1$  will contain  $W_2$



# Witness-Collector Properties

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

Layer Thickness

Construction

## Closing

Conclusions

Bibliography

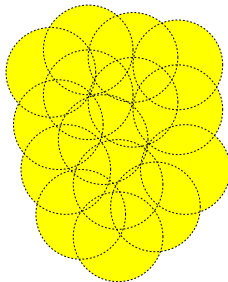
Desirable properties:

- **Packing:** Witnesses are disjoint (for packing arguments)
- **Covering:** Collectors cover  $K$ 's boundary
- **Similarity:** Small expansion of witness covers its collector
- **Locality:** If two potential witnesses overlap, a constant factor expansion of one encloses the other

How about  $\varepsilon$ -caps (and their expansions)?

Unfortunately, caps are **not local**

$\Rightarrow$  No constant expansion of  $W_1$  will contain  $W_2$



# Witness-Collector Properties

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

Layer Thickness

Construction

## Closing

Conclusions

Bibliography

Desirable properties:

- **Packing:** Witnesses are disjoint (for packing arguments)
- **Covering:** Collectors cover  $K$ 's boundary
- **Similarity:** Small expansion of witness covers its collector
- **Locality:** If two potential witnesses overlap, a constant factor expansion of one encloses the other



How about  $\varepsilon$ -caps (and their expansions)?

Unfortunately, caps are **not local**

$\Rightarrow$  No constant expansion of  $W_1$  will contain  $W_2$

# Witness-Collector Properties

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

Layer Thickness

Construction

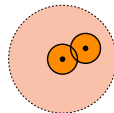
## Closing

Conclusions

Bibliography

Desirable properties:

- **Packing:** Witnesses are disjoint (for packing arguments)
- **Covering:** Collectors cover  $K$ 's boundary
- **Similarity:** Small expansion of witness covers its collector
- **Locality:** If two potential witnesses overlap, a constant factor expansion of one encloses the other



How about  $\varepsilon$ -caps (and their expansions)?

Unfortunately, caps are **not local**

$\Rightarrow$  No constant expansion of  $W_1$  will contain  $W_2$



# Witness-Collector Properties

## Preliminaries

### Introduction

### Complexity

### Main Result

### Vertices

### Caps

### Witness-Collector

### Macbeath Regions

## Construction

### ECC

### Difficulties

### Stratification

## New Insights

### Overview

### Volume Bound

### Polar

### Volume Bound

### Layer Thickness

### Construction

## Closing

### Conclusions

### Bibliography

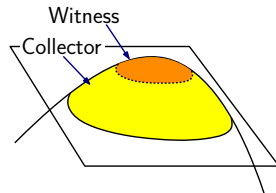
Desirable properties:

- **Packing:** Witnesses are disjoint (for packing arguments)
- **Covering:** Collectors cover  $K$ 's boundary
- **Similarity:** Small expansion of witness covers its collector
- **Locality:** If two potential witnesses overlap, a constant factor expansion of one encloses the other

How about  $\varepsilon$ -caps (and their expansions)?

Unfortunately, caps are **not local**

$\Rightarrow$  No constant expansion of  $W_1$  will contain  $W_2$



# Witness-Collector Properties

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

Layer Thickness

Construction

## Closing

Conclusions

Bibliography

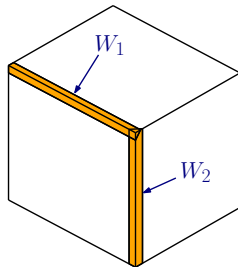
Desirable properties:

- **Packing:** Witnesses are disjoint (for packing arguments)
- **Covering:** Collectors cover  $K$ 's boundary
- **Similarity:** Small expansion of witness covers its collector
- **Locality:** If two potential witnesses overlap, a constant factor expansion of one encloses the other

How about  $\varepsilon$ -caps (and their expansions)?

Unfortunately, caps are **not local**

$\Rightarrow$  No constant expansion of  $W_1$  will contain  $W_2$



# Witness-Collector Properties

## Preliminaries

### Introduction

### Complexity

### Main Result

### Vertices

### Caps

### Witness-Collector

### Macbeath Regions

## Construction

### ECC

### Difficulties

### Stratification

## New Insights

### Overview

### Volume Bound

### Polar

### Volume Bound

### Layer Thickness

### Construction

## Closing

### Conclusions

### Bibliography

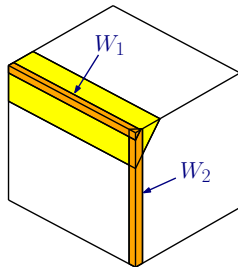
Desirable properties:

- **Packing:** Witnesses are disjoint (for packing arguments)
- **Covering:** Collectors cover  $K$ 's boundary
- **Similarity:** Small expansion of witness covers its collector
- **Locality:** If two potential witnesses overlap, a constant factor expansion of one encloses the other

How about  $\varepsilon$ -caps (and their expansions)?

Unfortunately, caps are **not local**

$\Rightarrow$  No constant expansion of  $W_1$  will contain  $W_2$



# Macbeath Regions - Definition

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

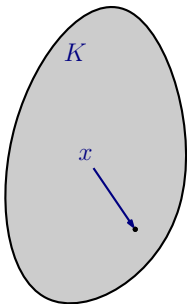
Layer Thickness

Construction

## Closing

Conclusions

Bibliography



## Macbeath Regions [Macbeath 1952]

Given a convex body  $K$  and  $x \in K$ :

$$M(x) = K \cap (2x - K)$$

- $M(x)$ : largest centrally symmetric convex body inside  $K$ , centered at  $x$
- Let  $M^\lambda(x)$  be a scaling of  $M(x)$  by a factor  $\lambda$
- Let  $M'(x) = M^\lambda(x)$  for a small constant  $\lambda$

# Macbeath Regions - Definition

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

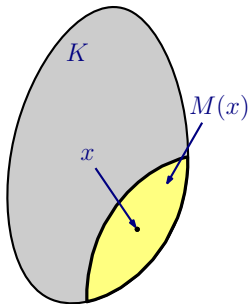
Layer Thickness

Construction

## Closing

Conclusions

Bibliography



## Macbeath Regions [Macbeath 1952]

Given a convex body  $K$  and  $x \in K$ :

$$M(x) = K \cap (2x - K)$$

- $M(x)$ : **largest centrally symmetric** convex body inside  $K$ , centered at  $x$
- Let  $M^\lambda(x)$  be a scaling of  $M(x)$  by a factor  $\lambda$
- Let  $M'(x) = M^\lambda(x)$  for a small constant  $\lambda$

# Macbeath Regions - Definition

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

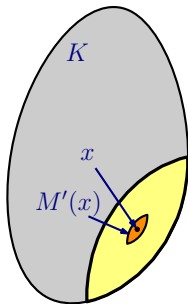
Layer Thickness

Construction

## Closing

Conclusions

Bibliography



## Macbeath Regions [Macbeath 1952]

Given a convex body  $K$  and  $x \in K$ :

$$M(x) = K \cap (2x - K)$$

- $M(x)$ : **largest centrally symmetric** convex body inside  $K$ , centered at  $x$
- Let  $M^\lambda(x)$  be a scaling of  $M(x)$  by a factor  $\lambda$
- Let  $M'(x) = M^\lambda(x)$  for a small constant  $\lambda$

# Macbeath Regions - Properties

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

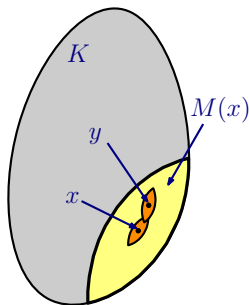
Layer Thickness

Construction

## Closing

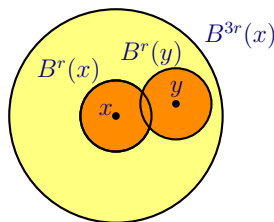
Conclusions

Bibliography



- **Locality:** For  $\lambda \leq 1/5$ , if  $M^\lambda(x)$  and  $M^\lambda(y)$  overlap, then  $M^\lambda(y) \subseteq M^{4\lambda}(x)$

(Like balls of radius  $r$ :  
 $B^r(x)$  and  $B^r(y)$  overlap,  
then  $B^r(y) \subseteq B^{3r}(x)$ )



- **Similarity:**  $M^{3d}(x)$  covers  $x$ 's minimum volume cap
- **Approximation:** If  $\lambda \leq 1$  and  $x$  is at distance  $\varepsilon$  from  $\partial K$ , then for all  $y \in M^\lambda(x)$ :  $y$  is at distance  $O(\varepsilon)$  from  $\partial K$

# Macbeath Regions - Properties

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

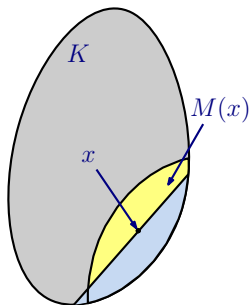
Layer Thickness

Construction

## Closing

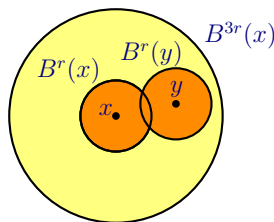
Conclusions

Bibliography



- **Locality:** For  $\lambda \leq 1/5$ , if  $M^\lambda(x)$  and  $M^\lambda(y)$  overlap, then  $M^\lambda(y) \subseteq M^{4\lambda}(x)$

(Like balls of radius  $r$ :  
 $B^r(x)$  and  $B^r(y)$  overlap,  
then  $B^r(y) \subseteq B^{3r}(x)$ )



- **Similarity:**  $M^{3d}(x)$  covers  $x$ 's minimum volume cap
- **Approximation:** If  $\lambda \leq 1$  and  $x$  is at distance  $\varepsilon$  from  $\partial K$ , then for all  $y \in M^\lambda(x)$ :  $y$  is at distance  $O(\varepsilon)$  from  $\partial K$



# Macbeath Regions - Properties

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

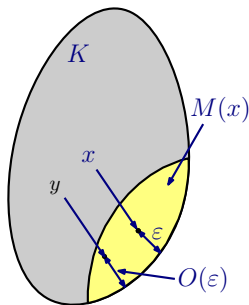
Layer Thickness

Construction

## Closing

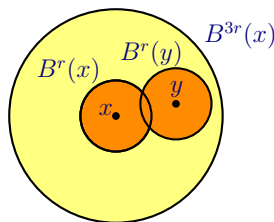
Conclusions

Bibliography



- **Locality:** For  $\lambda \leq 1/5$ , if  $M^\lambda(x)$  and  $M^\lambda(y)$  overlap, then  $M^\lambda(y) \subseteq M^{4\lambda}(x)$

(Like balls of radius  $r$ :  
 $B^r(x)$  and  $B^r(y)$  overlap,  
then  $B^r(y) \subseteq B^{3r}(x)$ )



- **Similarity:**  $M^{3d}(x)$  covers  $x$ 's minimum volume cap
- **Approximation:** If  $\lambda \leq 1$  and  $x$  is at distance  $\epsilon$  from  $\partial K$ , then for all  $y \in M^\lambda(x)$ :  $y$  is at distance  $O(\epsilon)$  from  $\partial K$

# Cardinality Bound

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

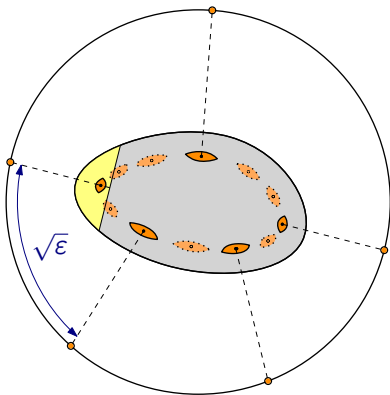
Layer Thickness

Construction

## Closing

Conclusions

Bibliography



## Economical Cap Cover [AFM 2017]

Let  $K \subset \mathbb{R}^d$  be a convex body of diameter 1. A set of disjoint Macbeath regions  $M'(x)$  placed at points  $x$  at distance  $\epsilon$  from the boundary of  $K$  has  $O(1/\epsilon^{(d-1)/2})$  Macbeath regions.

Proof strategy:

- Prune Macbeath regions that are too close to each other (by increasing volume)
- A constant fraction of the regions are pruned
- Project the centers of the regions onto the Dudley ball (perpendicularly to the corresponding cap)
- Show that the pairwise distance in the Dudley ball is at least  $\sqrt{\epsilon}$

# Economical Cap Covering (ECC)

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

Layer Thickness

Construction

## Closing

Conclusions

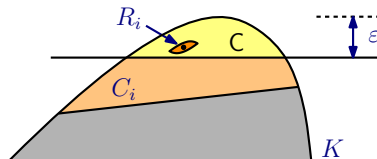
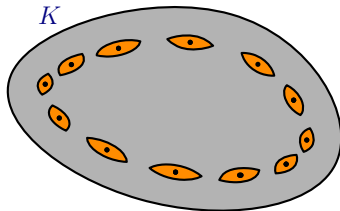
Bibliography

Can we use Macbeath regions as a basis for Witness-Collector?

## Economical Cap Cover [AFM 2017]

Given  $K$  and  $\varepsilon > 0$ , there exists:

- Macbeath regions  $R_1, \dots, R_k$ , for  $k = O(1/\varepsilon^{(d-1)/2})$
- Caps  $C_1, \dots, C_k$  of width  $\Theta(\varepsilon)$
- For every cap  $C$  of  $K$ , there is  $i$  such that either:
  - **Deep:**  $R_i \subseteq C$
  - **Shallow:**  $C \subseteq C_i$



# Are we there yet?

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

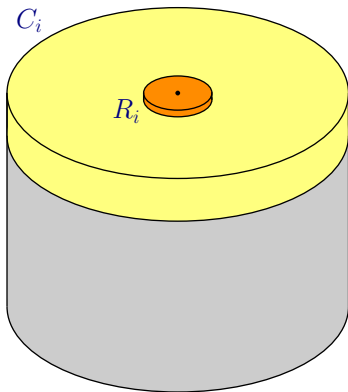
Layer Thickness

Construction

## Closing

Conclusions

Bibliography



- This suggests a **Witness-Collector** system:
  - Witnesses:  $R_i$
  - Collectors:  $C_i$
  - Points: Centers of the  $R_i$ 's
- Witness-Collector conditions (1) and (2) are **satisfied**
- But condition (3):  
*Each collector contains  $O(1)$  points of  $S$*   
... **does not hold**

# Are we there yet?

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

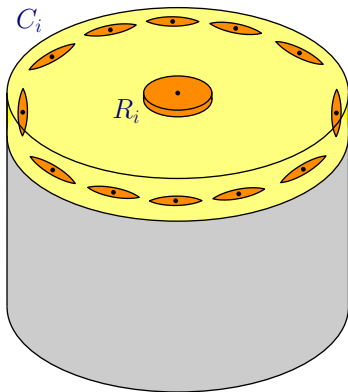
Layer Thickness

Construction

## Closing

Conclusions

Bibliography



- This suggests a **Witness-Collector** system:
  - Witnesses:  $R_i$
  - Collectors:  $C_i$
  - Points: Centers of the  $R_i$ 's
- Witness-Collector conditions (1) and (2) are **satisfied**
- But condition (3):  
*Each collector contains  $O(1)$  points of  $S$*   
... **does not hold**

# Stratified Construction

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

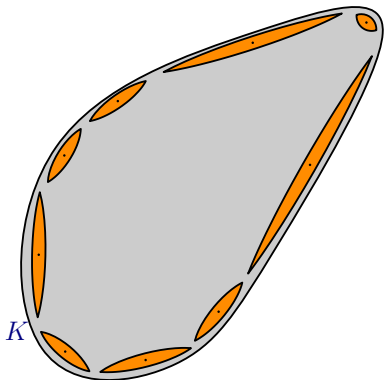
Layer Thickness

Construction

## Closing

Conclusions

Bibliography



Our earlier (suboptimal) solution [AFM 2017]:

- Partition witnesses in  $O(\log \frac{1}{\varepsilon})$  layers by volume
- Larger-volume regions in outer layers
- Why it works?
  - Witness overlaps collector  $\Rightarrow$  high volume
  - Apply a packing argument to bound them
- But, error increases from  $\varepsilon$  to  $O(\varepsilon \log \frac{1}{\varepsilon})$
- Number of regions grows to

$$O\left(\left(\frac{1}{\varepsilon} \log \frac{1}{\varepsilon}\right)^{\frac{d-1}{2}}\right)$$

# Stratified Construction

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

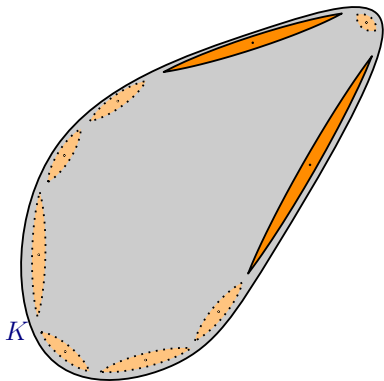
Layer Thickness

Construction

## Closing

Conclusions

Bibliography



Our earlier (suboptimal) solution [AFM 2017]:

- Partition witnesses in  $O(\log \frac{1}{\varepsilon})$  layers by volume
- Larger-volume regions in outer layers
- Why it works?
  - Witness overlaps collector  $\Rightarrow$  high volume
  - Apply a packing argument to bound them
- But, error increases from  $\varepsilon$  to  $O(\varepsilon \log \frac{1}{\varepsilon})$
- Number of regions grows to

$$O\left(\left(\frac{1}{\varepsilon} \log \frac{1}{\varepsilon}\right)^{\frac{d-1}{2}}\right)$$

# Stratified Construction

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

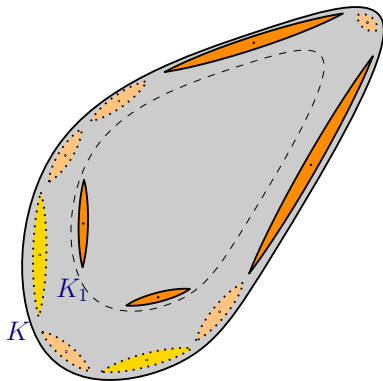
Layer Thickness

Construction

## Closing

Conclusions

Bibliography



Our earlier (suboptimal) solution [AFM 2017]:

- Partition witnesses in  $O(\log \frac{1}{\varepsilon})$  layers by volume
- Larger-volume regions in outer layers
- Why it works?
  - Witness overlaps collector  $\Rightarrow$  high volume
  - Apply a packing argument to bound them
- But, error increases from  $\varepsilon$  to  $O(\varepsilon \log \frac{1}{\varepsilon})$
- Number of regions grows to

$$O\left(\left(\frac{1}{\varepsilon} \log \frac{1}{\varepsilon}\right)^{\frac{d-1}{2}}\right)$$



# Stratified Construction

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

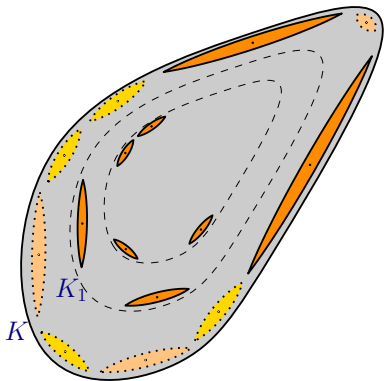
Layer Thickness

Construction

## Closing

Conclusions

Bibliography



Our earlier (suboptimal) solution [AFM 2017]:

- Partition witnesses in  $O(\log \frac{1}{\varepsilon})$  layers by volume
- Larger-volume regions in outer layers
- Why it works?
  - Witness overlaps collector  $\Rightarrow$  high volume
  - Apply a packing argument to bound them
- But, error increases from  $\varepsilon$  to  $O(\varepsilon \log \frac{1}{\varepsilon})$
- Number of regions grows to

$$O\left(\left(\frac{1}{\varepsilon} \log \frac{1}{\varepsilon}\right)^{\frac{d-1}{2}}\right)$$

# Stratified Construction

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

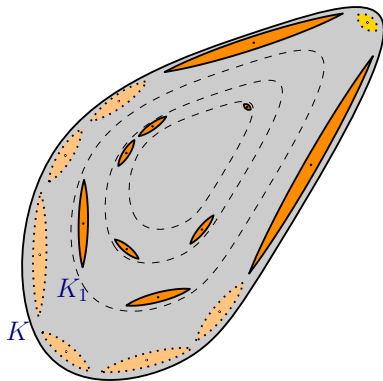
Layer Thickness

Construction

## Closing

Conclusions

Bibliography



Our earlier (suboptimal) solution [AFM 2017]:

- Partition witnesses in  $O(\log \frac{1}{\varepsilon})$  layers by volume
- Larger-volume regions in outer layers
- Why it works?
  - Witness overlaps collector  $\Rightarrow$  high volume
  - Apply a packing argument to bound them
- But, error increases from  $\varepsilon$  to  $O(\varepsilon \log \frac{1}{\varepsilon})$
- Number of regions grows to

$$O\left(\left(\frac{1}{\varepsilon} \log \frac{1}{\varepsilon}\right)^{\frac{d-1}{2}}\right)$$

# Stratified Construction

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

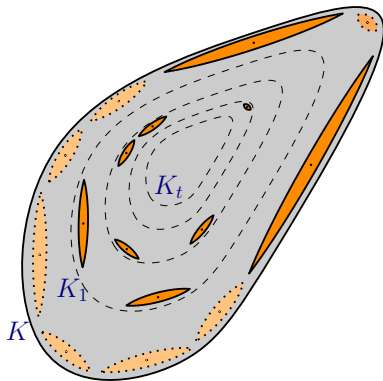
Layer Thickness

Construction

## Closing

Conclusions

Bibliography



Our earlier (suboptimal) solution [AFM 2017]:

- Partition witnesses in  $O(\log \frac{1}{\varepsilon})$  layers by volume
- Larger-volume regions in outer layers
- Why it works?
  - Witness overlaps collector  $\Rightarrow$  high volume
  - Apply a packing argument to bound them
- But, error increases from  $\varepsilon$  to  $O(\varepsilon \log \frac{1}{\varepsilon})$
- Number of regions grows to

$$O\left(\left(\frac{1}{\varepsilon} \log \frac{1}{\varepsilon}\right)^{\frac{d-1}{2}}\right)$$

Our optimal construction is based primarily on two new ideas:

- **Volume-sensitive bound** on the number of Macbeath regions in the ECC
- A **volume-inverting correspondence** between Macbeath regions in  $K$  and its polar  $K^*$

# Volume-Sensitive Bound on Macbeath Regions

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

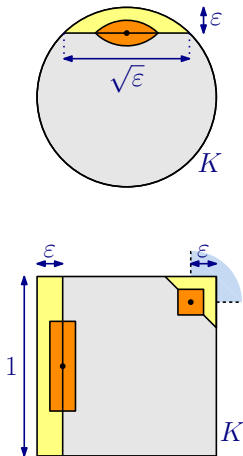
Layer Thickness

Construction

## Closing

Conclusions

Bibliography



Number of Macbeath regions **differs by volume**:

- Ball has  $\Theta(1/\epsilon^{(d-1)/2})$  regions of volume  $\Theta(\epsilon^{(d+1)/2})$
- Volumes of Macbeath regions vary from  $\Theta(\epsilon^d)$  to  $\Theta(\epsilon)$
- Since  $K$  has unit diameter, the portion of  $K$  within  $\epsilon$  of its boundary has volume  $\Theta(\epsilon)$
- By a **packing argument**, the number of disjoint Macbeath regions of volume at least  $v$  is  $O(\epsilon/v)$
- What about Macbeath regions of **small volume**?

# Macbeath Regions in the Polar

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

Layer Thickness

Construction

## Closing

Conclusions

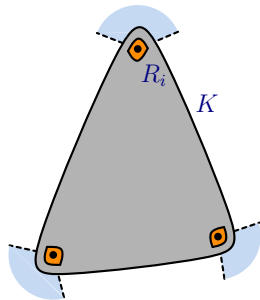
Bibliography

A packing argument **cannot** be used to bound the number of small Macbeath regions (volume from  $\varepsilon^d$  up to  $\varepsilon^{(d+1)/2}$ )

**But still, there cannot be many of them!**

- Consider a Macbeath region of volume  $O(\varepsilon^d)$
- Such a tiny Macbeath region must be close to a portion of  $K$ 's boundary with **high curvature**
- By convexity,  $K$ 's boundary **curvature** is **bounded**
- Therefore, the number of such Macbeath regions is  $O(1)$

How to **generalize** this intuition to all small Macbeath regions?



# Polar Body

## Preliminaries

Introduction  
Complexity  
Main Result  
Vertices  
Caps  
Witness-Collector  
Macbeath Regions

## Construction

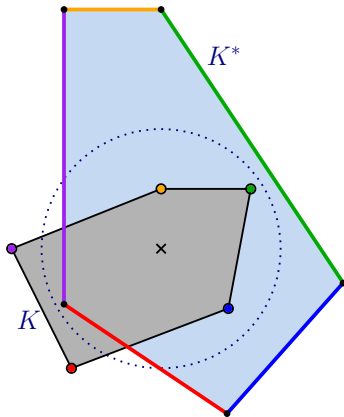
ECC  
Difficulties  
Stratification

## New Insights

Overview  
Volume Bound  
**Polar**  
Volume Bound  
Layer Thickness  
Construction

## Closing

Conclusions  
Bibliography



- $K$ : convex body
- Polar  $K^*$ :  
points  $p$  such that  $p \cdot q \leq 1$  for  $q \in K$
- High curvature maps to low curvature
- If origin is well-centered, then  
the product of the volumes (Mahler volume) is  
between two constants
- In  $K$ : extreme point in direction  $v$
- In  $K^*$ : ray shooting in direction  $v$   
from origin

# Polar Body

## Preliminaries

Introduction  
Complexity  
Main Result  
Vertices  
Caps  
Witness-Collector  
Macbeath Regions

## Construction

ECC  
Difficulties  
Stratification

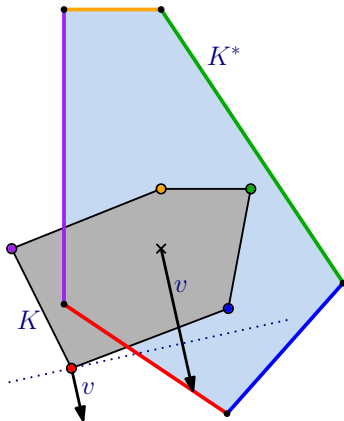
## New Insights

Overview  
Volume Bound  
Polar

Volume Bound  
Layer Thickness  
Construction

## Closing

Conclusions  
Bibliography



- $K$ : convex body
- Polar  $K^*$ :  
points  $p$  such that  $p \cdot q \leq 1$  for  $q \in K$
- High curvature maps to low curvature
- If origin is well-centered, then  
the product of the volumes (Mahler volume) is  
between two constants
- In  $K$ : extreme point in direction  $v$
- In  $K^*$ : ray shooting in direction  $v$   
from origin



# Caps in the Polar

## Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

## Construction

ECC

Difficulties

Stratification

## New Insights

Overview

Volume Bound

Polar

Volume Bound

Layer Thickness

Construction

## Closing

Conclusions

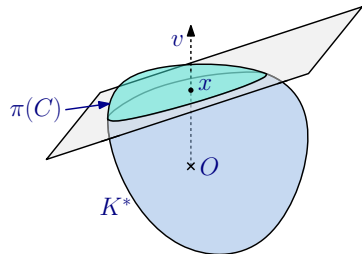
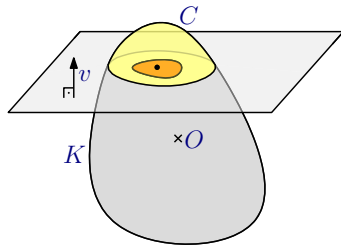
Bibliography

Correspondence between caps in  $K$  and  $K^*$ :

- Let  $C$  be an  $\varepsilon$ -width cap of  $K$  with base orthogonal to  $v$   
(**extremal** query in direction  $v$  with error  $\varepsilon$ )
- In  $K^*$ , shoot a ray in direction  $v$  from the origin and let  $x$  be a point distance  $\varepsilon$  before the boundary  
(**ray shooting** query in direction  $v$  with error  $\varepsilon$ )
- Let  $\pi(C)$  be the minimum volume cap containing point  $x$

## Polar Relationship for Caps

The polar of the base of  $C$  scaled by  $\varepsilon$  is a constant approximation of the base of  $\pi(C)$ .

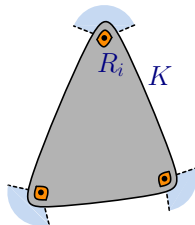


# Volume-Sensitive Bound

- Mahler volume inequalities imply that the product of the base areas is  $\Theta(\varepsilon^{d-1})$
- Hence, for each  $\varepsilon$ -width Macbeath region  $R$  of  $K$ , there exists a Macbeath region  $R^*$  in  $K^*$ , such that

$$\text{vol}(R) \cdot \text{vol}(R^*) = \Theta(\varepsilon^{d+1})$$

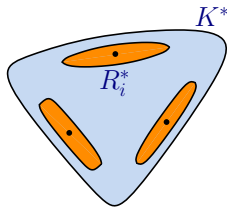
- Transforms **small-volume** Macbeath regions in  $K$  to **large-volume** Macbeath regions in  $K^*$ .
- **Packing argument** in  $K^*$  bounds their number



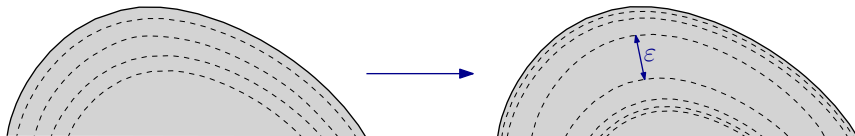
## Volume-Sensitive Bound

Let  $\mathcal{C}$  be a set of caps of  $K$  of width  $\Theta(\varepsilon)$  and volume  $\Theta(v)$ , such that the Macbeath regions  $M'(x)$  centered at the centroids  $x$  of the bases of these caps are disjoint. Then

$$|\mathcal{C}| = O\left(\min\left(\frac{\varepsilon}{v}, \frac{v}{\varepsilon^d}\right)\right).$$



# Varying Layer Thickness



We make layers have different **thicknesses**:

- **Intermediate layer** with thickness  $\varepsilon$ :
  - Regions of volume:  $\varepsilon^{(d+1)/2}$
  - Number of regions:  $1/\varepsilon^{(d-1)/2}$
- A layer  $k$  layers away from the intermediate will have **thickness**  $\varepsilon/k^2$ :
  - Regions of original volume:  $2^k \varepsilon^{(d+1)/2}$  or  $\varepsilon^{(d+1)/2}/2^k$
  - Number of regions if thickness  $\varepsilon$ :  $1/(2^k \varepsilon^{(d-1)/2})$
  - **Number of regions** becomes:  $1/(2^k (\varepsilon/k^2)^{(d-1)/2}) = (k^{d-1}/2^k)/\varepsilon^{(d-1)/2}$
- **Totals**:
  - **Number of regions**:  $\sum_k (k^{d-1}/2^k)/\varepsilon^{(d-1)/2} = 1/\varepsilon^{(d-1)/2}$
  - **Thickness**:  $\sum_k \varepsilon/k^2 = \varepsilon$

Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

Construction

ECC

Difficulties

Stratification

New Insights

Overview

Volume Bound

Polar

Volume Bound

Layer Thickness

Construction

Closing

Conclusions

Bibliography

# Construction

## Preliminaries

Introduction  
Complexity  
Main Result  
Vertices  
Caps  
Witness-Collector  
Macbeath Regions

## Construction

ECC  
Difficulties  
Stratification

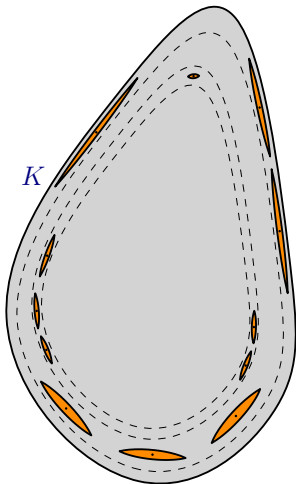
## New Insights

Overview  
Volume Bound  
Polar  
Volume Bound  
Layer Thickness

## Construction

## Closing

Conclusions  
Bibliography



- Build Macbeath regions in layers:
  - **Outer** layers responsible for **larger** Macbeath regions
  - **Inner** layers responsible for **smaller** Macbeath regions (volume doubles for each layer out)
  - Intermediate layer has thickness  $\varepsilon$  (responsible for regions of volume  $\Theta(\varepsilon^{(d+1)/2})$ )
  - $k$  layers away, thickness decreases to  $\varepsilon/k^2$
- Place a point inside each Macbeath region (anywhere)
- Take the convex hull

# Construction

## Preliminaries

Introduction  
Complexity  
Main Result  
Vertices  
Caps  
Witness-Collector  
Macbeath Regions

## Construction

ECC  
Difficulties  
Stratification

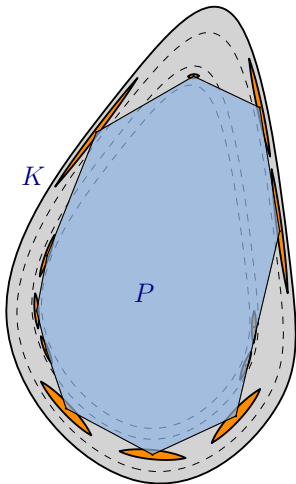
## New Insights

Overview  
Volume Bound  
Polar  
Volume Bound  
Layer Thickness

## Construction

## Closing

Conclusions  
Bibliography



- Build Macbeath regions in layers:
  - **Outer** layers responsible for **larger** Macbeath regions
  - **Inner** layers responsible for **smaller** Macbeath regions (volume doubles for each layer out)
  - Intermediate layer has thickness  $\varepsilon$  (responsible for regions of volume  $\Theta(\varepsilon^{(d+1)/2})$ )
  - $k$  layers away, thickness decreases to  $\varepsilon/k^2$
- Place a point inside each Macbeath region (anywhere)
- Take the convex hull

# Conclusion and Open Problems

There are many details omitted. . .

## Main Result:

- An optimal  $O(1/\varepsilon^{(d-1)/2})$  bound on the combinatorial complexity of an  $\varepsilon$ -approximating polytope in  $\mathbb{R}^d$ .
- Key contributions:
  - A **volume-sensitive** bound on the number of disjoint Macbeath regions
  - A **volume-inverting** correspondence between Macbeath regions in a convex body and its polar body (a local version of the **Mahler volume**)

## Open problems:

- Efficient construction?
- Can simple constructions (e.g., Dudley or Bronshteyn & Ivanov) provide any guarantees on combinatorial complexity?
- Instance optimality? (As opposed to worst-case optimality)

Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

Construction

ECC

Difficulties

Stratification

New Insights

Overview

Volume Bound

Polar

Volume Bound

Layer Thickness

Construction

Closing

Conclusions

Bibliography

# Bibliography

Preliminaries

Introduction

Complexity

Main Result

Vertices

Caps

Witness-Collector

Macbeath Regions

Construction

ECC

Difficulties

Stratification

New Insights

Overview

Volume Bound

Polar

Volume Bound

Layer Thickness

Construction

Closing

Conclusions

Bibliography

- [AFM17] S. Arya and G. D. da Fonseca and D. M. Mount, On the Combinatorial Complexity of Approximating Polytopes, *Discr. and Comp. Geom*, 58:849–870, 2017.
- [Bar07] I. Bárány. Random polytopes, convex bodies, and approximation. In W. Weil, editor, *Stochastic Geometry*, volume 1892 of *Lect. Notes in Math.*, pages 77–118, 2007.
- [BI74] E. M. Bronshteyn and L. D. Ivanov. The approximation of convex sets by polyhedra. *Siberian Math. J.*, 16:852–853, 1976. (Original in Russian: 1974.)
- [Cla06] K. L. Clarkson, Building triangulations using  $\epsilon$ -nets, In *Proc. 38th Annu. ACM STOC*, 2006, 326–335.
- [DGG13] O. Devillers, M. Glisse, and X. Goaoc. Complexity analysis of random geometric structures made simpler. In *Proc. 29th Annu. Sympos. Comput. Geom.*, pages 167–176, 2013.
- [Dud74] R. M. Dudley. Metric entropy of some classes of sets with differentiable boundaries. *Approx. Theory*, 10(3):227–236, 1974.
- [ELR70] G. Ewald, D. G. Larman, and C. A. Rogers. The directions of the line segments and of the  $r$ -dimensional balls on the boundary of a convex body in Euclidean space. *Mathematika*, 17:1–20, 1970.
- [Gru93] P. M. Gruber. Asymptotic estimates for best and stepwise approximation of convex bodies. *I. Forum Math.*, 5:521–537, 1993.
- [Mac52] A. M. Macbeath. A theorem on non-homogeneous lattices. *Annals of Mathematics*, 54:431–438, 1952.

- Preliminaries
- Introduction
- Complexity
- Main Result
- Vertices
- Caps
- Witness-Collector
- Macbeath Regions
- Construction
- ECC
- Difficulties
- Stratification
- New Insights
- Overview
- Volume Bound
- Polar
- Volume Bound
- Layer Thickness
- Construction
- Closing
- Conclusions
- Bibliography



Sculpture by Yoann Crépin

Thank you!