

Economical Convex Coverings and Applications

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Definition

Cover Size

Application 1

Application 2

Macbeath

Packing

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Difference

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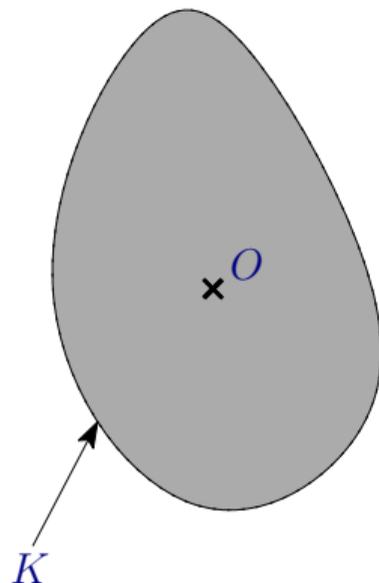
Bibliography

(c, ε) -covering:

- Given c, ε , and a convex body $K \subset \mathbb{R}^n$ (with a central origin)
- Collection \mathcal{Q} of convex bodies
- Union covers K
- Factor- c expansion of each $Q \in \mathcal{Q}$ about its centroid lies inside $(1 + \varepsilon)K$
- Usually $c = 2$

In our case:

- A constant contraction forms a packing
- Bodies are centrally symmetric

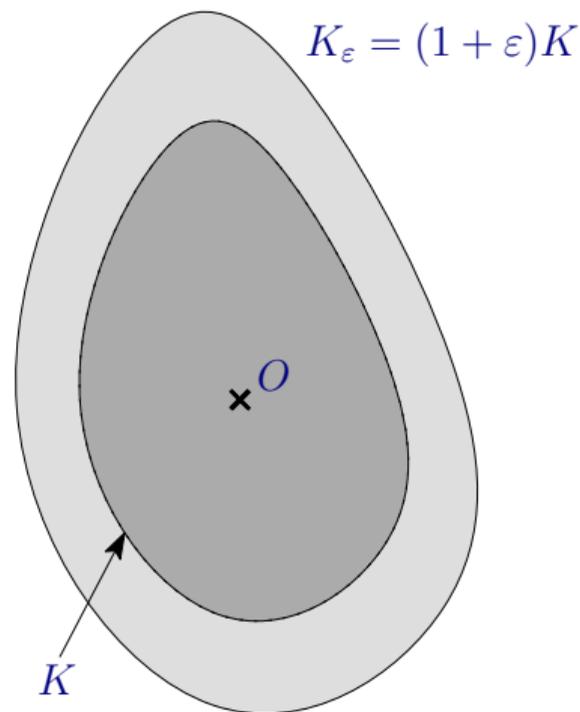


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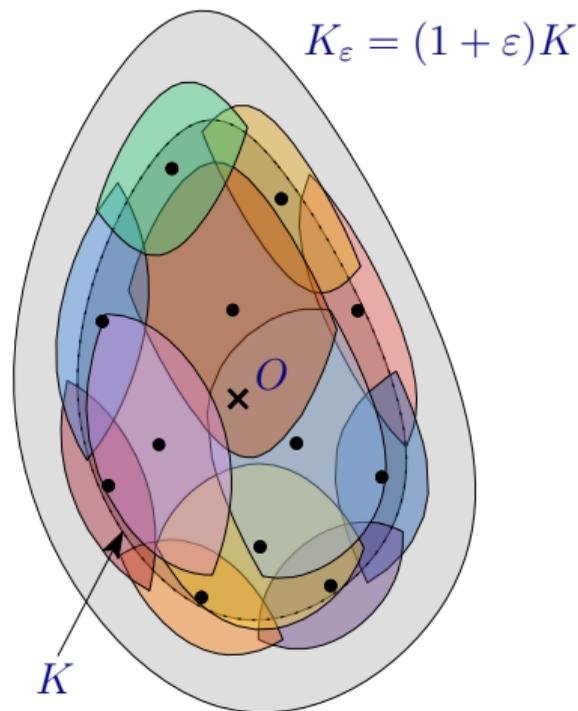
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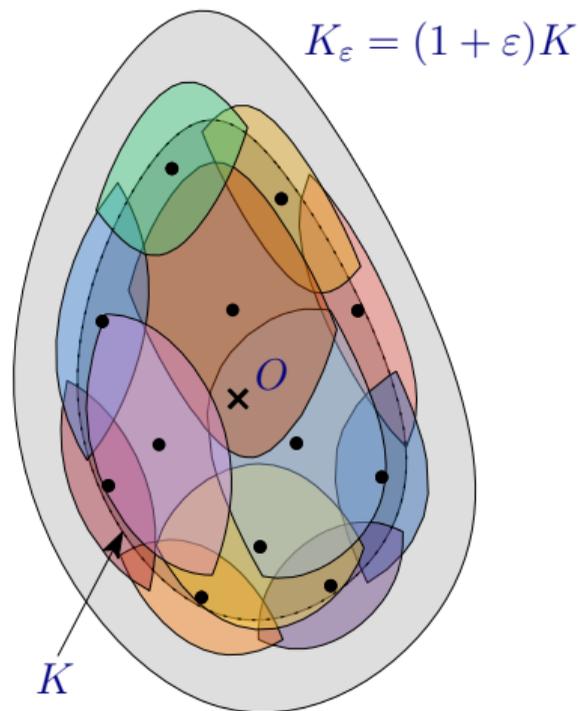
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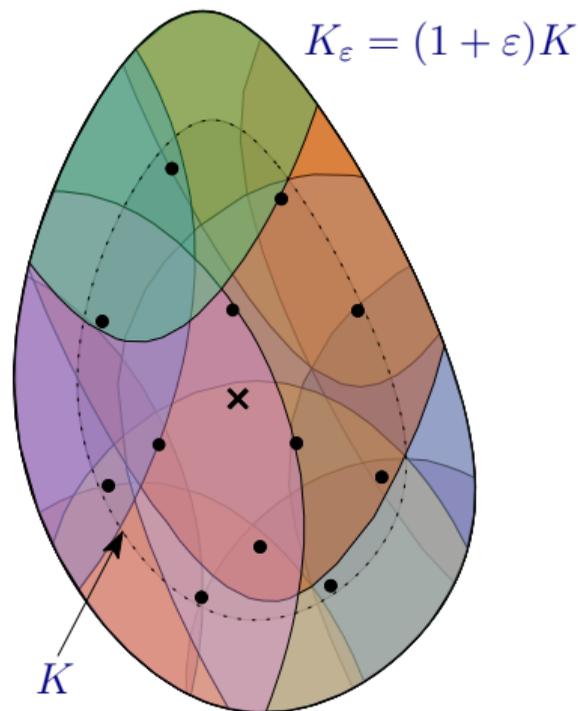
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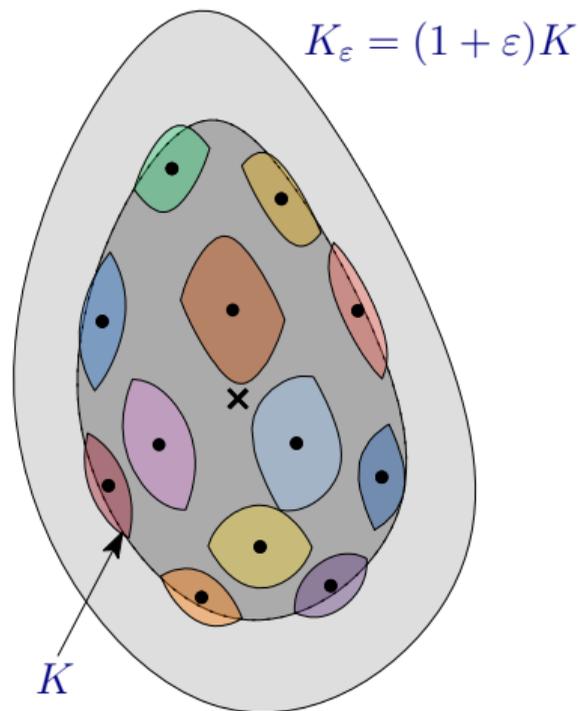
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Previous and New Cover Sizes

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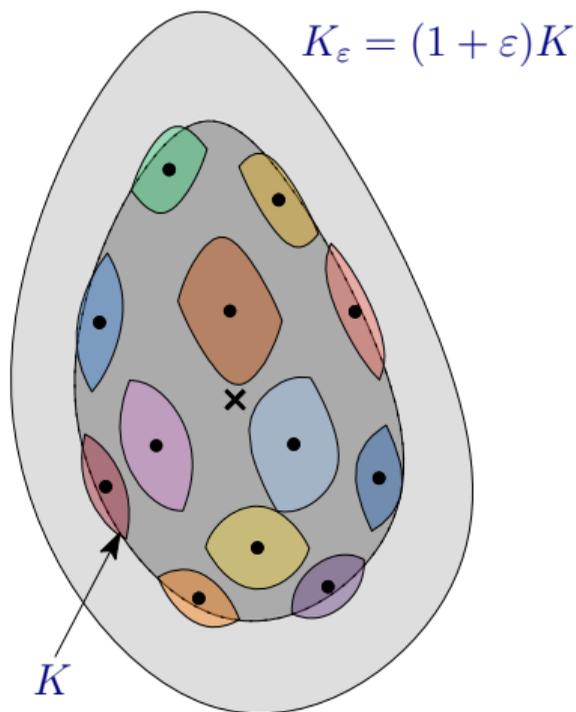
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Previous (c, ϵ) cover sizes (for constant c):

- $2^{O(n)} / \log^n(1/\epsilon)$ for ℓ_∞ balls [ENN11]
- $n^{O(n)} / \epsilon^{(n-1)/2}$ for **any convex body** [AM18]
- $2^{O(n)} / \epsilon^{n/2}$ for ℓ_p balls [NV22]
- Lower bound for ℓ_2 balls: $2^{-O(n)} / \epsilon^{(n-1)/2}$ [NV22]

Our cover size:

- $2^{O(n)} / \epsilon^{(n-1)/2}$ for **any convex body**

Application 1: Polytope Approximation

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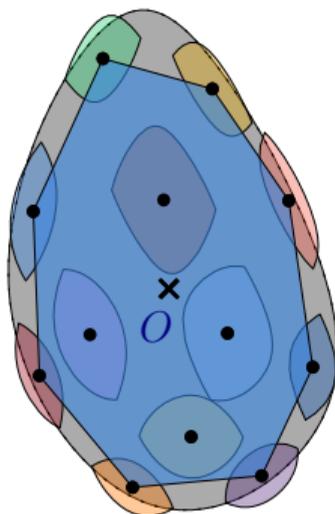
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- We want an approximation P of K such that:
 $K \subseteq P \subseteq (1 + \varepsilon)K$
- Implies Banach-Mazur metric
- Compared to Hausdorff:
Finer approximation in **narrow** directions
- Goal: small number of **vertices**

From (c, ε) -covering to polytope approximation:

Let X be the set of centers of any (c, ε') -covering of $K(1 + \varepsilon/c)$. Then $K \subset \text{conv}(X) \subset K(1 + \varepsilon)$.

- Number of vertices: $|Q| = 2^{O(n)} / \varepsilon^{(n-1)/2}$
- Matches best previous bound [NNR20]



Application 2: Approximate Closest Vector Problem (CVP)

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Closest Vector Problem (CVP) :

■ Given:

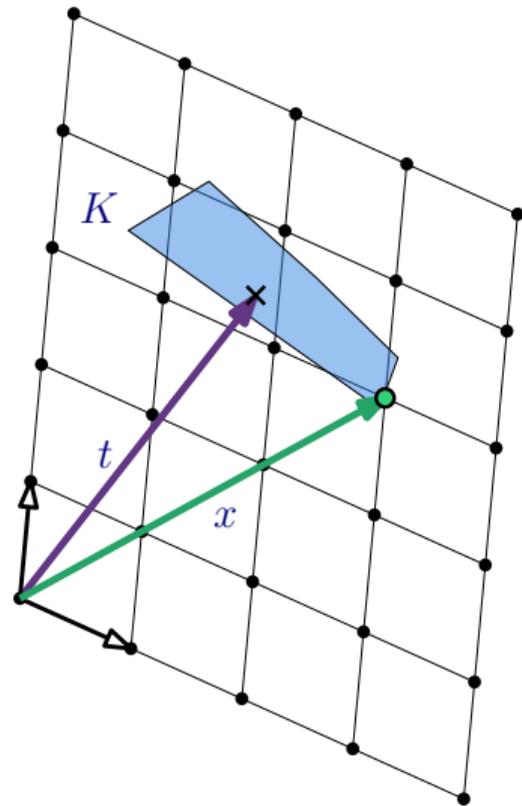
- n -dimensional lattice L in \mathbb{R}^n
- target vector $t \in \mathbb{R}^n$
- convex body K representing a “norm” $\|\cdot\|_K$

■ Find:

vector x minimizing $\|tx\|_K$

■ Approximation:

x' with $\|tx'\|_K \leq (1 + \varepsilon)\|tx\|_K$



Application 2: Approximate Closest Vector Problem (CVP)

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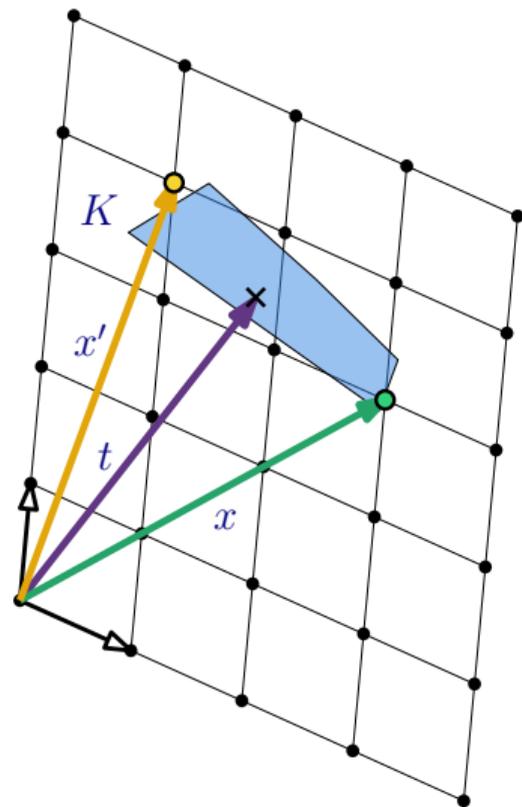
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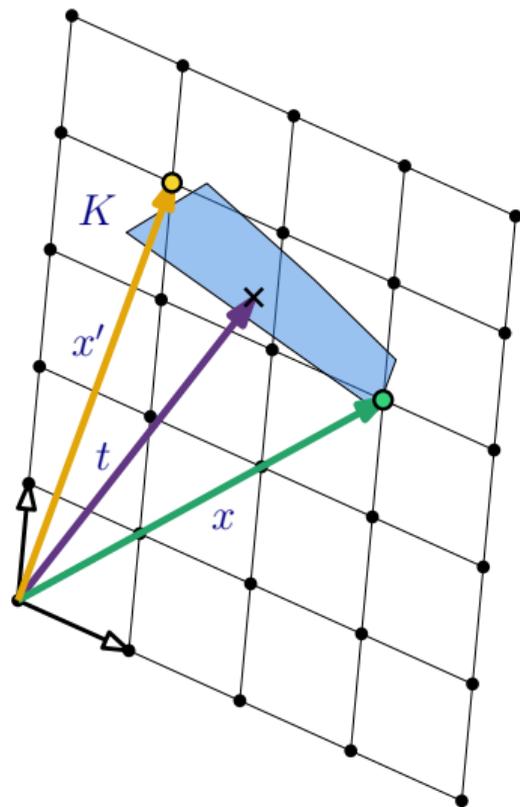
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From (c, ϵ) -covering to approximate CVP [NV22] :

Given a $(2, \epsilon)$ -covering of K consisting of N centrally symmetric convex bodies, we can solve $(1 + 7\epsilon)$ -CVP under $\|\cdot\|_K$ with $\tilde{O}(N)$ calls to a 2-CVP solver.

- Previous solution in $2^{O(n)}/\epsilon^n$ time [DK16]
- We use it to get $2^{O(n)}/\epsilon^{(n-1)/2}$ time
- Same time for **approximate integer programming**



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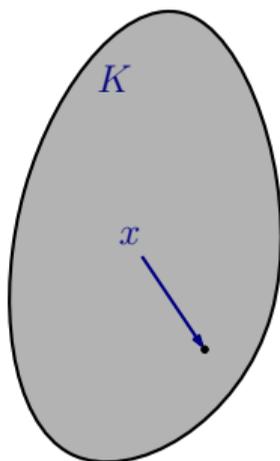
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Macbeath region [Mac52]:

- Given a convex body K , $x \in K$, and $\lambda > 0$:

- $M^\lambda(x) = x + \lambda((K - x) \cap (x - K))$

- $M(x) = M^1(x)$: intersection of K and K reflected around x

Equivalently:

- $M(x)$: largest centrally symmetric convex body centered on x
- $M^\lambda(x)$: $M(x)$ scaled by λ around x

Main Tool: Macbeath Regions

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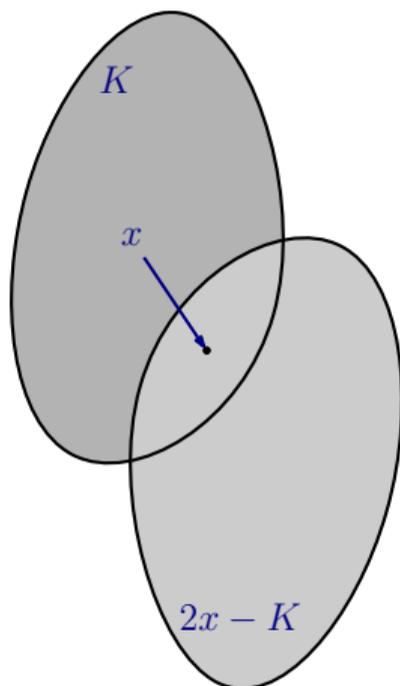
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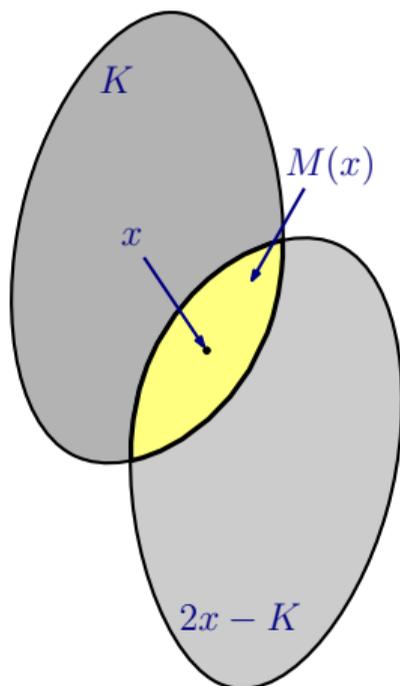
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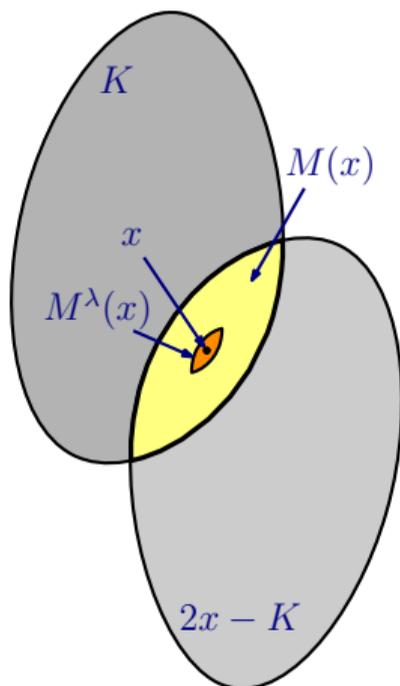
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Maximal Packing of Macbeath Regions

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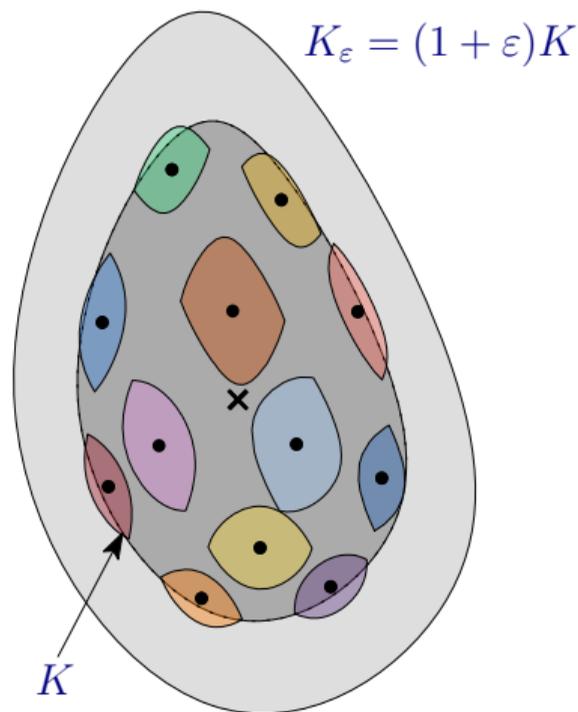
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- Our covering is defined by a **maximal** set of **disjoint Macbeath regions** for K_ϵ with $\lambda = 1/4c$
- Scaling them by 4 to $\lambda = 1/c$ gives our (c, ϵ) -cover \mathcal{Q} of K
- Scaling \mathcal{Q} by c to $\lambda = 1$ stays inside K_ϵ
- Previous bound was $|\mathcal{Q}| = n^{O(n)} / \epsilon^{(n-1)/2}$ [AAF22]
- We show that $|\mathcal{Q}| = 2^{O(n)} / \epsilon^{(n-1)/2}$
- New techniques are needed



Large Macbeath Regions

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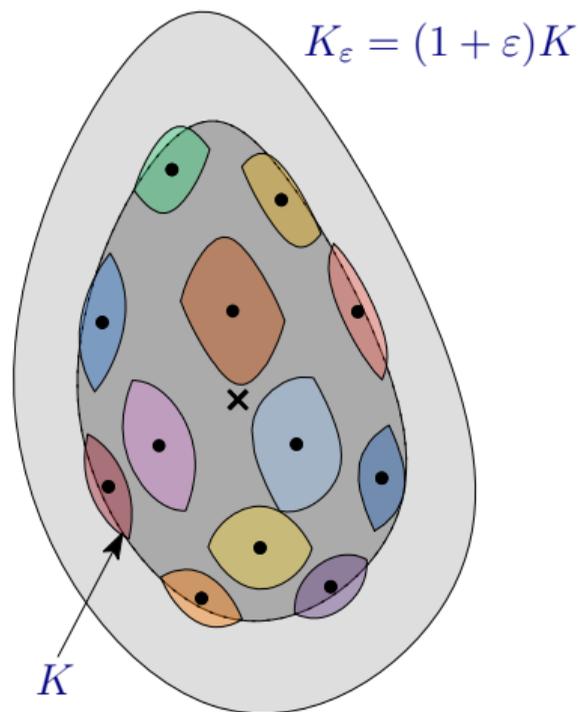
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- Assume $\text{vol}(K_\varepsilon) = 1$
- $\mathcal{Q}_{\geq t}$: Subset of regions of volume at least t
- Shrinking the regions by 4 produces a **packing**
- Hence, $|\mathcal{Q}_{\geq t}| = O(4^n/t) = 2^{O(n)}/t$
- For $t = \varepsilon^{(n+1)/2}$: $|\mathcal{Q}_{\geq t}| = 2^{O(n)}/\varepsilon^{(n+1)/2}$
- Bounds with $n - 1$ instead of $n + 1$ come from splitting K into **layers**
- Roughly, Macbeath regions with center x at distance α from the boundary are in a layer of volume $O(\alpha)$
- As α increases, Macbeath regions get larger
- Forms a geometric progression



Large Macbeath Regions

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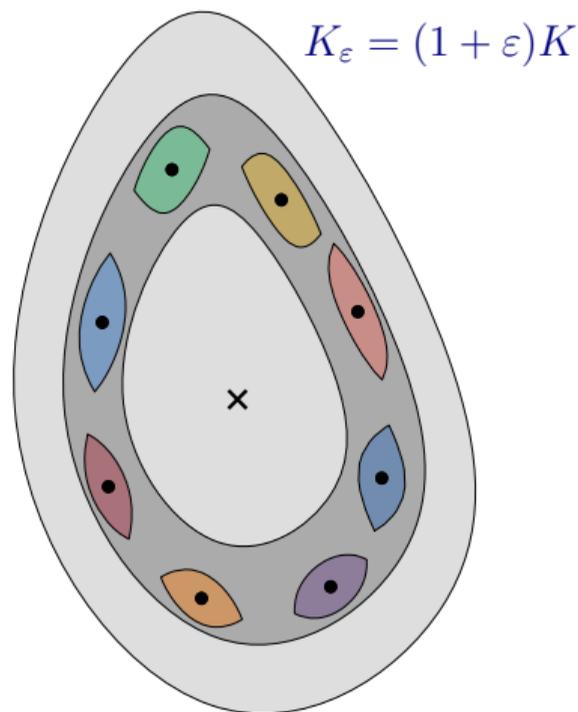
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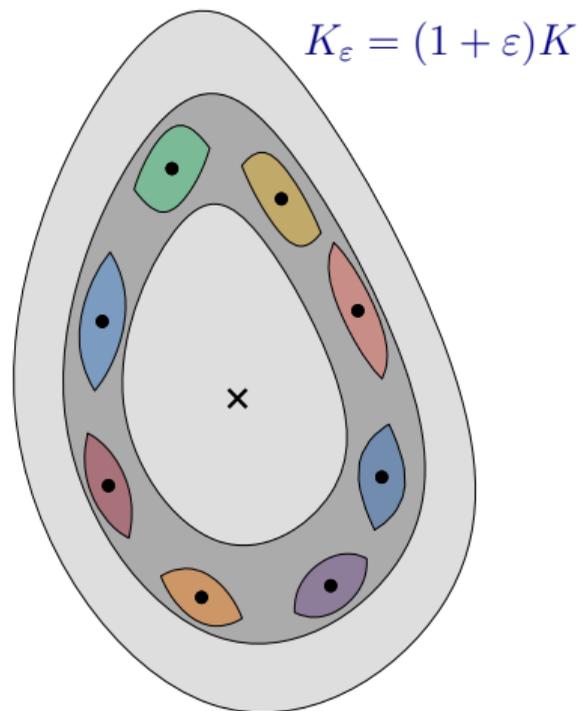
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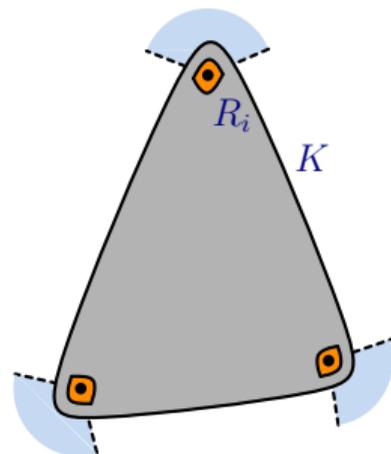
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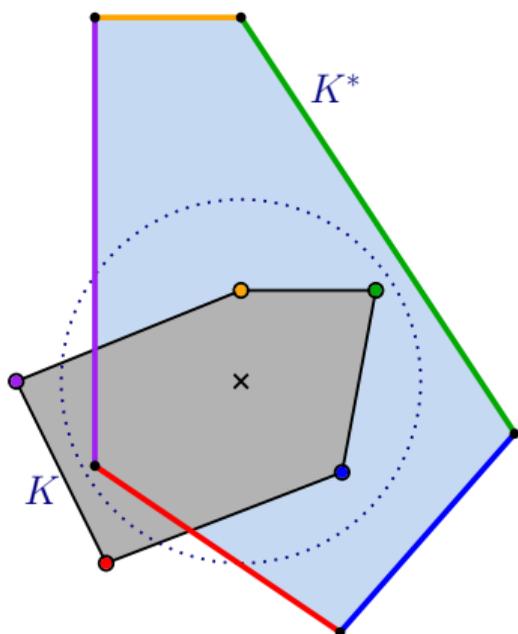
- Consider a tiny Macbeath region of volume $O(\varepsilon^n)$
- Such Macbeath region must be close to a portion of K 's boundary with **high curvature**
- By convexity, K 's boundary **curvature** is **bounded**
- Therefore, the number of such Macbeath regions is $2^{O(n)}$

- How to make this formal for all small regions?



Polar Body

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- q : point
- Polar hyperplane $q^* = \{p : p \cdot q = 1\}$
- K : convex body
- Polar convex body $K^* = \{p : p \cdot q \leq 1 \text{ for all } q \in K\}$
- High curvature maps to low curvature
- Mahler volume $\text{vol}(K) \cdot \text{vol}(K^*) \geq 2^{-O(n)} \cdot \omega_n^2$
- If the origin is well-centered:
 $\text{vol}(K) \cdot \text{vol}(K^*) \leq 2^{O(n)} \cdot \omega_n^2$
- ω_n : volume of the n -dimensional unit Euclidean ball

Polar Body

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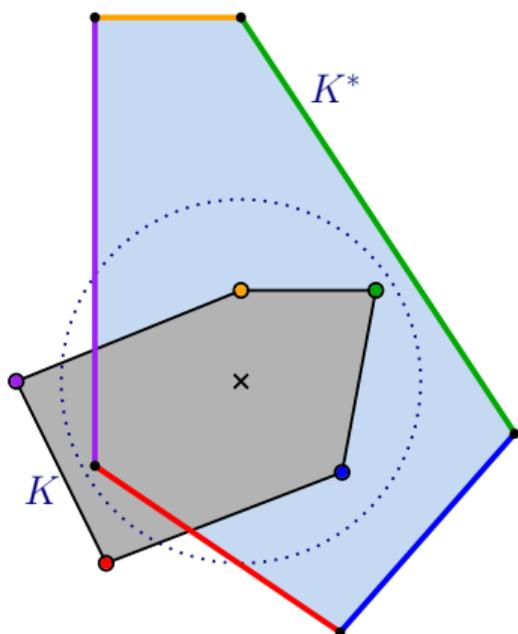
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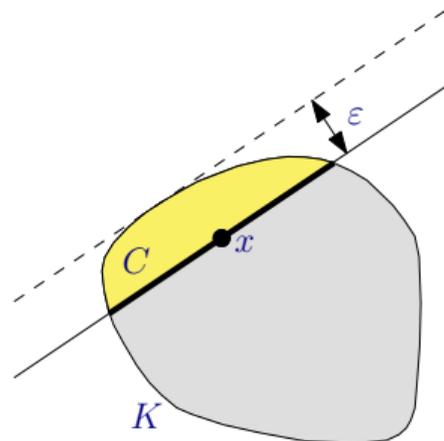
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- **Cap:**
intersection of K and a **halfspace**
- **Base** of a cap:
intersection of K and a **hyperplane**
- **Width** of a cap:
maximum orthogonal distance from the base
(often ε)
- x : **centroid** of the base of a cap C
- Cap and **Macbeath region** have **similar volumes**:
 $2^{-O(n)} \cdot \text{vol}(C) \leq \text{vol}(M(x)) \leq 2 \cdot \text{vol}(C)$



Caps in the Primal and Polar

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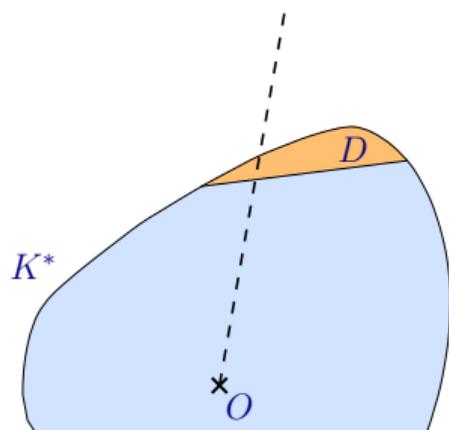
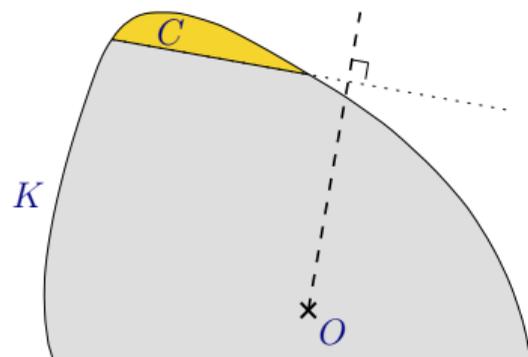
Key Lemma:

For a cap C of K and a related cap D of the polar K^* , both of width at least ε :

$$\text{vol}_K(C) \cdot \text{vol}_{K^*}(D) \geq 2^{-O(n)} \varepsilon^{n+1}.$$

Relationship: ray from the origin orthogonal to the base of C intersects D .

- We can bound the number of Macbeath regions:
small caps in the primal are large in the polar
- How do we prove the lemma?



Dual Cap and Inner Cone

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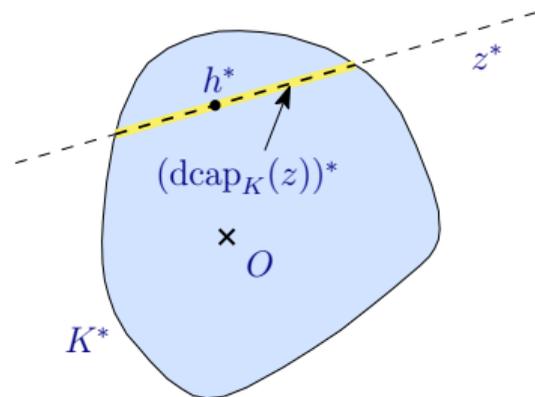
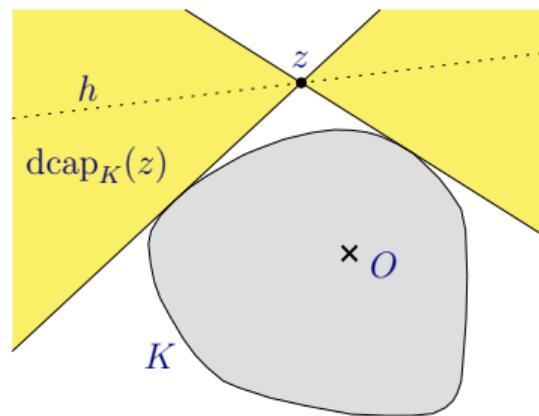
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set of hyperplanes containing point z
but no point of K
- **Inner cone:**
points in all rays from a point z
towards a point in K



Dual Cap and Inner Cone

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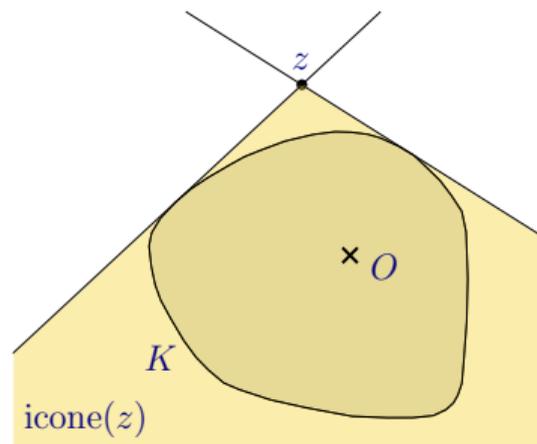
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First Attempt to Prove the Key Lemma

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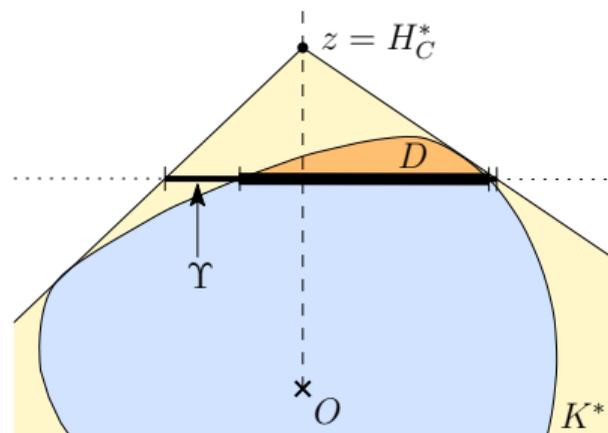
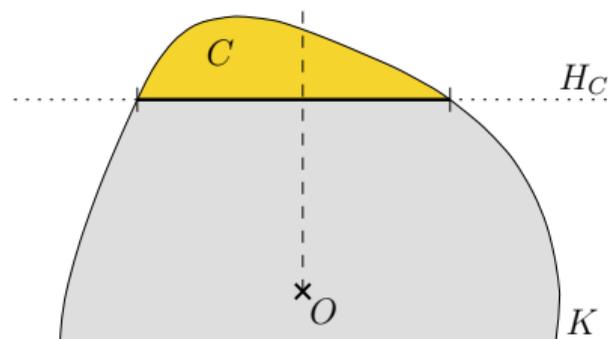
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- Region Υ : Intersection of the **inner cone** and the **base hyperplane of D**
- We show: Υ is the **polar** of the base of C scaled by $\Theta(\varepsilon)$
- Remember: **Mahler volume**
 $\text{vol}(K) \cdot \text{vol}(K^*) = 2^{O(n)}$
- Problem 1: Υ is **larger** than the base of D
- Easy fix: **Scale up D** by $O(n)$
- Problem 2: Increases the volume by $n^{O(n)}$



First Attempt to Prove the Key Lemma

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Application 2

Macbeath

Packing

Large

Small

Polar

Cap

Primal-Polar

Inner Cone

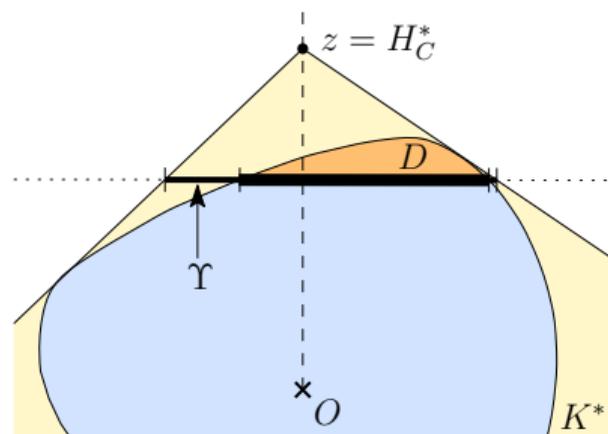
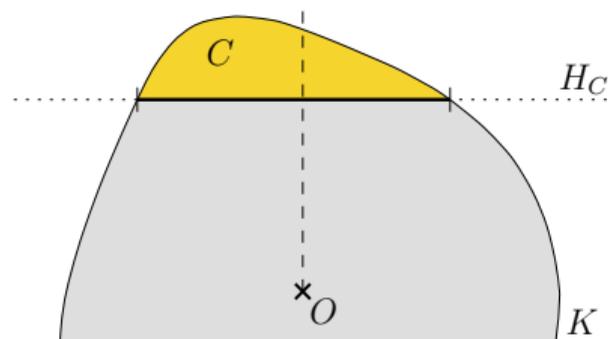
First Try

Difference

Conclusion

Bibliography

- Region Υ : Intersection of the **inner cone** and the **base hyperplane of D**
- We show: Υ is the **polar** of the base of C scaled by $\Theta(\varepsilon)$
- Remember: **Mahler volume**
 $\text{vol}(K) \cdot \text{vol}(K^*) = 2^{O(n)}$
- Problem 1: Υ is **larger** than the base of D
- Easy fix: **Scale up D** by $O(n)$
- Problem 2: Increases the volume by $n^{O(n)}$



First Attempt to Prove the Key Lemma

Definition

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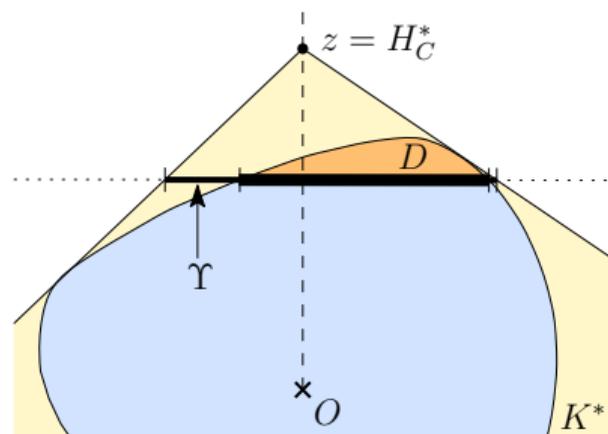
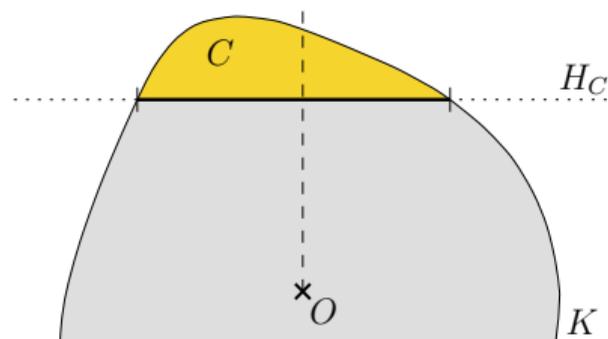
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Difference Body

Definition

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Small

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Cap

Primal-Polar

Inner Cone

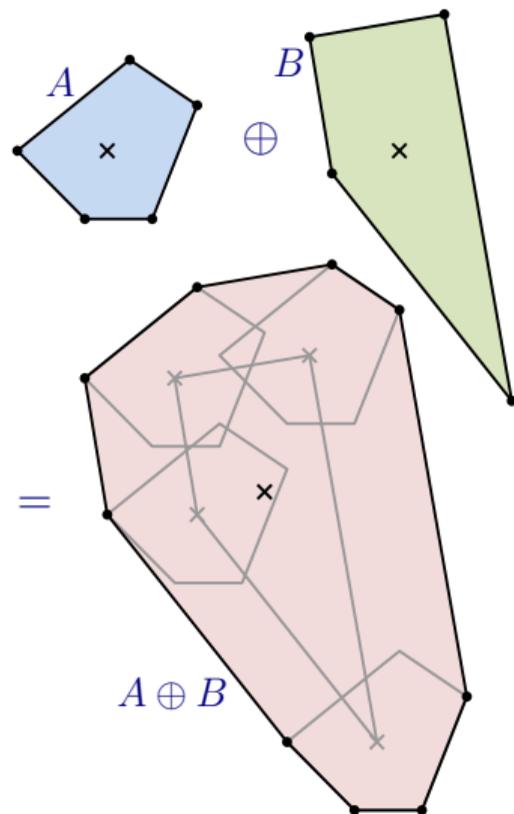
First Try

Difference

Conclusion

Bibliography

- **Minkowski sum:**
 $A \oplus B = \{p + q : p \in A, q \in B\}$
- **Difference body:**
 $\Delta(K) = K \oplus (-K)$
- $\text{vol}(\Delta(K)) \leq 4^n \text{vol}(K)$ [RS59]
- No $n^{O(n)}$ factor



Difference Body

Definition

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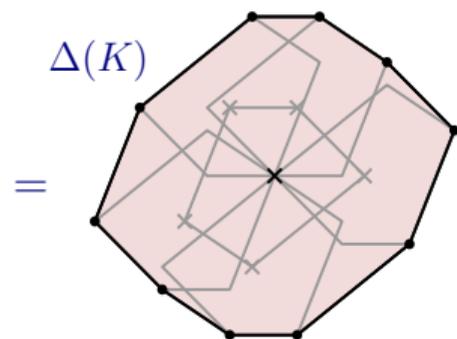
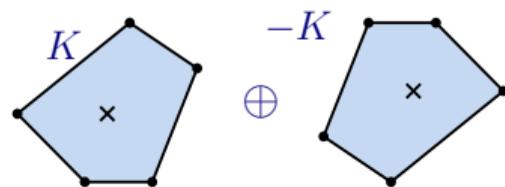
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Difference

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Difference Body and Inner Cone

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Large

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Polar

Cap

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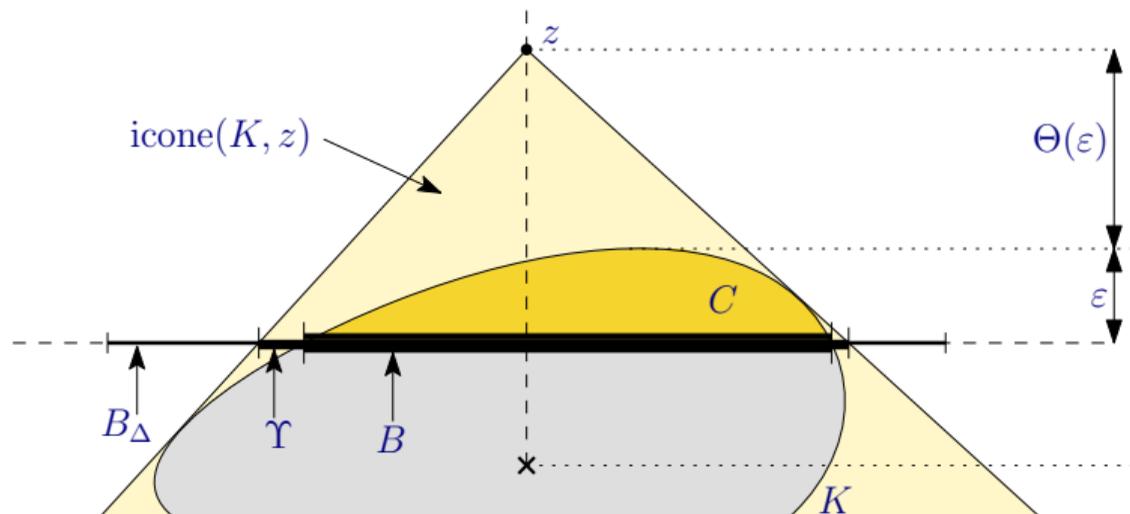
First Try

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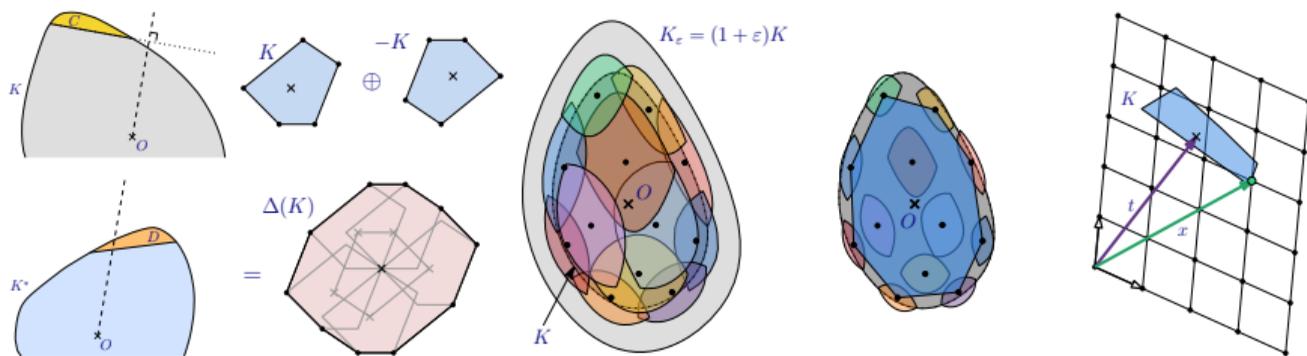
Bibliography

- B_Δ : difference body of the base of a cap scaled by 5 (instead of $O(n)$)
- B_Δ contains Υ



Conclusion

- We show that given a cap C of K there is a cap D of the polar K^* with $\text{vol}(C) \cdot \text{vol}(D) \geq 2^{-O(n)} \varepsilon^{n+1}$
- Key tools: **Mahler volume** and **difference body**
- **Small caps** in the **primal** take a **large volume** in the **polar**
- We get a (c, ε) -covering \mathcal{Q} with $|\mathcal{Q}| = 2^{O(n)} / \varepsilon^{n/2}$
- Implies **polytope approximation** in the Banach-Mazur metric
- Implies the same running time for ε -approximate **CVP** and **integer programming**



Definition

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Bibliography

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Marc Chagall

Thank you!