# On the extension complexity of low-dimensional polytopes

### Lisa Sauermann

Institute for Advanced Study

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Joint work with Matthew Kwan and Yufei Zhao.

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# Introduction

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However, there is a 3-dimensional polytope with only 5 facets whose projection is a regular hexagon:

(Note that this construction only works for certain hexagons, for most hexagons it doesn't work).





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Using the observation above, one can see that xc(regular hexagon) = 5. More generally, a regular (2-dimensional) *n*-gon has extension complexity  $\Theta(\log n)$  (Ben-Tal, Nemirovski, 2001).

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In particular, there has been a lot of work on the extension complexity of specific polytopes relevant in optimization problems, like the correlation polytope, the traveling salesman polytope, and the perfect matching polytope.

In general, it is a difficult problem to determine the extension complexity of a given polytope.

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Some simple general facts about the extension complexity:

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The extension complexity of an (n-1)-dimensional *n*-vertex simplex is equal to *n*.

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The answer to the question is n, since an (n-1)-dimensional n-vertex simplex has extension complexity n.

But what if we restrict the dimension of the polytope?

#### Open question

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Theorem (Shitov, 2014; Padrol, Pfeifle, 2015)

Any (2-dimensional) *n*-gon has extension complexity at most 6n/7.

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# Theorem (Shitov, 2020)

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What about lower bounds?

Theorem (Fiorini, Rothvoß, Tiwary, 2012)

Almost all *n*-gons have extension complexity at least  $\Omega(\sqrt{n})$ .

#### Theorem (Padrol, 2016)

Almost all *d*-dimensional polytopes with *n* vertices have extension complexity at least  $\Omega(\sqrt{dn})$ .

It seems plausible that a random polytopes are good candidates for having high extension complexity.

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This is also a natural question in itself, given the rich literature studying random polytopes.

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#### Model I

Choose *n* independent uniformly random points on the unit sphere in  $\mathbb{R}^d$ , and let the polytope *P* be their convex hull.

In this model, P has n vertices (with probability 1).

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# Model II

Choose *m* independent uniformly random points in the unit ball in  $\mathbb{R}^d$ , and let the polytope *P* be their convex hull.

In this model, P has a.a.s.  $\Theta\left(m^{(d-1)/(d+1)}\right)$  vertices (Reitzner, 2005).
## **Our results**

Fix a dimension  $d \ge 2$ .

### Theorem (Kwan, S., Zhao, 2020+)

Let P be the convex hull of n random points on the unit sphere in  $\mathbb{R}^d$ . Then, a.a.s.  $xc(P) = \Theta(\sqrt{n})$ .

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The lower bound in the second theorem is implied by a result of Padrol (2016), and for both theorems the lower bounds can easily be proved with an argument of Fiorini, Rothvoß and Tiwary (2012).

The interesting part of our results above is the upper bound.

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#### **Open question**

For a fixed dimension d, and large n, what is the maximum possible extension complexity of a d-dimensional polytope P with n vertices? Is the extension complexity always  $O(\sqrt{n})$ ?

For d = 2, the best upper bound is  $O(n^{2/3})$  (Shitov, 2020). For  $d \ge 3$ , no nontrivial upper bounds are known.

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It seems plausible that random polytopes exhibit the maximum possible extension complexity, but this is not at all clear.

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We proved that the answer is yes for d = 2.

### Theorem (Kwan, S., Zhao, 2020+)

Let *P* be the (2-dimensional) *n*-gon with all vertices on a common circle. Then *P* has extension complexity at most  $24\sqrt{n}$ .

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The proof follows a somewhat similar strategy as for our results for random polytopes.

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We proved that there are polytopes of dimension  $n^{o(1)}$  such that the extension complexity is close to n:

### Theorem (Kwan, S., Zhao, 2020+)

For any *n*, there exists a polytope with at most *n* vertices, dimension at most  $n^{o(1)}$ , and extension complexity at least  $n^{1-o(1)}$ .

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### **Open question**

For given n, what is the minimum dimension d such that there exists a d-dimensional polytope with n vertices and extension complexity equal to n?

## Open question

What about the extension complexity of random n-vertex polytopes if the dimension d grows slowly with n?

# Nonnegative rank

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#### Definition

The *rank* of an  $m \times n$  matrix  $M \in \mathbb{R}^{m \times n}$  is the minimum number r such that there is a factorization M = TU with matrices  $T \in \mathbb{R}^{m \times r}$  and  $U \in \mathbb{R}^{r \times n}$ .

## Definition

The nonnegative rank of a nonnegative  $m \times n$  matrix  $M \in \mathbb{R}_{\geq 0}^{m \times n}$  is the minimum number r such that there is a factorization M = TU with nonnegative matrices  $T \in \mathbb{R}_{\geq 0}^{m \times r}$  and  $U \in \mathbb{R}_{\geq 0}^{r \times n}$ .

The nonnegative rank of a matrix  $M \in \mathbb{R}_{\geq 0}^{m \times n}$  is at least its (ordinary) rank, but may be much larger.

The *slack* of a vertex v with respect to a constraint  $a \cdot x \leq b$  is  $b - a \cdot v \geq 0$  (here  $a \in \mathbb{R}^d$  and  $b \in \mathbb{R}$ ).

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The *slack matrix* of a polytope P is the (nonnegative) matrix with all the slacks as entries (the rows are indexed by the vertices of P and the columns are indexed by the facets/constraints).

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#### Theorem (Yannakakis, 1991)

The nonnegative rank of the slack matrix of P is equal to the extension complexity of P.

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In order to prove the our desired upper bounds for the extension complexity, we bound the nonnegative rank of the slack matrices of the polytopes.

# Proof overview for our random polytope results

## Theorem (Kwan, S., Zhao, 2020+)

Let P be the convex hull of n random points on the unit sphere in  $\mathbb{R}^d$ . Then, a.a.s.  $xc(P) = \Theta(\sqrt{n})$ .

#### Theorem (Kwan, S., Zhao, 2020+)

Let P be the convex hull of m random points in the unit ball in  $\mathbb{R}^d$ , and let  $n = m^{(d-1)/(d+1)}$ . Then, a.a.s.  $xc(P) = \Theta(\sqrt{n})$ .

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In the first theorem, all vertices of P are on the unit sphere. In the second theorem, all vertices of P are typically very close to the unit sphere.

In both cases, the vertices of P are fairly well-distributed on (or close to) the unit sphere.

The proofs of these two theorems are very similar (but the second theorem requires a bit more work).

Fix a dimension  $d \ge 2$ . Let P be a d-dimensional polytope with vertices on (or close to) the unit sphere.

Let V be the set of vertices of P, and F the set of facets of P, and M the slack matrix of P (with rows indexed by V and columns indexed by F).

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The following is a key lemma for our argument, and is inspired by a similar lemma due to Shitov (2014) for d = 2.

#### Lemma (Kwan, S., Zhao, 2020+)

Suppose  $F' \subseteq F$  is a small "patch" of facets of P, and  $V' \subseteq V$  is a set of vertices of P which are "far away" from the facets in F'.

Consider the  $V' \times F'$  submatrix M[V', F'] of the slack matrix M. Then the nonnegative rank of this submatrix M[V', F'] is O(1).

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Shitov's version of this lemma for dimension d = 2 does not require the "far away" assumption (the vertices in V' just need to lie outside the "patch").

For d > 2, the proof of the lemma is geometrically much more involved.

Suppose  $F' \subseteq F$  is a small "patch" of facets of P, and  $V' \subseteq V$  is a set of vertices of P which are "far away" from the facets in F'.

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Proof sketch:

Construct a "polyhedral lampshade" polytope Q with O(1) vertices, such that

- Q contains all vertices in V'.
- *Q* lies entirely on the "positive slack" side of all facets in *F*'.





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Construct a "polyhedral lampshade" polytope Q with O(1) vertices, such that

- Q contains all vertices in V'.
- *Q* lies entirely on the "positive slack" side of all facets in *F*'.

Each vertex  $v \in V'$  is a convex combination of the vertices of Q.





Suppose  $F' \subseteq F$  is a small "patch" of facets of P, and  $V' \subseteq V$  is a set of vertices of P which are "far away" from the facets in F'.

Then the nonnegative rank of the slack-submatrix M[V', F'] is O(1).

Proof sketch:

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Each vertex  $v \in V'$  is a convex combination of the vertices of Q.

So the vector of slacks of v with respect to the factes in F' is a convex combination of the "slack vectors" of the vertices of Q.





Typically, the vertices of P are well-distributed over the sphere, and the facets of P are fairly small.

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We cover the sphere by  $O(\sqrt{n})$  small caps, such that each facet of P is inside one of the caps, but each cap contains only  $O(\sqrt{n})$  vertices of P.

We apply the lemma to the "patches" of facets inside the different caps.

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This way, we can partition the slack matrix of P into parts, where by the lemma most parts have small nonnegative rank.

However, the challenge is to deal with the slacks of vertices with respect to nearby facets. To handle this, we actually need a stronger version of the lemma (allowing to make certain subtractions from the matrix).

With the stronger (and more technical) version of the lemma, we can then show that the slack matrix of P has nonnegative rank at most  $O(\sqrt{n})$ .

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## Thank you very much for your attention!

