# Combinatorial Designs Meet Hypercliques: Higher Lower Bounds for Klee's Measure Problem and Related Problems in Dimensions d > 4

## Egor Gorbachev <sup>1</sup> Marvin Künnemann <sup>2</sup>

 $^{1}$ Saarbrücken Graduate School of Computer Science, Saarland Informatics Campus

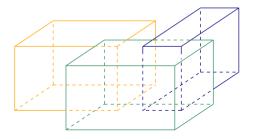
<sup>2</sup>RPTU Kaiserslautern-Landau

June 14, 2023

## Klee's Measure Problem

#### Klee's Measure Problem (KMP)

**Input:** n axis-parallel boxes in  $\mathbb{R}^d$ .

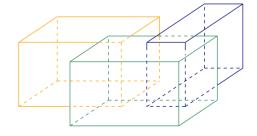


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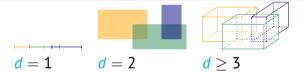
**Input:** n axis-parallel boxes in  $\mathbb{R}^d$ .

- basic geometric primitive
- many related problems, e.g.:
  - depth of axis-parallel boxes
  - largest empty (anchored) box
  - discrepancy of boxes
  - ...



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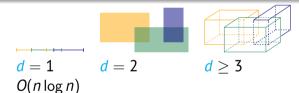
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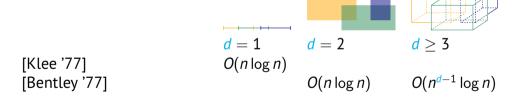
Output: volume of the union of these boxes.



[Klee '77]

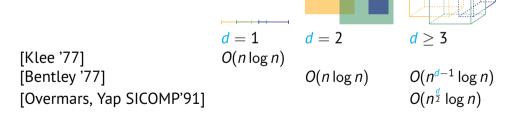
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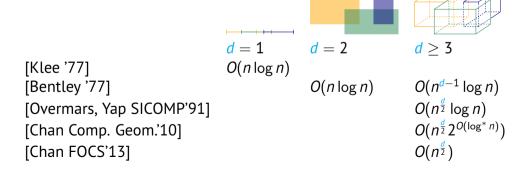
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- Can we make these lower bounds hold for **general** algorithms?

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$$d=3 \qquad d=4 \qquad \qquad d=5 \qquad \qquad d\geq 6$$
 UB: [Chan FOCS'13] 
$$O(n^{1.5}) \quad O(n^2) \qquad O(n^{2.5}) \qquad O(n^{d/2})$$
 LB: [Künnemann FOCS'22]

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# k-Clique Hypothesis

#### *k*-Clique

**Input:** k-partite graph  $G = (V_1 \cup V_2 \cup ... \cup V_k, E)$ ,  $|V_i| = n$  for all i.

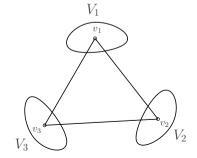
**Output:** Does *G* have a clique of size *k*?

I.e.,  $v_1 \in V_1, \ldots, v_k \in V_k$ , s.t.  $\{v_a, v_b\} \in E$  for all  $a \neq b$ .

Best known algorithm  $O(n^{\frac{\omega}{3}k})$  for k divisible by 3.

#### Combinatorial Clique Hypothesis

For any  $k \ge 3$  there is no  $O(n^{k-\varepsilon})$  combinatorial algorithm for k-Clique.



# k-HyperClique Hypothesis

#### 3-uniform *k*-HyperClique

**Input:** k-partite 3-uniform hypergraph  $G = (V_1 \cup V_2 \cup ... \cup V_k, E)$ ,  $|V_i| = n$  for all i.

**Output:** Does *G* have a hyperclique of size *k*?

I.e.,  $v_1 \in V_1, \ldots, v_k \in V_k$ , s.t.  $\{v_a, v_b, v_c\} \in E$  for all distinct a, b, c.

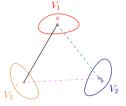
Best known algorithm  $n^{k\pm o(1)}$  (essentially bruteforce).

#### 3-uniform HyperClique Hypothesis

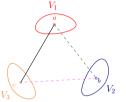
For any k > 3 there is no  $O(n^{k-\varepsilon})$  algorithm for 3-uniform k-hyperclique.

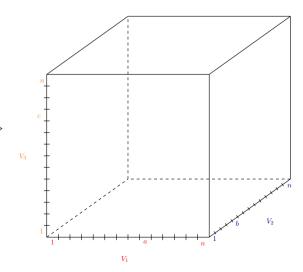
See [Lincoln, V. Williams, Williams'18], [Bringmann, Fischer, Künnemann'19], [Künnemann, Marx'20].

Reduction from triangle detection.

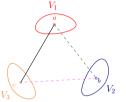


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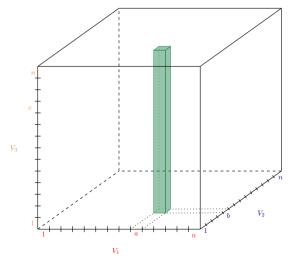


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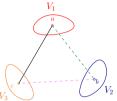


want: cube for (a, b, c) is covered by a box  $\Leftrightarrow$  (a, b, c) do **not** form a triangle

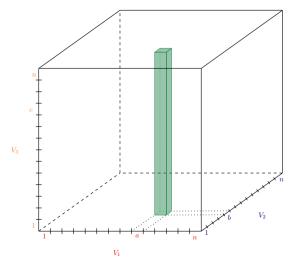
• For all non-adjacent  $a \in V_1$ ,  $b \in V_2$  add a box covering all  $(a, b, \cdot)$  unit cubes.



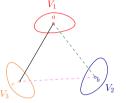
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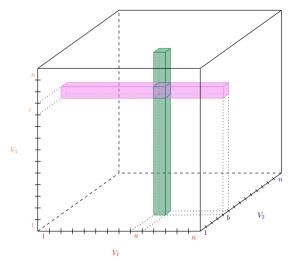
- For all non-adjacent  $a \in V_1$ ,  $b \in V_2$  add a box covering all  $(a, b, \cdot)$  unit cubes.
- For all non-adjacent  $a \in V_1$ ,  $c \in V_3$  add a box covering all  $(a, \cdot, c)$  unit cubes.



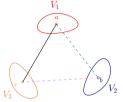
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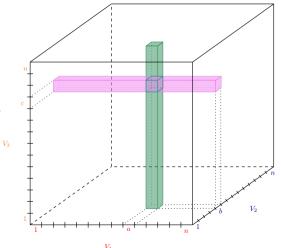
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Reduction from triangle detection.



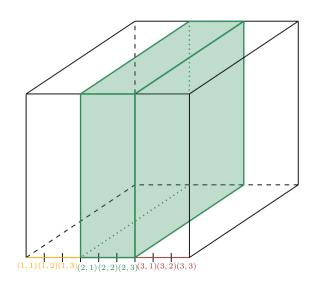
- We create  $N = O(n^2)$  boxes.
- $\Omega(N^{\frac{d}{2}-o(1)})$  lower bound for combinatorial algorithms.



# Lexicographic encoding

Encode a sequence of parts  $(V_{i_1}, V_{i_2}, \dots, V_{i_t})$  in each dimension lexicographically.

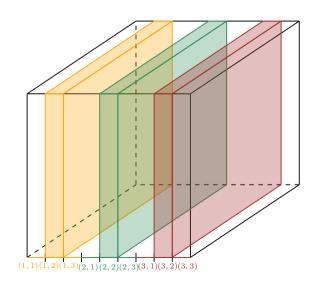
We can specify choices  $(\cdot, \cdot, \dots, v_{i_j}, \dots, \cdot)$  as  $n^{j-1}$  boxes.



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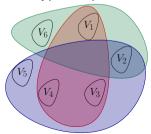
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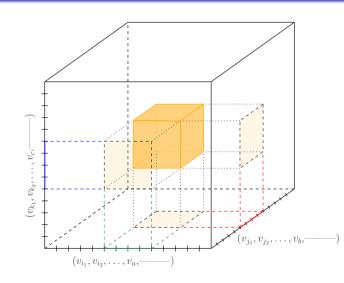


## Redundant Encoding

**Redundancy**: encode parts multiple times in different dimensions.

**1**  $\forall v_a \in V_a, v_b \in V_b, v_c \in V_c$  s.t.  $\{v_a, v_b, v_c\} \notin E$  add a box covering cubes corresponding to choosing this triplet into the hyperclique.

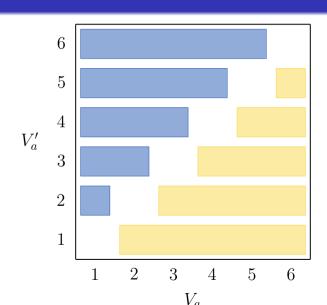




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- Cover inconsistent cubes: if for the same part different vertices are chosen in different dimensions.



**Definition:**  $(d, k, \alpha)$ -prefix covering design -d sequences over  $\{1, \ldots, k\}$  s.t.:

$$s_{1,1} s_{1,2} s_{1,3} \cdots$$

$$s_{2,1} s_{2,2} s_{2,3} \cdots$$

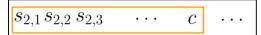
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• Triplet condition: Every triplet of elements can be covered by 3 prefixes of total length  $\leq \alpha$ .



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prefixes of total length  $< \alpha$ .

• Singleton condition: The first and last occurrences of any element can be covered by 2 prefixes of total length  $\leq \alpha + 1$ .

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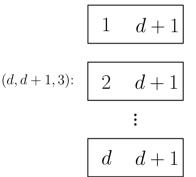
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d d + 1

#### Theorem 1 (Helpful tool)

 $(d, k, \alpha)$ -prefix covering design  $\Rightarrow \Omega(N^{\frac{k}{\alpha}-o(1)})$  lower bound for KMP in  $\mathbb{R}^d$  based on the 3-uniform k-hyperclique hypothesis.

# Prefix Covering Designs: Examples

**Definition:**  $(d, k, \alpha)$ -prefix covering design -d sequences over  $\{1, \ldots, k\}$  s.t.:

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#### Implicit in previous work [Künnemann FOCS'22]:

• There exists a  $(d, d^2, 3d - 3)$ -prefix covering design giving an  $\Omega(N^{\frac{d}{3} + \frac{1}{3} + \Theta(\frac{1}{d})})$  lower bound.

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• (3, 3g, 2g + 1)-prefix covering design for any  $g \ge 1$ :

1	2	 g	2g	2g - 1	 g+1
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• (3, 3g, 2g + 1)-prefix covering design for any  $g \ge 1$ :

•  $\Omega(N^{\frac{3g}{2g+1}-o(1)}) \xrightarrow{g \to \infty} \Omega(N^{\frac{3}{2}-o(1)})$  lower bound for d=3.

• Used the help of a SAT-solver to find good prefix covering designs.

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#### Theorem 2

There is a (4, 40, 21)-prefix covering design yielding an  $\Omega(N^{1.9047...-o(1)})$  lower bound for  $\mathbb{R}^4$ .

```
s_1 = (1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 40, 19, 28, 37, 26),

s_2 = (11, 12, 13, 14, 15, 16, 17, 18, 19, 20, 30, 9, 38, 27, 36),

s_3 = (21, 22, 23, 24, 25, 26, 27, 28, 29, 30, 20, 39, 8, 7, 37),

s_4 = (31, 32, 33, 34, 35, 36, 37, 38, 39, 40, 10, 29, 18, 17, 27).
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#### Theorem 3

There is a (5, 40, 18)-prefix covering design yielding an  $\Omega(N^{2.2222...-o(1)})$  lower bound for  $\mathbb{R}^5$ .

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#### Theorem 4

Prefix covering designs cannot give a tight lower bound already for d = 4.

• (v, c, 2) Covering Design — collection of c-sized subsets  $B_1, \ldots, B_d$  of the universe  $\{1, 2, \ldots, v\}$  such that every couple of elements of the universe is fully contained in some  $B_i$ . (see La Jolla covering repository by D. M. Gordon: dmgordon.org/cover)

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- Examples: finite projective planes, balanced incomplete block designs.

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- **Examples:** finite projective planes, balanced incomplete block designs.



#### Theorem 5 (Framework)

"Good" covering design with *d* subsets ⇒ "good" prefix covering designs. (+ a matching-like condition)

#### Theorem 6

Good specific lower bounds for fixed values of d + a general lower bound of  $\Omega(N^{\frac{d}{3}+\frac{2}{9}\cdot\sqrt{d}-o(\sqrt{d})})$ .

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#### Theorem 7

Prefix covering designs cannot give lower bounds higher than  $N^{\frac{d}{3} + \sqrt{\frac{2}{9}} \cdot \sqrt{d} + o(\sqrt{d})}$ .

#### Theorem 6

Good specific lower bounds for fixed values of d + a general lower bound of  $\Omega(N^{\frac{d}{3}+\frac{2}{9}\cdot\sqrt{d}-o(\sqrt{d})})$ .

#### Theorem 7

Prefix covering designs cannot give lower bounds higher than  $N^{\frac{d}{3}+\sqrt{\frac{2}{9}}\cdot\sqrt{d}+o(\sqrt{d})}$ .

[Künnemann FOCS'22] Lower Bound:  $\frac{d}{3} + \frac{1}{3} + \Theta(\frac{1}{d})$ Our Lower Bound (Theorem 6):  $\frac{d}{3} + \frac{2}{9} \cdot \sqrt{d} - o(\sqrt{d})$ Limitation (Theorem 7):  $\frac{d}{3} + \sqrt{\frac{2}{9}} \cdot \sqrt{d} + o(\sqrt{d})$ 

## Prefix Covering Designs: New Results Exponents Table

d	Upper b	ound	Previous lower bound	SAT-solver	Covering	( <b>v</b> , <i>c</i> ) of the
	[Chan'13]		[Künnemann'22]	lower	designs lower	covering
				bound	bound	design
3	1.5		1.5		1.5	(3, 2)
4	2		1.777	1.9047	1.8461	(20, 12)
5	2.5		2.0833	2.2222	2.1929	(45, 25)
6	3		2.4		2.5714	(6, 3)
7	3.5		2.7222		3	(7, 3)
8	4		3.0476		3.3333	(24, 10)
9	4.5		3.375		3.6818	(90, 36)
:	:		;		:	:
	•				•	•

### Recap and Open Questions

#### **Our Results:**

- We showed lower bounds of  $\Omega(N^{1.9047...})$  in  $\mathbb{R}^4$ ,  $\Omega(N^{2.2222...})$  in  $\mathbb{R}^5$ , and  $\Omega(N^{\frac{d}{3}+\Theta(\sqrt{d})})$  in  $\mathbb{R}^d$  for Klee's Measure Problem and related problems under the 3-uniform hyperclique hypothesis.
- These lower bounds are close to the best possible achievable using prefix covering designs.

#### **Open Questions:**

- Can we solve Klee's Measure Problem faster for large *d*?
- Can we show tight bounds for d = 4, 5, 6 using some different method?
- Can we show lower bounds of form  $\Omega(N^{\gamma \cdot d o(d)})$  for  $\gamma > 1/3$ ?