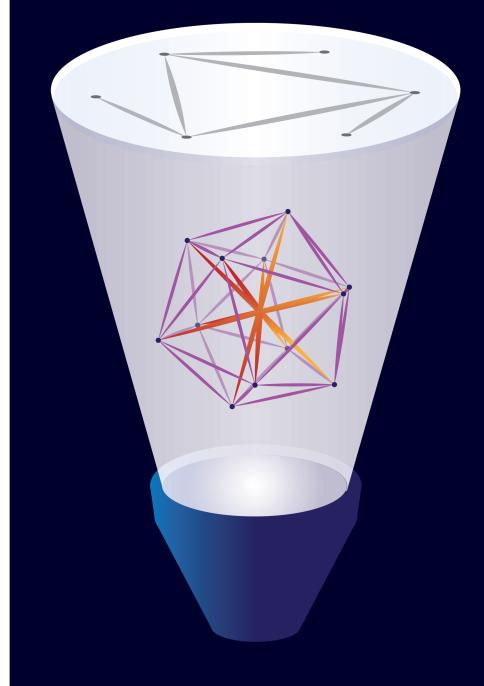
# Equiangular Lines and Eigenvalue Multiplicities

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## Equiangular lines

N(d) = max # of lines in  $\mathbb{R}^d$  with pairwise equal angles



Exact answer known for finitely many *d*General bounds:

[de Caen '00] 
$$cd^2 \le N(d) \le {d+1 \choose 2}$$
 [Gerzon '73]

In lower bound constructions, pairwise angles  $\rightarrow 90^\circ$  as  $d\rightarrow \infty$ 

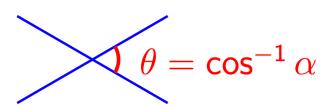
## Equiangular lines with a fixed angle

 $N_{\alpha}(d)$  = max # of lines in  $\mathbb{R}^d$  with pairwise angle  $\cos^{-1} \alpha$  (focus:  $\alpha > 0$  fixed,  $d \to \infty$ )

- $N_{\alpha}(d)$  grows linearly in d
  - in contrast to  $N(d) = \Theta(d^2)$



$$\lim_{d\to\infty}\frac{N_{\alpha}(d)}{d}$$



## Equiangular lines with a fixed angle: history

[Lemmens, Seidel '73] 
$$N_{1/3}(d) = 2(d-1) \quad \forall d \ge 15$$

[Neumaier '89] 
$$N_{1/5}(d) = \left| \frac{3}{2}(d-1) \right|$$
 for sufficiently large  $d$ 

"the next interesting case will require substantially stronger techniques"

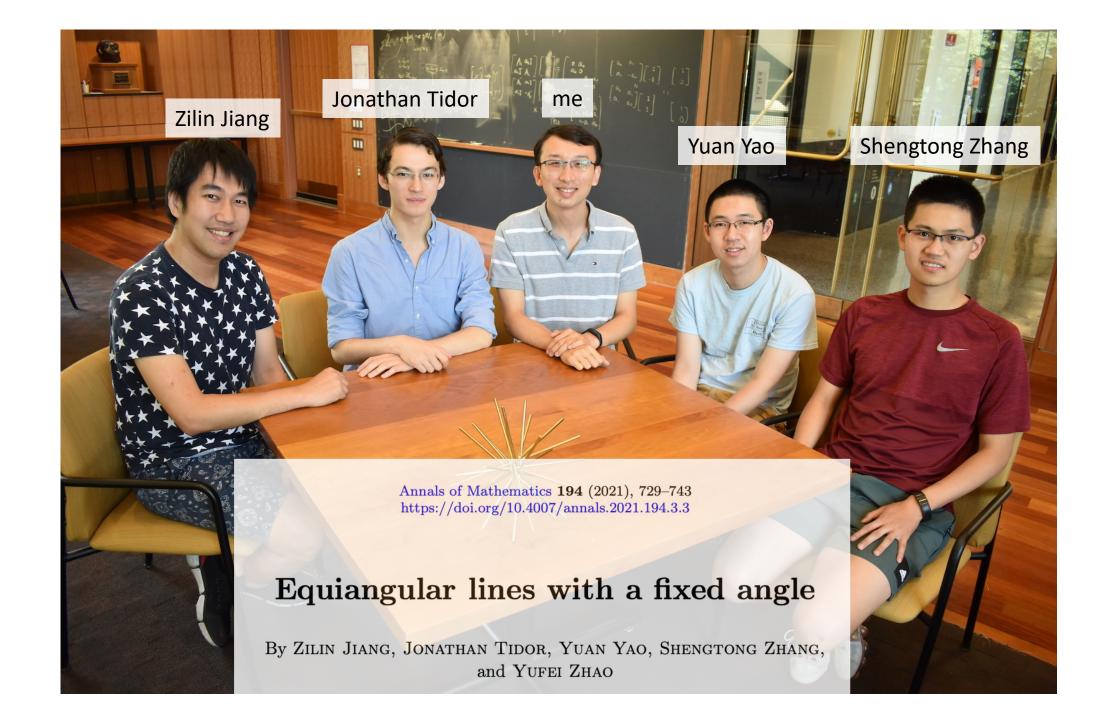


[Bukh '16] 
$$N_{\alpha}(d) \leq C_{\alpha}d$$

[Balla, Dräxler, Keevash, Sudakov '18] 
$$\limsup_{d o \infty} N_{lpha}(d)/d$$
 maximized at  $lpha = rac{1}{3}$ 

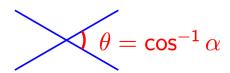
[Jiang, Polyanskii '20] Determined 
$$\lim_{d \to \infty} N_{\alpha}(d)/d \ orall \alpha > 0.196$$

[Jiang, Tidor, Yao, Zhang, Z. '21] Solved! Determined  $\lim_{d \to \infty} N_{\alpha}(d)/d$  for all fixed  $\alpha$ 



## Main result [Jiang, Tidor, Yao, Zhang, Z. '21]

 $N_{\alpha}(d)$  = max # of lines in  $\mathbb{R}^d$  with pairwise angle  $\cos^{-1} \alpha$ 



For every integer  $k \ge 2$ 

$$N_{\frac{1}{2k-1}}(d) = \left[\frac{k}{k-1}(d-1)\right] \ \forall d \ge d_0(k)$$

Proof needs  $d \ge 2^{2^{k^{1+o(1)}}}$ Conjecture:  $\forall d \ge k^C$ 

Other angles:  $\forall$  fixed  $\alpha \in (0,1)$ , setting  $\lambda = (1-\alpha)/(2\alpha)$  and

spectral radius order  $k = k(\lambda)$ 

= min # vertices in a graph with top eigval exactly  $\lambda$  (adj. matrix)

• If 
$$k < \infty$$
,  $N_{\alpha}(d) = \left\lfloor \frac{k}{k-1}(d-1) \right\rfloor \quad \forall d \ge d_0(\alpha)$ 

• If 
$$k = \infty$$
,  $N_{\alpha}(d) = d + o(d)$  as  $d \to \infty$ 

## Spectral radius order

#### spectral radius order $k = k(\lambda)$

= min # vertices in a graph with top eigval exactly  $\lambda$  (adj. matrix)

#### Examples

α	λ	k	G
1/3	1	2	•——•
1/5	2	3	
1/7	3	4	
$\frac{1}{1+2\sqrt{2}}$	$\sqrt{2}$	3	

## Key new result on eigenvalue multiplicity

A connected bounded degree graph has sublinear second eigenvalue multiplicity (always referring to the adjacency matrix)

Theorem. (Jiang, Tidor, Yao, Zhang, Z. '21)

A connected n-vertex graph with maximum degree  $\Delta$  has second largest eigenvalue with multiplicity

$$\leq C \log \Delta \frac{n}{\log \log n}$$

## Connection to spectral graph theory

## Graduate Texts in Mathematics

Chris Godsil Gordon Royle

Algebraic Graph Theory

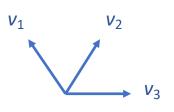
The problem that we are about to discuss is one of the founding problems of algebraic graph theory, despite the fact that at first sight it has little connection to graphs. A simplex in a metric space with distance function dis a subset S such that the distance d(x,y) between any two distinct points of S is the same. In  $\mathbb{R}^d$ , for example, a simplex contains at most d+1elements. However, if we consider the problem in real projective space then finding the maximum number of points in a simplex is not so easy. The points of this space are the lines through the origin of  $\mathbb{R}^d$ , and the distance between two lines is determined by the angle between them. Therefore, a simplex is a set of lines in  $\mathbb{R}^d$  such that the angle between any two distinct lines is the same. We call this a set of *equiangular lines*. In this chapter we show how the problem of determining the maximum number of equiangular lines in  $\mathbb{R}^d$  can be expressed in graph-theoretic terms.



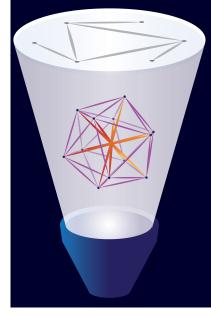
## Connection to spectral graph theory

Equiangular lines in  $\mathbb{R}^d \to \text{unit vectors in } \mathbb{R}^d \to \text{graph } G$ 









Given a list of vectors  $v_1, ..., v_n \in \mathbb{R}^d$ , Gram matrix is PSD and rank  $\leq d$ :

Gram matrix = 
$$\begin{pmatrix} v_1 \cdot v_1 & \cdots & v_1 \cdot v_n \\ \vdots & \ddots & \vdots \\ v_n \cdot v_1 & \cdots & v_n \cdot v_n \end{pmatrix} = (1 - \alpha)I - 2\alpha A_G + \alpha J_{\text{J = all 1s matrix}}$$

**Equivalent problem:** given  $\alpha$ , d, find graph G with max # vertices N s.t.

$$(1-\alpha)I - 2\alpha A_G + \alpha J$$
 is PSD and rank  $\leq d$ .

## Connection to spectral graph theory

**Problem:** Given  $\alpha$ , d, find graph G with max # vertices N s.t.

Gram = 
$$(1 - \alpha)I - 2\alpha A_G + \alpha J$$
 is PSD and rank  $\leq d$ .

Example: recall 
$$N_{1/5}(d) = \left[\frac{3}{2}(d-1)\right]$$
 for all large  $d$ .

To verify  $N_{1/5}(9) \ge 12$ , check

$$G = \bigvee \bigvee \bigvee \bigvee$$

$$(1-\alpha)I - 2\alpha A_G + \alpha J =$$
is PSD and rank 9
$$(\alpha = 1/5)$$

## Upper bounding N

**Problem:** Given  $\alpha$ , d, find graph G with max # vertices N s.t. Gram =  $(1 - \alpha)I - 2\alpha A_G + \alpha I$  is PSD and rank  $\leq d$ .

By rank-nullity

$$N = \operatorname{rank}(\operatorname{Gram}) + \operatorname{nullity}(\operatorname{Gram})$$
 $\leq d + \operatorname{null}((1 - \alpha)I - 2\alpha A_G + \alpha J)$ 
 $\leq d + \operatorname{null}((1 - \alpha)I - 2\alpha A_G) + 1$ 

Multiplicity of  $\lambda = \frac{1-\alpha}{2\alpha}$  as an eigval of  $A_G$ 

Since Gram is PSD, if  $\lambda=\frac{1-\alpha}{2\alpha}$  is an eigval of  $A_G$ , it must be either the largest eigval (equality case) or  $2^{nd}$  largest (need to rule out)

easy hard

#### Recap

- Equiangular lines in  $\mathbb{R}^d \to \text{unit vectors in } \mathbb{R}^d \to \text{graph } G$   $N = \# \text{ lines} \qquad \qquad \# \text{ vertices}$
- $N \le d + \text{mult}(\lambda, A_G) + 1$
- Optimal configuration (for large d) turns out to be

G = disjoint copies of a fixed graph with top eigval exactly  $\lambda = \frac{1-\alpha}{2\alpha}$ 









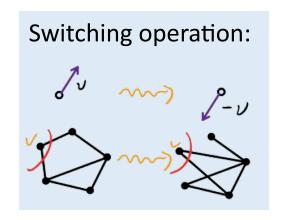
- What happens if  $\lambda$  is the 2<sup>nd</sup> eigval of G?
  - Can assume G is connected from now on
- Want to show that  $\operatorname{mult}(\lambda_2, A_G)$  is small

## Second eigenvalue multiplicity

Q: must all connected graphs have small 2<sup>nd</sup> eigval multiplicity?

**No.** k-clique has eigvals k-1 (once) and 1(k-1)

Not all graphs can arise from equiangular lines



Theorem (Balla, Dräxler, Keevash, Sudakov '18)

 $\forall \alpha \; \exists \Delta = \Delta(\alpha) : \text{can switch so that max degree} \leq \Delta$ 

[Balla '21+]  $\Delta = O(\alpha^{-4})$  & tight

**Theorem.** (Jiang, Tidor, Yao, Zhang, Z. '21) A connected n-vertex graph with max deg  $\leq \Delta$  has  $2^{\text{nd}}$  eigval multiplicity  $O_{\Delta}\left(\frac{n}{\log\log n}\right)$ 

## Sublinear second eigenvalue multiplicity

**Theorem.** (Jiang, Tidor, Yao, Zhang, Z. '21) A connected n-vertex graph with max deg  $\leq \Delta$  has  $2^{nd}$  eigval multiplicity  $O_{\Delta}\left(\frac{n}{\log\log n}\right)$ 

More generally,  $j^{\text{th}}$  eigval multiplicity  $O_{\Delta,j}\left(\frac{n}{\log\log n}\right)$  for fixed j

#### Near miss examples

- Strongly regular graphs (e.g., complete graph, Paley graph)
  - Not bounded degree
- has eigval 0 with linear multplicity
  - 0 is not the 2<sup>nd</sup> largest eigval
- - not connected

## Second eigenvalue multiplicity

**Open:** Maximum 2<sup>nd</sup> eigval mult of conn. bounded degree graph on *n* vertices?

• [Jiang, Tidor, Yao, Zhang, Z. '21]

$$\operatorname{mult}(\lambda_2, G) \leq \frac{C_{\Delta}n}{\log\log n}$$

• [Haiman, Schildkraut, Zhang, Z. '21+]

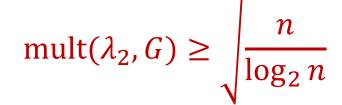
∃ infinite family of bounded degree graphs with

#### Construction.

**Step 1.** Cayley graph on  $\mathrm{Aff}(\mathbb{F}_q)$  generated by:

- (I) a multiplicative generator, and
- an additive shift.

**Step 2.** Each (II) edge  $\longrightarrow$  path of length log q





Milan Haiman

Carl Schildkraut

Shengtong Zhang

- Eigenvalues tend not to collide "by accident"
- Relies on group representations to get multiple eigval. Barrier at  $\sqrt{n}$
- Open:  $\operatorname{mult}(\lambda_2, G) < n^{1-c}$ ? ( $\Rightarrow$  equiangular lines theorem for dimension  $d > k^C$ )

## Second eigenvalue multiplicity

**Q:** Maximum 2<sup>nd</sup> eigval multiplicity of connected bounded degree *n*-vertex graph?

Main theorem (Jiang, Tidor, Yao, Zhang, Z. '21)  $\operatorname{mult}(\lambda_2, G) = O(n/\log\log n)$ 

- For expander graphs  $(N(A) \ge (1+c)|A| \ \forall |A| \le n/2)$ ,  $\text{mult}(\lambda_2, G) = O(n/\log n)$
- [Lee–Makarychev '08, building on Gromov, Colding–Minicozzi, Kleiner] For non-expanding Cayley graphs,  $\operatorname{mult}(\lambda_2, G) = O(1)$
- [McKenzie, Rasmussen, Srivastava '21] For regular graphs  $\operatorname{mult}(\lambda_2,G)=O(n/(\log n)^c)$ 
  - A typical length 2k closed walk covers  $\geq k^c$  vertices
- [Haiman, Schildkraut, Zhang, Z. '21+] Lower bounds (constructions)

Irregular: 
$$\geq \sqrt{n/\log_2 n}$$
 Cayley:  $\geq n^{2/5} - 1$ 

#### Proof sketch (moment method & vertex removal)

#### **Theorem.** $\operatorname{mult}(\lambda_2, G) \leq C_{\Delta} n / \log \log n$ for connected G

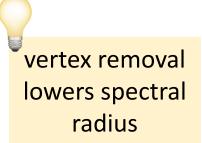
$$r = c \log \log n$$
  $s = c \log n$   $\lambda = \lambda_2(G)$ 

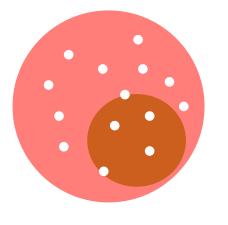
- H = G with a small r-net removed
- s-balls in H typically have spectral radius  $< \lambda \varepsilon$ 
  - By counting length 2s closed walks
- Bound 2<sup>nd</sup> eigval multiplicity in *H* via moments:

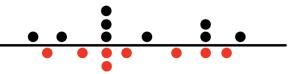
$$\operatorname{mult}(\lambda, H)\lambda^{2s} \leq \sum_{i} \lambda_{i}(H)^{2s} = \operatorname{tr} A_{H}^{2s} = \# \operatorname{closed} \operatorname{length} 2s \text{ walks in } H$$

$$\leq \sum_{v \in V(H)} \lambda_1(s - \text{ball around } v \text{ in } H)^{2s} \leq n(\lambda - \varepsilon)^{2s}$$

- $\Rightarrow$  mult( $\lambda$ , H) = o(n)
- $\Rightarrow$  mult $(\lambda, G) \le$  mult $(\lambda, H) + |net| = o(n)$  by Cauchy eigval interlacing

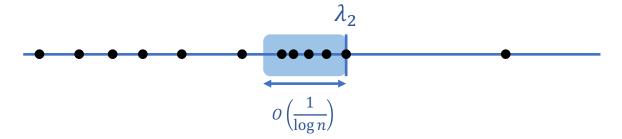






## Approximate 2<sup>nd</sup> eigenvalue multiplicity

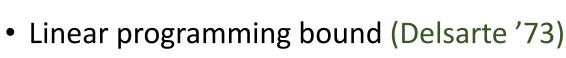
• Proof also bounds the "approximate 2<sup>nd</sup> eigval multiplicity", showing at most  $O\left(\frac{n}{\log\log n}\right)$  eigenvalues (incl. mult.) within  $O\left(\frac{1}{\log n}\right)$  of  $\lambda_2$ 

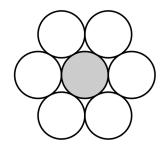


- [Haiman, Schildkraut, Zhang, Z. '21+]
  A construction showing the above bounds are tight
  - Demonstrates a limitation of the trace method

## Spherical codes

- $L \subseteq [-1,1)$ . An L-code in  $\mathbb{R}^d$  is a set of unit vectors whose pairwise inner products lie in L
- $N_L(d)$  = size of largest *L*-code in  $\mathbb{R}^d$
- Points on a sphere with pairwise angle  $\geq \theta$ :  $L = [-1, \cos \theta]$ 
  - Kissing number  $\mathbb{R}^d$ :  $L = \left[-1, \frac{1}{2}\right]$
  - Sphere packing upper bounds in high dimensions





• Equiangular lines:  $L = \{-\alpha, \alpha\}$ 

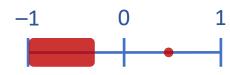
Beyond linear programming bounds ...

## Spherical codes

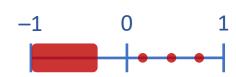
 $N_L(d)$  = size of largest L-code in  $\mathbb{R}^d$ , i.e., unit vec, pairwise inner products lie in L

• [Bukh '05]

For fixed 
$$L=[-1,-\beta]\cup\{\alpha\}$$
 with  $\beta>0$  
$$N_L(d)=O_L(d)$$



• [Balla, Dräxler, Keevash, Sudakov '18] For fixed  $L=[-1,-\beta]\cup\{\alpha_1,\dots,\alpha_k\}$  with  $\beta>0$   $N_L(d)=O_L(d^k)$ 

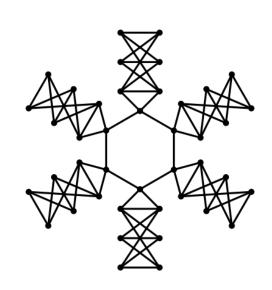


## Spherical two-distance sets

[Jiang, Tidor, Yao, Zhang, Z. '20+] [Jiang, Polyanskii '21+]

• **Problem.** For fixed  $\alpha$ ,  $\beta > 0$ , determine

$$\lim_{d\to\infty}\frac{N_{\{-\beta,\alpha\}}(d)}{d}$$



- A conjectural limit in terms of eigenvalue of signed graphs
- Solved in special cases:  $\alpha < 2\beta$  or  $(1 \alpha)/(\alpha + \beta) < 2.019 \cdots$
- Open in general
- Obstacle: Sublinear eigenvalue multiplicity FALSE for signed graphs
  - E.g.,  $\exists$  bounded degree graph whose most negative eigval multiplicity is linear

#### Solution Framework

- I. Forbidden local configurations / subgraphs
  - Using Gram matrix is PSD

#### II. Global graph structure

- Graph theory, Ramsey theory
- Equiangular lines: bounded degree graph
- Spherical two-dist sets: complete multipartite XOR bounded degree

#### III. Extremal result

- Spectral graph theory, eigenvalue multiplicity
- [JTYZZ] Sublinear eigenvalue multiplicity in connected bounded degree graphs
- [Jiang Polyanski '21+] {signed graphs with largest eigenvalue  $\leq \lambda$ } is characterized by forbidding a finite set of induced subgraphs iff  $\lambda < 2.019 \cdots$

#### Complex equiangular lines

#### Unrestricted angles

- Zauner's conjecture:  $N^{\mathbb{C}}(d) = d^2$  for all d (known:  $N^{\mathbb{C}}(d) \leq d^2$ ) i.e.,  $\exists d^2$  unit vec. in  $\mathbb{C}^d$  with equal abs. of pairwise inner product
  - "SIC-POVM" from quantum mechanics
  - Verified in small dim. (exactly for  $d \le 53$ , numerically for  $d \le 193$ )

#### Restricted angles

• Determine  $\lim_{d\to\infty}N_{\alpha}^{\mathbb{C}}(d)/d$ 

#### Equiangular subspaces in $\mathbb{R}^d$

• Configs of k-dim. subspaces in  $\mathbb{R}^d$  with given pairwise angles

#### Equiangular lines and eigenvalue multiplicities

#### **Equiangular lines with a fixed angle.**

 $N_{\alpha}(d)$  = max # of lines in  $\mathbb{R}^d$  with pairwise angle  $\cos^{-1} \alpha$ 

$$\forall$$
 integer  $k \ge 2$ ,  $N_{\frac{1}{2k-1}}(d) = \left\lfloor \frac{k}{k-1}(d-1) \right\rfloor \ \forall d \ge d_0(k)$ 

Other angles:  $\forall$  fixed  $\alpha \in (0,1)$ , setting  $\lambda = (1 - \alpha)/(2\alpha)$ 

spectral radius order  $k = k(\lambda)$ 

= min # vertex in a graph with top eigval exactly  $\lambda$ 

• If 
$$k < \infty$$
,  $N_{\alpha}(d) = \left\lfloor \frac{k}{k-1}(d-1) \right\rfloor \quad \forall d \ge d_0(\alpha)$ 

• If 
$$k = \infty$$
,  $N_{\alpha}(d) = d + o(d)$  as  $d \to \infty$ 

#### Sublinear eigenvalue multiplicity of bounded degree graphs.

A connected *n*-vertex graph with maximum degree  $\Delta$  has second largest eigenvalue with multiplicity  $\leq C \log \Delta \frac{n}{\log \log n}$ 

