

Topic Course on Probabilistic Methods (Week 5) Lovász Local Lemma

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Introduction



The topic course is mostly based the textbook "The probabilistic Method" by Noga Alon and Joel Spencer (third edition 2008, John Wiley & Sons, Inc. ISBN 9780470170205 or fourth edition ISBN-13: 978-1119061953.)







Selected topics



- Linearity of Expectation (2 weeks)
- Alterations (1 week)
- The second moment method (1 week)
- The Local Lemma (1-2 weeks)
- Correlation Inequalities (1 week)
- Large deviations (1-2 weeks)
- Poisson Paradigm (1 week)
- Random graphs (2 weeks)
- Discrepancy (1 week)
- Entropy (1 week)



Subtopics



The second moment method

- Lovász Local Lemma
- Property B
- k-coloring of $\mathbb R$
- Ramsey numbers R(k,k)
- Ramsey numbers R(3,k)
- Directed cycles
- Linear Arboricity



Lovász Local Lemma

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Lovász Local Lemma

- A_1, A_2, \ldots, A_n : *n* events in an arbitrary probability spaces.
- A dependency digraph D = (V, E): if for each A_i , A_i is mutually independent to all the events $\{A_j : A_i A_j \notin E\}$.

Lovász Local Lemma, general case: If there are real number x_1, \ldots, x_n such that $0 \le x_i < 1$ and $\Pr(A_i) \le x_i \prod_{(i,j) \in E} (1-x_j)$ for all $1 \le i \le n$. Then

$$\Pr\left(\wedge_{i=1}^{n}\bar{A}_{i}\right) \geq \prod_{i=1}^{n}(1-x_{i}) > 0.$$







Proof: Inductively prove that for any $S \subset [n]$, |S| = s < n, $i \notin S$,

$$\Pr\left[A_i \mid \wedge_{j \in S} \bar{A}_j\right] \le x_i.$$

Trivial for s = 0. Assuming it for all s' < s, we prove it for s.



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Thus,



 $\Pr\left[A_i \mid \wedge_{j \in S} \bar{A}_j\right] \le x_i.$



$$\Pr\left[\wedge_{i=1}^{n}\bar{A}_{i}\right] = (1 - \Pr[A_{1}])(1 - \Pr[A_{2}|\bar{A}_{1}]) \cdots \\ \cdots \left(1 - \Pr\left[A_{n}|\wedge_{i=1}^{n-1}\bar{A}_{i}\right]\right) \\ \geq \prod_{i=1}^{n} (1 - x_{i}).$$

The proof is finished.



Symmetric Case







Property B

Theorem: Let H = (V, E) be a hypergraph in which every edge has at least k elements, and suppose that each edge of H intersects at most d other edges. If $e(d + 1) \leq 2^{k-1}$, then H has property B.





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Proof: Color each vertex in two colors randomly and independently. For each edge $f \in E$, let A_f be the event that f is monochromatic. Then

$$\Pr(A_f) = 2^{1-|f|} \le 2^{1-k}.$$

 A_f is independent to all event but at most d. Aplly LLL.





$k\text{-coloring of }\mathbb{R}$



Let $c \colon \mathbb{R} \to \{1, 2, \dots, k\}$ be a k-coloring of \mathbb{R} . A set $T \subset \mathbb{R}$ is **multicolored** if $c(T) = \{1, 2, \dots, k\}$.





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Theorem: Let m and k be two positive intergers satisfying

$$e(m(m-1)+1)k(1-\frac{1}{k})^m \le 1.$$

Then, for any set S of m real numbers there is a k-coloring so that each translantion x + S (for $x \in \mathbb{R}$) is multicolored.





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Then, for any set S of m real numbers there is a k-coloring so that each translantion x + S (for $x \in \mathbb{R}$) is multicolored. The condition is satisfied if $m > (3 + o(1))k \log k$.





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 A_x depends on A_y if $(x + S) \cap (y + S) \neq \emptyset$. Equivalently, $y - x \in S - S$. There are at most m(m - 1) such events.

$$d \le m(m-1).$$









Apllying LLL, we get

$$\Pr(\wedge_{x\in X}\bar{A}_x)>0.$$

Then by Tikhonov's theorem, $[k]^{\mathbb{R}}$ is compact. For any $x\in\mathbb{R},$ let

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Now C_x is a closed set and $\bigcap_{x \in X} C_x \neq \emptyset$ for any finite X. Then $\bigcap_{x \in \mathbb{R}} C_x \neq \emptyset$.



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Best bounds for R(r,k) (for fixed r and k large),

$$c\left(\frac{k}{\log k}\right)^{(r+1)/2} < R(r,k) < (1+o(1))\frac{k^{r-1}}{\log^{r-2}k}.$$

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- Dependence graph: $d_{SS} \leq 3n$, $d_{ST} \leq 3\binom{n}{k-2}$, $d_{TS} \leq \binom{k}{2}n$, and $d_{TT} \leq \binom{k}{2}\binom{n}{k-2}$.







By LLL, we only require

$$p^{3} \leq x(1-x)^{3n}(1-y)^{3\binom{n}{k-2}}$$
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We can choose $p = c_1 n^{-1/2}$, $k = c_2 n^{1/2} \log n$, $x = c_3 n^{-3/2}$, and $y = c_4 / \binom{n}{k}$.





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This gives $R(3, k) > c_5 k^2 / \log^2 k$.





R(4,k)



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Erdős conjecture \$250: Prove

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The best lower bound is using LLL; $R(4,k) > c' \frac{k^{2.5}}{\log^{2.5} k}$.



Directed cycles



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Theorem [Alon and Linial (1989) If $e(\Delta\delta+1)(1-1/k)^{\delta} < 1$, then D contains a (directed, simple) cycle of length $0 \mod k$.



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Proof: First we can assume every out-degree is δ by deleting some edges if necessary. Consider $f: V \to \mathbb{Z}_k$. Bad event A_v : no $u \in \Gamma^+(v)$ with f(u) = f(v) + 1.

$$\Pr(A_v) = (1 - 1/k)^{\delta}.$$

δ_{Δ} Each event depends on at most $\delta\Delta$ others. Apply LLL. \Box

Linear Arboricity





Linear Arboricity

Linear forest: disjoint union of paths.
Linear arboricity la(G): the minimum number of linear forests, whose union is E(G).

The Linear Arboricity Conjecture (Akiyama, Exoo, Harary [1981]): For every *d*-regular graph *G*,

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If the conjecture is true, then it is tight.

$$\operatorname{la}(G) \ge \frac{nd}{2(n-1)} > \frac{d}{2}.$$



Directed graphs



- G = (V, E): a directed graph.
- G is d-regular if $d^+(v) = d^-(v) = d$ for any vertex v.
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DLA conjecture for d implies LA conjecture for 2d.





A proposition



Proposition: Let H = (V, E) be a graph with maximum degree d, and let $V = V_1 \cup V_2 \cup \cdots \cup V_r$ be a partition of V. If $|V_i| \ge 2ed$, then there is an independent set of vertices W that contains a vertex from each V_i .





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Proof: WLOG, we assume

$$|V_1| = |V_2| = \cdots = |V_r| = \lceil 2ed \rceil = g.$$

Pick from each V_i a vertex randomly and independently. Let W be the random set of the vertices picked. For each edge f, let A_f be the event that both ends in W. The maximum degree in the dependence graph is at most 2gd - 1. We have $e \cdot 2gd \cdot \frac{1}{g^2} = \frac{2ed}{g} < 1$. Apply LLL.



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Theorem Let G = (U, F) be a *d*-regular digraph with directed girth $g \ge 8ed$. Then

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Proof: Using Hall's matching theorem, we can partition F into d pairwise disjoint 1-regular spanning subgraphs F_1, \ldots, F_d of G.





Each F_i is a union of vertex disjoint directed cycles. Let V_1, \ldots, V_r are the sets of edges of all cycles. Then

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Apply the proposition to the line-graph H of G. Note H is 4d-2-regular.

There exists an independent set M_1 of H. Now $M_1, F_1 \setminus M_1, \ldots, F_d \setminus M_1$ forms d + 1 linear directed forests.



General *d*-regular graphs



Theorem [Alon 1988] There is an absolute constant c > 0 such that for every d-regular directed graph G

 $dla(G) \le d + cd^{3/4} \log^{1/2} d.$



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Corollary There is an absolute constant c > 0 such that for every d-regular graph G

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$$\leq \frac{d}{2} + cd^{3/4} \log^{1/2} d.$$



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The error terms can be improved to $cd^{2/3}\log^{1/3} d$.





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Define for $i \in \mathbb{Z}_p$,

$$E_i = \{ (u, v) \in E \colon f(v) = f(u) + i \}.$$

Let $G_i = (V, E_i)$ and

- Δ_i^+ : the maximum out-degree of G_i .
 - Δ_i^- : the maximum in-degree of G_i .
- Δ_i : the maximum of Δ_i^+ and Δ_i^- .







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- All G_i can be completed to a Δ_i -regular directed graph without deceasing the girth.

dla(G)
$$\leq 2\Delta_0 + \sum_{i=1}^{p-1} (\Delta_i + 1) \leq d + d/p + p + C\sqrt{dp \log d}.$$

Now choose $p \sim d^{1/2}$.

