

JUDICIOUS BISECTIONS

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Joint work with Choongbum Lee and Benny Sudakov

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Every graph has a cut with at least half of the edges crossing.

Proof:

- Independently choose a random side for each vertex.
- Each particular edge then crosses with probability $\frac{1}{2}$.
- Expected number of crossing edges is exactly half. □

Let n and m be the numbers of vertices and edges, respectively.

THEOREM (EDWARDS '73)

Every graph has a cut of size at least $\frac{m}{2} + \sqrt{\frac{m}{8} + \frac{1}{64}} - \frac{1}{8}$.

Tight: e.g., for complete graphs.

EXTENSIONS

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THEOREM (ERDŐS-GYÁRFÁS-KOHAYAKAWA '97)

For graphs with no isolated vertices, Max Cut $\geq \frac{m}{2} + \frac{n}{6}$.

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THEOREM (BOLLOBÁS-SCOTT '99)

All graphs admit bipartitions that achieve the Edwards bound, while also inducing at most $\frac{m}{4} + \sqrt{\frac{m}{32} + \frac{1}{256}} - \frac{1}{16}$ edges per side.

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A bipartition into two parts of equal size is called a *bisection*.

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Do judicious bisections always exist, inducing $\leq \frac{m}{4}$ edges per side?

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QUESTION (BOLLOBÁS-SCOTT)

What is the best result for graphs of minimum degree at least δ ?

MAIN RESULTS

THEOREM (LEE-L.-SUDAKOV)

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For even integers δ , graphs with all degrees $\geq \delta$ admit bisections that induce fewer than $(\frac{\delta+2}{4(\delta+1)} + o(1))m$ edges per side.

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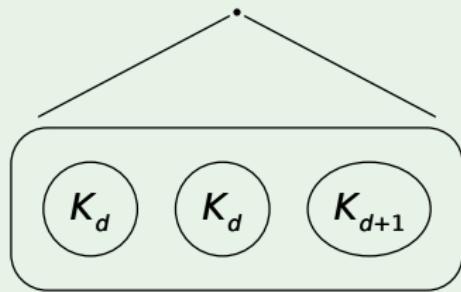
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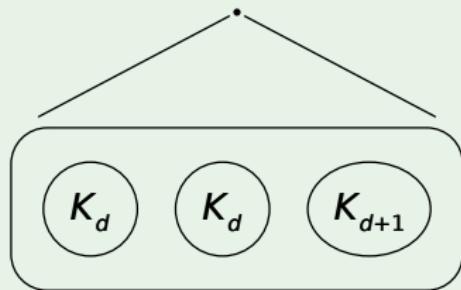
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Remark. For odd δ , the bound for $\delta - 1$ applies.

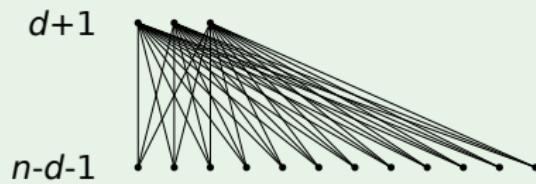
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CONSTRUCTION 2



RANDOMIZED BISECTION ALGORITHM

- Arbitrarily pair up vertices.
- Independently split each pair randomly.

Analysis.

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- Chebyshev: X exceeds $\mathbb{E}[X]$ by $2\sqrt{\text{Var}(X)}$ with probability at most $\frac{1}{4}$.
- There is an outcome with **both** $X, Y \leq \frac{m}{4} + 2\sqrt{\sum d(v)^2}$.

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- $\sum d(v)^2 \leq 2m\Delta \leq 2mn$.

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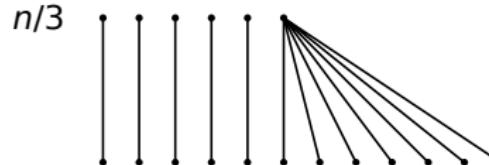
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Remark. Matches Max Cut bound; max degree condition is tight.



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- If d is the number of new edges contributed by adding u and v , then one orientation produces at least $\frac{d}{2}$ new crossing edges. □

Observations.

- If the new pair $\{u, v\}$ is actually an edge, then guarantee improves by $+\frac{1}{2}$.

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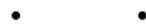
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- Also gain $+\frac{1}{2}$ if d is odd.

LARGE BISECTION

Proof of $\frac{m}{2} + \frac{n}{6}$ bound.

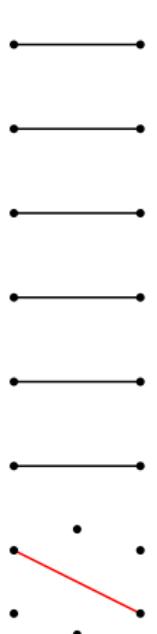


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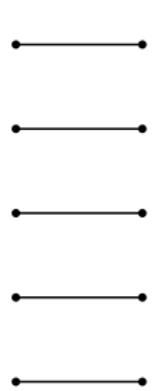
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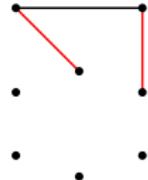
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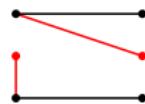


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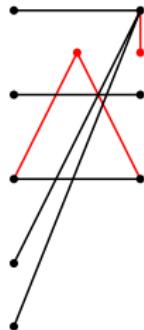
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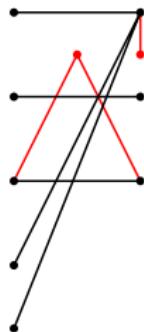
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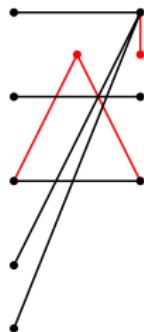
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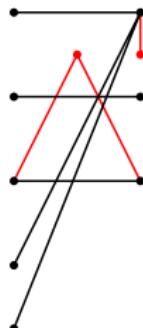
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- In both cases, there are at most $\frac{n}{3}$ unpaired vertices, hence at least $\frac{n}{3}$ pairs that are edges or odd-backs.
- Greedy algorithm gives bisection of size at least $\frac{m}{2} + \frac{n}{6}$. □

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