

BILL AND NATHAN, RECORD LECTURE!!!!

BILL RECORD LECTURE!!!

Lower Bounds on Approx Clique Via PCP and Gaps

Notation for Size of Max Clique

If G is a graph then

$\omega(G)$ = the size of the max clique in G .

CLIQUE and APPROX

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No. We will not quite show this but will show something close.

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We use the following in a poly time program for A :

1. The approx which gives $\geq n^{-\delta} \omega(G)$.
2. The $(c \lg n, d \lg n, \frac{1}{n})$ PCP for A .

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- 1) (\exists) a query that they answer differently. **Inconsistent**
- 2) (\forall) queries in common they answer the same. **Consistent**

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 - 4.2 $x \notin A \rightarrow \omega(G) \leq n^{d-1}$, so approx alg $\leq n^{d-1}$.
- In order to make these two cases not overlap we need

$$d - 1 < d - (c + d)\delta$$

$$\delta < \frac{1}{c + d}$$

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3. By our comments, no other case will occur.

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Alas **NO**, I do not know of any such results.

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 - 5) We now turn to a SAT-like non-approx result.