# BILL AND NATHAN, RECORD LECTURE!!!!

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#### BILL RECORD LECTURE!!!

TSP cannot be Approximated Unless P=NP

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#### Notation

In this slide packet G is always a weighted graph with natural number weights

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But what about approximating it? Need to define this carefully.

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- 4. Arora and Mitchell actually have an algorithm that works on *n* points in  $\mathbb{R}^d$  that runs in time  $O(n(\log n)^{O(\sqrt{d}/\epsilon)^{d-1}})$ .

# **TSP Does Not have an** $\alpha$ -**Approx**

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If G has a HAMC then  $OPT(G') \le n$  so  $M(G') \le \alpha n$ . If G has no HAMC then OPT(G') > B so M(G') > B.

Need to set B such that  $\alpha n < B$ .  $B = n^2$  will suffice.

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#### We can Do Better

We showed: Thm Let  $\alpha \ge 1$ . If there is an  $\alpha$ -approx for TSP then P=NP.

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We showed: **Thm** Let  $\alpha \ge 1$ . If there is an  $\alpha$ -approx for TSP then P=NP.

If you look at the proof more carefully you can prove this: Thm Let  $\alpha(n)$  be a polynomial. If there is an  $\alpha(n)$ -approx for TSP then P=NP.

Summary of Other Non-Approx Results

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But this was not very satisfying: it is plausible all these problems in MAXSNP had a PTAS.

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  - 2.3 If SET COVER has an  $(1 o(1)) \ln(n)$  approx then P = NP. (It is known to have a  $\ln(n)$ -approx. This took about 10 papers with many intermediary results.