# Pseudo-random graphs and bit probe schemes with one-sided error 

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Our technique: pseudo-random graphs

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Remark: $s=\Omega(n \log m)$
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3. Fredman-Komlós-Szemerédi (double hashing):

- good news: database of size $O(n \log m)$ bits
- good news: randomization only to constructe the database
- bad news: need to read $O(\log m)$ bits to answer a query


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- good news: read one bit to answer a query
- good news: memory $=O(n \log m)$
- bad news: exponential computations
- some news: two-sided errors
- bad news: need $\Omega\left(\frac{n^{2} \log m}{\log n}\right)$ for a one-sided error


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Do we cheat? Yes, we have changed the model!
We allow cached memory of size poly $(\log m)$.



Theorem. For any n-element set $A$ from an $m$-element universe there exists a randomized bit-probe scheme with one-sided error, with cache of size $O\left(\log ^{c} m\right)$ and database of size $O\left(n \log ^{2} m\right)$.
the left part: $m$ vertices; degree $d=O(\log m)$ the right part: $s=O\left(n \log ^{2} m\right)$ vertices

in the left part: set $A$ of $n$ vertices
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2nd idea: take a pseudo-random graph, cache the seed
We need a good PRG...

Fix a set $A$.
graph $G \longrightarrow \quad$ Test $\longrightarrow \begin{aligned} & \text { yes, if } G \text { is suitable for } A \\ & \text { no, otherwise }\end{aligned}$

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Size of the seed $=$ poly $(\log m)$.

Conclusion: a bit-probe scheme:

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Beyond this talk: combine our construction with Guruswami-Umans-Vadhan

- read two bit to answer a query
- one-sided error
- 1-st level "cache" memory = poly log $m$
- 2-nd level memory $=n^{1+\delta}$ poly log $m$
- computations in time poly $(n, \log m)$

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Thank you! Questions?

