



Lower Bounds for Number-in-Hand Multiparty Communication Complexity

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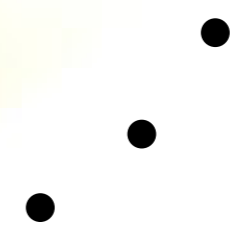
Jan. 17, 2012

The multiparty communication model

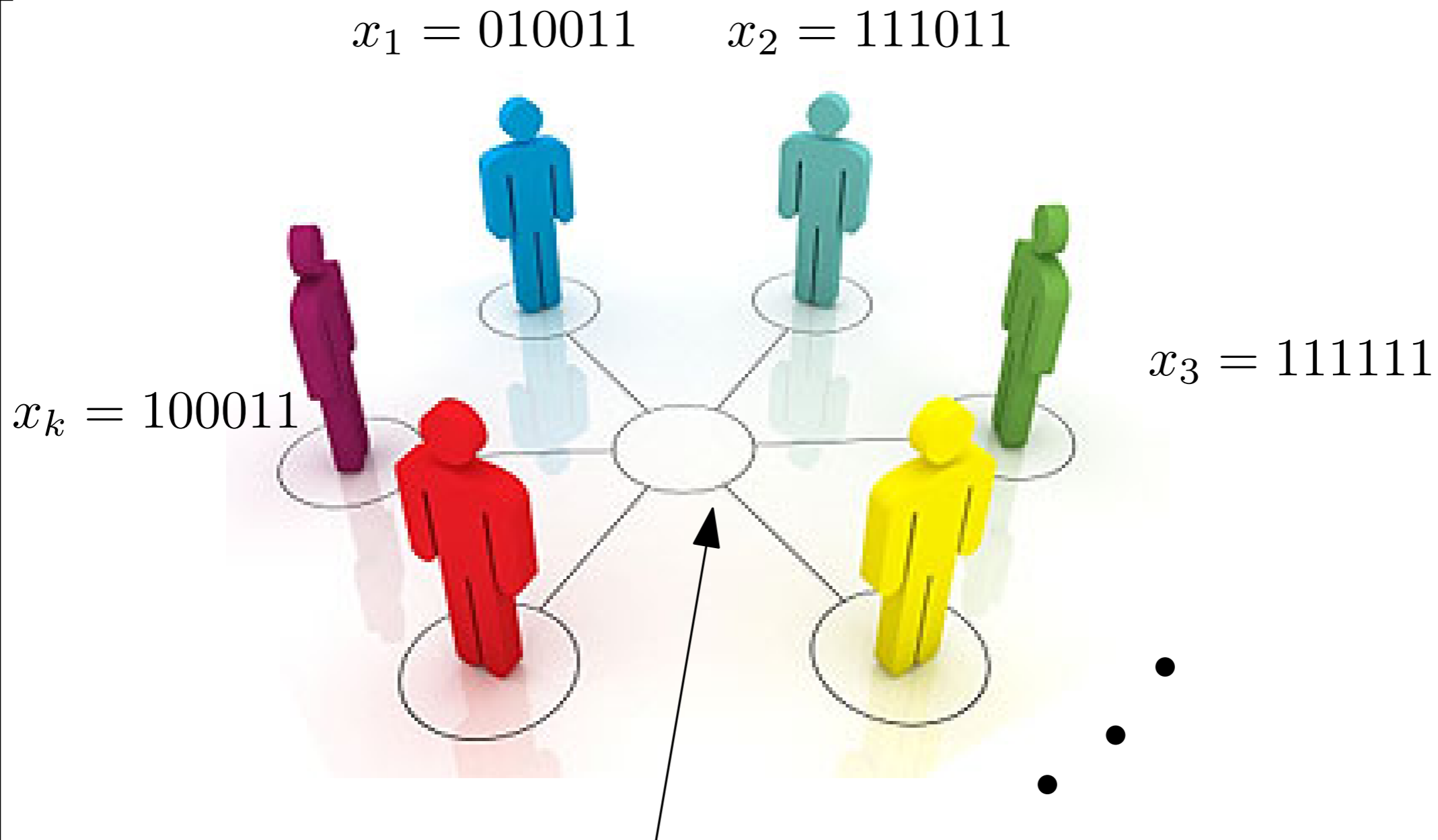
$$x_1 = 010011 \quad x_2 = 111011$$

$$x_k = 100011$$

$$x_3 = 111111$$



The multiparty communication model



We want to compute $f(x_1, x_2, \dots, x_k)$
 f can be bit-wise XOR, OR, AND, MAJ ...

The multiparty communication model

Blackboard: One speaks, everyone else hears.

Message passing: If x_1 talks to x_2 , others cannot hear. **Today's focus**

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by Duris and Rolim '98.

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- Gal and Gopalan for *“longest increasing sequence”*, '07.
and Guha and Huang for *“random order streams”*, '09.

Under “private message model” but it is different from ours.



Our results

1. $\Omega(nk)$ for the k -bitwise-XOR/OR/AND/MAJ.
2. $\Omega(n \log k)$ for k -bitwise-AND/OR in the black-board model.
3. $\tilde{\Omega}(nk)$ for k -connectivity.

All tight, and for randomized algorithms.

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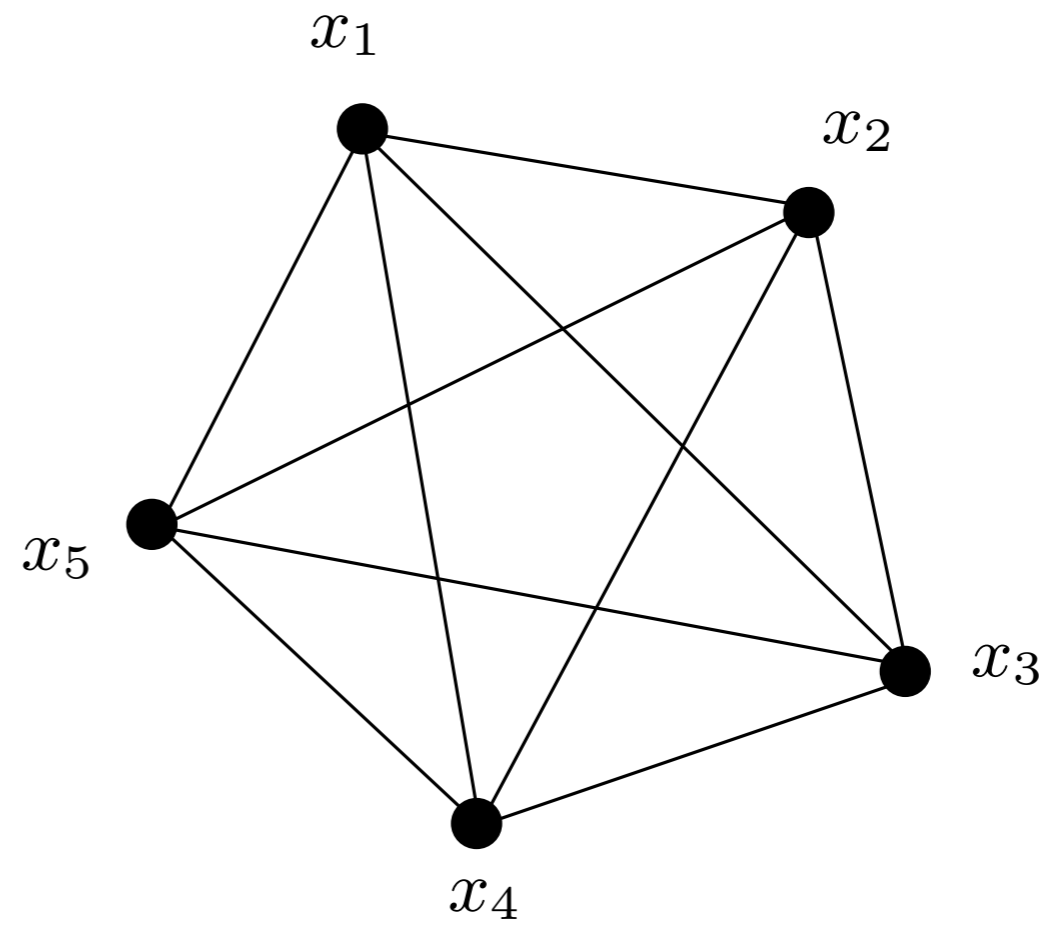
Artificial?

Well, some interesting problems can be reduced to these (later).

Warm up – k -bitwise-XOR

		1	0	...	0
XOR					
S_1		$A_{1,1}$	$A_{1,2}$...	$A_{1,n}$
S_2		$A_{2,1}$	$A_{2,2}$...	$A_{2,n}$
⋮					
$S_{\frac{k}{2}}$		$A_{\frac{k}{2},1}$	$A_{\frac{k}{2},2}$...	$A_{\frac{k}{2},n}$
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S_k		$A_{k,1}$	$A_{k,2}$...	$A_{k,n}$

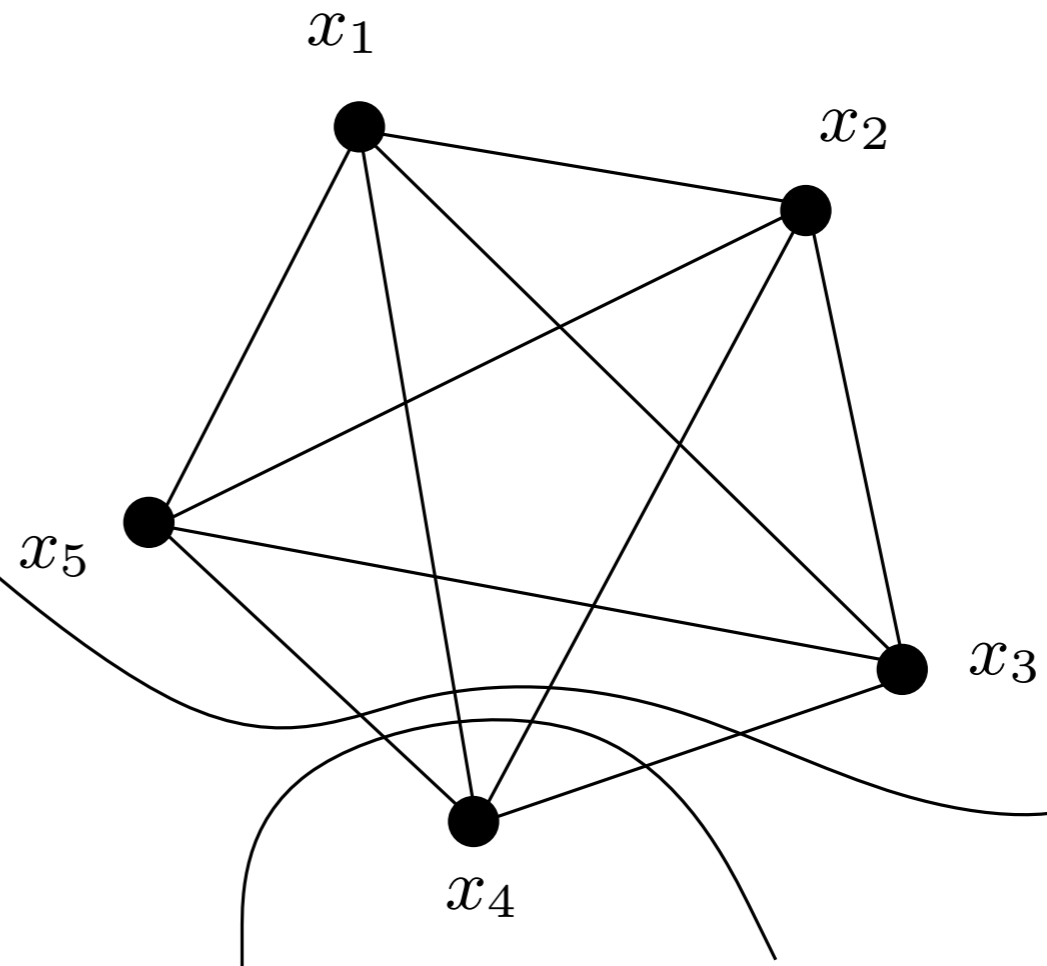
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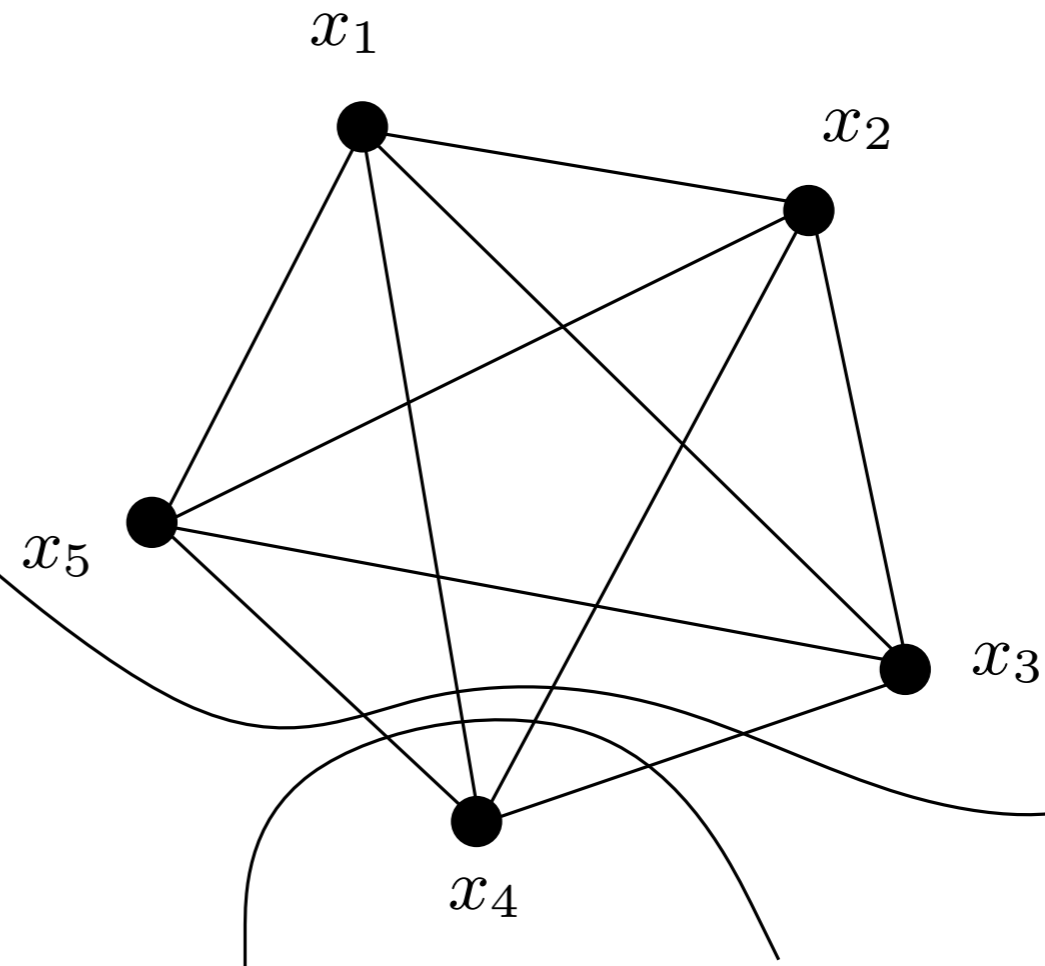
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the **expected** CC(x_4 : others)
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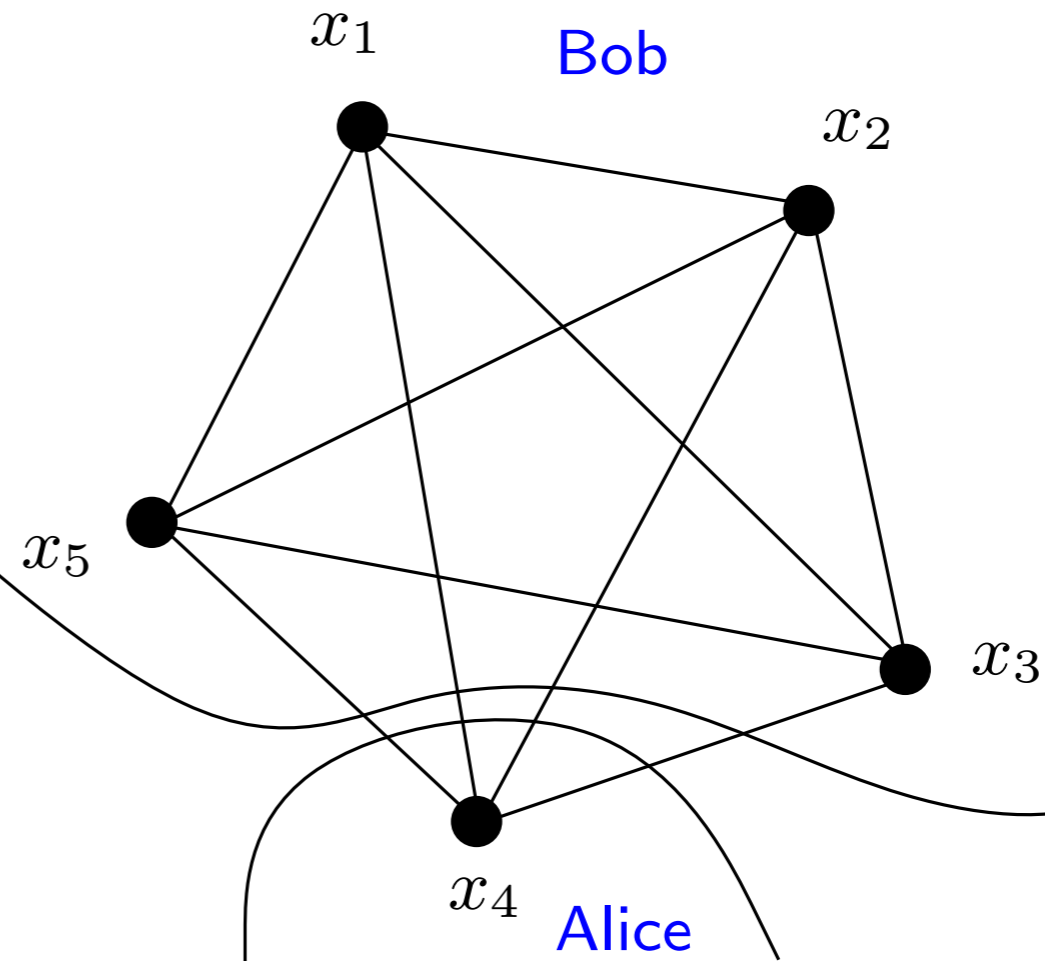


Alice and Bob want to solve the **2-XOR** (the inputs are randomly from $\{0, 1\}^n$)
 \Rightarrow running a protocol for **k -XOR** as follows:

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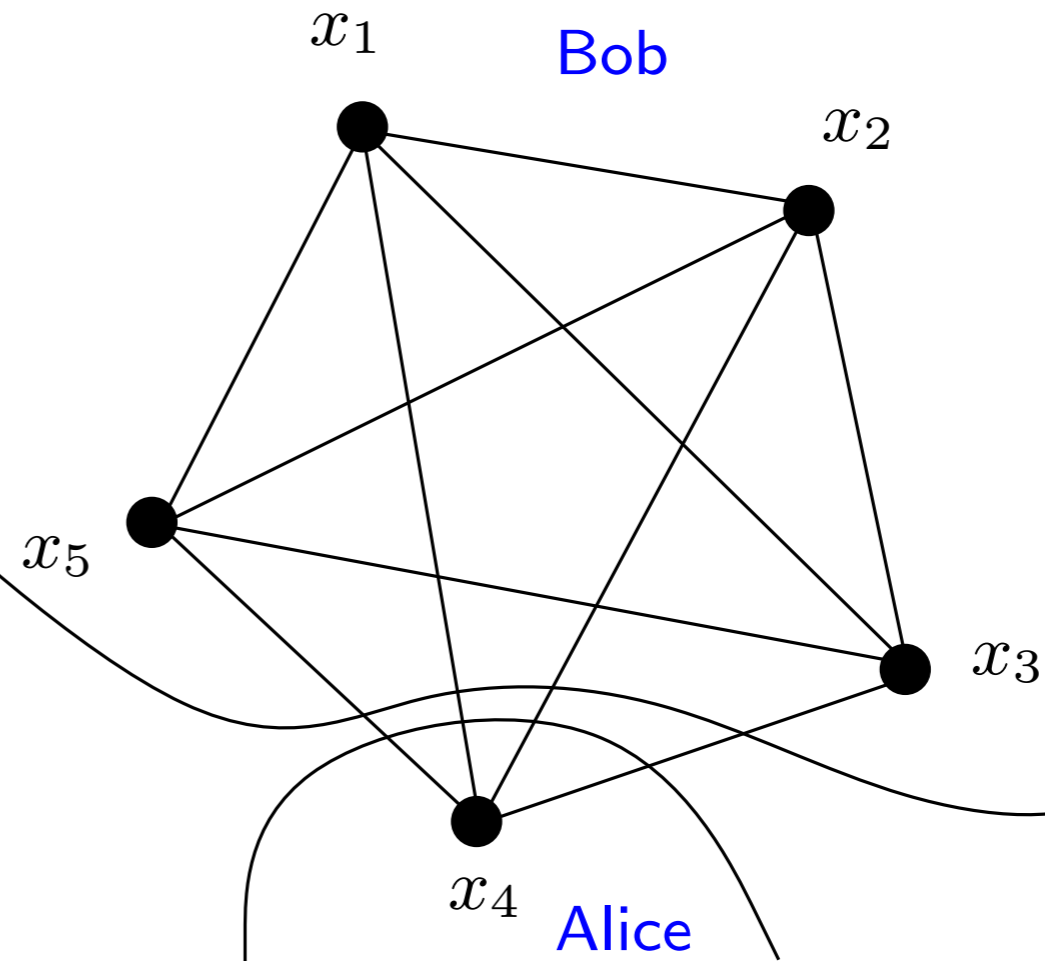
Bob plays another random guy with his input.

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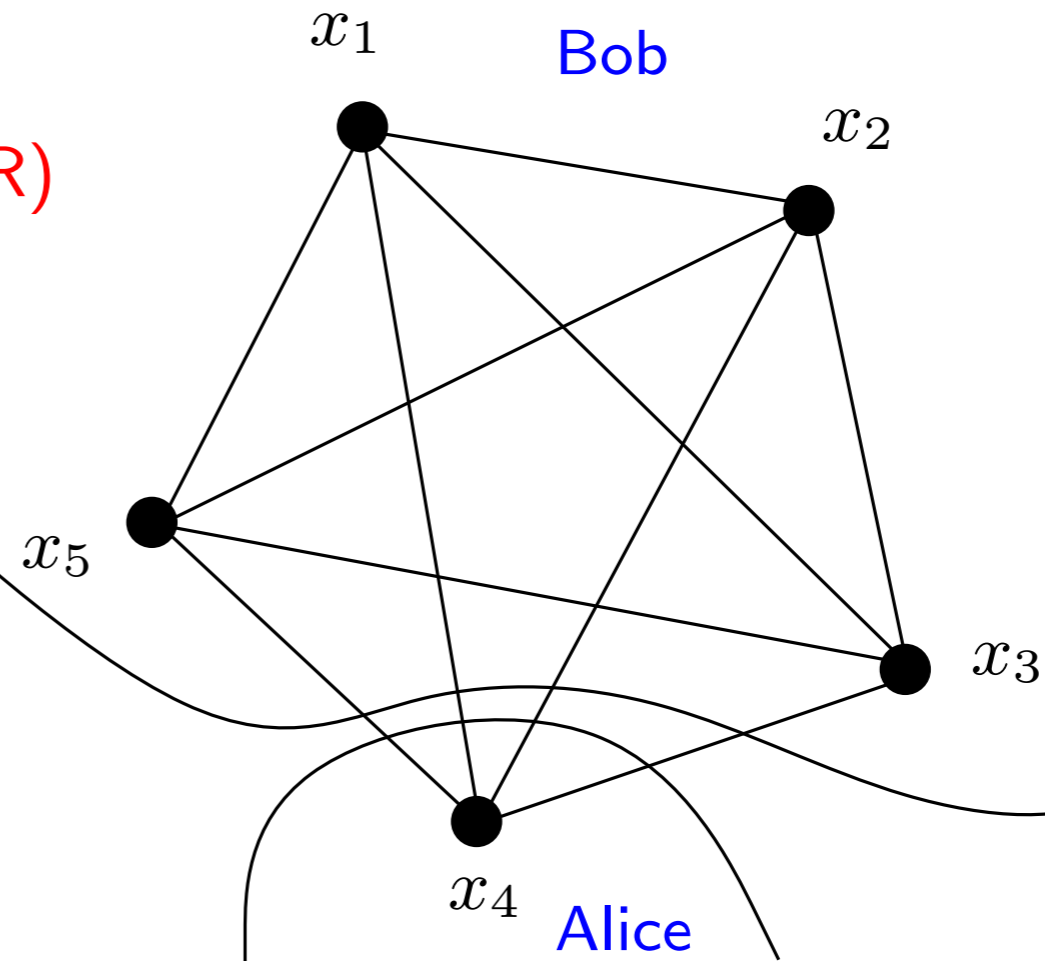
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$$\mathbf{E}[\text{CC}(2\text{-XOR})] \leq \frac{2}{k} \text{CC}(k\text{-XOR})$$

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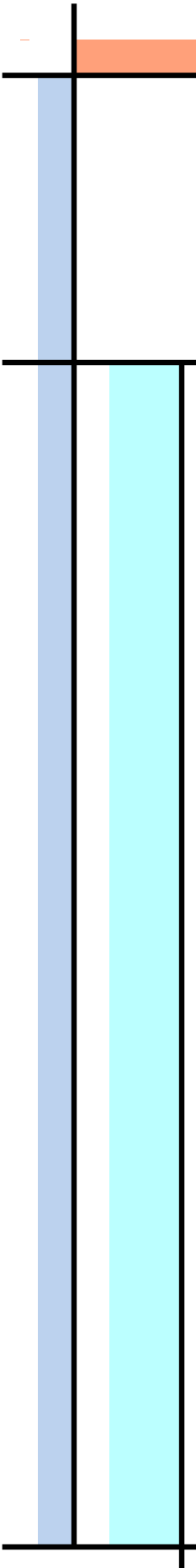
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Intuition to reduce from 2-DISJ

As always, first, try to find the hard distance for k -OR!

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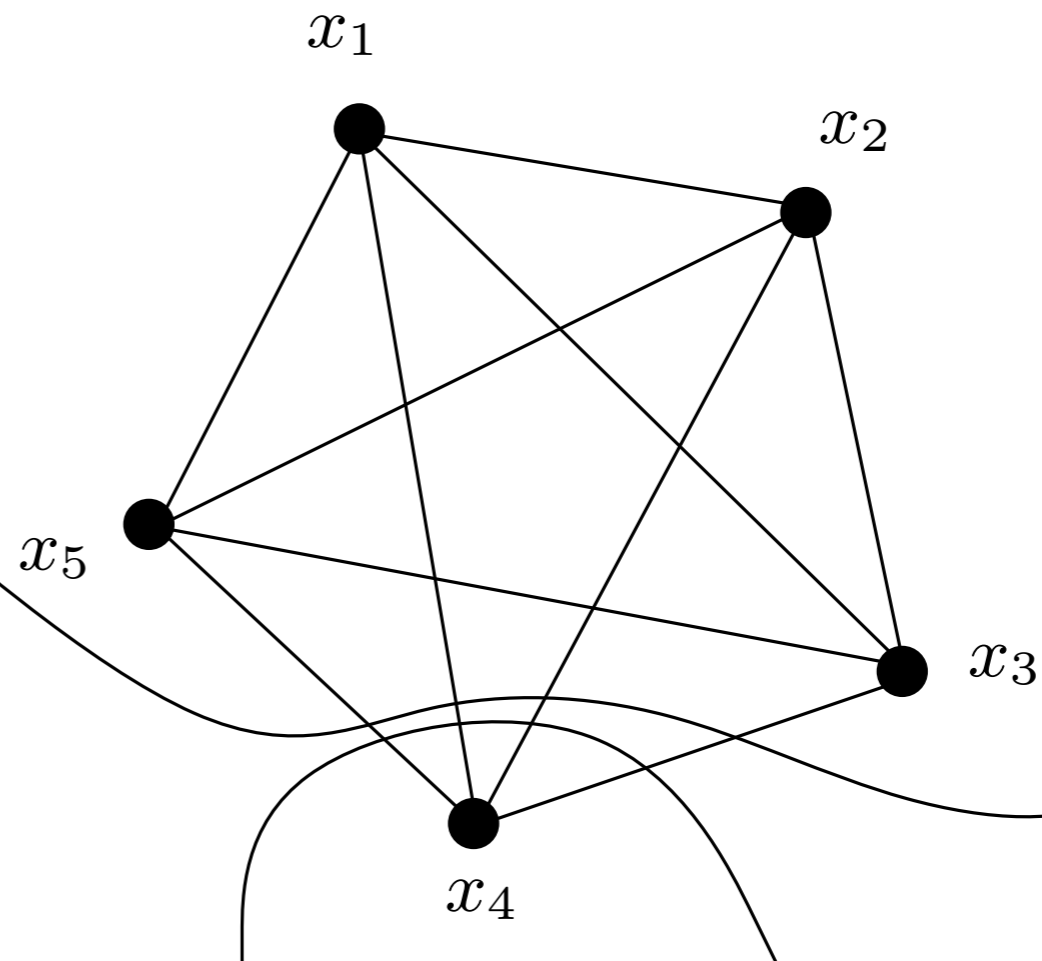
Now Alice takes one vector. Bob takes the other $k - 1$ vectors and OR them together, and then takes the complement.

Looks like 2-DISJ.

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2-DISJ: Alice has $x \in [n]$ and Bob has $y \in [n]$.

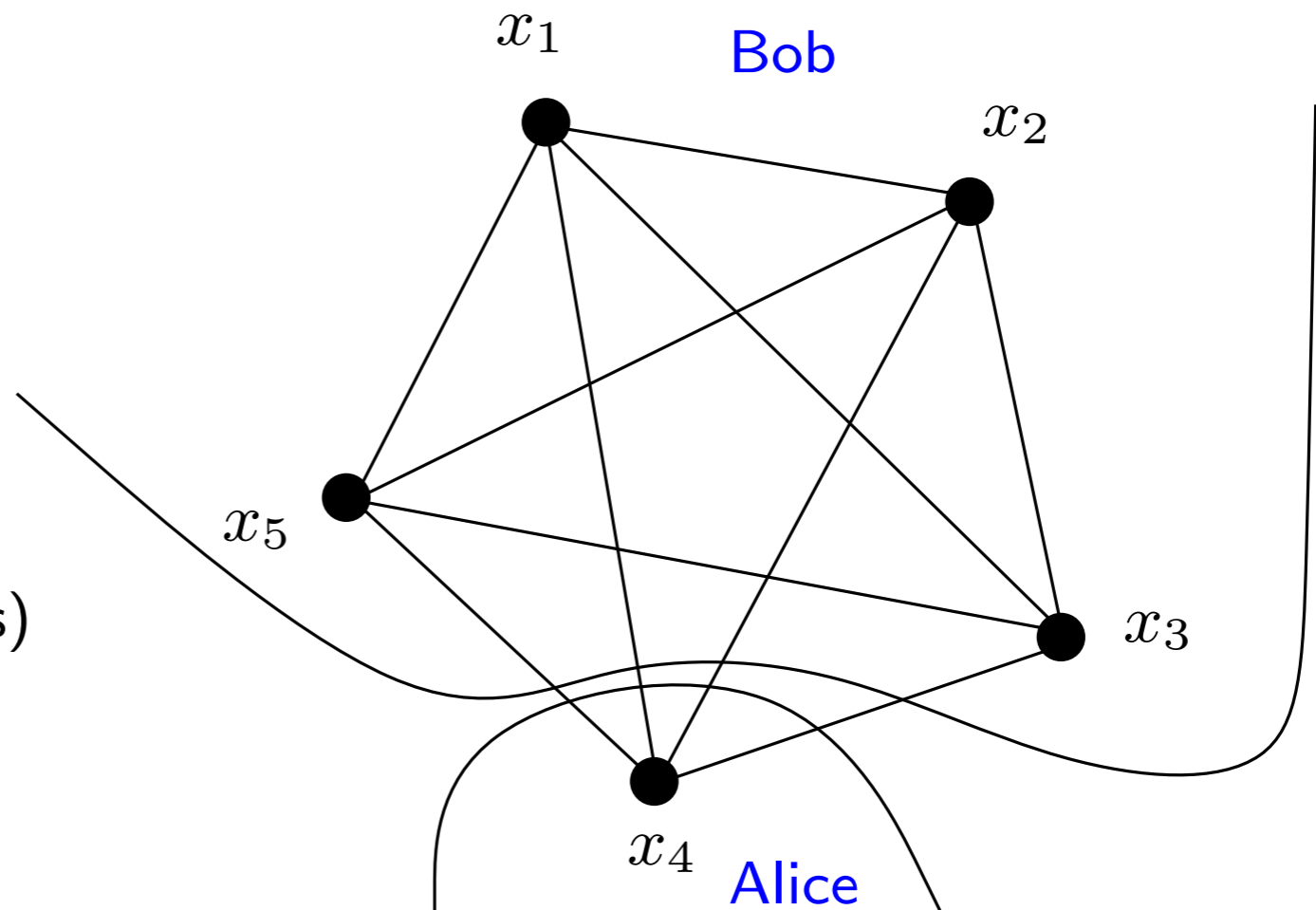
W.p. $1/4$, x and y are random subsets of $[n]$ of size $n/4$ and $|x \cap y| = 1$.

And w.p. $1 - 1/4$, x and y are random subsets of $[n]$ of size $n/4$ and $x \cap y = \emptyset$.

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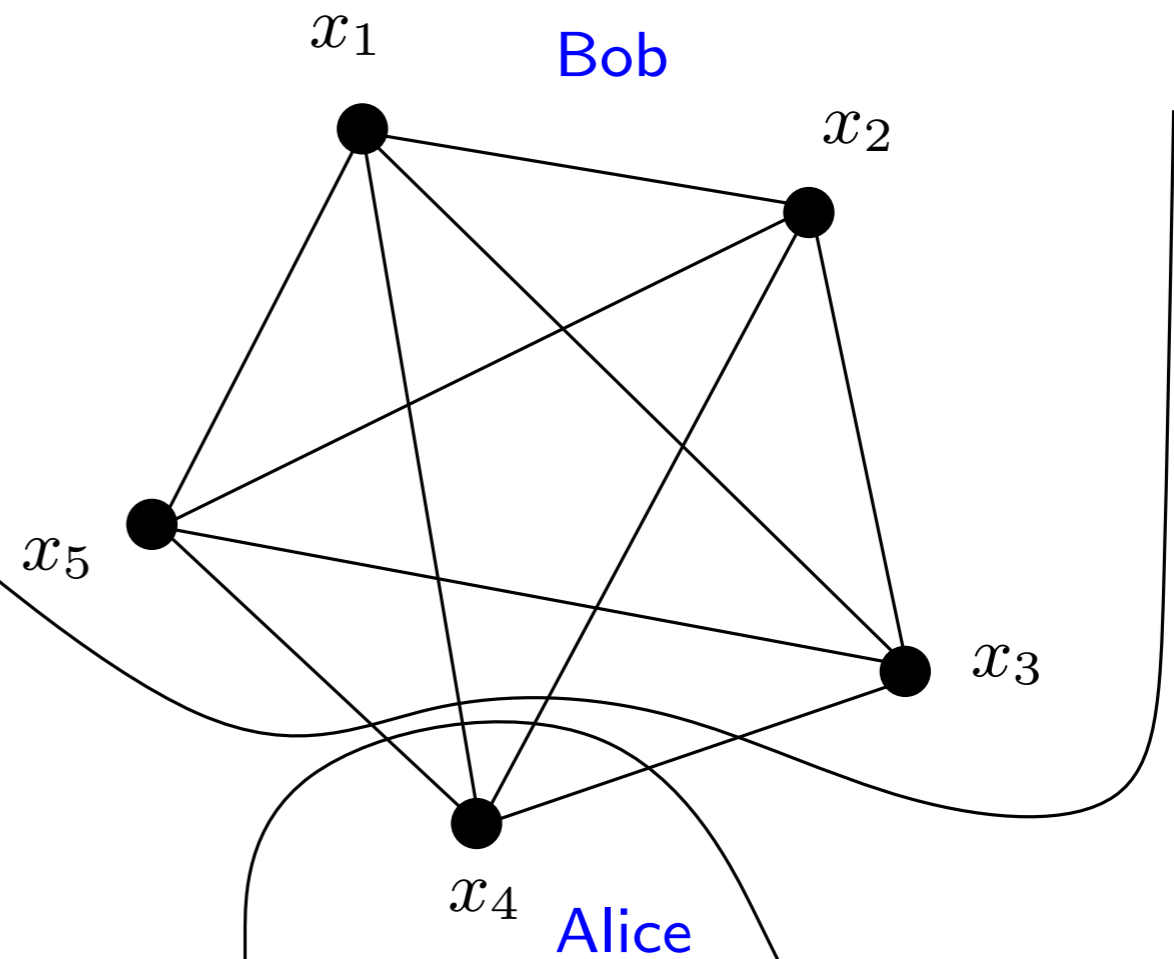
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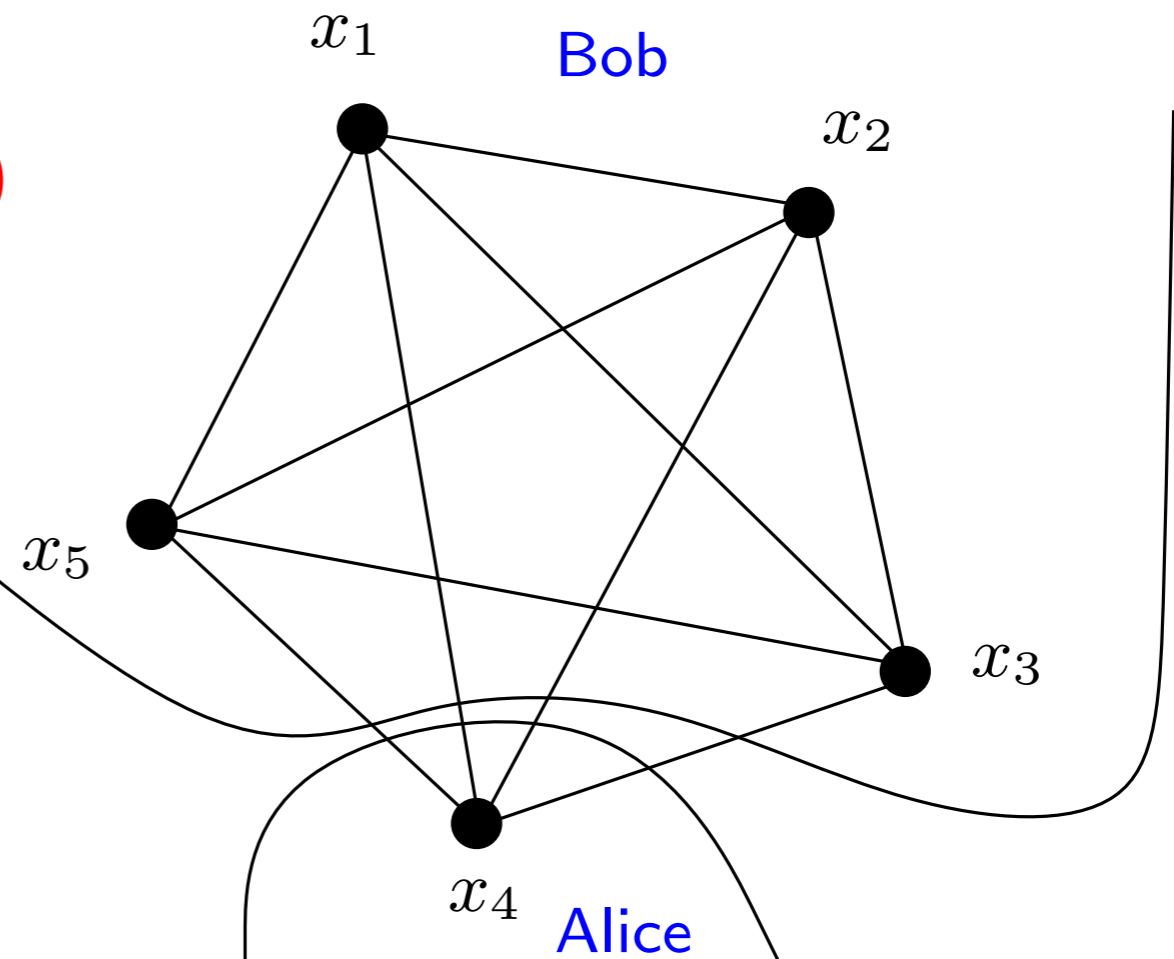
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Razborov[90]: $\Omega(n)$. $\Omega(nk)$

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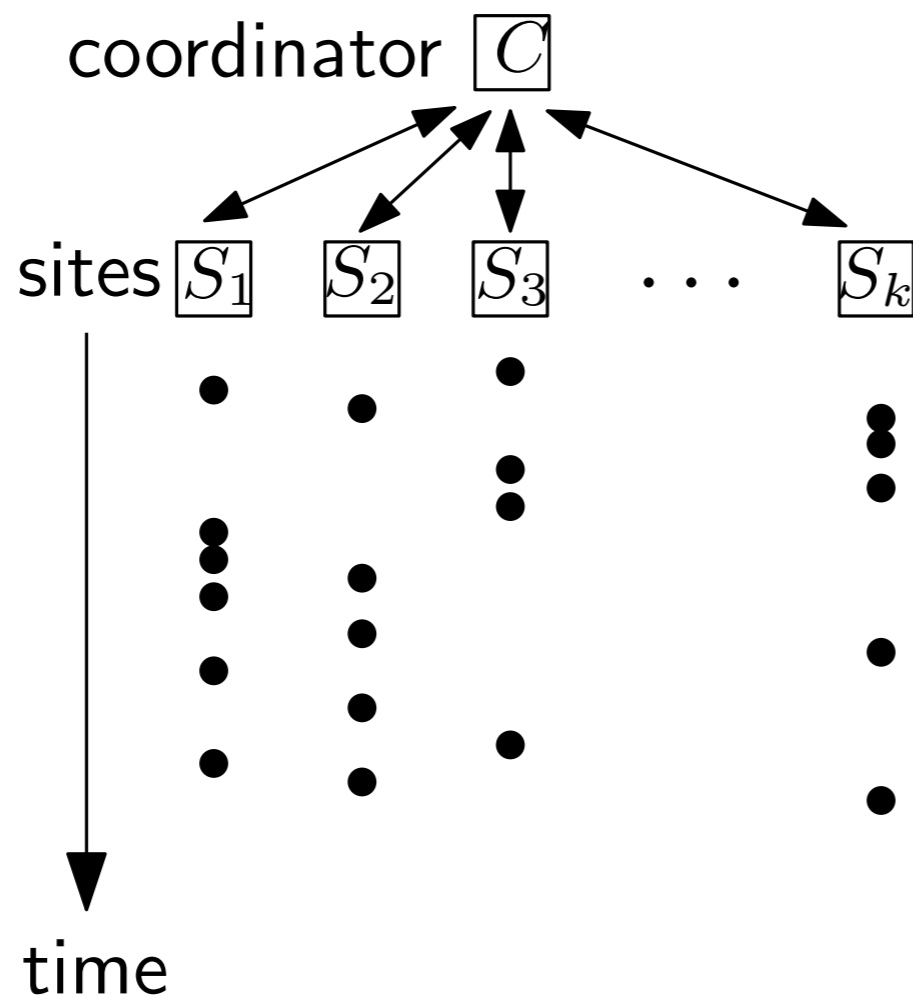
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Summary of other results

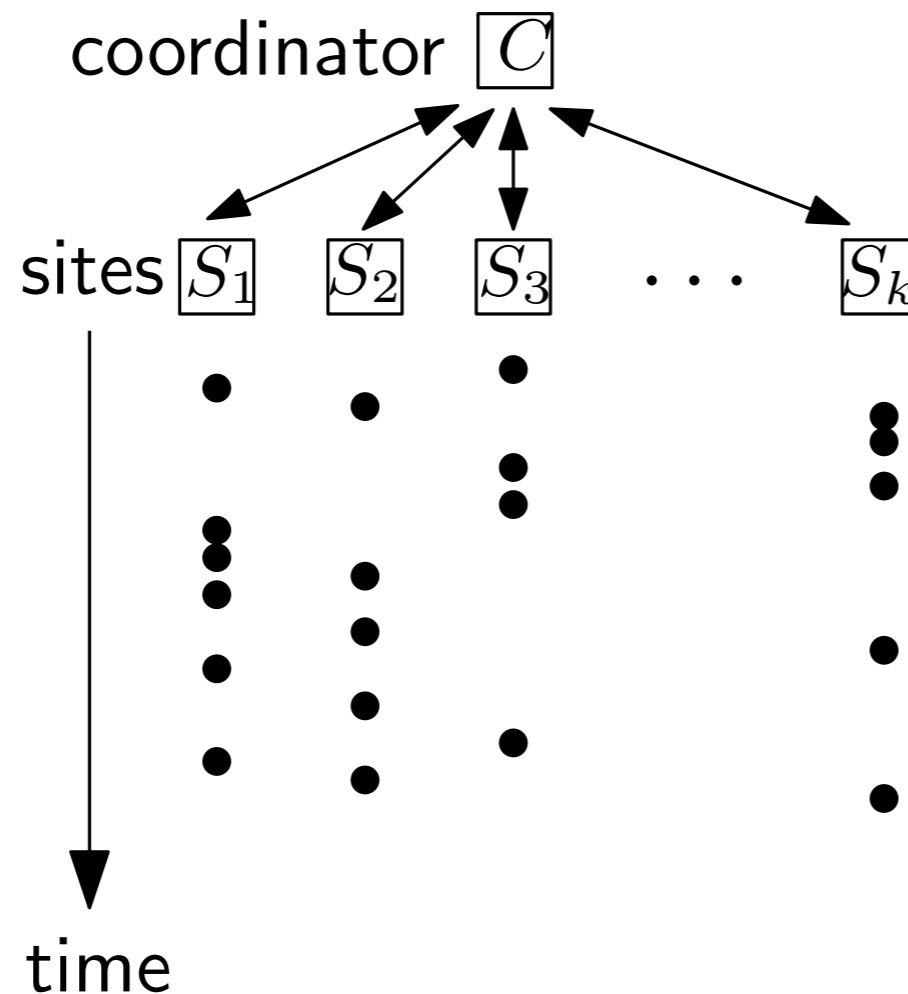
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3. $\tilde{\Omega}(nk)$ for k -connectivity.
(one of main technical contributions)
4. Some direct sum results.
5. Some applications, e.g. the heavy hitter problem and the ϵ -kernels in the site-server model (next page).

Motivation



The Distributed Streaming Model

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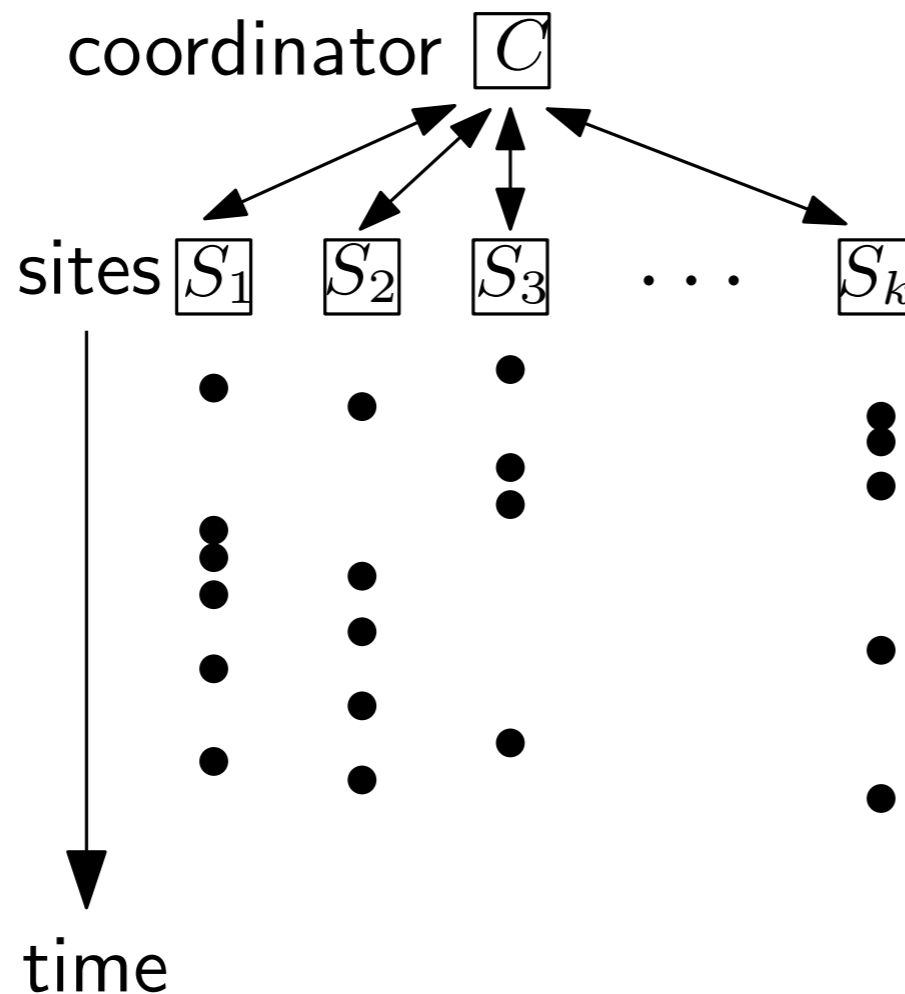
Static case (or the site-server model, exactly our model)

- Top- k (Can and Wang '04, Michel et. al. '05, Patt-Shamir and Shafrir '08)
- Heavy-hitter (Zhao et. al. '06, Huang et. al. '11)

Dynamic case

- Samplings (Cormode et. al. '10)
- Frequent moments (...)
- Heavy-hitter (...)
- Quantile (...)
- Entropy (...)
- Various sketches (...)
- Non-linear functions (...)

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The Distributed Streaming Model

A large number of upper bounds,
but very few lower bounds.

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A stream of data that can only be scanned from left to right. The goal is to compute some function of the stream, and minimize the space usage.

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- **Secure Multiparty Computation:**
Players who do not trust each other, but want to compute a joint function of their inputs.
- **Streaming:**
A stream of data that can only be scanned from left to right. The goal is to compute some function of the stream, and minimize the space usage.
- Some nice lower bounds given, e.g., by [Bar-Yossef et al. '04](#) for frequent moments, but [in blackboard model](#) or the “one way” [private message model](#).



Discussions

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 - ▣ E.g. k -DISJ ...
- ▣ Require proving distributional lower bounds for 2-player problems, often over somewhat-convoluted distributions.
 - ▣ Can we avoid this?
- ▣ In order to use symmetrization, one needs to find a hard distribution for the k -player problem which is symmetric.
 - ▣ Can we relax or generalize this?

List of other problems

- **Coordinate-wise problems:** Each player gets a vector of length n . Some symmetric coordinate-wise function $g : \{0, 1\}^k \rightarrow \{0, 1\}$ is applied, resulting in a length n vector. Then a “combining function” $h : \{0, 1\}^n \rightarrow Z$ is applied to the bits of the result.
- **Equality:** Each player gets a vector of length n , and the goal is to decide whether all players have received the same vector.
- **Graph problems**
- **Pointer Chasing**
- ...



The End

THANK YOU

Q and A