

# On the complexity of distributions

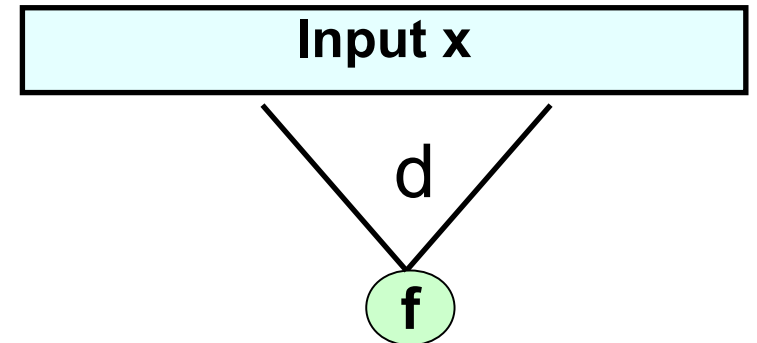
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Laci Babai's 60th birthday conference  
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# Local functions

- $f : \{0,1\}^n \rightarrow \{0,1\}$  **d-local** :  
output depends on d input bits



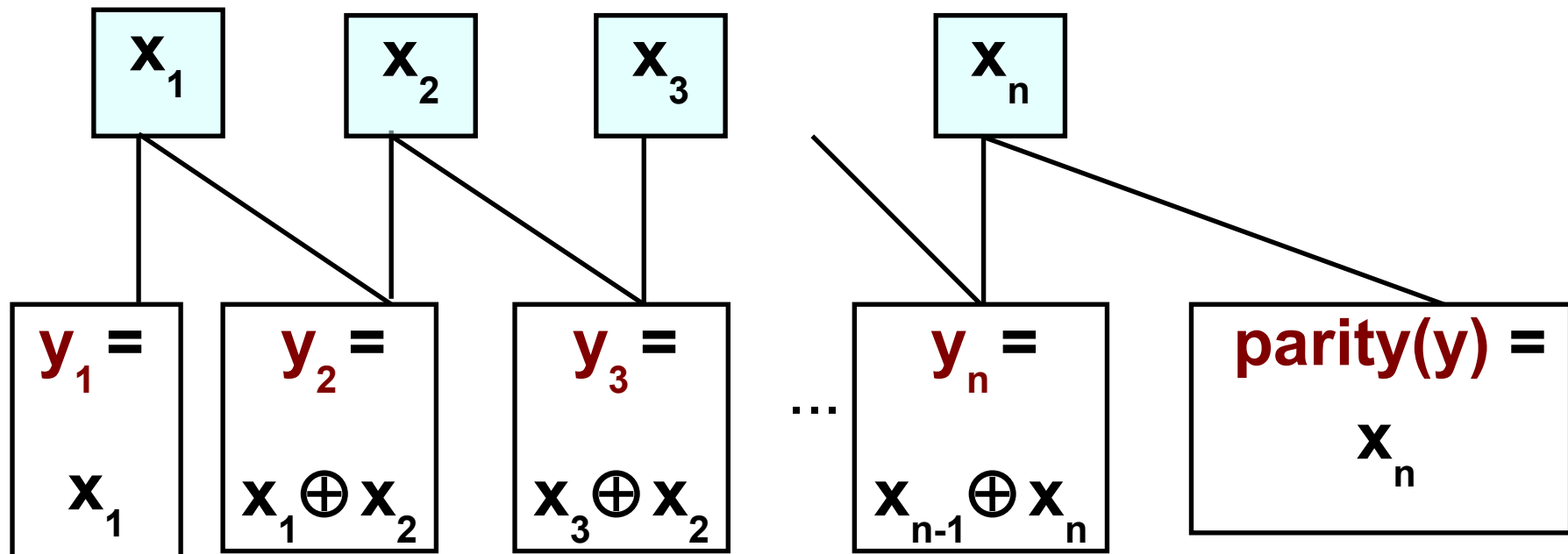
- **Fact:**  $\text{Parity}(x) = 1 \Leftrightarrow \sum x_i = 1 \pmod{2}$   
is not  $n-1$  local
- Proof: Flip any input bit  $\Rightarrow$  output flips  $\blacklozenge$

# Local generation of $(Y, \text{parity}(Y))$

- Theorem** [Babai '87]

There is  $f : \{0,1\}^n \rightarrow \{0,1\}^{n+1}$ , each bit is 2-local

Distribution  $f(X) \equiv (Y, \text{parity}(Y))$  ( $X, Y \in \{0,1\}^n$  uniform)



# Message

- Complexity theory of **distributions** (as opposed to functions)

How hard is it to generate distribution  $D$  given random bits ?

E.g.,  $D = (Y, \text{parity}(Y))$ ,  $D = W_k := \text{uniform } n\text{-bit with } k \text{ 1's}$

# Rest of this talk

- Connection with succinct data structures
- Lower bound for generating  $W_{n/2}$  = uniform n-bit with n/2 1's
- Other results and conclusion

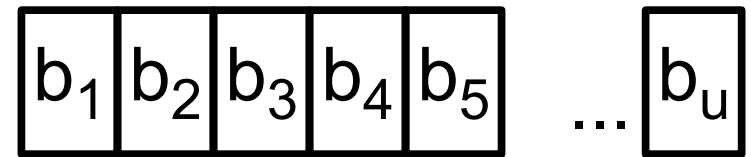
# Succinct data structures for sets

- Store  $S \subseteq \{1, 2, \dots, n\}$  of size  $|S| = k$



Store

In  $u$  bits  $b_1, \dots, b_u \in \{0,1\}$



- Want:

Small space  $u$  (optimal =  $\lceil \lg_2 \binom{n}{k} \rceil$ )

Answer “ $i \in S$ ?” by probing few bits (optimal = 1)

- In combinatorics: Nešetřil Pultr, ..., Körner Monti

# Previous results

- Store  $S \subseteq \{1, 2, \dots, n\}$ ,  $|S| = k$ , in bits, answer “ $i \in S?$ ”
- [Minsky Papert '69, Buhrman Miltersen Radhakrishnan Venkatesh; Pagh; ...; Pătrașcu; V. '09]
- Surprising upper bounds  
space = optimal +  $o(n)$ , probe  $O(\log n)$
- No lower bounds for  $k = n / 2^a$

# General connection

- **Claim:** If store  $S \subseteq \{1, 2, \dots, n\}$ ,  $|S| = k$  in  $u = \text{optimal} + r$  bits answer “ $i \in S?$ ” by (non-adaptively) probing  $d$  bits.

Then  $\exists f : \{0, 1\}^u \rightarrow \{0, 1\}^n$ ,  $d$ -local

Distance(  $f(X)$ ,  $W_k = \text{uniform set of size } k$ )  $< 1 - 2^{-r}$

$$\left( \text{distance}(A, B) := \max_T \left| \Pr[A \in T] - \Pr[B \in T] \right| \right)$$

- **Proof:**  $f_i := \text{“}i \in S\text{”}$

$f(X) = W_k$  with probability  $\binom{n}{k} / 2^u = 2^{-r}$  ♦



# Our result

- **Theorem:**  $f : \{0, 1\}^{\text{optimal} + n^{o(1)}} \rightarrow \{0, 1\}^n$ ,  $(d < \varepsilon \log(n))$ -local.  
Distance( $f(X)$ ,  $W_k = \text{uniform set of size } k = \Theta(n)$ )  $> 1 - n^{-\Omega(1)}$
- Tight up to  $\Omega()$  if  $k = n/2$ :  $f(x) = x$ ,  $(n \text{ choose } n/2) = O(2^n/\sqrt{n})$
- **Corollary:** To store  $S \subseteq \{1, 2, \dots, n\}$ ,  $|S| = k = n / 2^a$   
answer “ $i \in S?$ ” probing  $d < \varepsilon \log(n)$  bits:  
Need space  $> \text{optimal} + \Omega(\log n)$

# Rest of this talk

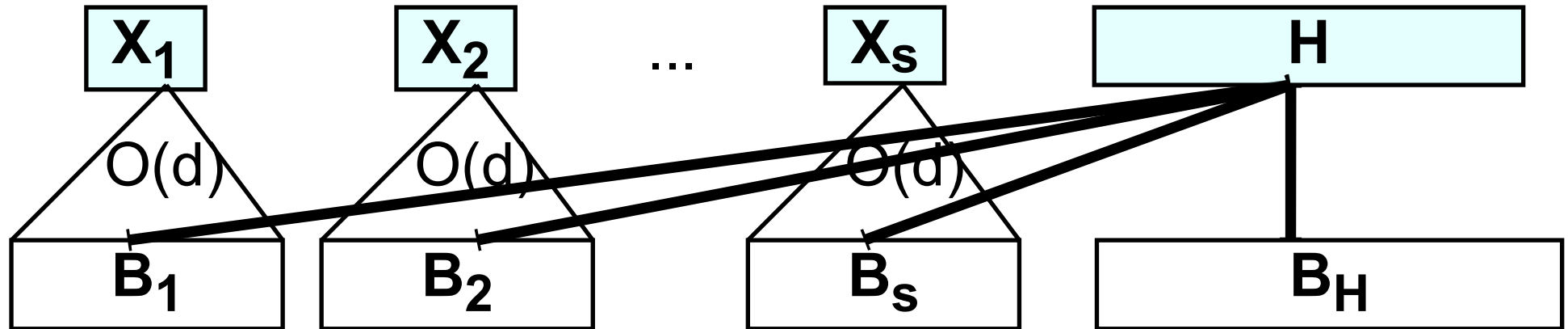
- Connection with succinct data structures
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- Other results and conclusion

# Our result

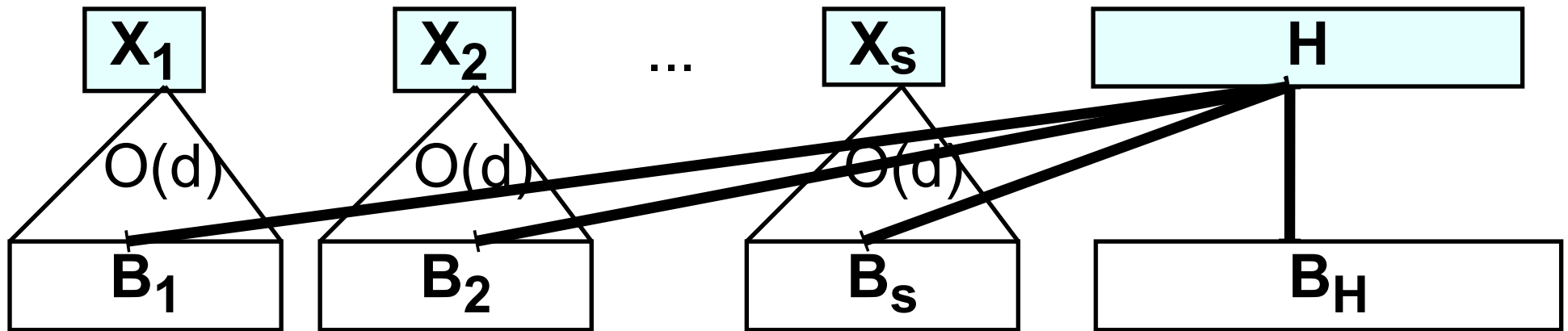
- **Theorem:** Let  $f : \{0,1\}^n \rightarrow \{0,1\}^n : (d=O(1))$ -local.  
There is  $T \subseteq \{0,1\}^n : \left| \Pr[f(x) \in T] - \Pr[W_{n/2} \in T] \right| > 1 - n^{-\Omega(1)}$
- **Warm-up** scenarios:
  - $f(x) = 000111$     **Low-entropy**     $T := \{ 000111 \}$   
 $\left| \Pr[ f(x) \in T] - \Pr[W_{n/2} \in T] \right| = \left| 1 - |T| / \binom{n}{n/2} \right|$
  - $f(x) = x$     **“Anti-concentration”**     $T := \{ z : \sum_i z_i = n/2 \}$   
 $\left| \Pr[ f(x) \in T] - \Pr[W_{n/2} \in T] \right| = \left| 1/\sqrt{n} - 1 \right|$

# Proof

- Partition input bits  $X = (X_1, X_2, \dots, X_s, H)$



- Fix  $H$ . Output block  $B_i$  depends only on bit  $X_i$
- Many  $B_i$  constant (  $B_i(0,H) = B_i(1,H)$  )  $\Rightarrow$  **low-entropy**
- Many  $B_i$  depend on  $X_i$  (  $B_i(0,H) \neq B_i(1,H)$  )  
Intuitively, **anti-concentration**: output bits can't sum to  $n/2$



- If many  $B_i(0,H)$ ,  $B_i(1,H)$  have **different sum of bits**, use

**Anti-concentration Lemma** [ Littlewood Offord ]

For  $a_1, a_2, \dots, a_s \neq 0$ , any  $c$ ,  $\Pr_{X \in \{0,1\}^s} [\sum_i a_i X_i = c] < 1/\sqrt{n}$

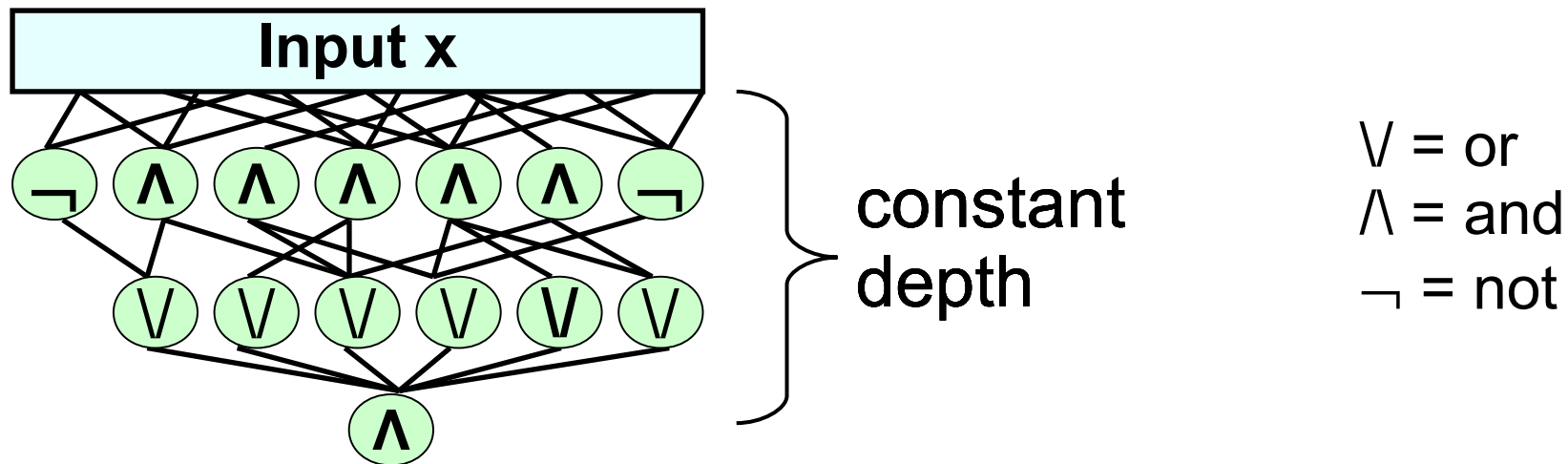
- **Problem:**  $B_i(0,H) = 100$ ,  $B_i(1,H) = 010$   
high entropy but no anti-concentration
- **Fix:** want many blocks 000, so high entropy  $\Rightarrow$  different sum

# Rest of this talk

- Connection with succinct data structures
- Lower bound for generating  $W_{n/2}$  = uniform n-bit with n/2 1's
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# Other directions and results

- More general model: small bounded-depth circuits ( $AC^0$ )



- **Challenge:**  $\exists$  explicit boolean  $f$  : cannot generate  $(Y, f(Y))$  ?
- **Theorem** [Matias Vishkin, Hagerup, Czumaj Kanarek Lorys Kutylowski, [V.](#)]  
**Can** generate  $(Y, \text{majority}(Y))$  (exp. small error)
- **Theorem** [Lovett [V.](#)] **Cannot** generate error-correcting **code**

# Conclusion

- Complexity of distributions = uncharted territory
- Lower bound for generating  $W_k$  locally
- $\Rightarrow$  lower bound for succinct data structures for storing sets of size  $n / 2^a$



- $\Sigma \Pi \forall \exists \cup \cap \subseteq \supseteq \neq \approx \Downarrow \Uparrow \Leftarrow \Leftrightarrow \wedge \vee \geq \leq \forall \exists \Omega \alpha \beta \epsilon \gamma \delta \rightarrow$
- $\neq \approx$

# More connections

- More uses of generating  $W_k :=$  uniform  $n$ -bit string with  $k$  1's
- McEliece cryptosystem
- Switching networks, ...

# Previous results

- Store  $S \subseteq \{1, 2, \dots, n\}$ ,  $|S| = k$ , in bits, answer “ $i \in S?$ ”
- [Minsky Papert '69] Average-case study
- [Buhrman Miltersen Radhakrishnan Venkatesh; Pagh '00]  
Space  $O(\text{optimal})$ , probe  $O(1)$  when  $k = \Theta(n)$   
Lower bounds for  $k < n^{1-\epsilon}$
- [..., Pagh, Pătraşcu] space = optimal +  $o(n)$ , probe  $O(\log n)$
- [V. '09] lower bounds for  $k = \Omega(n)$ , **except**  $k = n / 2^a$