

Toward Better Formula Lower Bounds: An Information Complexity Approach to the KRW Composition Conjecture

Dmitry Gavinsky Or Meir Omri Weinstein Avi Wigderson

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- **This talk:** Fan-in is **2**.

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- **This talk:** Log-depth circuits and formulas.

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- The class \mathbf{NC}_1 can be defined as
 - The class of functions f with $D(f) = O(\log n)$.
 - The class of functions f with $L(f) = \text{poly}(n)$.
- Major open problem: Prove $\mathbf{NC}_1 \neq \mathbf{P}$.

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- The composition $g \circ f : \{0, 1\}^{m \times n} \rightarrow \{0, 1\}$ is

$$(g \circ f)(x_1, \dots, x_m) = g(f(x_1), \dots, f(x_m)).$$

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- Implies that $\mathbf{NC}_1 \neq \mathbf{P}$.
- Compose a random function on $\log n$ bits for $\log n$ times.

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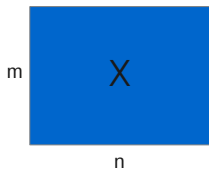
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- [KW90]: $D(f) = C(R_f)$.
- Only **deterministic** protocols!

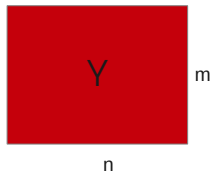
KRW and KW

- Can we use KW relations to attack the KRW conjecture?
- How does $R_{g \circ f}$ look like?
- Recall: $g \circ f$ maps $\{0, 1\}^{m \times n}$ to $\{0, 1\}$.

Alice

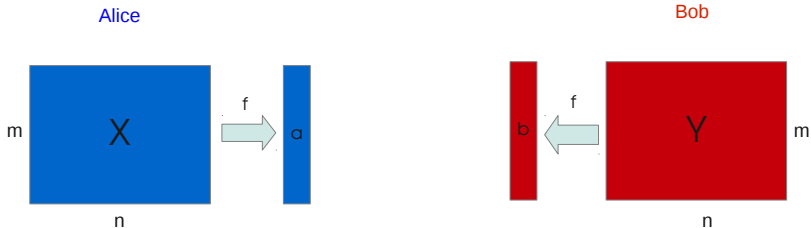


Bob



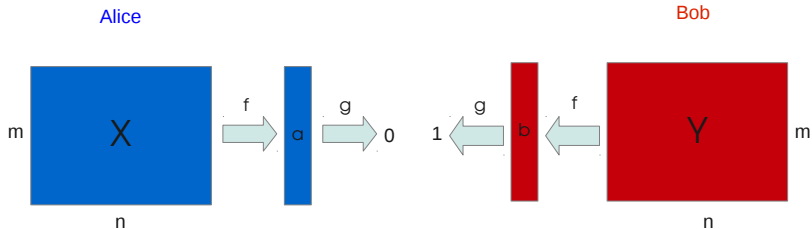
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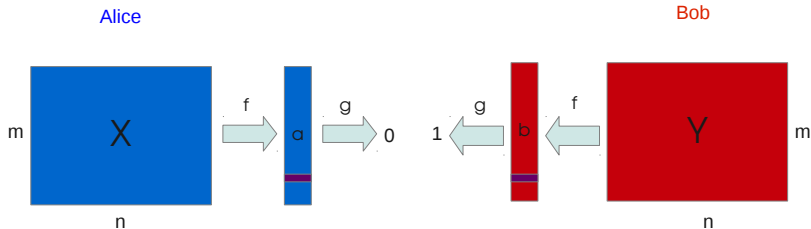
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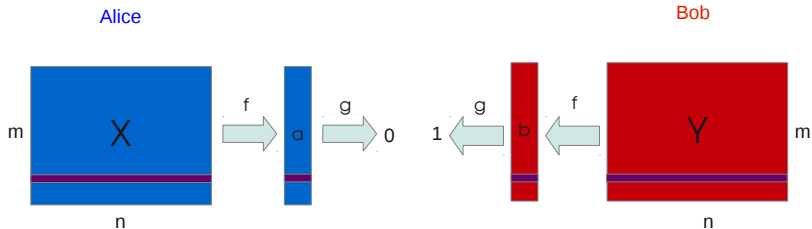
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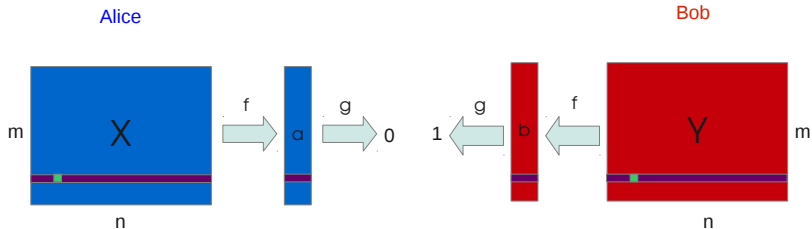
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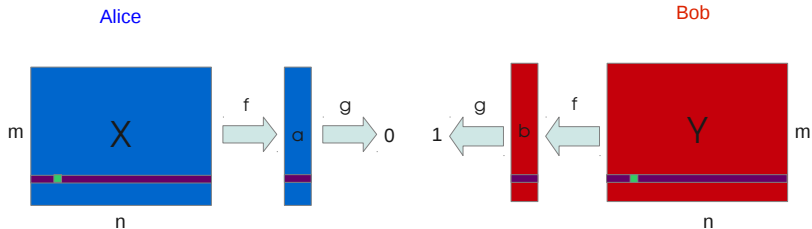
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- **KRW conjecture:** the trivial protocol is essentially optimal.

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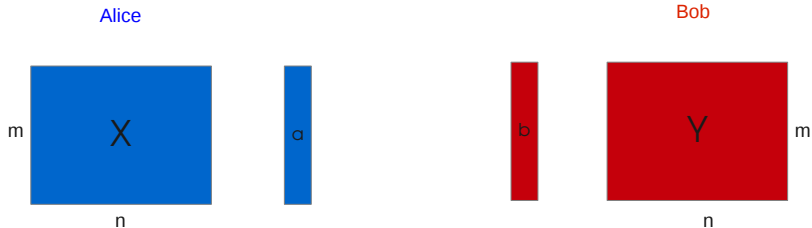
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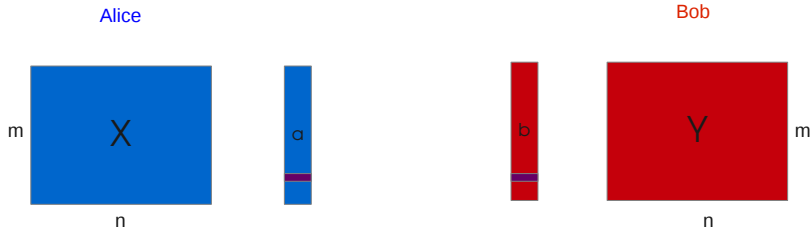
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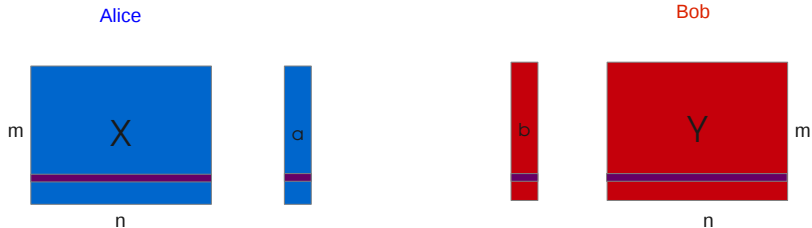
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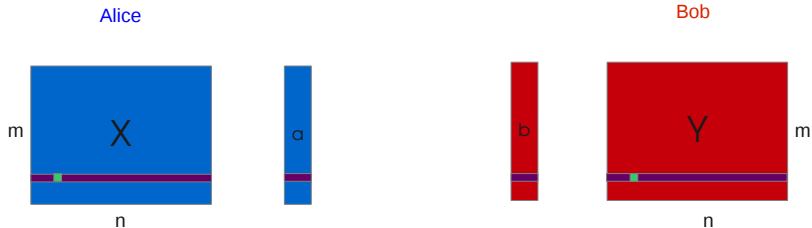
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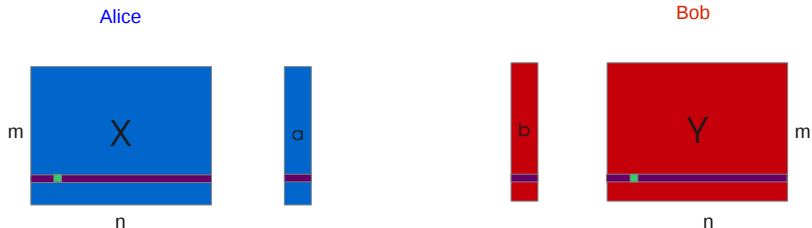
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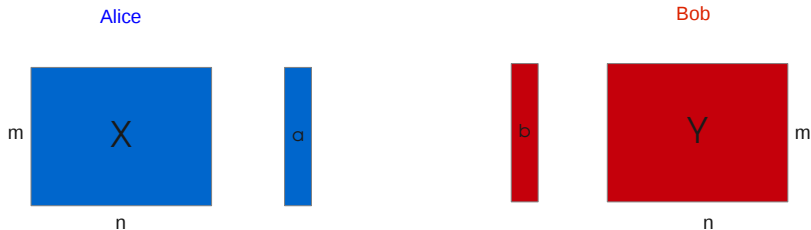
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- Every KW relation R_{gof} reduces to $R_{U_m \circ U_n}$.

The composition of the universal relation

- Goal: $C(R_{U_m \circ U_n}) \geq m + n$.
- Challenge was met by [EIRS91] and [HW93].
- To this end, they developed new techniques.



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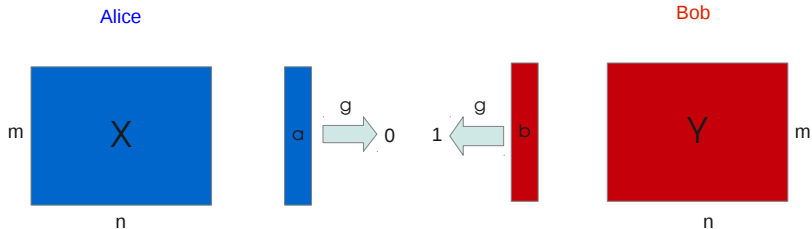
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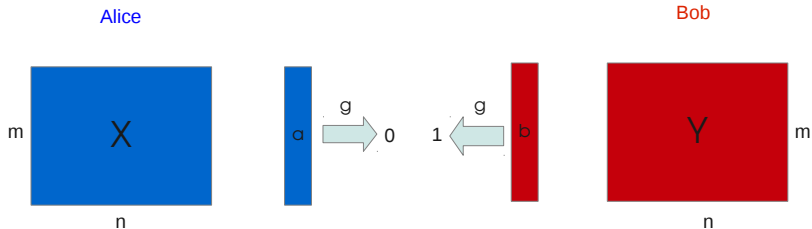
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- Our result: $C(R_{g \circ U_n}) \geq \Omega(C(R_g)) + n - O\left(\frac{m \cdot \log m}{n}\right)$.
- Actually: $C(R_{g \circ U_n}) \geq \log L(g) + n - O\left(\frac{m \cdot \log m}{n}\right)$.

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- Every KW game $R_{g \circ f}$ reduces to $R_{g \circ U_n}$.

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- Lower bound communication complexity by analyzing the information that protocol gives on players' inputs.
- $\log L(g)$ can be viewed as information complexity of R_g .
- This is why we have $\log L(g)$ in our bound.
- Maybe “correct” KRW conjecture is $L(g \circ f) \approx L(g) \cdot L(f)$.

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One key idea

When measuring information instead of communication, can use the **chain rule** to do the decomposition.

- Basic observations for analyzing KW relations with information complexity.

Other results

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- Alternative proof for main result using a counting argument.
- **Another open problem:** What about $R_{U_m \circ f}$?