

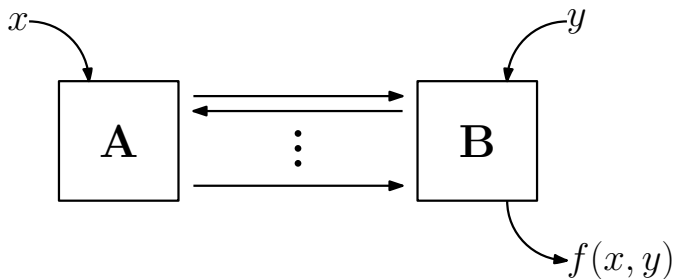
The communication complexity of functions with large outputs

Lila Fontes ¹, Sophie Laplante ², Mathieu Laurière ³, and Alexandre Nolin ⁴

¹ Swarthmore College ² Université Paris Cité ³ NYU Shanghai ⁴ CISPA

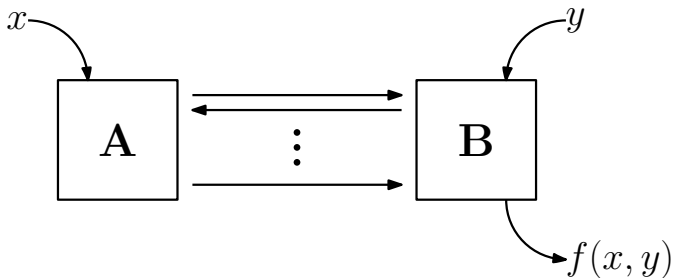
SIROCCO 2023

2-party communication complexity [Yao79]



$$x, y \in \{0, 1\}^n, \quad f(x, y) \in \{0, 1\}^k$$

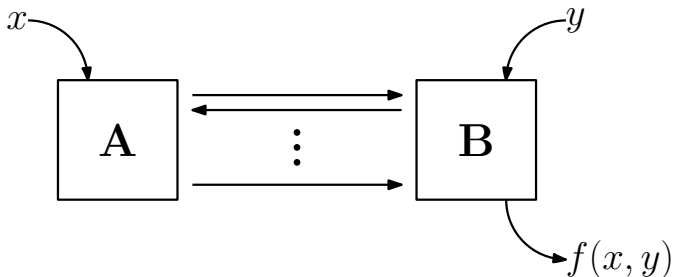
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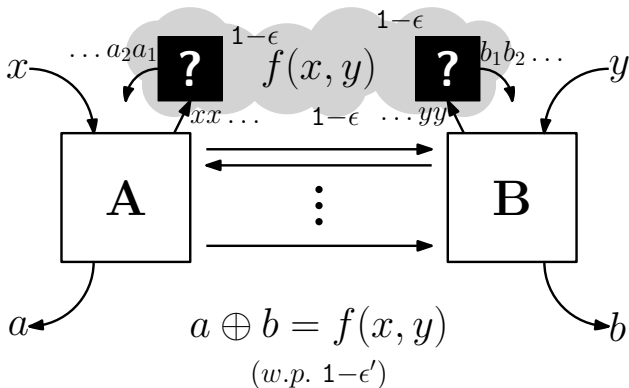
$$\underbrace{R_\epsilon(f)} \leq \underbrace{D(f)} \in [0, n]$$

public-coin randomized complexity

deterministic complexity

A riddle

Given a black box which computes a function f with error ϵ in the XOR model, how much do you need to communicate to compute f with error $\epsilon' < \epsilon$?



First remark: correctness of blackboxes?

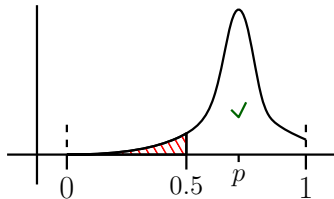
A single box / in expectation: correct w.p. $\geq 1 - \epsilon$.

Probability of a correct majority?

Probability of a correct constant fraction?

(Chernoff bound)

$$\Pr \left[\left| \frac{1}{t} \sum_{i=1}^t X_i - p \right| \geq \delta \right] \leq e^{-\frac{\delta^2 n}{2t(1-p)}}$$



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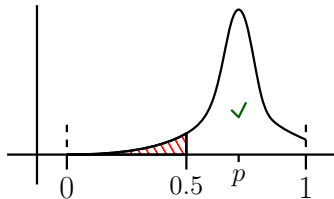
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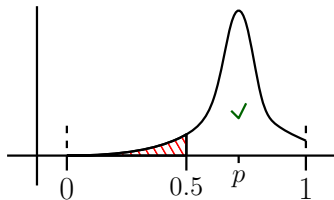
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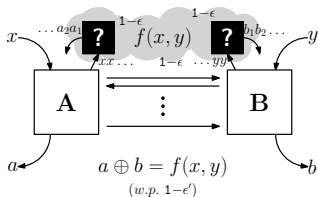
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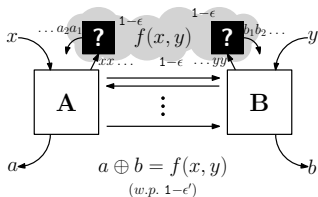
1st answer to the riddle



1. Use the black boxes $C_{\epsilon, \epsilon'} \in \Theta\left(\frac{\epsilon \cdot \ln\left(\frac{1}{\epsilon'}\right)}{\left(\frac{1}{2} - \epsilon\right)^2}\right)$ times, store results,
2. Alice sends all her a_i 's to Bob,
3. Bob finds most common value $z \in \{0, 1\}^k$ for $a_i \oplus b_i$.
4. Alice outputs the all-0 k -bit string, Bob outputs z .

Complexity: $C_{\epsilon, \epsilon'} \cdot k$.

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Second remark: finding runs with equal output

Take two sets of outputs of the blackboxes a_1, b_1 and a_2, b_2 .

$$a_1 \oplus b_1 = a_2 \oplus b_2 \quad \Leftrightarrow \quad a_1 \oplus a_2 = b_1 \oplus b_2$$

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2nd answer to the riddle: $O\left(C_{\epsilon, \epsilon'}^2 \cdot \log(C_{\epsilon, \epsilon'}^2 / \epsilon')\right)$

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No dependence on k , Alice and Bob oblivious to $f(x, y)$.

Third remark: batch equality

Theorem (Optimal batch equality [HPZZ'21, SIAM J COMP])

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Fourth remark: eliminate most candidates fast

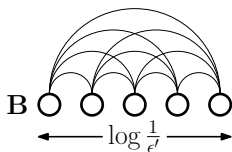
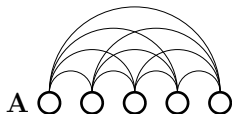
In a batch of $\Theta(\log(1/\epsilon'))$ runs, $> 1/3$ should be the correct output, w.p. $\geq 1 - \epsilon'$.

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← $\log \frac{1}{\epsilon'}$ →

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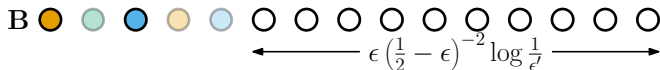
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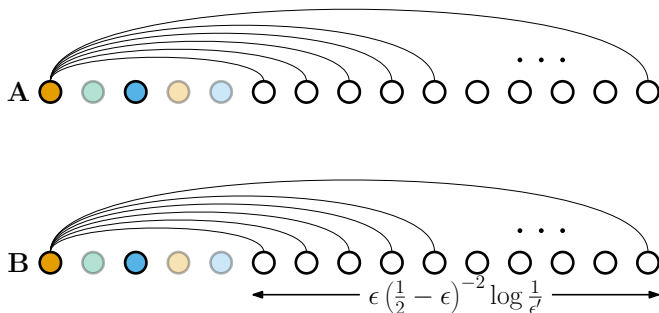
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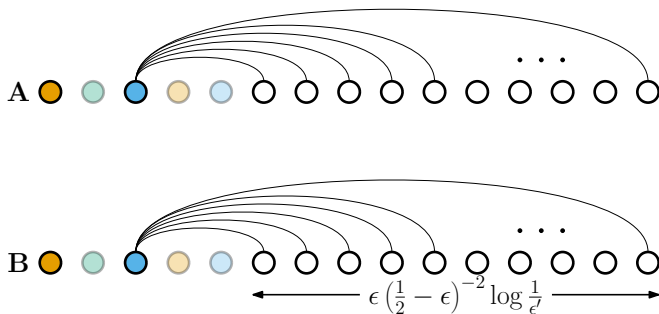
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Last optimization: largest component in random graphs

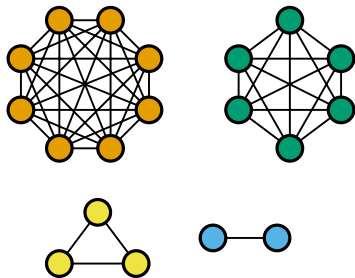
Lemma (Variation of a lemma in [ER'60])

- $G(n, p)$: graph with n vertices, each edge picked w.p. p
- $L_1(G)$: size of the largest connected component of G .
- $\alpha \in [0, 1]$ and $c \in \mathbb{R}^+$

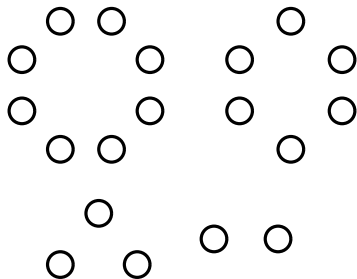
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In particular, goes to 0 exponentially fast with n if $\alpha c > 4 \ln(2)$.

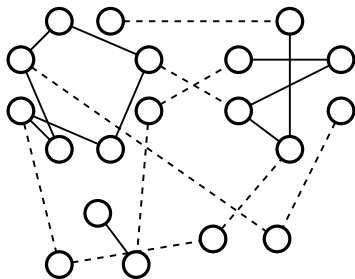
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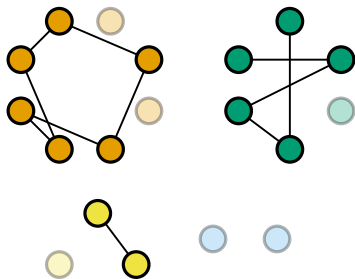
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last answer to the riddle: $O(C_{\epsilon, \epsilon'}) = O\left(\frac{\epsilon \cdot \ln(\frac{1}{\epsilon'})}{(\frac{1}{2} - \epsilon)^2}\right)$ 😊

Why the riddle?

$$C_{\epsilon, \epsilon'} \in \Theta\left(\frac{\epsilon \cdot \ln\left(\frac{1}{\epsilon'}\right)}{\left(\frac{1}{2} - \epsilon\right)^2}\right)$$

Theorem (Usual error reduction [folklore, KN'97])

Let $\epsilon > \epsilon' > 0$ and $\mathcal{M} \in \{\text{open, loc, B, A}\}$, then:

$$R_{\epsilon'}^{\mathcal{M}}(f) \leq C_{\epsilon, \epsilon'} \cdot R_{\epsilon}^{\mathcal{M}}(f).$$

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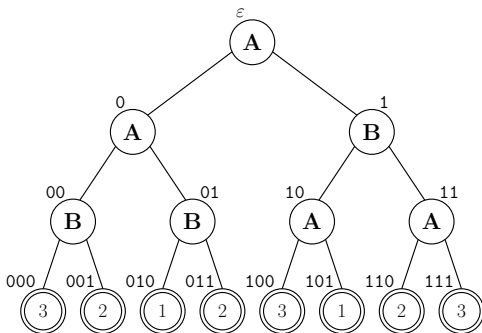
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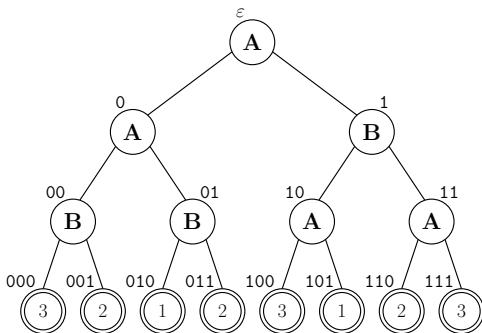
$$R_{\epsilon'}^{\text{XOR}}(f) \leq C_{\epsilon, \epsilon'} \cdot (R_{\epsilon}^{\text{XOR}}(f)) + O(C_{\epsilon, \epsilon'}).$$

Communication complexity: protocol tree



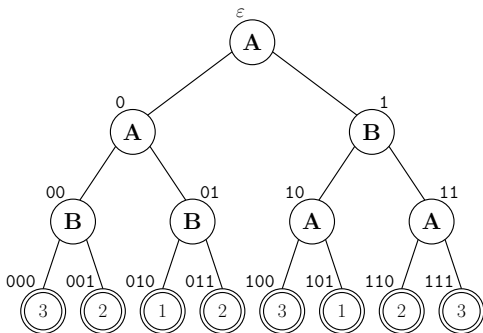
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- Nodes are partitioned between Alice and Bob.
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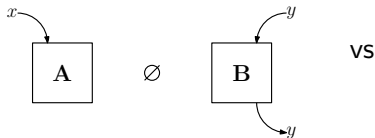
Communication complexity: protocol tree



- Nodes are partitioned between Alice and Bob.
- A node's owner decides whether to go left or right from there.
- The process is unambiguous.

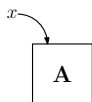
An ambiguity in the model.

Consider the function $id_B(x, y) = y$.

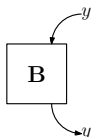


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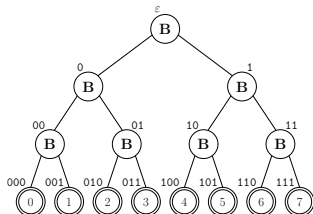
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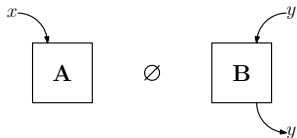


VS

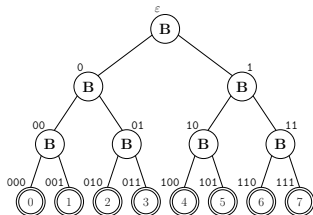


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VS



Who outputs the result matters.

Nothing new

The observation that 'who outputs' matters is nothing new.

- Sending a message [Shannon'48]
- NBA problem [Orlitsky'90]
- Compression to information [BR'14, BBCR'13, BMY'15, Sherstov'18, BK'18]

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However...

- ...never systematically studied?

Adapted tree definition

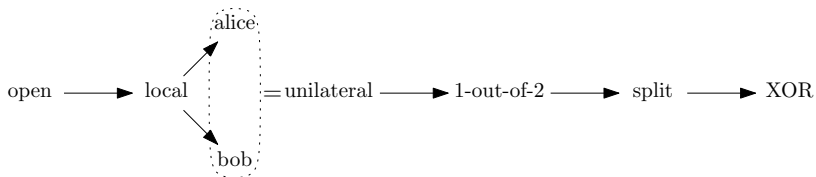
Leaves are now labeled by an output mechanism:

- It may be an output
- It may be a function of one of the player's input (if one player outputs)
- It may be two functions of the player's inputs (in which case the two players output something)

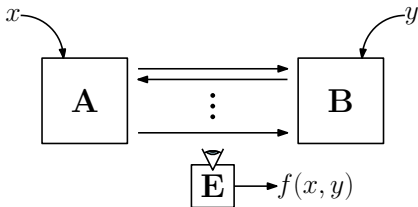
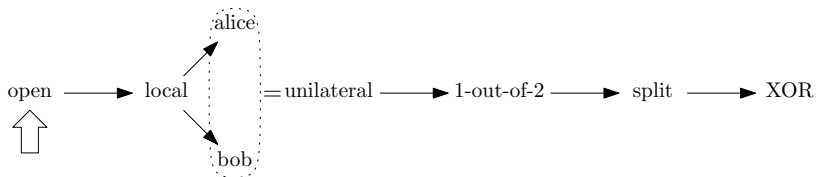
We define different models of communication complexity, with the measures:

- $D^{\mathcal{M}}(f)$ = deterministic communication complexity of f in model \mathcal{M} .
- $R_{\epsilon}^{\mathcal{M}}(f)$ = randomized communication complexity of f in model \mathcal{M} with error $\leq \epsilon$.

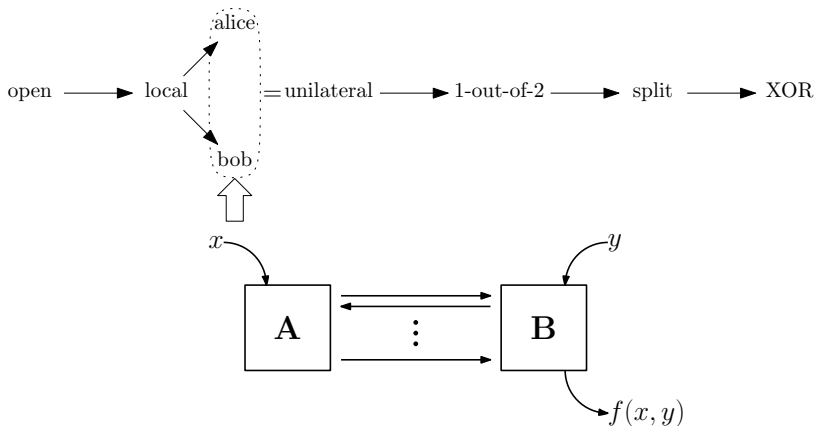
Models



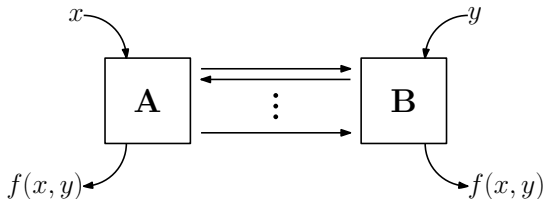
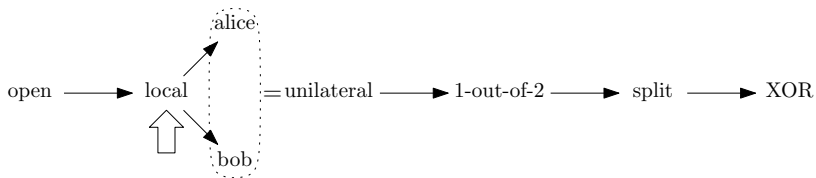
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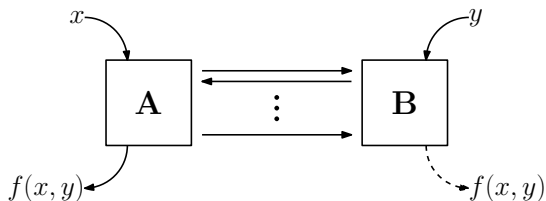
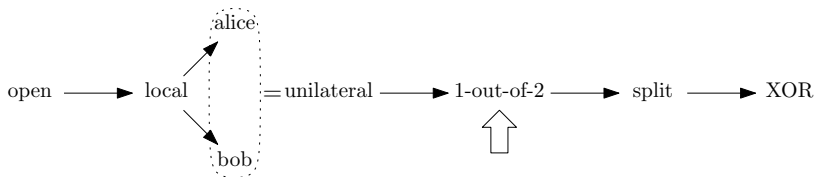
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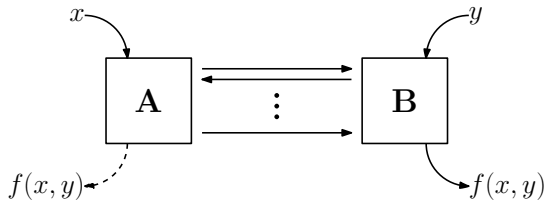
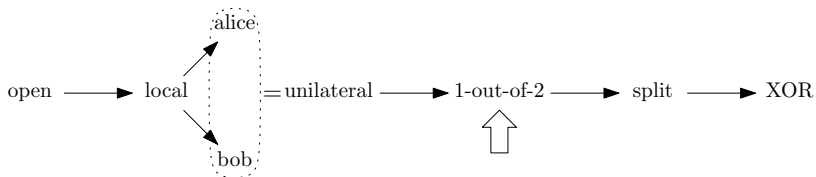
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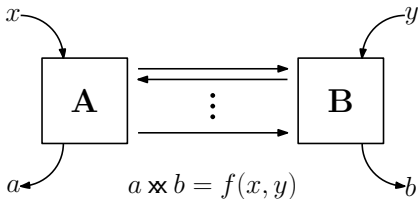
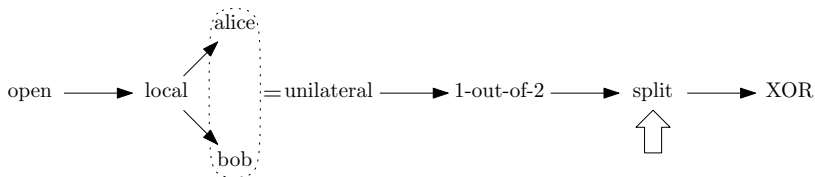
Models



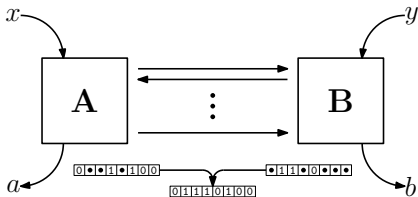
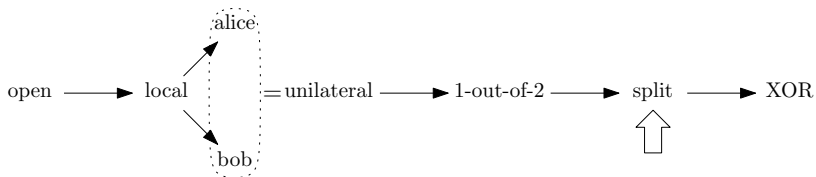
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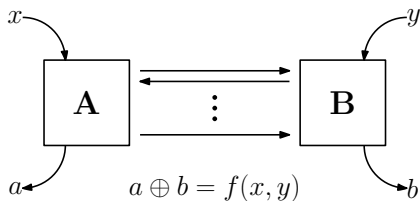
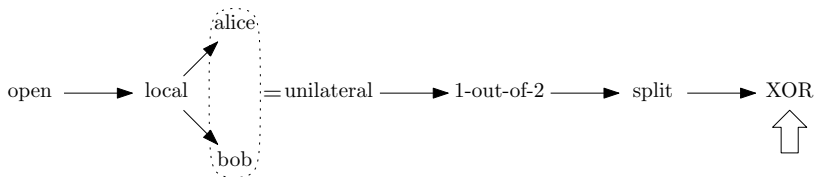
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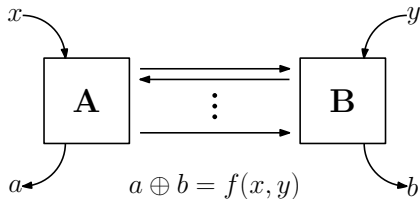
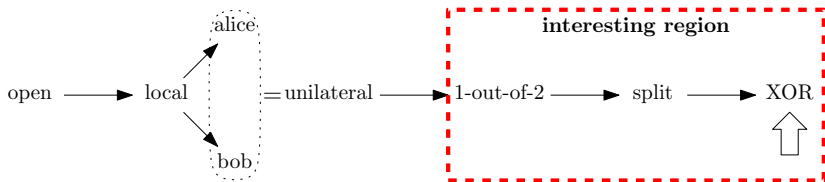
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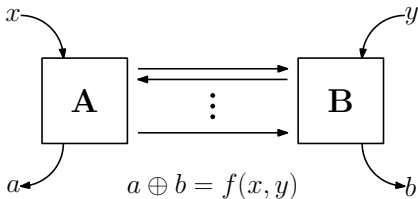
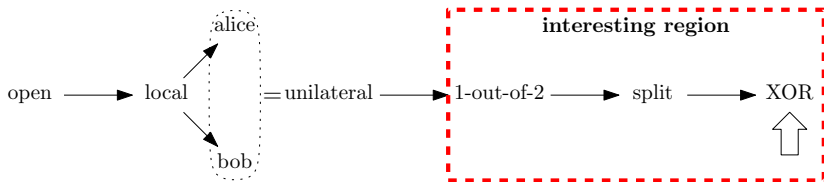
Models



Models



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Thanks!