

# Communication Complexity

Sushovan “Sush” Majhi

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## Andrew Chi-Chih Yao 姚期智



<b>Born</b>	December 24, 1946 (age 69) <a href="#">Shanghai, China</a>
<b>Residence</b>	<a href="#">Beijing</a>
<b>Citizenship</b>	<a href="#">United States</a> <a href="#">Taiwan</a>
<b>Fields</b>	<a href="#">Computer science</a>
<b>Institutions</b>	<a href="#">Stanford University</a> <a href="#">Princeton University</a> <a href="#">Tsinghua University</a> <a href="#">Chinese University of Hong Kong</a>
<b>Alma mater</b>	<a href="#">National Taiwan University (BS)</a> <a href="#">Harvard University (AM, PhD)</a> <a href="#">University of Illinois at Urbana-Champaign (PhD)</a>
<b>Known for</b>	<a href="#">Yao's Principle</a>
<b>Notable awards</b>	<a href="#">Pólya Prize (SIAM) (1987)</a> <a href="#">Knuth Prize (1996)</a> <a href="#">Turing Award (2000)</a>



Communication exists because of the limitation of resources in a single system

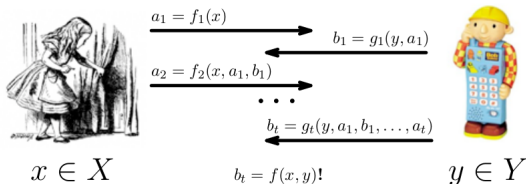
# Setting Up The Stage

Given a boolean function

$$f : X \times Y \rightarrow \{0, 1\}$$

that both Alice and Bob want to compute on an input  $(x, y)$ .

Let's take  $X = Y = \{0, 1\}^n$ .



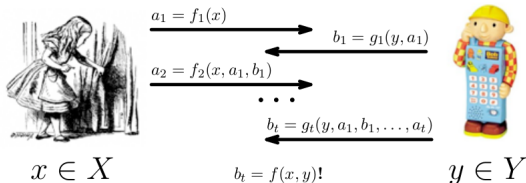
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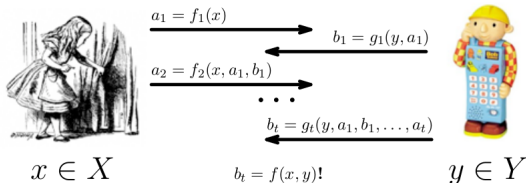
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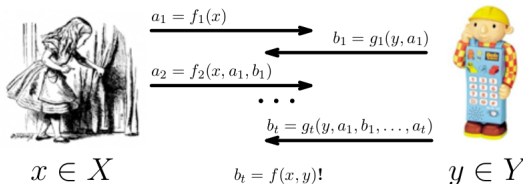
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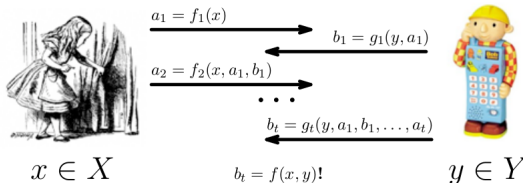
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- ii) The communication channel is completely secure and noiseless.
- iii) The parties have **unbounded/infinite computational power**.
- iv) The number of rounds or the size of the sets  $X, Y$  are not that important to us.



## Measuring The Cost

We are interested in  $\mu(A)$  = the number of bits exchanged between Alice and Bob by a protocol  $A$  to successfully transmit  $f(x, y)$  in the last round for all possible inputs  $x$  and  $y$ .

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After having access to  $x$ , Bob computes the function and shares the output of  $f$  in the second round using a single bit.

## ExM:1

Given two integers (in binary)  $x$  and  $y$  of length  $n$

$f(x, y)$  decides whether  $x + y$  is the binary representation of an EVEN integer.

Can we have a communication protocol that uses less than  $n + 1$  bits?

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$C(f) \leq \log(2016) + 1$ .

Round one: Alice divides  $x$  by 2016 and sends the remainder  $r$  to Bob!

Round two: Bob checks divisibility of  $(y + r)$  by 2016 and sends it back to Alice!

Hence,  $C(f) \in O(1)$ !

# The Halting Problem

Fix  $n$ .

Let  $x, y \in \{0, 1\}^n$ .

$$H(x, y) = \begin{cases} 1 & \text{if } x = 1^n \text{ and } y \text{ is a Turing machine that halts on the input } x \\ 0 & \text{otherwise} \end{cases}$$

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Round one: Alice confirms whether  $x$  is of the form  $1^n$ .

Round two: Bob determines whether the Turing machine halts on  $x$ .

**Remember:** Alice and Bob have unbounded computational power, including the ability to decide the Halting Problem.

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$C(EQ) \geq n$

Yao proved it.



## Fooling Set

We say that a function  $f : \{0, 1\}^n \times \{0, 1\}^n \rightarrow \{0, 1\}$  has a size  $M$  fooling set if there is an  $M$ -sized subset  $S \subset \{0, 1\}^n \times \{0, 1\}^n$  and a value  $b \in \{0, 1\}$  such that

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## Disjointness

Input strings  $x, y$  can be interpreted as characteristic vectors of subsets of  $\{1, 2, \dots, n\}$ .

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$$S = \left\{ (A, \overline{A}) : A \subset \{1, 2, \dots, n\} \right\}$$

is a fooling set of size  $2^n$ .

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## Corollary

- 1)  $C(DISJ) \geq n$
- 2)  $C(EQ) \geq n$

# Lower Bound Methods: The Tiling Method

$M(f) = 2^n \times 2^n$  matrix of  $f$ .

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## Definition

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*One can also show that*

$\log \chi(f) \leq C(f) \leq (\log \chi(f))^2$

### Definition

For every function  $f$ ,  $\chi(f) \geq \text{rank}(M(f))$ .



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## Variants

- 1 Multipart games

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- 2 Nondeterministic communication protocols

- a. "Communication Complexity", Eyal Kushilevitz, Noam Nisan
- b. "Computational Complexity", Arora, Barak
- c. "1979 Yao",

Thank You!