# Communication Complexity 

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


## Communication Everywhere



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

## Setting Up The Stage

Given a boolean function

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f: X \times Y \rightarrow\{0,1\}
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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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ii) The communication channel is completely secure and noiseless.
iii) The parties have unbounded/infinte computational power.
iv) The number of rounds or the size of the sets $X, Y$ are not that important to us.

## Defining The Communication Complexity

## 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 possbile 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.

## Some Examples

## ExM:1

Given two integers(in binary) $x$ and $y$ of lenth $n$ $f(x, y)$ decides whether $x+y$ is the binary representation of an EVEN integer. Can we have a communication protocol that uses less that $n+1$ bits?

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Can we have a communication protocol that uses less that $n+1$ bits?
Think for a moment.......
$C(f) \leq \log (2016)+1$.
Round one: Alice divids $x$ 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)=\left\{\begin{array}{ll}
1 & \text { if } x=1^{n} \\
0 & \text { otherwise }
\end{array} \text { and } y \text { is a Turing machine that halts on the input } x\right.
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## $C(f) \leq 2$

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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## $C(E Q) \geq n$

Yao proved it.

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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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(1) for every $<x, y>\in S, f(x, y)=b$ and
(2) for every distinct $\left\langle x, y>,<x^{\prime}, y^{\prime}>\in S\right.$, either $f\left(x, x^{\prime}\right) \neq b$ or $f\left(x^{\prime}, y\right) \neq b$.

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## Disjointness

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

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\end{aligned}
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is a fooling set of size $2^{n}$.

## Fooling Set Method:Theorem

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Corollary

1) $C(D I S J) \geq n$
2) $C(E Q) \geq n$

## Lower Bound Methods: The Tiling Method

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## Definition

An $f$-monochromatic tiling of $M(f)$ is a partition of $M(f)$ into disjoint monochromatic rectangles.
We denote by $\chi(f)$ the minimum number of rectangles in any monochromatic tiling of $M(f)$.

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One can also show that
$\log \chi(f) \leq C(f) \leq(\log \chi(f))^{2}$

## Lower Bound Methods: The Rank Method

## Definition

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

## Summary

## Results

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\log _{2} \operatorname{rank}(M(f)) \leq \log _{2} \chi(f) \leq C(f) \leq(n+1)
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C(f) \in O\left(\log _{2}(\operatorname{rank}(M(f)))^{c}\right)
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for all $f$ and for all input size $n$.
The rank is taken over the reals.

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## Variants Of The Basic Model And Open Problems

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(1) Multiparty games
(2) Nondeterministic communication protocols

## References

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

## Thank You!

