



**European Research Council** 

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# Information Complexity Dagstuhl seminar 22301



Yuval Filmus, 28 July 2022



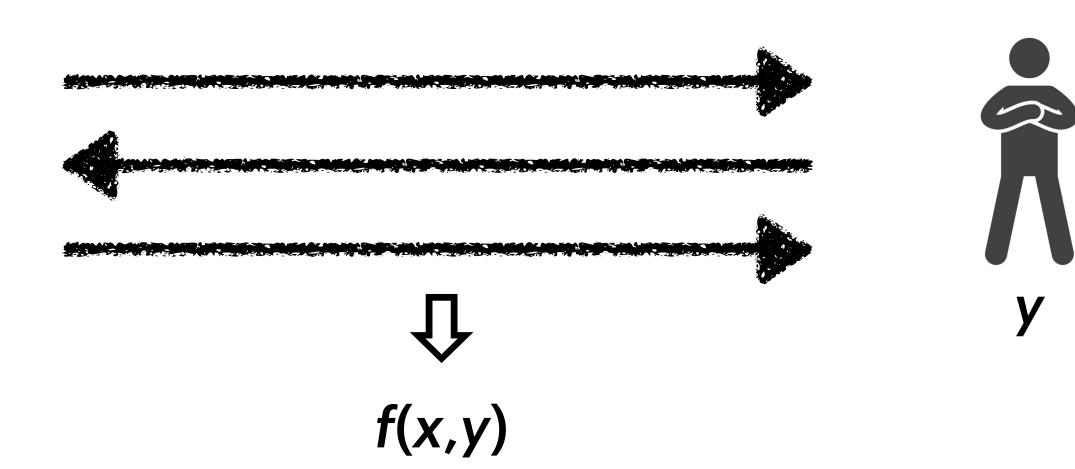


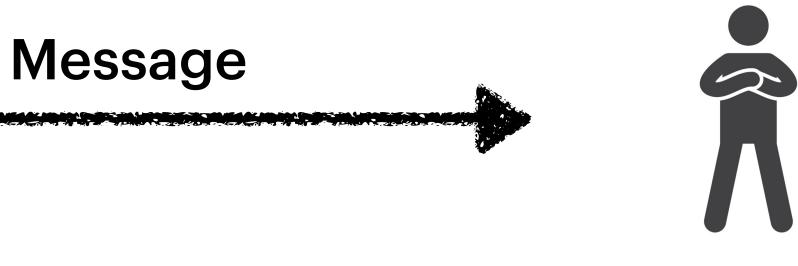
# **Information Theory**

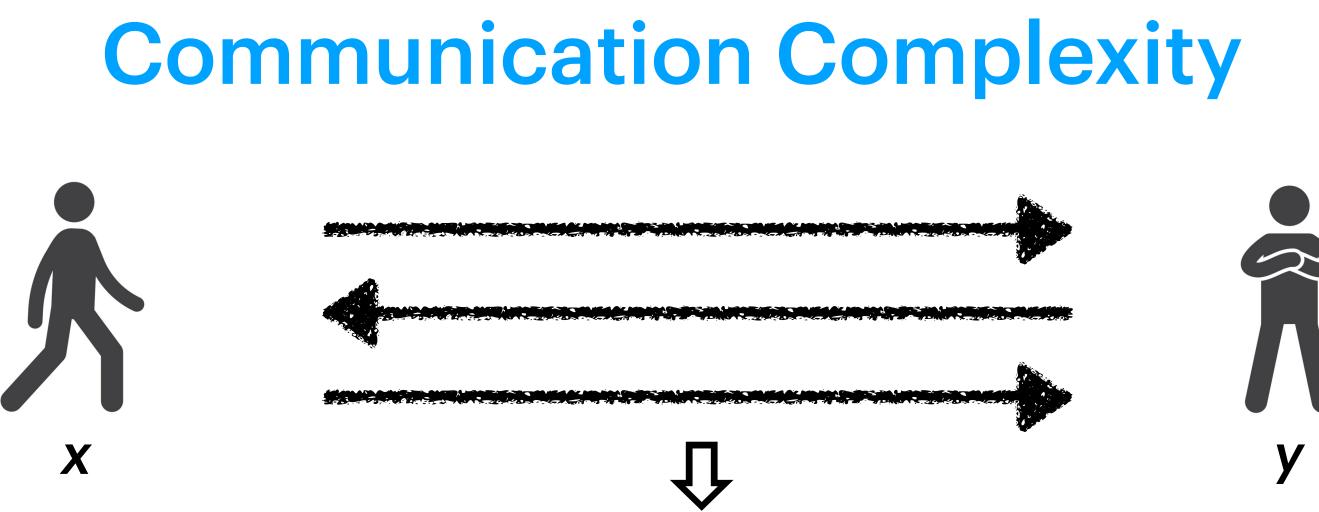


### **Communication Complexity**









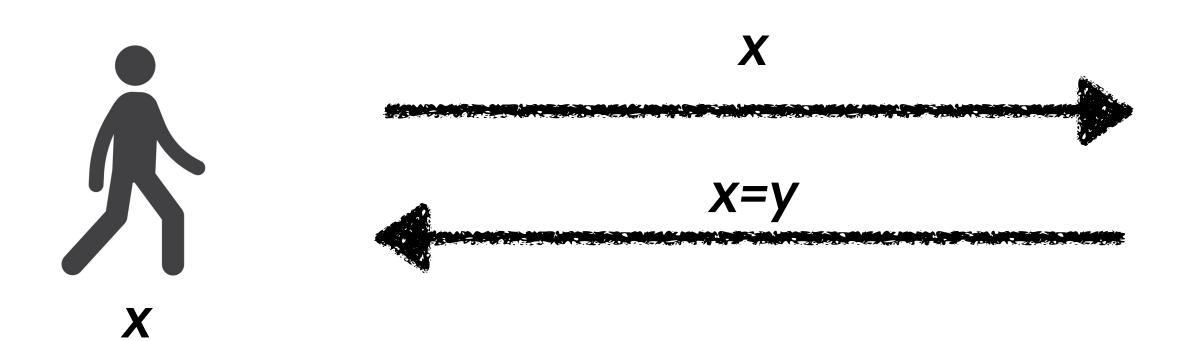
### Variants

**Deterministic: output always correct** Randomized: output correct w.p.  $1-\varepsilon$ Distributional: output correct on  $1-\varepsilon$  of inputs Minimax: randomized = worst distributional Cost: CC = maximum number of bits transmitted

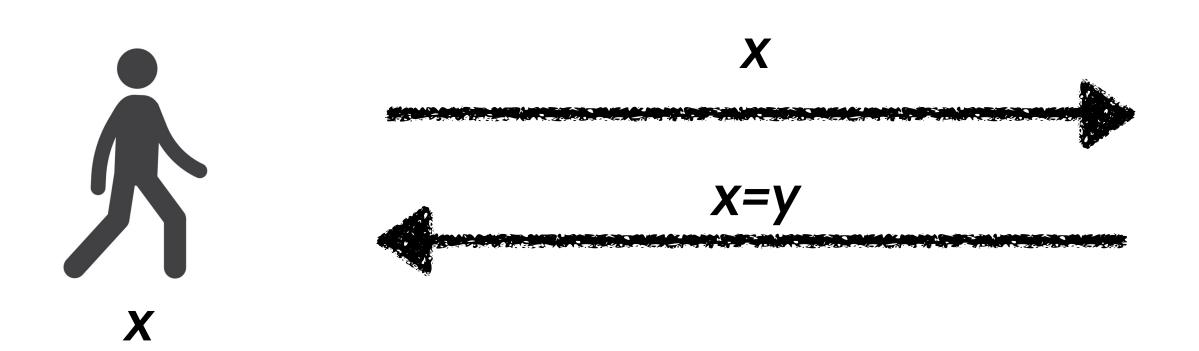
f(x,y)

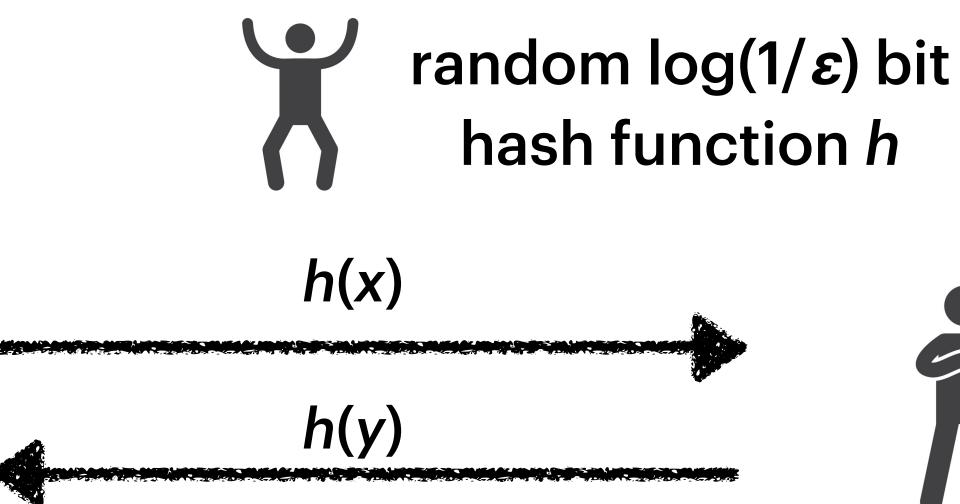


# Equality of *n*-bit strings













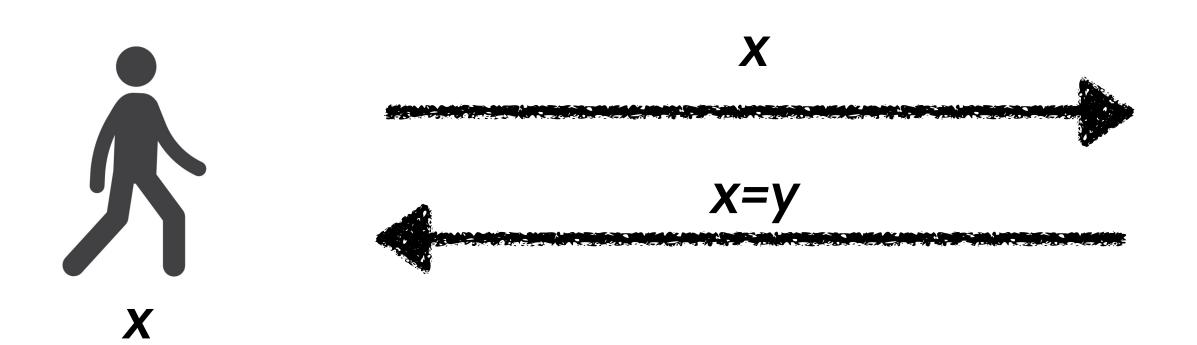




### Randomized: $O(\log(1/\varepsilon))$ (with public coins)



# Equality of *n*-bit strings



# random $log(1/\varepsilon)$ bit hash function h h, h(x) h(y)





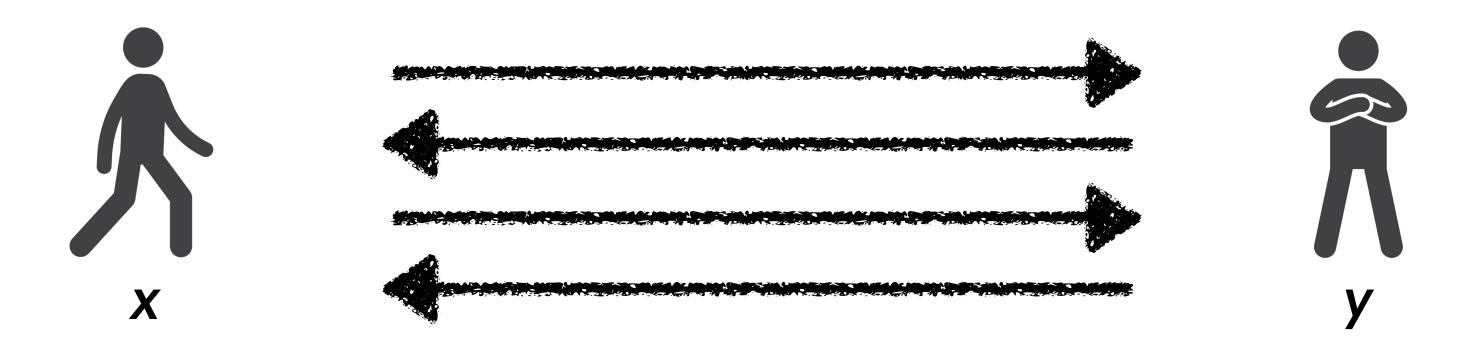


# Randomized: $O(\log(1/\varepsilon))$



(with only private coins)

### **Greater than on** *n***-bit strings** (randomized, constant $\varepsilon$ )



Following bit reveals which input is larger Cost per round: O(1) Number of rounds: logn Total cost: O(logn)

# Using binary search, find maximal common prefix of x,y

### **Some hard functions** (randomized)

# **Inner product:** $x_1y_1 \oplus \cdots \oplus x_ny_n$ Randomized cost: n+1

Set (non-)disjointness:  $x_1y_1 \vee \cdots \vee x_ny_n$ Randomized cost:  $\Theta(n)$ Trivial protocol can be improved by constant factor



### Why are they hard? (randomized)

**Inner product:**  $x_1y_1 \oplus \cdots \oplus x_ny_n$ Hard since involves computing n many ANDs

Set (non-)disjointness:  $x_1y_1 \vee \cdots \vee x_ny_n$ Hard since involves computing *n* many ANDs ... ... where answer is almost always O

How to turn this intuition into a proof?

**Easier question:** 

**Information theory:** Cost of sending *n* samples of  $X \approx n H(X)$ 

Information complexity: Cost of computing *n* copies of  $f \approx n \text{ IC}(f)$ 

### **Direct product** (randomized)

# Cost of computing $f(x_1, y_1), \dots, f(x_n, y_n) \approx n \times \text{cost of computing } f$ ?



## Information complexity

**Goal: Cost of computing** *n* **copies of** *f* ≈ *n* **IC(***f* **)** 

Information complexity of protocol P wrt distribution  $\mu$ :

"What Alice learns about Bob's input from transcript" + "What Bob learns about Alice's input from transcript"

- $IC(P,\mu) = I(\Pi;Y|X) + I(\Pi;X|Y)$ , where X,Y=inputs,  $\Pi$ =transcript of P



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IC of function f wrt distribution  $\mu$  and error  $\epsilon$ :

- $IC(P,\mu) = I(\Pi;Y|X) + I(\Pi;X|Y)$ , where X,Y=inputs,  $\Pi$ =transcript of P
- $IC(f,\mu,\varepsilon) = \min IC(P,\mu)$  over all P computing f with error  $\varepsilon$  wrt  $\mu$





## Information complexity

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Information complexity of protocol P wrt distribution  $\mu$ :

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IC of function f wrt distribution  $\mu$  and error  $\epsilon$ :

IC of function f with error  $\varepsilon$ :  $IC(f,\varepsilon) = max IC(f,\mu,\varepsilon)$  over all distributions  $\mu$ 

- $IC(P,\mu) = I(\Pi;Y|X) + I(\Pi;X|Y)$ , where X,Y=inputs,  $\Pi$ =transcript of P
- $IC(f,\mu,\varepsilon) = \min IC(P,\mu)$  over all P computing f with error  $\varepsilon$  wrt  $\mu$





# **Properties of information complexity**

 $IC(P,\mu) = I(\Pi;Y|X) + I(\Pi;X|Y)$ , where X,Y=inputs,  $\Pi$ =transcript of P  $IC(f,\mu,\varepsilon) = \min IC(P,\mu)$  over all P computing f with error  $\varepsilon$  wrt  $\mu$  $IC(f,\varepsilon) = \max IC(f,\mu,\varepsilon)$  over all distributions  $\mu$ 

**IC lower bounds communication:**  $IC(f,\mu,\varepsilon) \leq CC(f,\mu,\varepsilon)$ Direct product:  $IC(f \otimes g, \mu \otimes v, \varepsilon^*) = IC(f, \mu, \varepsilon) + IC(g, v, \varepsilon)$ "Source coding theorem":  $CC(f^n, \mu^n, \varepsilon^*) \approx n IC(f, \mu, \varepsilon)$ 



# **Properties of information complexity**

 $IC(P,\mu) = I(\Pi;Y|X) + I(\Pi;X|Y)$ , where X,Y=inputs,  $\Pi$ =transcript of P  $IC(f,\mu,\varepsilon) = \min IC(P,\mu)$  over all P computing f with error  $\varepsilon$  wrt  $\mu$  $IC(f,\varepsilon) = \max IC(f,\mu,\varepsilon)$  over all distributions  $\mu$ 

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"Source coding theorem":  $CC(f^n, \mu, \varepsilon^*) \approx n IC(f, \mu, \varepsilon)$ 

No analog of Shannon–Fano: Gap between IC and CC can be exponential!

- - \*error per copy
- (True even when measuring average number of bits communicated)



# **Exact complexity of set disjointness**

"Source coding theorem":  $CC(f^n, \mu, \varepsilon^*) \approx n IC(f, \mu, \varepsilon)$ Version for OR: CC( $\lor$  of *n* copies of *f*,*o*(1)) $\approx$ *n* IC<sup>0</sup>(*f*,O)

Example:  $IC^{0}(AND, 0) = 0.4827...$ Conclusion: CC(set-disjointness,o(1)) $\approx 0.4827...n$ 

No explicit protocol is known!

- where IC<sup>0</sup>(f,0)=max IC(f, $\mu$ ,0) over  $\mu$  supported on f<sup>-1</sup>(0)

Alice gets a bit x, Bob gets a bit y Alice chooses a random  $t_a \in [0,1]$ Bob chooses a random  $t_b \in [0,1]$ 

**Optimal protocol for AND (for symmetric distributions)** 



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- At time  $t_a$ : if x=0, Alice presses buzzer, protocol outputs 0 At time  $t_b$ : if y=0, Bob presses buzzer, protocol outputs 0





**Optimal protocol for AND (for symmetric distributions)** Alice gets a bit x, Bob gets a bit y Alice chooses a random  $t_a \in [0,1]$ Bob chooses a random  $t_b \in [0,1]$ A timer counts from 0 to 1 continuously At time 1: protocol outputs 1

- At time  $t_a$ : if x=0, Alice presses buzzer, protocol outputs 0 At time  $t_b$ : if y=0, Bob presses buzzer, protocol outputs 0





# Generalized protocols

The buzzer protocol is not a real protocol! It can be discretized to a real protocol with *r* rounds whose information complexity is  $OPT+O(1/r^2)$ . OPT cannot be achieved using any real protocol!

Challenge: Define a generalized notion of protocols which achieves the optimal information complexity **exactly** for every *f*.

### More open questions

# **Amortized communication complexity for zero error?**

Information complexity for multiple parties?

Is CC(f) polynomial in IC(P) log CC(P)?

## Monographs

### **Surveys**

Mark Braverman, Communication and information complexity, Proc. ICM 2022 Papers

Braverman, Rao, Information equals amortized communication, 2014





Anup Rao and Amir Yehudayoff, Communication Complexity: And Applications, 2020

**Omri Weinstein, Information Complexity and the Quest for Interactive Compression, 2015** 

- Barak, Braverman, Chen, Rao, How to compress interactive communication, 2013
- Braverman, Garg, Pankratov, Weinstein, From information to exact communication, 2013

## **2022 Abacus Medal awarded to Mark Braverman**



