

An operational characterization of mutual information in algorithmic information theory

Andrei Romashchenko

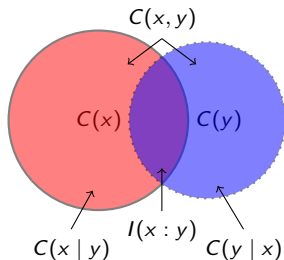
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Towson University

ICALP, Prague, July 10, 2018

Two strings x , y , and the information therein



$C(x)$ = length of a shortest description of x .
 $C(x | y)$ = length of a shortest description of x given y .

⋮

Mutual information of x and y is defined by a formula:

$$I(x : y) = C(x) + C(y) - C(x, y).$$

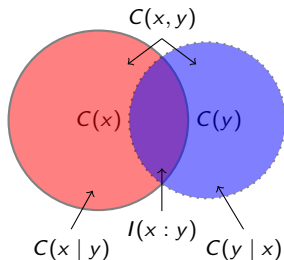
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($=^+$ hides $\pm O(\log n)$)

All the regions except the center have an operational meaning.

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Does $I(x : y)$ have an operational meaning?

This work in one slide

- Question: Can mutual information be “materialized”?

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- We show it in the framework of **Kolmogorov complexity** (it has been an open folklore question since the '70s).

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- We show it in the framework of **Kolmogorov complexity** (it has been an open folklore question since the '70s).
- We also have analog results for multiparty secret key agreement protocols.
- We present matching upper/lower bounds for the communication complexity of 2-party secret key agreement protocols, in the public randomness model.

IT vs. AIT

IT (à la Shannon)

- Data is the realization of a random variable X .
- The model: a stochastic process generates the data.
- Amount of information in the data: $H(X)$ (Shannon entropy).

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Kolmogorov complexity

Fix U a universal Turing machine.

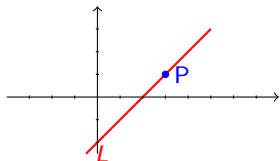
p is a description of x if $U(p) = x$. p is a description of x given y if $U(p, y) = x$.

$C(x) = \min\{|p| \mid p \text{ is a description of } x.\}$

$C(x \mid y) = \min\{|p| \mid p \text{ is a description of } x \text{ given } y.\}$

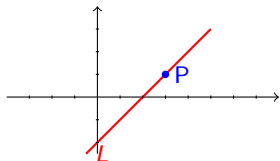
Secret key agreement protocol: warm-up example

- Alice and Bob want to agree on a secret key.
- Problem is that they can only communicate through a public channel.
- Alice knows line $L : y = a_1x + a_0$;
Bob knows point $P : (b_1, b_2)$;
- L : $2n$ bits of information (intercept, slope in \mathbb{F}_{2^n}).
- P : $2n$ bits of information (the 2 coord. in \mathbb{F}_{2^n}).
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SOLUTION:

- Alice sends a_1 to Bob.
- Bob, knowing that $P \in L$, finds L .
- Alice and Bob use a_0 as a secret key.
- It works! Eve has seen a_1 , but a_1 and a_0 are independent.

Main result (informally stated)

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Theorem (Characterization of the mutual information)

- ① *There is a protocol that for every n -bit strings x and y allows to compute with high probability a shared secret key of length $I(x : y)$ (up to $-O(\log n)$).*
- ② *No protocol can produce a longer shared secret key (up to $+O(\log n)$).*

Main result (positive part).

Theorem

There exists a secret key agreement protocol with the following property: if

- Alice knows x , ϵ , and the complexity profile of (x, y) ,*
- Bob knows y , ϵ , and the complexity profile of (x, y) ,*

then with probability $1 - \epsilon$ they obtain a string z such that,

$$|z| \geq I(x : y) - O(\log(n/\epsilon))$$

$$\text{and } C(z \mid \text{transcript}) \geq |z| - O(\log(1/\epsilon)).$$

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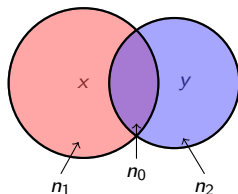
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$$|z| \geq I(x : y) - O(\log(n/\epsilon)) \quad /* \text{ common key of size } \geq^+ I(x : y) */$$

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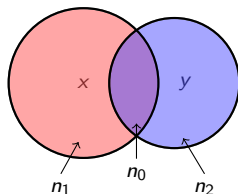
Secret key agreement: sketch of the general protocol

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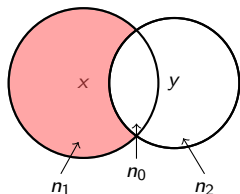
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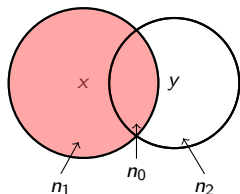


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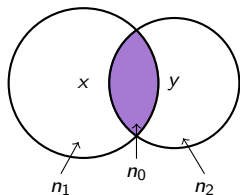


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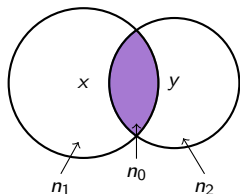


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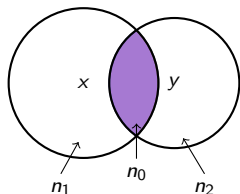


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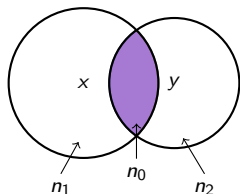
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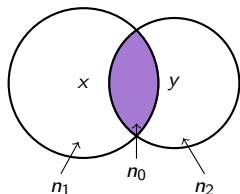
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randomness extractors and universal hashing.

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Protocol:

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- cf. Buhrman-Fortnow-Laplante 2001,
Musatov-R.-Shen 2009,
Bauwens et al. 2013,
Z. 2017
- of size $\approx n_0$

Tricky part: choose “computationally independent $\text{hash}^{(1)}$ and $\text{hash}^{(2)}$ ”.

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randomness extractors and universal hashing.

Main result (negative part).

Theorem

Let x and y be input strings of length n on which the protocol succeeds with error probability ϵ so that with prob $1 - \epsilon$ Alice and Bob have at the end the same z , and $C(z | t) \geq |z| - \delta(n)$.

Then with probability $\geq 1 - O(\epsilon)$ we have $|z| \leq I(x : y) + \delta(n) + O(\log(n/\epsilon))$.

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$|z| \leq I(x : y) + \delta(n) + O(\log(n/\epsilon))$. /* common key of size $\leq^+ I(x : y)$ */

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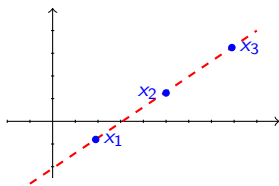
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cf. Kaced-R.-Vereshchagin 2017
(Shannon's entropy version)

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Result (2): Multi-party secret agreement



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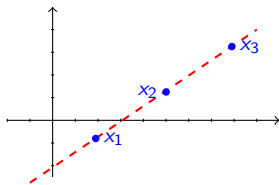
Bob: x_2

Charlie: x_3

points x_1, x_2, x_3 belong to one line
in the affine plane over \mathbb{F}_{2^n}

maximal common secret key: $n/2$ bits

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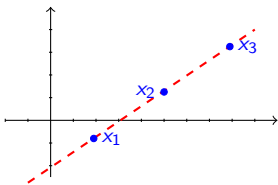
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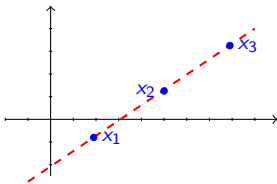
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Under the hood:

- the size of the secret key \rightarrow linear program \rightarrow explicit (but complex) formula [Chan et. al., 2015]
- ... + the same techniques as for $\ell = 2$

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Fact: Our protocol for secret key agreement produces a key of length $\approx I(x : y)$ and has communication complexity $\approx \min\{C(x | y), C(y | x)\}$.

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- opposition stochastic/nonstochastic objects (Shen 1983; Razenshteyn 2011)

Open question

What is the communication complexity for the model with private random bits?

Previous results: Shannon framework

- Ahlswede and Csiszár [1993] and Maurer [1993]:
the optimal size of the common secret key for two parties
- Csiszár and Narayan [2004]:
the optimal size of the common secret key for $\ell > 2$ parties
- Tyagi [2013]: communication complexity of the protocols
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formal difference

previous works: random variables & Shannon's entropy

our work: binary strings & Kolmogorov complexity

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1st substantial difference

previous works: (X, Y) from random memoryless / stationary ergodic sources
our work : no specific structure on X and Y

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2nd substantial difference

previous works: protocols work for most admissible pairs (X, Y)

our work: protocols work for all admissible pairs (X, Y)

Previous results: Kolmogorov complexity framework

- Finding an operational characterization of mutual information has been a folklore open problem.
- Some earlier approaches:
 - Common information of x and y : longest z that can be computed from x and, separately, from y with a few help bits:
 $C(z | x) = O(\log n)$ $C(z | y) = O(\log n)$.
 - Is common information equal to mutual information?
 - Gács and Körner [1973]: **NO!** They exhibit x, y with $I(x : y) = \Omega(n)$ and $|z| = o(n)$.
 - Muchnik, Romashchenko, Chernov, Vereschagin: several papers with refinements of Gács and Körner.

For example: there are x, y with $C(x), C(y) =^+ n, I(x : y) = 0.99n, |z| = O(\log n)$.

One proof

- Upon conditioning, mutual information can increase or decrease.
- There are x, y, t_1, t_2 such that $I(x : y | t_1) > I(x : y)$ and $I(x : y | t_2) < I(x : y)$
- We show:

If $t(x, y)$ is a function with the **rectangle property**, then conditioning with $t(x, y)$ decreases mutual information.

- t has the **rectangle property**, if

$$t(x_1, y_1) = t(x_2, y_2) = t \Rightarrow t(x_1, y_2) = t.$$

- This fact is the key point in showing the negative part of our main result.
- The transcript $t(x, y)$ of a protocol on input (x, y) has the **rectangle property**.
- It has other applications in comm. complexity, maybe elsewhere as well.

One proof(2)

Theorem

If t has the rectangle property, then for all x, y , $I(x : y | t(x, y)) \leq I(x : y) + O(\log n)$.

Proof:

- Fix x, y , $t = t(x, y)$
- x' is a **clone** of x , if $\exists y', t(x', y') = t$ and $C(x') \leq C(x)$.
- y' is a **clone** of y , if $\exists x', t(x', y') = t$ and $C(y') \leq C(y)$.
- Clones_x : set of clones of x ; Clones_y : set of clones of y .
- **FACT: $\log |\text{Clones}_x| \geq C(x | t) - O(\log n)$ (and similarly for Clones_y .)**

Proof: x is described by its ordinal in an enumeration of Clones_x , which can be done effectively given t and $C(x)$.

So, $C(x | t) \leq \log |\text{Clones}_x| + O(\log n)$.

One proof(3)

Theorem

If t has the rectangle property, then for all x, y , $I(x : y | t(x, y)) \leq I(x : y) + O(\log n)$.

Proof (continuation):

- Take a pair $(x', y') \in \text{Clones}_x \times \text{Clones}_y$ with maximal $C(x', y' | t)$.
- $C(x', y' | t) \geq^+ \log |\text{Clones}_x \times \text{Clones}_y| =^+ C(x | t) + C(y | t)$.
- $C(x', y') = C(x', y', t)$ (because $t = t(x', y')$, using the rectangle property)
 $=^+ C(t) + C(x', y' | t)$ (chain rule)
 $\geq^+ C(t) + C(x | t) + C(y | t)$.
- On the other hand,
 $C(x', y') \leq C(x') + C(y') \leq C(x) + C(y)$ (by def. of clones)
- Combining the last two inequalities, $C(t) + C(x | t) + C(y | t) \leq^+ C(x) + C(y)$.
- Now subtract $C(x, y, t)$ in the LHS, and (the smaller) $C(x, y)$ in the RHS.
- QED

Take home message

- Operational characterization of the mutual information of strings x and y :

$I(x : y)$ is equal (up to logarithmic precision) to the length of a longest secret key that two parties, one having x and the other having y , can establish via an interactive protocol on an open channel.

The protocol is probabilistic and the parties also need to know how their strings are correlated (i.e., they know the complexity profile of x and y).

- The protocol has communication complexity $\min(C(x | y), C(y | x))$.
- The communication is **optimal** for finding a secret key of maximal length, in the model with public randomness.
- We also determine the maximum length of a shared secret key in the multi-party setting.

Thank you

Full version:

- A. Romashchenko and M. Zimand, An operational characterization of mutual information in algorithmic information theory, available at ECCC <https://eccc.weizmann.ac.il/report/2018/043>