

Function Computation, Secrecy Generation and Common Randomness

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Processing of Distributed Data

Correlated data are collected and stored at distributed terminals.

Examples include:



* Image from <http://www.prismaelectronics.eu>

Sensor Networks

Function
Computation

Secure
Computing

CR for SK
Generation

General Secure
Computing



Processing of Distributed Data

Correlated data are collected and stored at distributed terminals.

Examples include:



Data Centers

A public network is available for communication.

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Processing of Distributed Data

Correlated data are collected and stored at distributed terminals.

A public network is available for communication.

- ▶ **Function computation:**

A subset of terminals want to evaluate a function of the data.

What is the minimum amount of communication required?

- ▶ **Secure function computation:**

Computing a function of the data

- using communication independent of the function value.

- ▶ **Secret key generation**

Share bits using communication independent of the function value.

Function
Computation

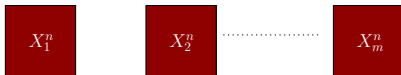
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Multiterminal Source Model



Assumption on the data

1. $X_i^n = (X_{i1}, \dots, X_{in})$
 - Data observed at time instance t : $X_{\mathcal{M}t} = (X_{1t}, \dots, X_{mt})$
 - probability distribution of X_1, \dots, X_m is known.
2. Observations are i.i.d. across time:
 - $X_{\mathcal{M}1}, \dots, X_{\mathcal{M}n}$ are i.i.d. rvs.
3. Observations are finite-valued.

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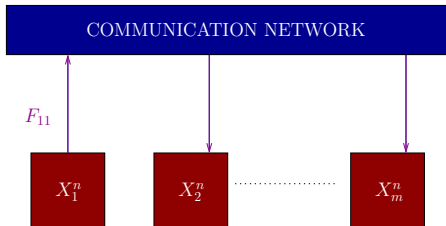
Interactive Communication Protocol

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Assumptions on the protocol

- ▶ Each terminal has access to all the communication.
- ▶ Multiple rounds of interactive communication are allowed.
- ▶ Communication from terminal 1: $F_{11} = f_{11}(X_1^n)$



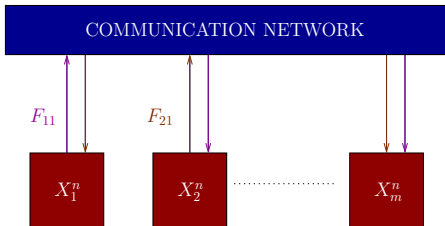
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Assumptions on the protocol

- ▶ Each terminal has access to all the communication.
- ▶ Multiple rounds of interactive communication are allowed.
- ▶ Communication from terminal 2: $F_{21} = f_{21}(X_2^n, F_{11})$



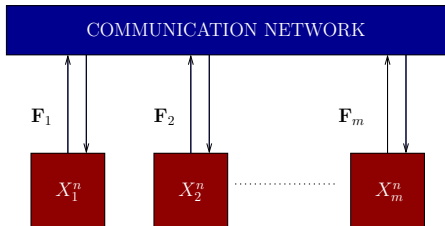
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Assumptions on the protocol

- ▶ Each terminal has access to all the communication.
- ▶ Multiple rounds of interactive communication are allowed.
- ▶ r rounds of interactive communication: $\mathbf{F} = \mathbf{F}_1, \dots, \mathbf{F}_m$



Outline of the Talk

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Function computation

Secure function computation

Common randomness for secret key generation

Computing without revealing the critical data



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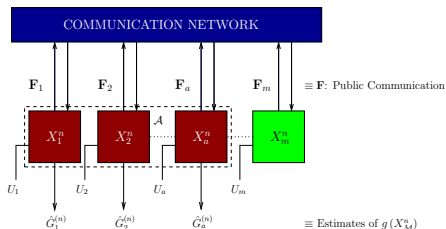
Computing a Function of Distributed Data

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- Given: a single-letter function to be computed:

$$g(X_{\mathcal{M}}^n) = (g(X_{\mathcal{M}1}), \dots, g(X_{\mathcal{M}n})).$$

- Notation: $G = g(X_{\mathcal{M}})$, $G^n = (g(X_{\mathcal{M}1}), \dots, g(X_{\mathcal{M}n}))$

Recoverability:

$$\Pr \left(\hat{G}_i^{(n)} = G^n, i \in \mathcal{A} \right) \geq 1 - \epsilon, \quad \text{for all } n \text{ large.}$$

What is the minimum rate of communication $\frac{1}{n} \log \|\mathbf{F}\|$ needed?

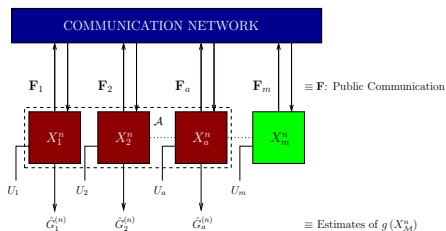
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What is the minimum rate of communication $\frac{1}{n} \log \|\mathbf{F}\|$ needed?



A. C. Yao

Some complexity questions related to distributive computing

STOC '79

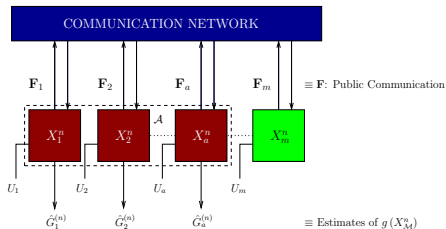
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Recoverability:

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What is the minimum rate of communication $\frac{1}{n} \log \|\mathbf{F}\|$ needed?



J. Körner and K. Marton

How to encode the modulo-two sum of binary sources

IT, 25(2), March 1979, 219 - 221



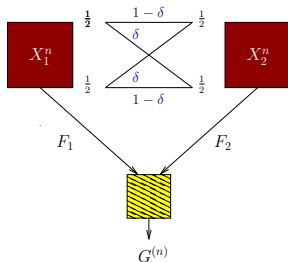
Special Case: Körner-Marton

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Function computed: $g(X_1, X_2) = X_1 \oplus X_2$

Theorem

The rate region of communication for computing parity is given by

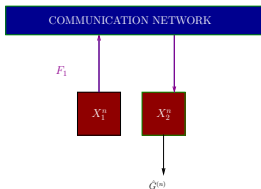
$$\{(R_1, R_2) : R_1 \geq h(\delta), \quad R_2 \geq h(\delta)\}.$$



Special Case: Orlitsky-Roche



A. Orlitsky and J. R. Roche, [Coding for computing](#), IT, 47(3), March 2001, pp. 903-917.



Theorem

The minimum rate of communication required for function computation is given by

$$\min_{W \oplus X_1 \oplus X_2} I(W \wedge X_1 | X_2)$$

where $W | X_1 \sim$ independent sets of the function graph that contain X_1 .

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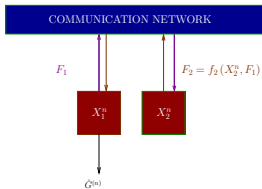
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Special Case: Orlitsky-Roche



A. Orlitsky and J. R. Roche, [Coding for computing](#), IT, 47(3), March 2001, pp. 903-917.



Theorem

The rate region of communication for function computation consists of (R_1, R_2) s.t.

$$\left\{ (R_1, R_2) : R_1 \geq I(U \wedge X_1 | X_2), \quad R_2 \geq I(V \wedge X_2 | X_1, U) \right. \\ \left. U \circlearrowleft X_1 \circlearrowleft X_2, \quad V \circlearrowleft X_2, U \circlearrowleft X_1 \quad \text{and} \quad H(G|U, V, X_1) = 0 \right\}.$$

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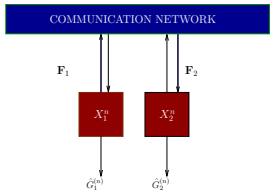
Special Case: Orlitsky-Roche

Extensions:

- Function Computation
- Secure Computing
- CR for SK Generation
- General Secure Computing



- ▶ N. Ma and P. Ishwar, [Some results on distributed source coding for interactive function computation](#), IT, 57(9), September 2011, pp. 6180-6195.
- ▶ N. Ma and P. Ishwar, [Infinite-message distributed source coding for interactive function computation](#), arXiv:0908.3512v2.



Special Case: Orlitsky-Roche

Extensions:

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Computation

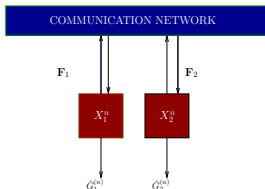
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How many rounds of interaction are optimal?



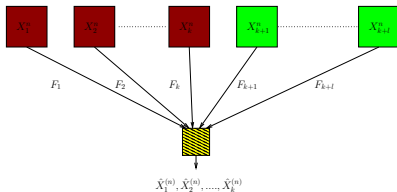
Function Computation and Helper Problems

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General Secure Computing



l helpers, $k + l$ terminals



I. Csiszár and J. Körner, [Towards a general theory of source networks](#), IT, 26(2), March 1980, pp. 155-165.

Theorem (No-helper problem)

The rate region consists of k -tuples (R_1, \dots, R_k) s.t.

$$\sum_{i \in B} R_i \geq H(X_B | X_{\{1, \dots, k\}/B}), \quad B \subseteq \{1, \dots, k\}.$$

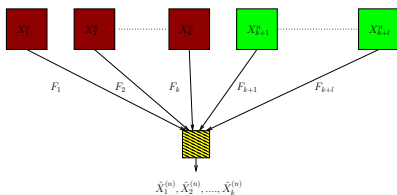
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l helpers, $k + l$ terminals



I. Csiszár and J. Körner, [Towards a general theory of source networks](#), IT, 26(2), March 1980, pp. 155-165.

Theorem

The rate region consists of $k + l$ -tuples (R_1, \dots, R_{k+l}) s.t.

$$\forall k + 1 \leq i \leq k + l : R_i \geq \frac{1}{n} H(f_i(X_i^n))$$

$$\forall B \subseteq \{1, \dots, k\} : \sum_{i \in B} R_i \geq \frac{1}{n} H(X_B^n | X_{\{1, \dots, k\}/B}^n, f_{\{1, \dots, k\}/B})$$

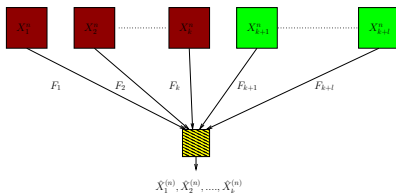
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l helpers, $k + l$ terminals



T. S. Han and K. Kobayashi, [A unified achievable rate region for a general class of multiterminal source coding systems](#), IT, 26(3), May 1980, pp. 277-288.



Function Computation and Helper Problems

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I. Csiszár and J. Körner, [Towards a general theory of source networks](#), IT, 26(2), March 1980, pp. 155-165.

Single-letter characterization of the general helper problem remains open.

- ▶ **Entropy sets** corresponding to rvs $Y_1, \dots, Y_p, Z_1, \dots, Z_q$:

$$cl \left\{ \left(\frac{1}{n} H(Y_1^n | f_1, \dots, f_q), \dots, \frac{1}{n} H(Y_p^n | f_1, \dots, f_q) \right) : n \geq 1, f_i = f_i(Z_i^n) \right\}.$$

Here Z_1, \dots, Z_q correspond to the helper sources.



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Here Z_1, \dots, Z_q correspond to the helper sources.

Csiszár-Körner-Marton solved for $p = 3, q = 1$ with $Z_1 = Y_1$.

Most general achievable region for 1 helper problem:

J. Körner, "OPEC or a basic problem in source networks," IT, 30(1), January 1984, pp. 68 - 77.

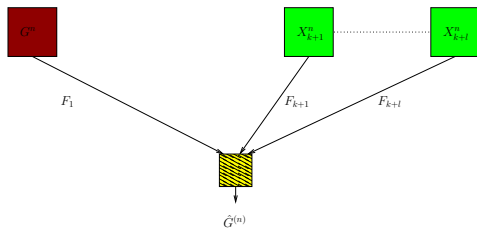
Function Computation and Helper Problems

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Function computation as a helper problem

- ▶ One of the encoders knows the function value \Rightarrow Helper problem
- ▶ *In general, can we introduce a dummy terminal and set its rate to 0?*
- ▶ How to handle interactive communication?

How does the Csiszár-Körner result extends to function computation?



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Computing**

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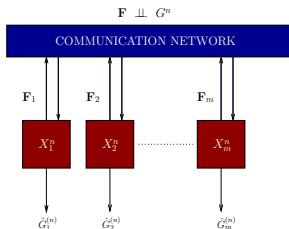
Secure Computation of Functions

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- ▶ $G_i^{(n)}$ is the estimate of G^n at terminal i .

Secure computability of g :

Recoverability : $\Pr \left(G_i^{(n)} = G^n, i \in \mathcal{M} \right) \geq 1 - \epsilon$

Secrecy : $I(G^n \wedge \mathbf{F}) \leq \epsilon$

When is a given function g securely computable?



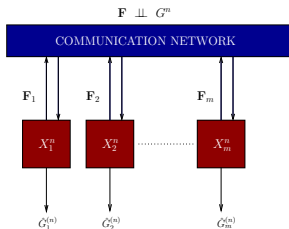
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Deterministic Model:



A. Orlicsky and A. El Gamal, [Communication with secrecy constraints](#), STOC '84.



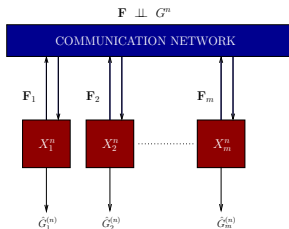
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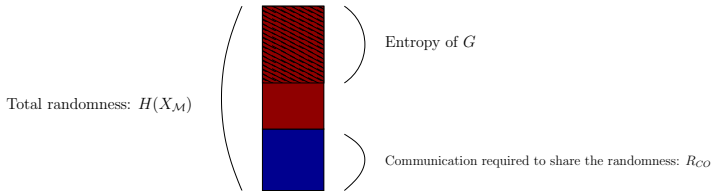
When is a given function g securely computable?

H. Tyagi, P. Narayan, and P. Gupta, "When is a function securely computable?," IT, 57(10), October 2011, pp. 6337-6350.



A Sufficient Condition

- ▶ Share all data to compute g : Omniscience $\equiv X_{\mathcal{M}}^n$
- ▶ Can we attain omniscience using $\mathbf{F} \stackrel{\perp}{\sim} G^n$?



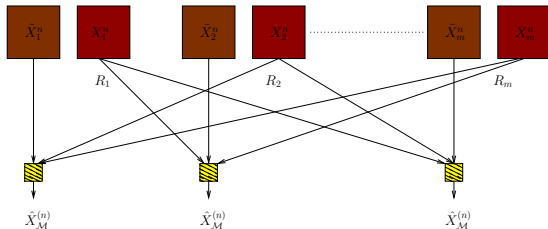
Claim: Omniscience can be attained using $\mathbf{F} \stackrel{\perp}{\sim} G^n$ if:

$$H(G) < H(X_{\mathcal{M}}) - R_{CO}$$

Random Mappings For Omniscience



I. Csiszár and P. Narayan, [Secrecy capacities for multiple terminals](#), IT, 50(12), December 2004, pp. 3047 - 3061.



- ▶ $F_i = F_i(X_i^n)$: random mapping of rate R_i .
- ▶ With large probability, F_1, \dots, F_m result in omniscience if:

$$\sum_{i \in B} R_i \geq H(X_B | X_{B^c}), \quad B \subsetneq \mathcal{M}.$$

- ▶ $R_{CO} = \min \sum_{i \in \mathcal{M}} R_i$.



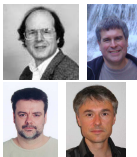
Independence Properties of Random Mappings

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C. H. Bennett, G. Brassard, C. Crépeau, and U. M. Maurer,
[Generalized privacy amplification](#),
IT, 41(6), November 1995, pp. 1915-1923.

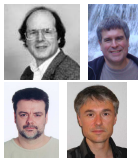
- ▶ Given \mathcal{X} -valued rv X .
- ▶ $R(X) = -\log \sum_{x \in \mathcal{X}} P_X(x)^2$: Rényi entropy
- ▶ F is chosen uniformly over the set of all mappings from X to $\{0, 1\}^r$.

Generalized Privacy Amplification:

$$I(F(X) \wedge F) \leq \frac{2^{r-R(X)}}{\ln 2}.$$



Independence Properties of Random Mappings



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Generalized Privacy Amplification:

$$I(F(X) \wedge F) \leq \frac{2^{r-R(X)}}{\ln 2}.$$

- ▶ $\Pr(\{y : R(X|Y=y) \geq c\}) \geq 1 - \delta$

$$I(F(X) \wedge F, Y) \leq \delta r + (1 - \delta) \left(\frac{2^{-(c-r)}}{\ln 2} \right)$$



Independence Properties of Random Mappings



R. Ahlswede and I. Csiszár, [Common randomness in information theory and cryptography. ii. CR capacity](#), IT, 44(1), January 1998, pp. 225 - 240.

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- ▶ \mathcal{P} be a family of N pmfs on \mathcal{X} s.t.

$$P \left(\left\{ x \in \mathcal{X} : P(x) > \frac{1}{2^d} \right\} \right) \leq \epsilon, \quad \forall P \in \mathcal{P}.$$

Balanced Coloring Lemma: Probability that a random mapping $F : \mathcal{X} \rightarrow \{1, \dots, 2^r\}$ fails to satisfy for some $P \in \mathcal{P}$

$$\sum_{i=1}^{2^r} \left| P(F(X) = i) - \frac{1}{2^r} \right| \leq 3\epsilon.$$

is less than

$$\exp \left\{ r + \log(2N) - (\epsilon^2/3) 2^{(d-r)} \right\}$$

- ▶ $X = X^n$, $\mathcal{P} \equiv$ family of distributions $P_{X^n|Y^n}(\cdot|y)$



Sufficiency of $H(G) < H(X_{\mathcal{M}}) - R_{CO}$

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H. Tyagi, P. Narayan, and P. Gupta, "When is a function securely computable?," IT, 57(10), October 2011, pp. 6337-6350.

If $H(G) < H(X_{\mathcal{M}}) - R_{CO}$:

Consider random mappings $F_i = F_i(X_i^n)$ of rates R_i such that

$$\sum_{i \in B} R_i \geq H(X_B | X_{B^c}), \quad B \subsetneq \mathcal{M}.$$

- ▶ \mathbf{F} results in omniscience at all the terminals.
- ▶ \mathbf{F} is approximately independent of G^n .

We prove a multiterminal version of the balanced coloring lemma.



Sufficiency of $H(G) < H(X_{\mathcal{M}}) - R_{CO}$

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 - ▶ \mathbf{F} is approximately independent of G^n .
-



C. Chan, [Multiterminal secure source coding for a common secret source](#), Allerton 2011.

Proved a multiterminal version of privacy amplification.



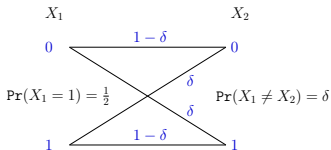
Example: Secure Computation of Parity

Function Computation

Secure Computing

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General Secure Computing



- ▶ $g(x_1, x_2) = x_1 \oplus x_2 \Rightarrow H(G) = h(\delta)$
- ▶ Sufficient condition for secure computing:

$$H(G) < H(X_1, X_2) - R_{CO}$$

$$\Leftrightarrow H(G) < I(X_1 \wedge X_2) = 1 - h(\delta).$$

- ▶ g is securely computable if

$$2h(\delta) < 1$$



Example: Secure Computation of Parity

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- ▶ **Secure computability condition:** $h(\delta) < 1 - h(\delta)$
- ▶ \mathbf{P} : parity check matrix of a *linear* SW code for X_1 given X_2
- ▶ $I(G^n \wedge X_1^n) = 0 \Rightarrow I(G^n \wedge F_1) = 0$.
- ▶ K : location of X_1^n in the coset of the standard array (for \mathbf{P}).
- ▶ Rate of $K = 1 - h(\delta)$.
- ▶ $I(K \wedge F_1) = 0$.
- ▶ $I(K \wedge F_1, G^n) = I(K \wedge F_1 | G^n) = 0$
 - P_{X^n} remains unchanged upon conditioning on G^n
- ▶ Use K as one-time pad to send $\hat{G}^{(n)}$.

X_1^n

X_2^n



Example: Secure Computation of Parity

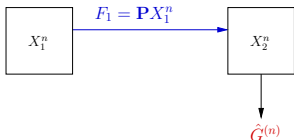
- ▶ Secure computability condition: $h(\delta) < 1 - h(\delta)$
- ▶ \mathbf{P} : parity check matrix of a *linear* SW code for X_1 given X_2
- ▶ $I(G^n \wedge X_1^n) = 0 \Rightarrow I(G^n \wedge F_1) = 0$
- ▶ $I(K \wedge F_1) = 0$
- ▶ $I(K \wedge F_1, G^n) = I(K \wedge F_1 | G^n) = 0$
- P_{X^n} remains unchanged upon conditioning on G^n
- ▶ Use K as one-time pad to send $\hat{G}^{(n)}$.



A. D. Wyner

[Recent Results in the Shannon Theory](#)

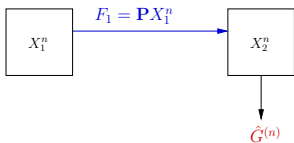
IT, 20, January 1974, pp. 2-10.





Example: Secure Computation of Parity

- ▶ Secure computability condition: $h(\delta) < 1 - h(\delta)$
- ▶ \mathbf{P} : parity check matrix of a *linear* SW code for X_1 given X_2
- ▶ $I(G^n \wedge X_1^n) = 0 \Rightarrow I(G^n \wedge F_1) = 0$.
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- ▶ Rate of $K = 1 - h(\delta)$.
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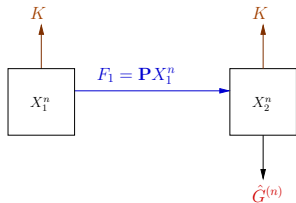


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- ▶ I
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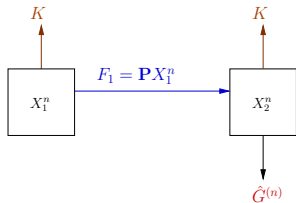
C. Ye and P. Narayan, [Secret key and private key constructions for simple multiterminal source models](#) IT, to appear in February 2012.





Example: Secure Computation of Parity

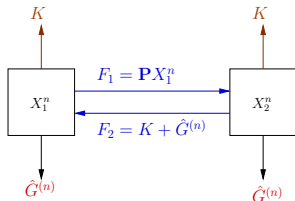
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Example: Secure Computation of Parity

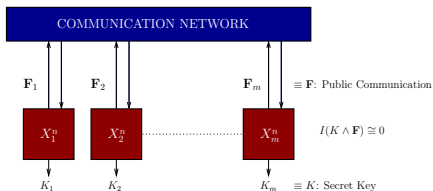
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A Necessary Condition

Secret Key Generation



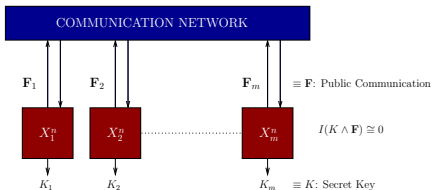
- ▶ I. Csiszár and P. Narayan, [Secrecy capacities for multiple terminals](#), IT, 50(12), December 2004, pp. 3047 - 3061.

$$C = H(X_M) - R_{CO}$$



A Necessary Condition

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- I. Csiszár and P. Narayan, [Secrecy capacities for multiple terminals](#), IT, 50(12), December 2004, pp. 3047 - 3061.

$$C = H(X_M) - R_{CO}$$

If g is securely computable,

$$H(G) \leq C.$$



Characterization of Securely Computable Functions

Function
Computation

Secure
Computing

CR for SK
Generation

General Secure
Computing

Theorem

If g is securely computable: $H(G) \leq C$.

Conversely, g is securely computable if: $H(G) < C$.

For a securely computable function g :

- ▶ *Omniscience can be obtained using $\mathbb{F} \stackrel{\perp}{\sim} G^n$.*
- ▶ *Noninteractive communication suffices.*
- ▶ *Randomization is not needed.*



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**CR for SK
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Function computation

Secure function computation

Common randomness for secret key generation

Computing without revealing the critical data



Common Randomness

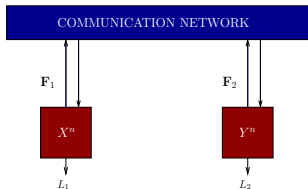
R. Ahlswede and I. Csiszár, [Common randomness in information theory and cryptography. ii. CR capacity](#), IT, 44(1), January 1998, pp. 225 - 240.

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L forms a CR if L is ϵ -recoverable from \mathbf{F} :

$$\Pr(L = L_1 = L_2) \geq 1 - \epsilon$$



Common Randomness

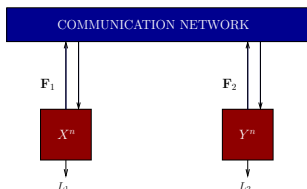
R. Ahlswede and I. Csiszár, [Common randomness in information theory and cryptography. ii. CR capacity](#), IT, 44(1), January 1998, pp. 225 - 240.

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P. Gács and J. Körner, [Common information is far less than mutual information](#), Problems of Control and Information Theory, 2(2), 1973, pp. 149-162.

► In general, CR rate is zero without public communication



Secret Key Generation



U. Maurer, [Secret key agreement by public discussion](#), IT, 39(3), May 1993, pp. 733 - 742.



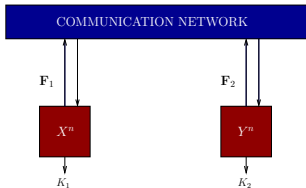
R. Ahlswede and I. Csiszár, [Common randomness in information theory and cryptography. i. secret sharing](#), IT, 39(4), July 1993, pp. 1121 - 1132.

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$$\frac{1}{n}I(\mathbf{F} \wedge K) \approx 0: \text{Weak Secrecy}$$

$$\text{Rate of the secret key} = \frac{1}{n}H(K)$$

$$\text{Secret key capacity } C = I(X \wedge Y)$$



Common Randomness for SK Capacity

What is the form of CR that yields an optimum rate SK?

► Maurer-Ahlsvede-Csiszár

- Common randomness (CR) generated: X^n or Y^n
- Rate of communication required = $\min\{H(X|Y), H(Y|X)\}$
- Decomposition:
$$H(X) = H(X|Y) + I(X \wedge Y),$$
$$H(Y) = H(Y|X) + I(X \wedge Y)$$

► Csiszár-Narayan

- Common randomness generated: X^n, Y^n (Omniscience)
- Rate of communication required = $H(X|Y) + H(Y|X)$
- Decomposition:
$$H(X, Y) = H(X|Y) + H(Y|X) + I(X \wedge Y)$$

Himanshu Tyagi, [Minimal public communication for maximum rate secret key generation](#), ISIT 2011.



Common Randomness for SK Capacity

Lemma (Characterization of CR for generating an optimum rate SK)

A CR J recoverable from communication \mathbf{F} yields an optimum rate SK if and only if

$$\frac{1}{n} I(X^n \wedge Y^n | J, \mathbf{F}) \approx 0.$$

► Optimal rate of SK generated: $\frac{1}{n} H(J | \mathbf{F})$

Necessity: If CR J is generated to establish an SK K and

$$\frac{1}{n} I(X^n \wedge Y^n | J, \mathbf{F}) > 0,$$

⇒ there exists an SK K' of positive rate and independent of (J, \mathbf{F}) .

Sufficiency:

$$\begin{aligned} I(X \wedge Y) &\approx \frac{1}{n} \left[I(X^n \wedge Y^n | J, \mathbf{F}) + H(J, \mathbf{F}) - H(\mathbf{F} | X^n) - H(\mathbf{F} | Y^n) \right] \\ &\leq \frac{1}{n} \left[I(X^n \wedge Y^n | J, \mathbf{F}) + H(J | \mathbf{F}) \right] \end{aligned}$$



Common Randomness for SK Capacity

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Lemma (Characterization of CR for generating an optimum rate SK)

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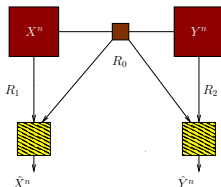
What is the minimum rate of CR for optimum rate SK generation?

Interactive common information



Interactive Common Information

- Wyner's Common Information
In the context of source coding:



$$CI(X \wedge Y) := \min_{R_0 + R_1 + R_2 \leq H(X, Y)} R_0 = \min_{X \oplus W \oplus Y} I(W \wedge X, Y).$$

Simple bound on CI: $I(X \wedge Y) \leq CI(X \wedge Y) \leq \min\{H(X), H(Y)\}$.

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Interactive Common Information

Function
Computation

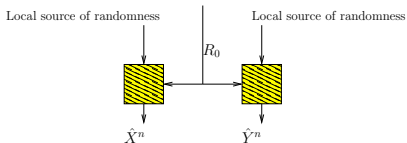
Secure
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► Wyner's Common Information

In the context of source generation:



$$D(\mathbb{P}_{X^n, Y^n} || \mathbb{P}_{\hat{X}^n, \hat{Y}^n}) \approx 0$$

$$CI(X \wedge Y) := \min R_0$$



Interactive Common Information

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► Wyner's Common Information

$CI(X \wedge Y) \equiv \min.$ rate of a function $L = L(X^n, Y^n)$ such that

$$\frac{1}{n}I(X^n \wedge Y^n | L) \approx 0.$$



Interactive Common Information

► Wyner's Common Information

$CI(X \wedge Y) \equiv \min.$ rate of a function $L = L(X^n, Y^n)$ such that

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► Interactive Common Information

Terminals agree on CR J using r rounds of communication \mathbf{F} .

$CI_i^r(X; Y) \equiv \min.$ rate of (J, \mathbf{F}) such that

$$\frac{1}{n} I(X^n \wedge Y^n | J, \mathbf{F}) \approx 0.$$

$$CI_i(X \wedge Y) := \lim_{r \rightarrow \infty} CI_i^r(X; Y)$$

Note: $CI(X \wedge Y) \leq CI_i(X \wedge Y) \leq \min\{H(X), H(Y)\}$.



Common Information Quantities

For a pair of rvs X, Y

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$$CI_{GC} \leq I(X \wedge Y) \leq CI \leq CI_i \leq CI_i^r \leq CI_i^{r-1} \leq \min\{H(X), H(Y)\}$$



Common Information Quantities

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Common Information Quantities

For a pair of rvs X, Y



$$CI_{GC} \leq I(X \wedge Y) \leq CI \leq CI_i \leq CI_i^r \leq CI_i^{r-1} \leq \min\{H(X), H(Y)\}$$



Interactive Common Information

- CI_i is indeed a new quantity:

For binary symmetric X, Y

$$CI_i(X \wedge Y) = \min\{H(X), H(Y)\}$$

$$CI(X \wedge Y) < \min\{H(X), H(Y)\}$$



Application: Minimum Communication for Optimum Rate SK

CR (J, \mathbf{F}) yields an optimum rate SK if and only if

$$\frac{1}{n} I(X^n \wedge Y^n | J, \mathbf{F}) \approx 0.$$

\Rightarrow It suffices to characterize minimum rate of the communication above.

Theorem

For r -round interactive communication \mathbf{F} let

$$CI_i^r = \min. \text{ rate of } (J, \mathbf{F}) \text{ s.t. } X^n \underset{\sim}{\perp\!\!\!\perp} Y^n | (J, \mathbf{F}),$$

$$R_{SK}^r = \min. \text{ rate of } \mathbf{F} \text{ required for optimal rate SK generation,}$$

$$R_{CI}^r = \min. \text{ rate of } \mathbf{F} \text{ required for generating CR } J \text{ s.t. } X^n \underset{\sim}{\perp\!\!\!\perp} Y^n | (J, \mathbf{F}),$$

Then,

$$R_{SK}^r = R_{CI}^r = CI_i^r(X; Y) - I(X \wedge Y).$$

A single letter characterization of CI_i^r is available.



Application: Minimum Communication for Optimum Rate SK

CR (J, \mathbf{F}) yields an optimum rate SK if and only if

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Then,

$$R_{SK}^r = R_{CI}^r = CI_i^r(X; Y) - I(X \wedge Y).$$

Taking limit $r \rightarrow \infty$:

$$R_{SK} = R_{CI} = CI_i(X \wedge Y) - I(X \wedge Y)$$



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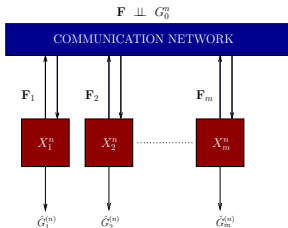
Computing Without Revealing Critical Data

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- ▶ Critical data: $g_0(X_{\mathcal{M}})$.
- ▶ Secure computability of $g_{\mathcal{M}} = (g_0, g_1, \dots, g_m)$:

$$\text{Recoverability : } \Pr \left(G_i^{(n)} = g_i(X_{\mathcal{M}}^n), 1 \leq i \leq m \right) \approx 1$$

$$\text{Security : } I(g_0(X_{\mathcal{M}}^n) \wedge \mathbf{F}) \approx 0$$

When is a given function $g_{\mathcal{M}}$ securely computable?



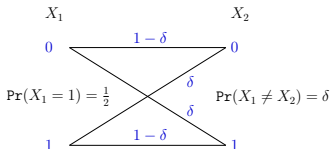
Application to Binary Symmetric Sources

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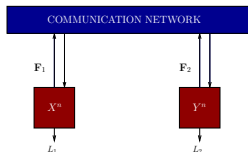
General Secure
Computing



g_0	g_1	g_2	SC condition
$X_1 \oplus X_2$	$X_1 \oplus X_2$	$X_1 \oplus X_2$	$h(\delta) < 1/2$
$X_1 \oplus X_2$	$X_1 \oplus X_2$	ϕ	$h(\delta) < 1$
$X_1 \oplus X_2, X_1 \cdot X_2$	$X_1 \oplus X_2, X_1 \cdot X_2$	$X_1 \cdot X_2$	$h(\delta) < 1/3$
$X_1 \oplus X_2$	$X_1 \oplus X_2$	$X_1 \cdot X_2$	$h(\delta) < 2/3$



In Closing ...



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- ▶ Identify the form of CR established
- ▶ Restrictions on the CR established:
 - ▶ *Function computation*: G^n is recoverable from L .
 - ▶ *Optimum rate SK generation*:
CR renders X^n and Y^n conditionally independent.
- ▶ Restrictions on the communication:
 - ▶ *Secure function computation*: G^n is independent of F .
 - ▶ *Secret key generation*: $K \equiv$ CR bits independent of F .

Can the study of CR generated lead to a better understanding of computation over networks?