

Unique Information and Secret Key Decompositions

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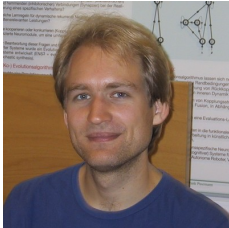


Max-Planck-Institut für

Mathematik

in den **Naturwissenschaften**

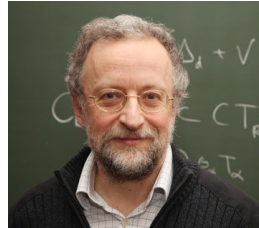
Joint work with



Johannes Rauh



Eckehard Olbrich



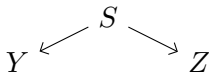
Jürgen Jost

- ① Positive information decomposition and the UI
- ② UI and secret key decomposition
- ③ UI -based bounds on secret key rates

Positive information decomposition and the *UI*

Positive information decomposition

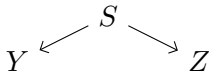
Suppose we want to know S , but can only observe Y and/or Z



How is the information about S distributed?

Positive information decomposition

Suppose we want to know S , but can only observe Y and/or Z



Classify information about S according to “*who knows what*”:

Williams and Beer (2010), “Nonnegative decomposition of multivariate information” [WB10]

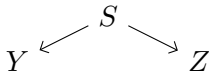
Unique: information *known to Y , but unknown to Z*

Redundant: information *known in common to Y and Z*

Synergistic: information that *materializes only when Y and Z act jointly*

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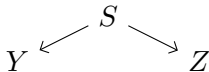
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- Synergy: Y, Z independent binary, $S = \text{XOR}(Y, Z)$:
 $I(S; Y) = I(S; Z) = 0$, but $I(S; YZ) = 1$ bit
- Redundancy: $S = Y = Z$ uniform binary: $I(S; Y) = I(S; Z) = 1$ bit

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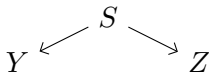
Synergistic: information that *materializes only when Y and Z act jointly*

In general, all three flavors may be present at the same time.

How can we separate them?

Positive information decomposition

Suppose we want to know S , but can only observe Y and/or Z



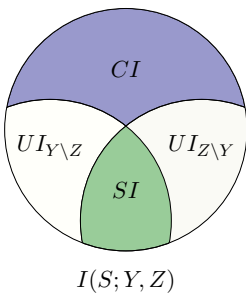
Mathematically, we are looking for a decomposition:

$$\begin{aligned} I(S; Y, Z) = & \underbrace{SI(S; Y, Z)}_{\text{shared information (redundancy)}} + \underbrace{UI(S; Y \setminus Z)}_{\text{unique information of } Y} \\ & + \underbrace{UI(S; Z \setminus Y)}_{\text{unique information of } Z} + \underbrace{CI(S; Y, Z)}_{\text{complementary information (synergy)}} \end{aligned}$$

$$I(S; Y) = SI(S; Y, Z) + UI(S; Y \setminus Z)$$

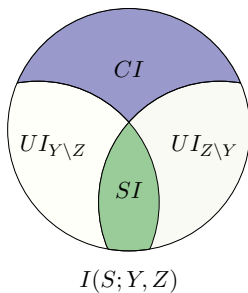
$$I(S; Z) = SI(S; Y, Z) + UI(S; Z \setminus Y)$$

Information decomposition



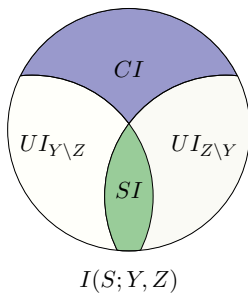
Need to fix a degree of freedom

Information decomposition



Need to fix a degree of freedom

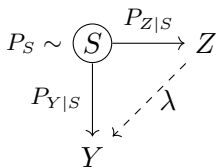
Information decomposition



Need to fix a degree of freedom

The Unique Information (UI)

Bertschinger, Rauh, Olbrich, Jost, Ay (2014) [BRO⁺14]

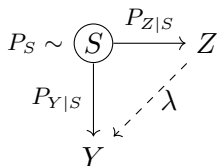


$$UI_P(S; Y \setminus Z) := \min_{Q \in \Delta_P} I_Q(S; Y|Z)$$

$$\Delta_P = \{Q_{SYZ} \in \Delta: Q_{SY} = P_{SY}, Q_{SZ} = P_{SZ}\}$$

The Unique Information (UI)

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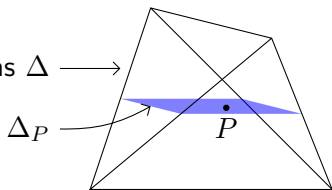


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Convex program over a polytope of dimension $|\mathcal{S}|(|\mathcal{Y}| - 1)(|\mathcal{Z}| - 1)$

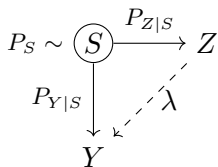
simplex of joint distributions $\Delta \longrightarrow$



Computing the Unique Information, Proc. IEEE ISIT, [BRM18]

The Unique Information (UI)

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$$UI_P(S; Y \setminus Z) := \min_{Q \in \Delta_P} I_Q(S; Y|Z)$$

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Theorem 1 ([BRO⁺14])

$UI(S; Y \setminus Z) = 0$ if and only if there is a stochastic matrix λ with

$$P(y|s) = \sum_z \lambda(y|z)P(z|s).$$

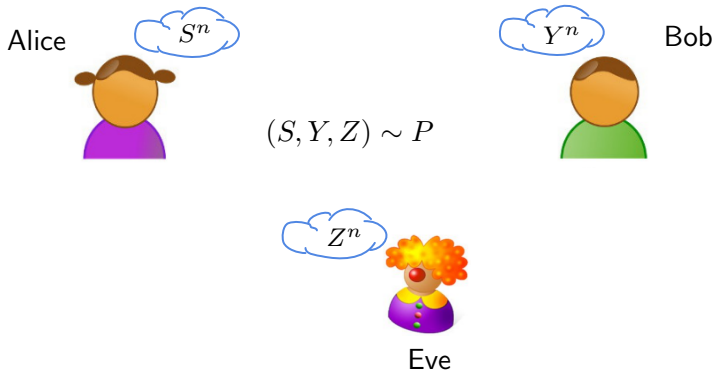
D. Blackwell, “Equivalent comparisons of experiments,” Ann. Math. Stat. [Bla53]

Corollary 2 (by Blackwell’s theorem)

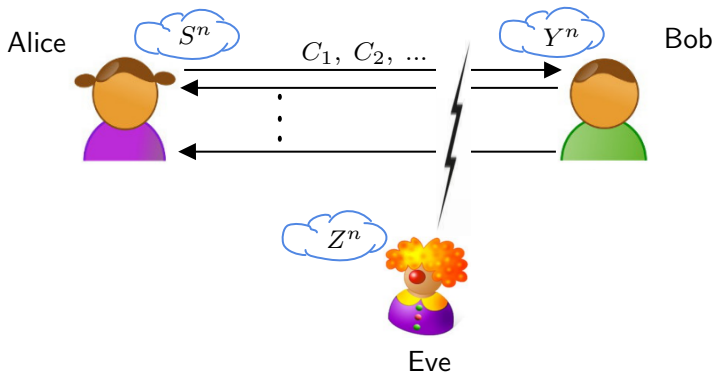
$UI(S; Y \setminus Z) = 0 \iff Z$ performs better than Y in any decision problem.

UI and secret key decomposition

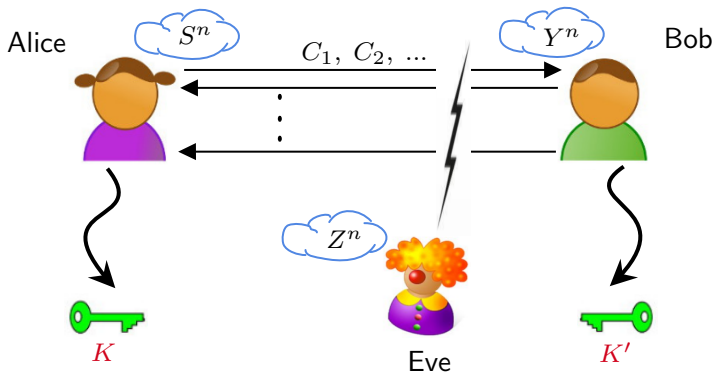
The secret key agreement problem



The secret key agreement problem



The secret key agreement problem



$$\begin{aligned}\Pr[K = K'] &\approx 1 \\ I(K; Z^n, \vec{C}) &\approx 0 \\ \frac{1}{n} H(K) &\end{aligned}$$

The one-way secret key rate (S_{\rightarrow})

- The protocol is *one-way* if Alice is allowed to send only one message and Bob none
- Ahlswede and Csiszár [AC93] showed:

$$S_{\rightarrow}(S; Y|Z) = \max_{P_{UV|SYZ}: V-U-S-YZ} I(U; Y|V) - I(U; Z|V)$$

where it suffices to restrict the range of U and V resp. to $|\mathcal{S}|^2$ and $|\mathcal{S}|$

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where it suffices to restrict the range of U and V resp. to $|\mathcal{S}|^2$ and $|\mathcal{S}|$

- No analogous formula for the two-way secret key rate, $S_{\leftrightarrow}(S; Y|Z)$
- Value of S_{\leftrightarrow} is known only for a handful of distributions

Bounds on the two-way secret key rate

Trivial upper bound [Mau93]

$$S_{\leftrightarrow}(S; Y|Z) \leq \min\{I(S; Y), I(S; Y|Z)\}$$

Intrinsic information [MW99]

$$I_{\downarrow}(S; Y|Z) := \min_{P_{Z'|Z}} I(S; Y|Z'), \quad |Z'| \leq |Z|$$

Reduced intrinsic information [RW03]

$$I_{\downarrow\downarrow}(S; Y|Z) := \inf_{P_{U|SYZ}} I_{\downarrow}(S; Y|ZU) + H(U)$$

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Secret key decomposition-based bounds [GA10, GA17]

$$B_1(S; Y|Z) := \min_{P_{Z'|SYZ}} I(S; Y|Z') + I(SY; Z'|Z), \quad |Z'| \leq |S||Y||Z|$$

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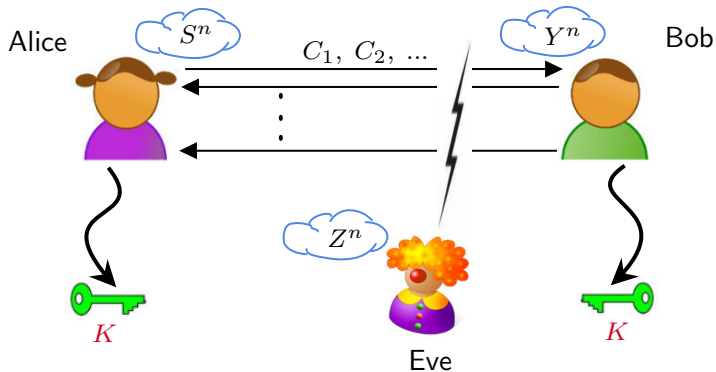
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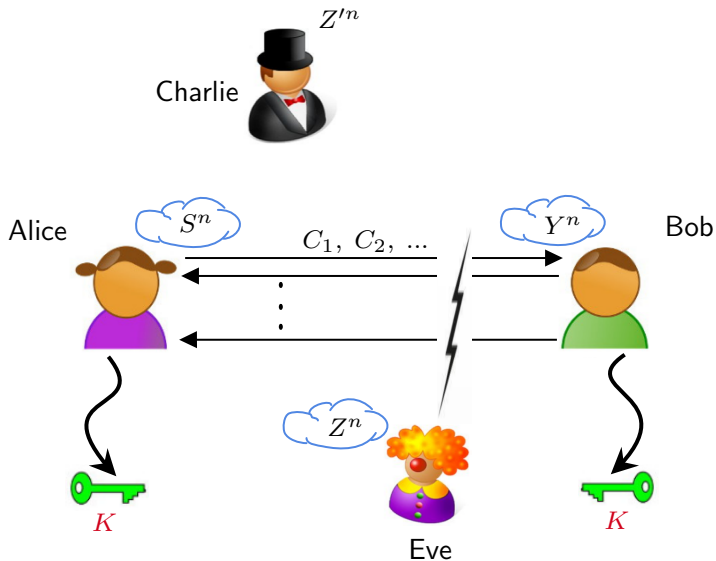
Full chain of bounds on S_{\leftrightarrow}

$$S_{\rightarrow} \leq S_{\leftrightarrow} \leq B_1 \leq I_{\downarrow\downarrow} \leq I_{\downarrow} \leq I$$

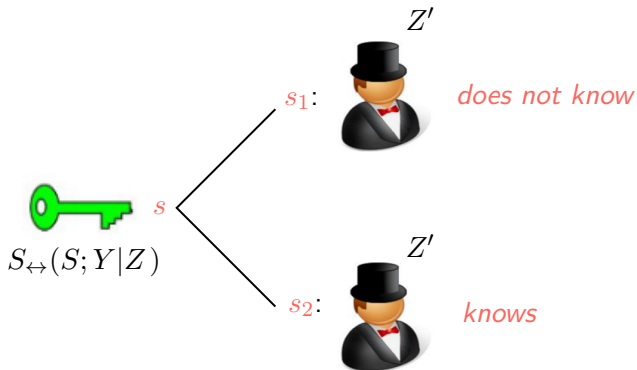
Secret key decomposition



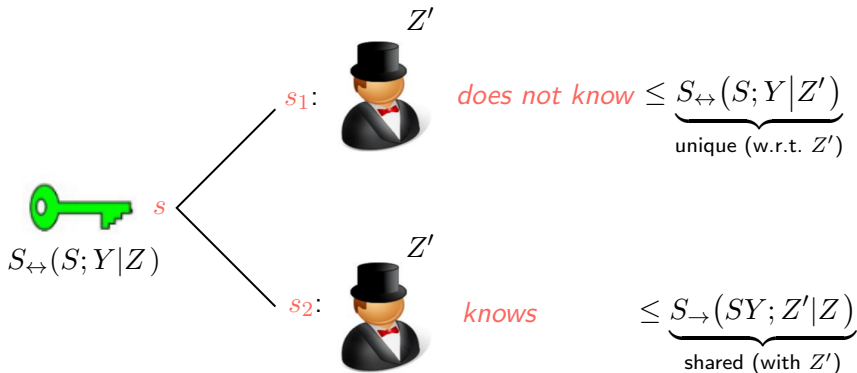
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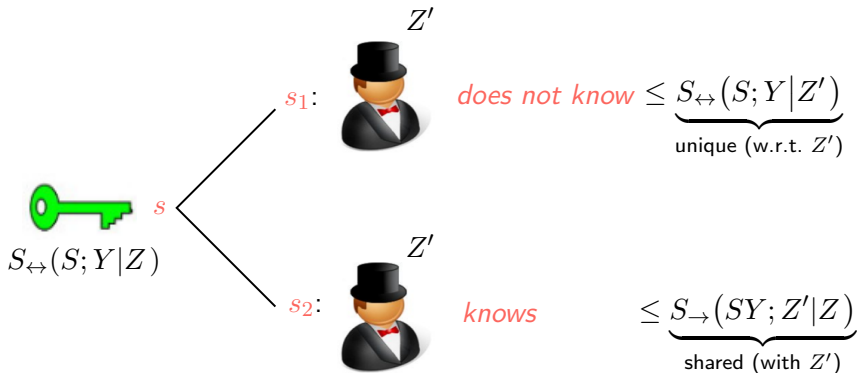
Secret key decomposition



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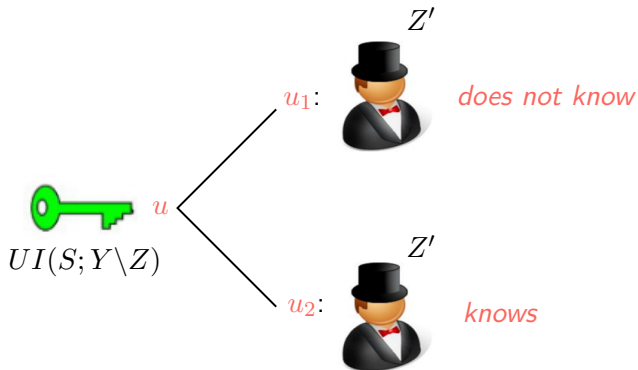
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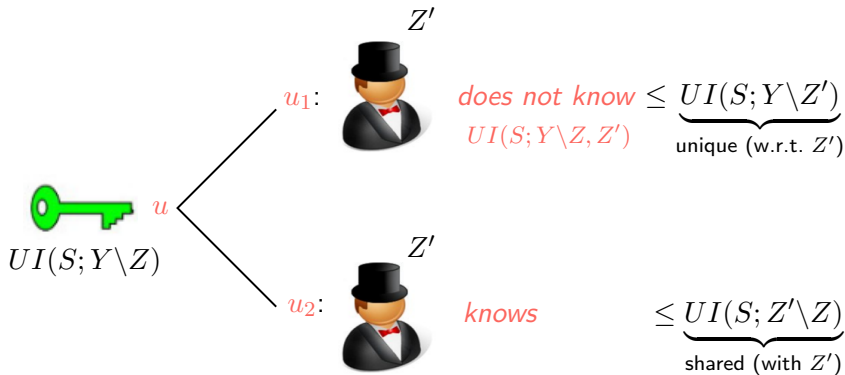
Secret key decomposition property [GA10, GA17]

$$\forall (S, Y, Z, Z') : S_{\leftrightarrow}(S; Y|Z) \leq \underbrace{S_{\leftrightarrow}(S; Y|Z')}_{\text{unique (w.r.t. } Z')} + \underbrace{S_{\rightarrow}(SY; Z'|Z)}_{\text{shared (with } Z')}$$

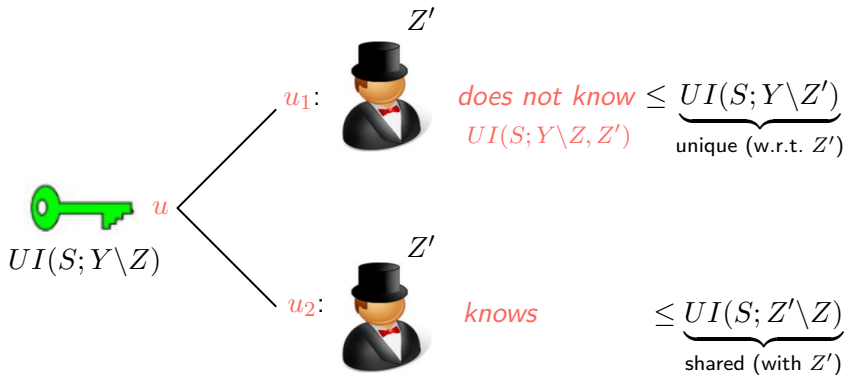
Unique information decomposition



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Unique information decomposition



Triangle inequality for the UI [RBOJ19]

$$\forall (S, Y, Z, Z') : UI(S; Y \setminus Z) \leq \underbrace{UI(S; Y \setminus Z')}_{\text{unique (w.r.t. } Z')} + \underbrace{UI(S; Z' \setminus Z)}_{\text{shared (with } Z')}$$

UI and Secret key decomposition

Unique information decomposition property [RBOJ19]

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$$UI \leq B_1 \leq I_{\downarrow\downarrow} \leq I_{\downarrow} \leq I$$

Secret key decomposition property [GA10, GA17]

$$\forall (S, Y, Z, Z') : S_{\leftrightarrow}(S; Y|Z) \leq S_{\leftrightarrow}(S; Y|Z') + S_{\rightarrow}(SY; Z'|Z)$$

→ Key takeaway: The *UI* is similar in spirit to the secret key rates

- $UI(S; Y \setminus Z)$: *Information about S known to Y but unknown to Z*
- $S_{\leftrightarrow}(S; Y|Z)$: *Information common to S and Y that is unique w.r.t. Z*

UI-based bounds on secret key rates

UI is a secrecy monotone

Key property: UI is *nonincreasing* under local operations (LO) of Alice and Bob and one-way public communication (PC) by Alice

Theorem 3

$$S_{\rightarrow} \leq UI$$

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Theorem 3

$$S_{\rightarrow} \leq UI$$

Theorem 4

Let (S, Y, Z) be a triple of random variables such that $S_{\leftrightarrow}(S; Y|Z) > 0$. If either $UI(S; Y \setminus Z)$ or $UI(Y; S \setminus Z)$ vanishes, then the secret key rate in the active adversary scenario vanishes, or else it equals $S_{\leftrightarrow}(S; Y|Z)$.

UI -based bounds on secret key rates

Theorem 5

$$S_{\rightarrow} \leq UI \leq B_1 \leq I_{\downarrow\downarrow} \leq I_{\downarrow} \leq I$$

Full chain of bounds on S_{\leftrightarrow}

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UI-based bounds on secret key rates

Theorem 5

$$S_{\rightarrow} \leq \textcolor{red}{UI} \leq B_1 \leq I_{\downarrow\downarrow} \leq I_{\downarrow} \leq I$$

Full chain of bounds on S_{\leftrightarrow}

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Given $(S, Y, Z) \sim P$, let

$$\begin{aligned} Q^* &\in \operatorname{argmin}_{Q \in \Delta_P} I_Q(S; Y|Z) \\ CI_P(S; Y, Z) &= I_P(S; Y|Z) - UI(S; Y \setminus Z) \\ &= I_P(S; Y|Z) - I_{Q^*}(S; Y|Z) \end{aligned}$$

Q^* is called a *minimum synergy distribution*, as

$$CI_P(S; Y, Z) = 0 \text{ if and only if } P = Q^*$$

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→ Choosing $P = Q^*$, all upper bounds on S_{\leftrightarrow} collapse to the UI

A conjecture

UI cannot be an upper bound on the two-way rate:

- If the pairs (S, Y) and (S, Z) have the same distribution, then $UI(S; Y \setminus Z) = UI(S; Z \setminus Y) = 0$
- S_{\leftrightarrow} can still be positive in such a situation [GA17]

Conjecture 6

$$UI(S; Y \setminus Z) \leq S_{\leftrightarrow}(S; Y|Z)$$

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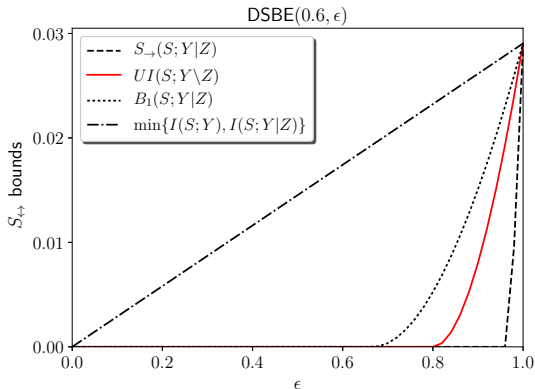
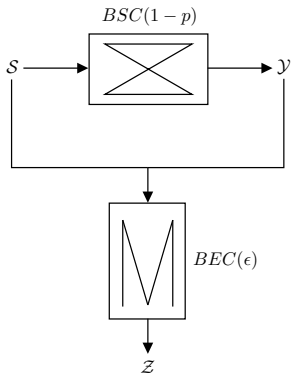
Sandwich bound on $S_{\leftrightarrow}(S; Y|Z)$: If Conjecture 6 is true, then

$$UI(S; Y|Z) = I_{Q^*}(S; Y|Z) \leq S_{\leftrightarrow}(S; Y|Z) \leq I_P(S; Y|Z)$$

The set of all Q^* is a set of distributions for which the UI equals S_{\leftrightarrow}

→ **Operationalizes the UI**

DSBE source example



- $S_{\leftrightarrow} = 0 \iff \epsilon \leq \frac{1-p}{p}$
- $UI = 0 \iff \epsilon \leq 2(1-p)$

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Unique information and deficiencies

Output deficiency

$$\mathcal{S} \xrightarrow{\kappa} \mathcal{Y}$$

$$\mathcal{S} \xrightarrow{\mu} \mathcal{Z} \dashrightarrow^{\lambda} \mathcal{Y}$$

Input deficiency

$$\mathcal{Y} \xrightarrow{\bar{\kappa}} \mathcal{S}$$

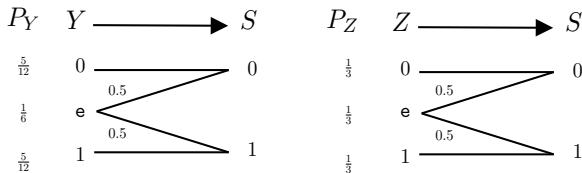
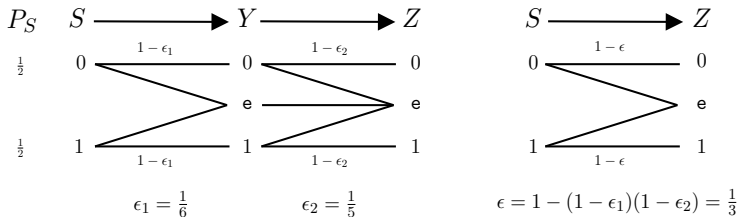
$$\mathcal{Y} \dashrightarrow^{\bar{\lambda}} \mathcal{Z} \xrightarrow{\bar{\mu}} \mathcal{S}$$

$$\delta_o^\pi(\mu, \kappa) := \min_{\lambda \in \mathbf{M}(\mathcal{Z}; \mathcal{Y})} D(\kappa \| \lambda \circ \mu | \pi_S)$$

$$\delta_i^\pi(\bar{\mu}, \bar{\kappa}) := \min_{\bar{\lambda} \in \mathbf{M}(\mathcal{Y}; \mathcal{Z})} D(\bar{\kappa} \| \bar{\mu} \circ \bar{\lambda} | \pi_Y)$$

Unique informations and deficiencies, Proc. IEEE Allerton, [BOJR18]

Vanishing sets of UI and δ_i^π are different



$$UI = \frac{1}{6} \quad \delta_i^\pi = 0$$

Properties of the UI

Non-locking and monotonicity under LO of Eve

The secret key rate is **non-locking**:

$$\forall (S, Y, Z, U) : S_{\leftrightarrow}(S; Y|ZU) \geq S_{\leftrightarrow}(S; Y|Z) - H(U)$$

P.1 UI is *non-locking*

$$\forall (S, Y, Z, U) : UI(S; Y \setminus ZU) \geq UI(S; Y \setminus Z) - H(U)$$

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P.1 UI is non-locking

$$\forall (S, Y, Z, U) : UI(S; Y \setminus ZU) \geq UI(S; Y \setminus Z) - H(U)$$

If Eve sends Z through a channel $P_{Z'|Z}$, then the key rate cannot decrease:

$$S_{\leftrightarrow}(S; Y|Z) \leq S_{\leftrightarrow}(S; Y|Z') \text{ for any } P_{Z'|Z}$$

P.2 Monotonicity under local operation (LO) of Eve

$$\forall (S, Y, Z, Z') : SY - Z - Z', \text{ we have } UI(S; Y \setminus Z) \leq UI(S; Y \setminus Z')$$

A consequence of Properties **P.1** and **P.2**:

$$UI \leq I_{\downarrow\downarrow} \leq I_{\downarrow}$$

Properties of the UI

Monotonicity under LOPC

P.3 *Monotonicity under local operation (LO) of Alice and Bob*

$\forall (S, S', Y, Z) : YZ - S - S',$ we have $UI(S; Y \setminus Z) \geq UI(S'; Y \setminus Z)$

and likewise for local operations on Y

P.4 *Monotonicity under (one-way) public communication (PC) by Alice*

For all (S, Y, Z) and functions f over the support of S , we have

$$UI(S; Y \setminus Z) \geq UI((S, f(S)); (Y, f(S)) \setminus (Z, f(S)))$$

Properties of the UI

Monotonicity under LOPC

P.3 *Monotonicity under local operation (LO) of Alice and Bob*

$\forall (S, S', Y, Z) : YZ - S - S',$ we have $UI(S; Y \setminus Z) \geq UI(S'; Y \setminus Z)$

and likewise for local operations on Y

P.4 *Monotonicity under (one-way) public communication (PC) by Alice*

For all (S, Y, Z) and functions f over the support of S , we have

$$UI(S; Y \setminus Z) \geq UI((S, f(S)); (Y, f(S)) \setminus (Z, f(S)))$$

$UI(S; Y \setminus Z)$ is a **monotone** under **LO** of **Alice** and **Bob** and **one-way PC** of **Alice**

Properties of the UI

Additivity and asymptotic continuity

P.5 *Normalization* For a perfect secret bit $\Phi(s, y, z) := \frac{1}{2}\delta_{s,y} \times Q_Z(z)$,

$$UI_{\Phi}(S, Y \setminus Z) = 1$$

P.6 *Additivity on tensor products* For n i.i.d. copies of $(S, Y, Z) \sim P$,

$$UI(S^n; Y^n \setminus Z^n) = n \cdot UI(S; Y \setminus Z)$$

P.7 *Asymptotic continuity*

For any $P, P' \in \mathbb{P}_{\mathcal{S} \times \mathcal{Y} \times \mathcal{Z}}$, and $\epsilon \in [0, 1]$, if $\|P - P'\|_1 = \epsilon$, then

$$UI_{P'}(S; Y \setminus Z) - UI_P(S; Y \setminus Z) \leq \zeta(\epsilon) + \frac{5}{2}\epsilon \log \min\{|\mathcal{S}|, |\mathcal{Y}|\}$$

for some bounded, continuous function $\zeta : [0, 1] \rightarrow \mathbb{R}_+$ s.t. $\zeta(0) = 0$.