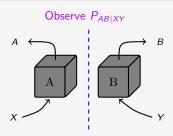
# Device-independent lower bounds on the conditional von Neumann entropy

Peter Brown, Hamza Fawzi and Omar Fawzi

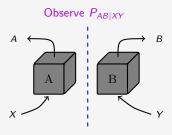
arXiv:2106.13692

Aug 25, 2021

# **Bell-nonlocality**



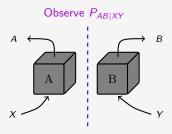
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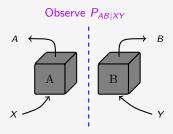
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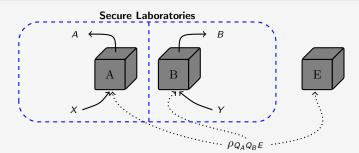
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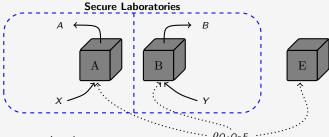


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- Foundation for randomness expansion / key-distribution protocols!
- Security and analysis relies on being able to calculate the rates of such protocols (bits per round).

# Randomness generated per round



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Asymptotic rates are given by:

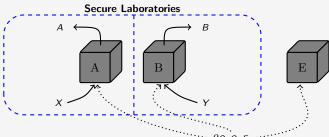
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$$H(AB|X = x^*, Y = y^*, E)$$

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Want device-independent lower bounds

Fix some linear constraint(s) C on  $p_{AB|XY}$  (observations). E.g.

$$\frac{1}{4} \sum_{xy=a \oplus b} p(ab|xy) \ge 0.8.$$

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A strategy for C is a tuple  $(\rho, \{M_{a|x}\}, \{N_{b|y}\})$  such that

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- Analytical bounds [PAB<sup>+</sup>09]
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## Our approach

Define a sequence

$$H_m(\rho) = \inf_{Z_1, \dots, Z_m \in B(H)} \operatorname{Tr} \left[ \rho \ q(Z_1, \dots, Z_m) \right] \tag{1}$$

such that  $H_m \leq H$  and  $H_m \to H$  as  $m \to \infty$ .



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# Generalization: relative entropy bounds

We actually work with the relative entropy

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## The goal

Derive something of the form

$$D(\rho \| \sigma) \leq \sum_{i=1}^{m} \inf_{Z} \operatorname{Tr} \left[ \rho p_{i}(Z) \right] + \operatorname{Tr} \left[ \sigma q_{i}(Z) \right]$$

with  $p_i$  and  $q_i$  some polynomials and with the RHS converging as  $m \to \infty$ .

Gauss-Radau approximation of the logarithm

$$\ln(x) \geq \sum_{i=1}^{m} w_i f_{t_i}(x)$$

where  $f_t(x) = rac{x-1}{t(x-1)+1}$  (RHS converges as  $m o \infty$ ).

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#### Result

$$D(\rho \| \sigma) \leq \sum_{i=1}^{m} \frac{w_i}{t_i \ln 2} \inf_{Z \in B(H)} \{ \text{Tr} \left[ \rho (I + Z + Z^* + (1 - t_i)Z^*Z) \right] + t_i \text{Tr} \left[ \sigma Z Z^* \right] \}$$

and RHS converges as  $m \to \infty$ .

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$$H(A|B) = -D(\rho_{AB}||I_A \otimes \rho_B)$$

#### **Theorem**

The rate inf  $H(A|X = x^*, Q_E)$  is never larger than

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■ Can now be easily relaxed to an NCPOP and solved using NPA [PNA10].

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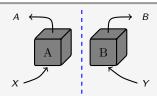
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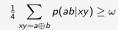
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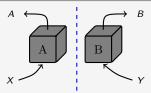


CHSH score

■ Full distribution

$$p(ab|xy) = c_{abxy}$$

$$\forall (a, b, x, y)$$



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$$\frac{1}{4} \sum_{xy=a \oplus b} p(ab|xy) \ge \omega$$

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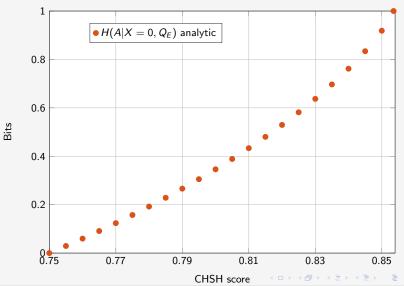
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- Investigated detection efficiency noise model.
  - Independent probability  $\eta \in [0,1]$  that each device *succeeds*.
  - Device failures recorded as a particular outcome.

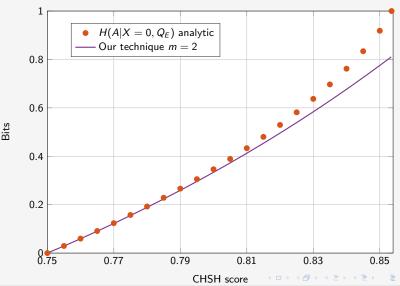
# Results I - Recovering tight bounds for the CHSH game

# Bounding inf $H(A|X = 0, Q_E)$



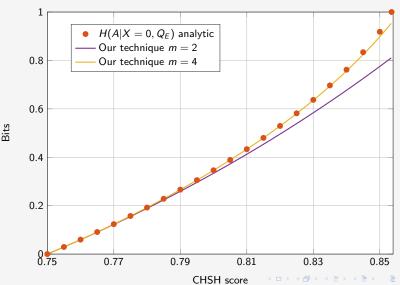
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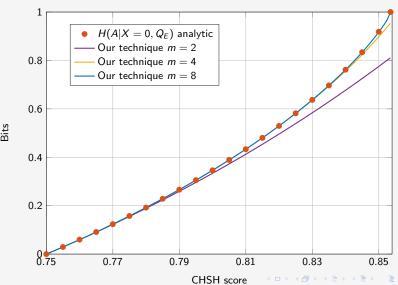
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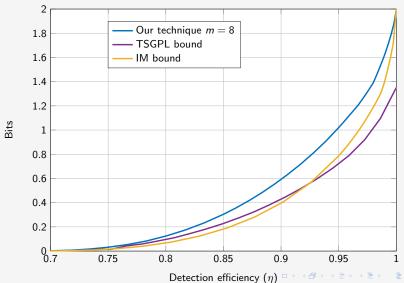
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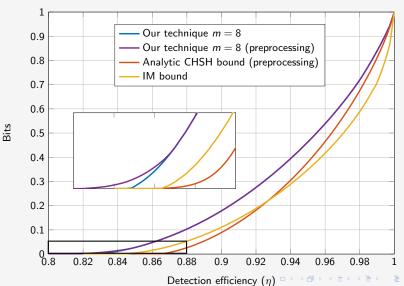
# Results II – Improved randomness expansion rates

Bounding inf  $H(AB|X = 0, Y = 0, Q_E)$ 



# Results III - Improved DIQKD rates

Bounding inf  $H(A|X = 0, Q_E) - H(A|X = 0, Y = 2, B)$ 



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- Other entropic quantities?

# Bibliography



Peter Brown, Hamza Fawzi, and Omar Fawzi.

Computing conditional entropies for quantum correlations. *Nature communications*, 12(1):1–12, 2021.



Stefano Pironio, Antonio Acín, Nicolas Brunner, Nicolas Gisin, Serge Massar, and Valerio Scarani.

Device-independent quantum key distribution secure against collective attacks.

New Journal of Physics, 11(4):045021, 2009.



Stefano Pironio, Miguel Navascués, and Antonio Acín.

Convergent relaxations of polynomial optimization problems with noncommuting variables.

SIAM Journal on Optimization, 20(5):2157-2180, 2010.



Ernest Y-Z Tan, René Schwonnek, Koon Tong Goh, Ignatius William Primaatmaja, and Charles C-W Lim.

Computing secure key rates for quantum key distribution with untrusted devices.

e-print arXiv:1908.11372, 2019.