

**Google** Research

# Bounding the set of classical correlations of a many-body system

September 2<sup>nd</sup> 2022

#### Jordi Tura Applied Quantum Algorithms group Leiden

Leiden Institute of Physics

Outline



- A quantum information scientist meets non-negative polynomials
- Sum-of-squares representations
- Characterízing many-body correlations
- An application of sum-of-quares in quantum information: self-testing



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  - Bounds on línear partíal dífferentíal equations
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• A bit of history



#### A bit of history



Who among us would not be happy to lift the veil behind which is hidden the future; to gaze at the coming developments of our science and at the secrets of its development in the centuries to come? What will be the ends toward which the spirit of future generations of mathematicians will tend? What methods, what new facts will the new century reveal in the vast and rich field of mathematical thought?

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Continuum hypothesis

Riemann Hypothesis and other number theory conjectures

Given a multivariate nonnegative polynomial, does it admit a sum-of-squres

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representation?,





Given  $p(\vec{x}) \in \mathbb{R}[\vec{x}]$  satisfying  $p(\vec{x}) \ge 0 \ \forall \vec{x} \in \mathbb{R}^n$ , does  $p(\vec{x})$  admit a sum-of-squares (s.o.s.) representation  $p(\vec{x}) = \sum q_i(\vec{x})^2$ ?



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Converse is trivial. When does equivalence hold?



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- Converse is trivial. When does equivalence hold?
- How powerful is this representation?



Given  $p(\vec{x}) \in \mathbb{R}[\vec{x}]$  satisfying  $p(\vec{x}) \ge 0 \ \forall \vec{x} \in \mathbb{R}^n$ , does  $p(\vec{x})$  admit a sum-of-squares (s.o.s.) representation  $p(\vec{x}) = \sum_i q_i(\vec{x})^2$ ?

- Converse is trivial. When does equivalence hold?
- How powerful is this representation?
- Can one extend it to subsets of  $\mathbb{R}^n$ ?

- Semialgebraic sets  $\begin{cases} f_i(\vec{x}) &= 0\\ g_j(\vec{x}) &\geq 0 \end{cases}$ 







n 2d	1	2	3	4	5
2					
4					
6					
8					
10					



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 $p(x) \ge 0 \iff p(x)$  s.o.s.



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Non-constructive proof







• Textbook counter-example




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  - Motzkin polynomial  $GM(x^4y^2, x^2y^4, 1) \le AM(x^4y^2, x^2y^4, 1)$



## Non-negative polynomial

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  - Motzkin polynomial  $GM(x^4y^2, x^2y^4, 1) \le AM(x^4y^2, x^2y^4, 1)$  $x^4y^2 + x^2y^4 + 1 - 3x^2y^2 > 0$



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Does not admit a sum-of-squares representation Not even adding an arbitrarily large constant But  $(x^2 + y^2)(x^4y^2 + x^2y^4 + 1 - 3x^2y^2)$  does admit a sos decomposition!!

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Is there a tractable approach to this question? Semidefinite programs



 $p(\vec{x}) = \sum_{i} h_i^{\dagger}(\vec{x}) h_i(\vec{x})$ 



Helton's theorem (2002)  $p(\vec{x}) = \sum h_i^{\dagger}(\vec{x})h_i(\vec{x})$ 



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Not positive on 2x2 matrices  

$$Q\left(\begin{pmatrix} 0 & 1 \\ -1 & 0 \end{pmatrix}, \begin{pmatrix} 1 & 0 \\ 0 & 1 \end{pmatrix}\right) = \begin{pmatrix} -1 & 0 \\ 0 & -1 \end{pmatrix}$$



Sums-of-squares



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Example: Cauchy-Schwarz Inequality

$$||\vec{x}||^2 \cdot ||\vec{y}||^2 - \langle \vec{x}, \vec{y} \rangle^2 = \sum_{i < j} (x_i y_j - x_j y_i)^2$$



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• Primal-dual formulation



## Semidefinite Programmin

• Primal-dual formulation

 $\begin{array}{ll} \min_X & \langle C, X \rangle \\ \text{s.t.} & \langle A_i, X \rangle = b_i \\ & X \succcurlyeq 0 \end{array}$ 



#### Semídefinite Programmín

• Primal-dual formulation

 $\begin{array}{ll} \min_X & \langle C, X \rangle & \max_y & b^T y \\ \text{s.t.} & \langle A_i, X \rangle = b_i & \text{s.t.} & \sum_i A_i y_i \preccurlyeq C \\ & X \succcurlyeq 0 \end{array}$ 



#### Semídefíníte Programmín

 $b^T y$ 

 $A_i y_i \preccurlyeq C$ 

• Primal-dual formulation

 $\min_X$  s.t.

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Deciding if  $p(\vec{x})$  admits a sos representation is simply an SdP in disguise

An easy one, since one can assume  $\deg(q_i) \leq d$  $p(\vec{x}) = \sum_{i} q_i^2(\vec{x})$   $(\deg(p) = 2d)$ 





• Writing a polynomial as a sos


• Writing a polynomial as a sos  $p(x,y) = 2x^4 + 5y^4 - x^2y^2 + 2x^3y$ 



• Writing a polynomial as a sos  $p(x,y) = 2x^{4} + 5y^{4} - x^{2}y^{2} + 2x^{3}y$   $p(\vec{x}) = \begin{pmatrix} x^{2} \\ y^{2} \\ xy \end{pmatrix}^{T} \begin{pmatrix} q_{0} & q_{1} & q_{2} \\ q_{3} & q_{4} \\ & q_{5} \end{pmatrix} \begin{pmatrix} x^{2} \\ y^{2} \\ xy \end{pmatrix}$ 



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- Writing a polynomial as a sos  $p(x,y) = 2x^4 + 5y^4 x^2y^2 + 2x^3y$ 
  - $p(\vec{x}) = \begin{pmatrix} x^2 \\ y^2 \\ xy \end{pmatrix}^T \begin{pmatrix} q_0 & q_1 & q_2 \\ q_3 & q_4 \\ q_5 \end{pmatrix} \begin{pmatrix} x^2 \\ y^2 \\ xy \end{pmatrix}$  $= q_0 x^4 + q_3 y^4 + (2q_1 + q_5) x^2 y^2 + \dots$

Finding  $Q \succcurlyeq 0$  is a semidefinite program!!





# Semidefinite Programmin

• Writing a polynomial as a sos  $p(x,y) = 2x^4 + 5y^4 - x^2y^2 + 2x^3y$ 

$$p(\vec{x}) = \begin{pmatrix} x^2 \\ y^2 \\ xy \end{pmatrix}^T \begin{pmatrix} q_0 & q_1 & q_2 \\ q_3 & q_4 \\ & q_5 \end{pmatrix} \begin{pmatrix} x^2 \\ y^2 \\ xy \end{pmatrix}$$
$$= q_0 x^4 + q_3 y^4 + (2q_1 + q_5) x^2 y^2 + \dots$$

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$$Q = \begin{pmatrix} 2 & -3 & 1 \\ -3 & 5 & 0 \\ 1 & 0 & 5 \end{pmatrix} = L^T L$$



# Semidefinite Programmin

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$$= q_0 x^4 + q_3 y^4 + (2q_1 + q_5) x^2 y^2 + \dots$$

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$$Q = \begin{pmatrix} 2 & -3 & 1 \\ -3 & 5 & 0 \\ 1 & 0 & 5 \end{pmatrix} = L^T L \quad L = \frac{1}{\sqrt{2}} \begin{pmatrix} 2 & -3 & 1 \\ 0 & 1 & 3 \end{pmatrix}$$



• Let's consider a bit more interesting case



- Let's consider a bit more interesting case
  - $f(x,y) = y x^2$





• Let's consider a bit more interesting case

 $f(x, y) = y - x^2$ 





# Semídefinite Programmine

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$$f(x, y) = y - x^2$$
$$p(x, y) = y - 2x + 1 \ge 0$$





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## Semidefinite Programmin

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Sums-of-squares modulo ídeals are powerful!





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Sums-of-squares modulo ídeals are powerful!  $p(\vec{x}) = p(\vec{x}) + \sum_{i=1}^{k} f_i(\vec{x})g_i(\vec{x}) \forall \ \vec{x} \in \mathcal{V}$ 





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Ideal generated  
by  $\{f_i\}$ 





$$f(x,y) = x^4 - x^2 + y^2 = 0$$



Semídefíníte Programmín

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Semídefíníte Programmín

$$f(x,y) = x^4 - x^2 + y^2 = 0$$

Simplification rule 
$$x^4 \rightarrow x^2 - y^2$$





Semídefíníte Programmín

 $f(x,y) = x^4 - x^2 + y^2 = 0$ 

Simplification rule  $x^4 \rightarrow x^2 - y^2$ Gröebner basís





Semídefíníte Programmín

 $f(x,y) = x^4 - x^2 + y^2 = 0$ 

Simplification rule 
$$x^4 \rightarrow x^2 - y^2$$
  
Gröebner basis

 $\begin{pmatrix} 1 & x & y & w_2^0 & w_1^1 & w_0^2 \\ x & w_2^0 & w_1^1 & w_3^0 & w_2^1 & w_1^2 \\ y & w_1^1 & w_0^2 & w_2^1 & w_1^2 & w_0^3 \\ w_2^0 & w_3^0 & w_2^1 & w_2^0 - w_0^2 & w_3^1 & w_2^2 \\ w_1^1 & w_2^1 & w_1^2 & w_3^1 & w_2^2 & w_1^3 \\ w_0^2 & w_1^2 & w_0^3 & w_2^2 & w_1^3 & w_0^4 \end{pmatrix}$ 

Moment matrix, 2<sup>nd</sup> order



[Gouveia, Thomas, Convex Hulls of semialgebraic sets, 2012] [Lasserre, 2001]



Semídefíníte Programmín

 $f(x,y) = x^4 - x^2 + y^2 = 0$ 

Simplification rule 
$$x^4 
ightarrow x^2 - y^2$$
Gröebner basis

 $w_i^j$  linearizes  $x^i y^j$ 

Moment matrix, 2<sup>nd</sup> order

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• We can also add inequality constraints!



- We can also add inequality constraints!  $f(x,y) = x^4 - x^2 + y^2 = 0$   $g(x,y) = x \ge 0$ 



# Semidefinite Programmin

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# Semídefinite Programmin

 We can also add inequality constraints!  $f(x,y) = x^4 - x^2 + y^2 = 0$  $g(x, y) = x \ge 0$  $w_2^0 \quad w_3^0 \quad w_2^1 \quad w_2^0 - w_0^2 \quad w_3^1 \quad w_2^2$  $l(x,y) \ge 0$ 

Moment matrix, 2<sup>nd</sup> order



• We can also add inequality constraints!  $f(x, y) = x^4 - x^2 + y^2 = 0$  $g(x, y) = x \ge 0$  $x \quad y \quad w_2^0 \quad w_1^1$  $w_0^2$ 



#### Moment matrix, 2<sup>nd</sup> order $w_2^0 \quad w_1^1$ $\begin{pmatrix} w_2^0 & w_3^0 & w_2^1 \\ w_1^1 & w_2^1 & w_1^2 \end{pmatrix}$

Shifted moment matrix by x, 1st order

[Gouveia, Thomas, Convex Hulls of semialgebraic sets, 2012] [Lasserre, 2001]



• In general, we can consider



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Convex hulls of semialgebraic sets

 $S = \{ \vec{x} : f_i(\vec{x}) = 0, \ g_j(\vec{x}) \ge 0 \}$ 



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$$S = \{\vec{x} : f_i(\vec{x}) = 0, g_j(\vec{x}) \ge 0\}$$
$$p(\vec{x}) = \sigma_0(\vec{x}) + \sum_{i=1}^k \sigma_i(\vec{x})g_i(\vec{x}) \ge 0 \mod I \quad \forall \ \vec{x} \in \mathcal{S}$$



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sums-of squares



# Semídefinite Programmin

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# Semídefinite Programmin

- In general, we can consider Convex hulls of semialgebraic sets



Increasing the degree of the sos  $\sigma_i$  gives more representability power





• A more physical example



# Semidefinite Programmin

• A more physical example Classical Hamiltonian


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$$H(\vec{x}) = \sum_{i,j} h_{ij} x_i x_j + \sum_i h_i x_i$$



• A more physical example Classical Hamiltonian

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Ideal generated by 
$$\{f_i(\vec{x}) = x_i^2 - 1\}$$



A more physical example
 Classical Hamiltonian

$$H(\vec{x}) = \sum_{i,j} h_{ij} x_i x_j + \sum_i h_i x_i$$

- Ideal generated by  $\{f_i(\vec{x}) = x_i^2 1\}$
- $\max \qquad \lambda$
- s.t.  $H(\vec{x}) \lambda \ge 0 \mod I$



A more physical example
 Classical Hamiltonian

$$H(\vec{x}) = \sum_{i,j} h_{ij} x_i x_j + \sum_i h_i x_i$$

to the ground energy

Ideal generated by  $\{f_i(\vec{x}) = x_i^2 - 1\}$ 

 $\begin{array}{ll} \max & \lambda \\ \text{s.t.} & H(\vec{x}) - \lambda \geq 0 \mod I \\ \\ \text{Lower bound [not variational!!]} \end{array}$ 





# Semídefíníte Programmín

A more physical example
 Classical Hamiltonian

$$H(\vec{x}) = \sum_{i,j} h_{ij} x_i x_j + \sum_i h_i x_i$$

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Lower bound [not variational!!] to the ground energy







Outline



- A quantum information scientist meets non-negative polynomials
- Sum-of-squares representations
- Characterízing many-body correlations
- An application of sum-of-quares in quantum information: self-testing









• The set of quantum correlations



A bit of Quantum Info



- The set of quantum correlations
  - Characterizing quantum systems is difficult

A bit of Quantum Info



- The set of quantum correlations
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    - Too many degrees of freedom

A bit of Quantum Info



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- The set of quantum correlations
  - Characterizing quantum systems is difficult
    - Too many degrees of freedom
    - Too many approximations
  - Let's try to characterize only the statistics arising from quantum physics









































































A bit of Quantum Info

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If Alice and Bob can simulate statistics locally, perhaps assisted by shared randomness: LHVM

A bit of Quantum Info



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$$\sum_{a} p(ab|xy) = \sum_{a} p(ab|x'y) \equiv p(b|y), \dots$$







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$$LHVM \subsetneq Q \subsetneq NS$$



A bít of Quantum Info



A bit of Quantum Info



A bit of Quantum Info



Quantum correlations must be the NS principle plus something else...

• Non-trivial communication complexity?

A bit of Quantum Info



- Non-trivial communication complexity?
- No advantage for nonlocal computation?



• Quantum correlations from operational principles?

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Popescu-Rohrlich 94, Brassard et al 06, Linden et al 07, Pawlowski et al 09, Navascues-Wunderlich 10, Fritz et al, 13



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Sos of degree 2 "mod I"



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Sos of degree 1 "mod I"

"Almost quantum" correlations

Navascués et al, NatComms 2014

Sos of degree 2 "mod I"

## SdP solves this problem... kind of

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- Generalization of Lasserre's hierarchy to the non-commutative case  $Q_1 \supseteq Q_{1+AB} \supseteq Q_2 \supseteq \ldots \supseteq Q$

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Sos of degree 2 "mod I"

Includes most of the operational principles







• Toy example: The CHSH inequality

A bit of Quantum Info



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- Quantum bound: Non-commutative sos  $\sqrt{2}(2\sqrt{2} - CHSH) = (A_0 - (B_0 + B_1)/\sqrt{2})^2 + (A_1 - (B_0 - B_1)/\sqrt{2})^2 \ge 0$



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- Quantum bound: Non-commutative sos  $\sqrt{2}(2\sqrt{2} - CHSH) = (A_0 - (B_0 + B_1)/\sqrt{2})^2 + (A_1 - (B_0 - B_1)/\sqrt{2})^2 \ge 0$
- Other cases: PPT states do not violate CHSH  $(2 - CHSH)^2 + [(2 - CHSH^{\Gamma})^2]^{\Gamma} \propto 2 - CHSH \ge_{|_{PPT}} 0$





### Nonlocalíty ín many-body quantum systems







Finding all Bell inequalities - Convex Hull problem





Finding all Bell inequalities - Convex Hull problem

 $\left(n,m,d
ight)$  scenarío











Finding all Bell inequalities -Convex Hull problem

(n, m, d) scenario

Dimension of the Local Polytope  $D \approx (md)^n$ 

Number of vertices  $v = d^{mn}$ 



Complexity of dual description:  $O(v^{\lfloor D/2 \rfloor} + v \log v)$ 

[B. Chazelle, An optimal convex hull algorithm in any fixed dimension, Discrete Comput. Geom. 10 377409 (1993)]



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$$\begin{array}{c} (2,2,2) \longrightarrow O(\mathrm{ms}) \\ (3,2,2) \longrightarrow 5' \end{array}$$



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$$\begin{array}{c} (2,2,2) \longrightarrow O(\mathrm{ms}) \\ (3,2,2) \longrightarrow 5' \\ (4,2,2) \longrightarrow 10^{67} \text{ years} \end{array}$$

$$[S. Dalí The persistence of memory (1931)]$$





Finding all Bell inequalities -

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### Nonlocalíty ín many-body quantum systems









#### Nonlocality in many-body quantum systems • Reducing the mathematical complexity

Polytope		
Dimension		
Vertices		



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Polytope	$\mathbb{P}_n$		
Dimension	$3^{n} - 1$		
Vertices	$2^{2n}$		





### Nonlocalíty ín many-body

quantum systems
 Reducing the mathematical complexity



Polytope	$\mathbb{P}_n$ Lower order correlators
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### Nonlocalíty ín many-body

quantum systems
 Reducing the mathematical complexity

🖌 2-body

Polytope	$\mathbb{P}_n$ Lower order $\mathbb{P}_2$		
Dimension	$3^{n} - 1$	$2n^2$	
Vertices	$2^{2n}$	$2^{2n}$	





# Nonlocalíty ín many-body

quantum systems
 Reducing the mathematical complexity

🖌 2-body

Polytope	$\mathbb{P}_n$ Lower order $\mathbb{P}_2$ Action of a symmetry group			
Dimension	$3^n - 1$	$2n^2$		
Vertices	$2^{2n}$	$2^{2n}$		





quantum systems
 Reducing the mathematical complexity

2-body  $\mathbb{P}_2$ Polytope Lower order correlators  $\mathbb{P}_n$ Action of a symmetry group Dimension  $2n^2$  $3^{n} - 1$  $2^{2n}$ Vertices  $2^{2n}$ 



[JT, A. B. Sainz, T. Vértesi, M. Lewenstein, A. Acín, R. Augusiak *J. Phys. A: Math. Theor.* **47** 424024 (2014)]


2-body
Cyclic group
Symmetric group

quantum systems
 Reducing the mathematical complexity

	/		5	1
Polytope	$\mathbb{P}_n \xrightarrow[correlators]{} \mathbb{P}_2 \xrightarrow[symmetry group]{} \text{Action of a symmetry group}$			
Dimension	$3^{n} - 1$	$2n^2$		
Vertices	$2^{2n}$	$2^{2n}$		



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Some applications



PRL 119, 230402 (2017)

PHYSICAL REVIEW LETTERS

week ending 8 DECEMBER 2017

#### Bounding the Set of Classical Correlations of a Many-Body System

Matteo Fadel<sup>1,\*</sup> and Jordi Tura<sup>2,3,†</sup>

We present a method to certify the presence of Bell correlations in experimentally observed statistics, and to obtain new Bell inequalities. Our approach is based on relaxing the conditions defining the set of correlations obeying a local hidden variable model, yielding a convergent hierarchy of semidefinite programs (SDP's). Because the size of these SDP's is independent of the number of parties involved, this technique allows us to characterize correlations in many-body systems. As an example, we illustrate our method with the experimental data presented in Science **352**, 441 (2016).



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DOI: 10.1103/PhysRevLett.119.230402



 Certify Bell correlations from experiments



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- Certify Bell correlations from experiments
- Fínd new Bell Inequalítíes



Some applications



Some applications

 $\sum_{k} \sum_{j_1 \leq \ldots \leq j_k} \alpha_{j_1 \ldots j_k} \mathcal{S}_{j_1 \ldots j_k} + \beta_C \ge 0$ 



Some applications

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with 
$$S_{j_1...j_k} = \sum_{\substack{i_1,...,i_k=1 \\ \text{all } i$$
's different}}^N \langle \mathcal{M}\_{j\_1}^{(i\_1)}...\mathcal{M}\_{j\_k}^{(i\_k)} \rangle





Some applications

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Dimension depends on



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Dimension depends on - Order of the correlators



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Dímension depends on

- Order of the correlators
- #Measurements





Some applications

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Dimension depends on

- Order of the correlators
- #Measurements
- #outcomes





Some applications

$$\sum_k \sum_{j_1 \leq \ldots \leq j_k} lpha_{j_1 \ldots j_k} \mathcal{S}_{j_1 \ldots j_k} + eta_C \geq 0$$

with 
$$S_{j_1...j_k} = \sum_{\substack{i_1,...,i_k=1 \\ \text{all } i's \text{ different}}}^N \langle \mathcal{M}_{j_1}^{(i_1)}...\mathcal{M}_{j_k}^{(i_k)} \rangle$$

Dimension depends on Does NOT depend on

- Order of the correlators
- #Measurements
- #outcomes





Some applications

$$\sum_{k} \sum_{j_1 \leq \ldots \leq j_k} \alpha_{j_1 \ldots j_k} \mathcal{S}_{j_1 \ldots j_k} + \beta_C \ge 0$$

with 
$$S_{j_1...j_k} = \sum_{\substack{i_1,...,i_k=1 \\ \text{all } i's \text{ different}}}^N \langle \mathcal{M}_{j_1}^{(i_1)}...\mathcal{M}_{j_k}^{(i_k)} \rangle$$

Dimension depends on

- Does NOT depend on - #Parties
- Order of the correlators
- #Measurements
- #outcomes





Previous results





Previous results

### Detecting nonlocality in many-body quantum states

J. Tura,<sup>1</sup> R. Augusiak,<sup>1\*</sup> A. B. Sainz,<sup>1</sup> T. Vértesi,<sup>2</sup> M. Lewenstein,<sup>1,3</sup> A. Acín<sup>1,3</sup>

Previous results

#### **Detecting nonlocality in many-body quantum states** $\mathcal{E}_{XX}$

Example  $-2S_0 + \frac{1}{2}S_{00} - S_{01} + \frac{1}{2}S_{11} + 2N \ge 0$ 

J. Tura,<sup>1</sup> R. Augusiak,<sup>1</sup>\* A. B. Sainz,<sup>1</sup> T. Vértesi,<sup>2</sup> M. Lewenstein,<sup>1,3</sup> A. Acín<sup>1,3</sup>

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Science **352**, 441 (2016)

#### **Bell correlations in a Bose-Einstein condensate**

Roman Schmied,<sup>1</sup>\* Jean-Daniel Bancal,<sup>2,4</sup>\* Baptiste Allard,<sup>1</sup>\* Matteo Fadel,<sup>1</sup> Valerio Scarani,<sup>2,3</sup> Philipp Treutlein,<sup>1</sup>+ Nicolas Sangouard<sup>4</sup>+

$$\hat{W} = -\left|\frac{\hat{S}_n}{N/2}\right| + (a \cdot n)^2 \frac{\hat{S}_a^2}{N/4} + 1 - (a \cdot n)^2$$



Previous results

#### **Detecting nonlocality in many-body** Example $-2S_0 + \frac{1}{2}S_{00} - S_{01} + \frac{1}{2}S_{11} + 2N \ge 0$ quantum states

J. Tura,<sup>1</sup> R. Augusiak,<sup>1\*</sup> A. B. Sainz,<sup>1</sup> T. Vértesi,<sup>2</sup> M. Lewenstein,<sup>1,3</sup> A. Acín<sup>1,3</sup>



#### **Bose-Einstein condensate**

Roman Schmied,1\* Jean-Daniel Bancal,2,4\* Baptiste Allard,1\* Matteo Fadel,1 Valerio Scarani,2,3 Philipp Treutlein,1+ Nicolas Sangouard4+

$$\hat{W} = -\left|\frac{\hat{S}_n}{N/2}\right| + (\boldsymbol{a} \cdot \boldsymbol{n})^2 \frac{\hat{S}_a^2}{N/4} + 1 - (\boldsymbol{a} \cdot \boldsymbol{n})^2$$

week ending 7 APRIL 2017



The Local polytope

• Solving for a few values of N...



The Local polytope

• Solving for a few values of N...





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26334 - 2601 306 136 -17 1

25994 - 2584 287 136 -16 1

#### • Solving for a few values of N...







26334 - 2601 306 136 -17 1 25994 - 2584 287 136 -16 1

13264 -1197 325 57 -18 1 12734 -1161 306 56 -17 1

#### • Solving for a few values of N...



What's the physical significance of each inequality?





26334 - 2601 306 136 -17 1

#### • Solving for a few values of N...



What's the physical significance of each interpretation of the physical significance of each interpretation is called a set of the physical set o





Bounding the LHVM set

• Main Observation





### Bounding the LHVM set

• Main Observation





## Bounding the LHVM set

• Main Observation



As the system becomes larger



# Bounding the LHVM set



• Main Observation



As the system becomes larger




• Main Observation



As the system becomes larger



Where does this extra structure come from?





• Main Observation



As the system becomes larger

Where does this extra structure come from?

Local Determínístic Strategy víew:





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Permutational Invariance:





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Permutational Invariance:

Only amount of each color becomes relevant



• Main Observation



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Permutational Invariance:

Only amount of each color becomes relevant

 $x_i \ge 0$ 



• Main Observation



As the system becomes larger







- Algebraic structure at every LDS
  - $\mathcal{S}_{kl} = \mathcal{S}_k \cdot \mathcal{S}_l \mathcal{Z}_{kl}$



Bounding the LHVM set

• Algebraic structure at every LDS

$$\begin{pmatrix} N \\ \mathcal{S}_1 \\ \mathcal{S}_0 \\ \mathcal{Z}_{01} \end{pmatrix} = 2H^{\otimes 2} \begin{pmatrix} x_1 \\ x_2 \\ x_3 \\ x_4 \end{pmatrix}$$

 $\mathcal{S}_{kl} = \mathcal{S}_k \cdot \mathcal{S}_l - \mathcal{Z}_{kl}$ 



Bounding the LHVM set
Algebraic structure at every LDS

 $\mathcal{S}_{kl} = \mathcal{S}_k \cdot \mathcal{S}_l - \mathcal{Z}_{kl}$ 

 $\begin{pmatrix} N \\ S_1 \\ S_0 \\ Z_{01} \end{pmatrix} = 2H^{\otimes 2} \begin{pmatrix} x_1 \\ x_2 \\ x_3 \\ x_4 \end{pmatrix}$   $\mathbb{P}^{\mathbb{S}} = \operatorname{CH} \left\{ \vec{\mathcal{S}}(\vec{x}) \text{ s.t. } \sum_i x_i = N, \ x_i \in \mathbb{Z}_{\geq 0} \right\}$ 



Bounding the LHVM set

• Algebraic structure at every LDS



Goal: Define a manifold interpolating the vertices of the symmetric 2body polytope, and compute its convex hull



First relaxation











Computing the convex hull of a semialgebraic set is NP-hard



UGD





 $\mathcal{S}_1$ 

 ${\mathcal S}$ 

Second relaxation  $l(\vec{s})$  $\tilde{\mathbb{P}}^S$  is defined by  $\begin{cases} f_i(\vec{\mathcal{S}}_K) = 0\\ g_i(\vec{\mathcal{S}}_K) \ge 0 \end{cases}$  $\mathcal{S}_0$  $\mathbb{P}^{S}$ ansatz:  $l(\vec{\mathcal{S}}) = \sum g_i(\vec{\mathcal{S}}) \ \sigma_i(\vec{\mathcal{S}})$  $\sigma_i(\vec{\mathcal{S}})$  sos polynomials NOTE: l is positive in  $\tilde{\mathbb{P}}^S$  $\tilde{\mathbb{P}}^{S}$ 





Solve the sos representation problem as an SDP!





(aQa')



subject to:  $\mathcal{S}_0 = \mathcal{S}_0^*$  ,  $\mathcal{S}_1 = \mathcal{S}_1^*$  , ...



subject to:  $\mathcal{S}_0 = \mathcal{S}_0^*$  ,  $\mathcal{S}_1 = \mathcal{S}_1^*$  , ...

(Experimental data point)





(aQa')

Results



Testing all BI of a certain form with a single SDP

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- Testing all BI of a certain form with a single SDP
- If the experimental point is sufficiently nonlocal, the SDP outputs the Bell inequality that is violated, with a proof of its classical bound

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Approximation for N= 10



Results



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Generalization







Generalization
More outcomes, higher-order correlators...



Spin-nematic squeezing





Spin-nematic squeezing Polytope approach already impractical





Spin-nematic squeezing Polytope approach already impractical

[Ongoing work with A. Aloy and M. Fadel]



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 More outcomes, higher-order correlators...



Spín-nematic squeezing Polytope approach already impractical

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Generalization
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[Ongoing work with A. Aloy and M. Fadel]










Outline



- A quantum information scientist meets non-negative polynomials
- Sum-of-squares representations
- Characterizing many-body correlations
- An application of sum-of-quares in quantum information: self-testing





• Some quantum correlations can be produced only by some quantum states  $|\psi\rangle = \frac{1}{\sqrt{2}}(|00\rangle + |11\rangle)$ 

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 $2\sqrt{2} - CHSH = \frac{1}{\sqrt{2}}(A_0 - (B_0 + B_1)/\sqrt{2})^2 + \frac{1}{\sqrt{2}}(A_1 - (B_0 - B_1)/\sqrt{2})^2 \ge 0$ 



- Info. about optimal measurements?
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 $\left(A_0 - \frac{B_0 + B_1}{\sqrt{2}}\right) |\psi\rangle = 0 \quad \left(A_1 - \frac{B_0 - B_1}{\sqrt{2}}\right) |\psi\rangle = 0$  $M \otimes N |\psi\rangle = \mathbb{1} \otimes N M^T |\psi\rangle$ 





• Maximally entangled states







Alexía Salavrakos

Remígíusz Augusíak

Peter Wíttek



Antonío Acín



Stefano Píronío



"SATWAP inequality", PRL 119, 040402 (2017)

• Maximally entangled states











Stefano Píronio

Alexía Salavrakos

Remigiusz Augusíak

Peter Wittek

Antonio Acín





"SATWAP inequality", PRL 119, 040402 (2017)

- Typícal approach
  - Tíght Bell ínequalítíes

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Mínímal number



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I HVM

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Collíns-Gísín-Línden-Massar-Popescu (CGLMP) ínequalíty

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Collins-Gisin-Linden-Massar-Popescu (CGLMP) inequality

 $\mathcal{B}_{\text{CGLMP}}^{d} = \sum_{k=0}^{\lfloor d/2 \rfloor} \left( 1 - \frac{2k}{d-1} \right) \left( \left[ P(A_1 = B_1 + k) + P(B_1 = A_2 + k + 1) + P(A_2 = B_2 + k) + P(B_2 = A_1 + k) \right] - \left[ P(A_1 = B_1 - k - 1) + P(B_1 = A_2 - k) + P(A_2 = B_2 - k - 1) + P(B_2 = A_1 - k - 1) \right] \le 2$ 

Typícal approach

I HVM

- Tíght Bell ínequalítíes

Mínímal number Optímal ín what sense?

CGLMP is tight, resistant to noise, analytically easy... but has an important "anomaly"

$$|\psi^{\rm CGLMP}\rangle = \frac{|00\rangle + \gamma|11\rangle + |22\rangle}{\sqrt{2 + \gamma^2}}$$

Collíns-Gísín-Línden-Massar-Popescu (CGLMP) ínequalíty

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• Is that surprising?









Tíght ínequalíty deríved from LHVM models





Tíght ínequalíty deríved from LHVM models



Bell inequality tailored to the maximally entangled state



• Is that surprising? LHVM set has actually nothing to do with quantum physics; in particular, max. ent. States.



Tight inequality derived from LHVM models Complicated Operatorsum-of-squares



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> Símple, fírst-degree operator-sum-of-squares

 $\phi^+$
Fídelíty wíth maximally entangled qutrít paír

 Fídelíty wíth maximally entangled qutrít paír









• Experiment in Bristol



P. Skrzypczyk



R. Santagati



M. Thompson

University of BRISTOL



K. Rottwitt

D. Bacco



L. K. Oxenløwe



DTH
DIU

DTU Fotonik Department of Photonics Engineering

A. Salavrakos R. Augusiak







The Institute of Photonic **Sciences** 



• Experiment in Bristol





Integration of more than 500 optical components, including:

- 93 active components (phase shifters).
- 16 SFWM single photon sources.



• State tomography







SATWAP Bell inequalities:

$$\tilde{I}_d = \sum_{i=1}^2 \sum_{l=1}^{d-1} \langle A_i^l \bar{B}_i^l \rangle$$

A. Salavrakos et al, PRL 119, 040402 (2017).



Self-testing quantum devic

SATWAP Bell inequalities:

### $\tilde{I}_d = \sum_{i=1}^2 \sum_{l=1}^{d-1} \langle A_i^l \bar{B}_i^l \rangle$

A. Salavrakos et al, PRL 119, 040402 (2017).

#### Self-testing:

Device-independent characterisation of quantum devices from nonlocal correlations

Self-testing states:  $|\psi_{\gamma}
angle = rac{1}{\sqrt{2+\gamma^2}}(|00
angle + \gamma|11
angle + |22
angle)$ 

14 1.0 Q<sub>d</sub> bound 12 0.8 Self-tested fideity Bell value  $\tilde{I}_d$ 10 0.6 8 0.75  $H_{\min}/n = 1$ 0.4 6 0.5 0.2 4 C<sub>d</sub> LHV bound 2 0.0 0.75 2 3 5 6 7 4 8 Dimension

1.0 0.8 0.6 0.4 0.75 0.4 0.95 0.95 0.975 1.00 0.95 0.90 0.95 1.00Relative quantum violation  $\tilde{I}_d/Q_d$ 



Conclusions





(aQa

#### Conclusions

- SDPs and polynomial optimization are ubiquitous in quantum information
- Here we showed how they yield accurate outer approximations to the LHVM set via CH of semialgebraic sets
- Approach is scalable, independent of the system size
- SOS certificates allow to «peek inside» the black box











(aQa')

#### Outlook

- Convergence analysis
- Highly scalable approach
- Self-testing of spin-squeezed states
- Detection of nonlocality in non-Gaussian states
- Incorporate symmetries to the noncommutative case → Quantum upper bounds
- Nonlocality depth quantification



#### Thanks for your attention!

