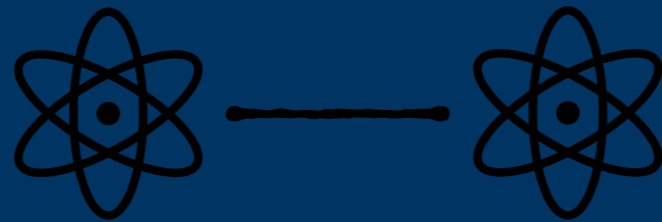
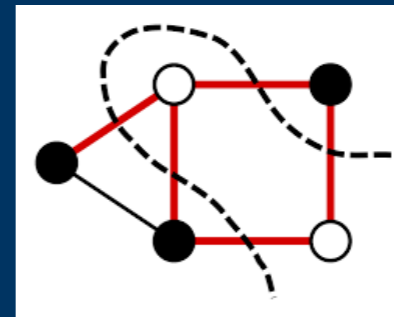


# Algebras, CSPs, and Quantum Computation



Maximize  $\langle \phi | A_0 B_0 + A_0 B_1 + A_1 B_0 - A_1 B_1 | \phi \rangle$



Max-Cut

# Algebras, CSPs, and Quantum Computation

## Plan

- Noncommutative constraint satisfaction problems (NC-CSPs)
  - Classical theory
  - Noncommutative extension
- New directions?
  - Quantum computation

# Algebras, CSPs, and Quantum Computation

## NC-CSP Terminology

- Quantum nonlocal games
- Bell inequalities
- Entangled multiprover interactive proofs (MIP\*)
- Noncommutative polynomial optimization
  
- 3SAT instance is a boolean formula
- NC-3SAT should evoke a similar picture but for the quantum setting

**NC-CSPs**

# Magic Square

$$x_{ij} \in \{+1, -1\}$$

$x_{11}$	$x_{12}$	$x_{13}$	+1
$x_{21}$	$x_{22}$	$x_{23}$	+1
$x_{31}$	$x_{32}$	$x_{33}$	+1
+1	+1	-1	

# Perfect Operator Solution

Mermin 1990 and Peres 1990

$I \otimes X$	$X \otimes I$	$X \otimes X$	$+I$
$Z \otimes I$	$I \otimes Z$	$Z \otimes Z$	$+I$
$Z \otimes X$	$X \otimes Z$	$Y \otimes Y$	$+I$
$+I$	$+I$	$-I$	

$x_{11}$	$x_{12}$	$x_{13}$	$+1$
$x_{21}$	$x_{22}$	$x_{23}$	$+1$
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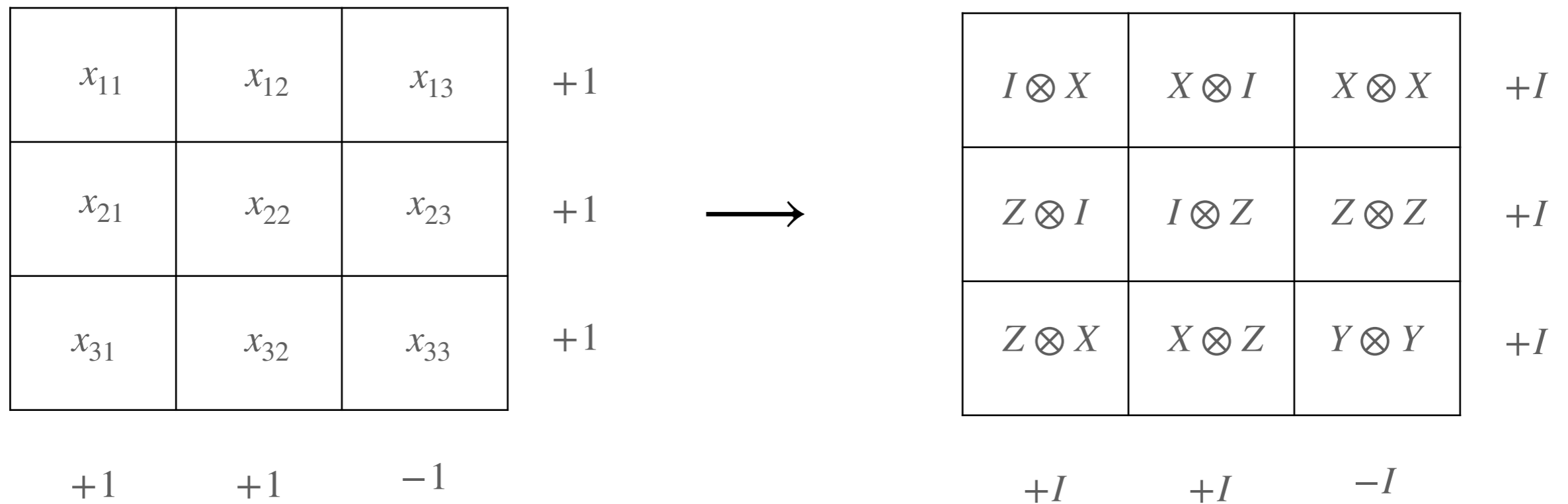
$+1$        $+1$        $-1$

$$x_{ij} \in \{+1, -1\}$$



$I \otimes X$	$X \otimes I$	$X \otimes X$	$+I$
$Z \otimes I$	$I \otimes Z$	$Z \otimes Z$	$+I$
$Z \otimes X$	$X \otimes Z$	$Y \otimes Y$	$+I$

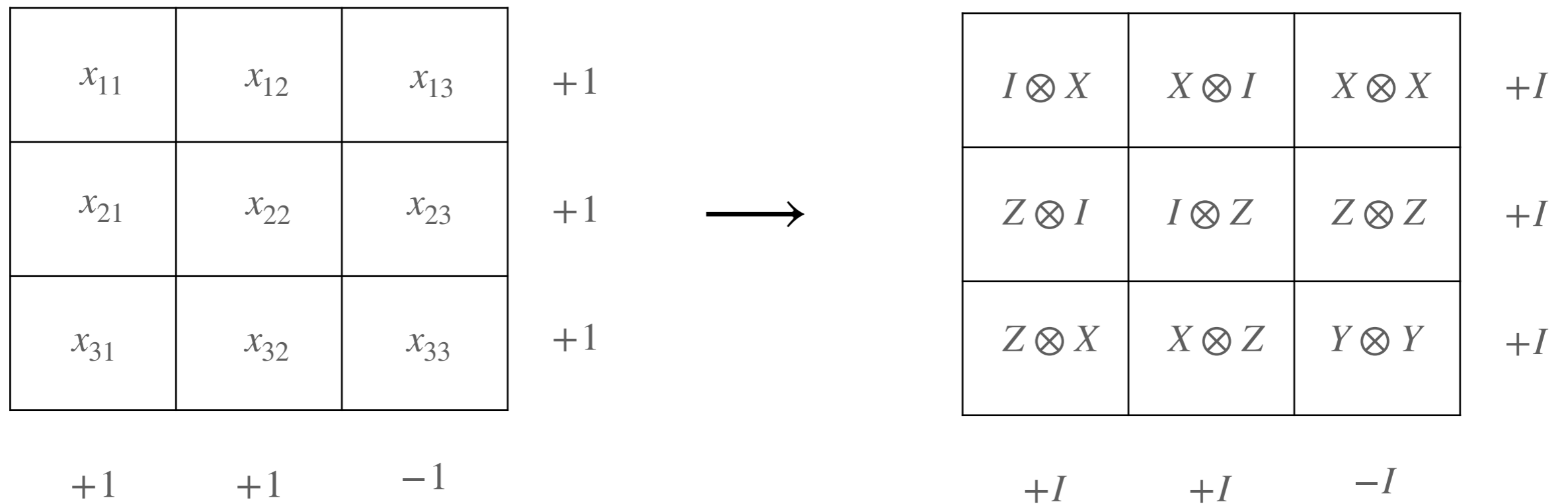
$+I$        $+I$        $-I$



$$x_{ij} \in \{+1, -1\}$$

Binary alphabet  $\{+1, -1\}$  in the classical case  $\longrightarrow$  Binary observables





$$x_{ij} \in \{+1, -1\}$$

Binary alphabet  $\{+1, -1\}$  in the classical case  $\longrightarrow$  Binary observables

Binary observables: Unitary operators with  $\{+1, -1\}$  eigenvalues

$$O^*O = O^2 = I$$

# An operator CSP

$$X_{ij}^* X_{ij} = I$$

$$X_{ij}^2 = I$$

$X_{11}$	$X_{12}$	$X_{13}$	$+I$
$X_{21}$	$X_{22}$	$X_{23}$	$+I$
$X_{31}$	$X_{32}$	$X_{33}$	$+I$
$+I$	$+I$	$-I$	

# An operator CSP

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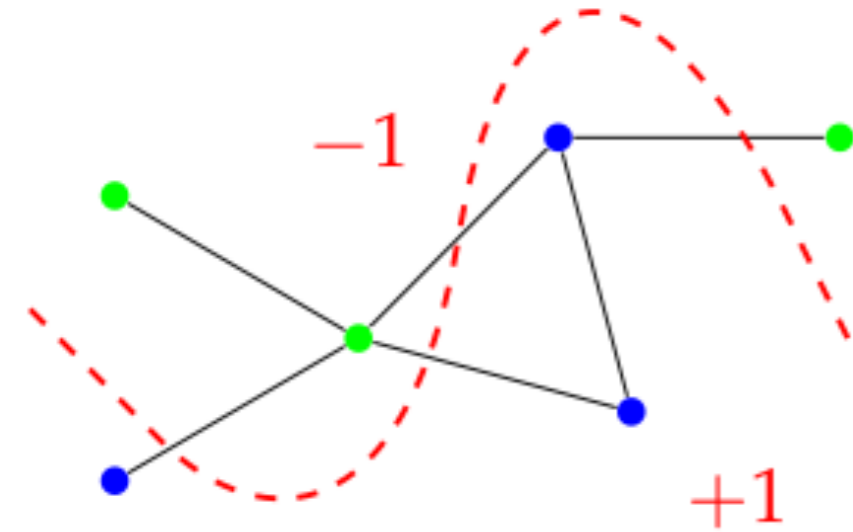
$X_{11}$	$X_{12}$	$X_{13}$	$+I$
$X_{21}$	$X_{22}$	$X_{23}$	$+I$
$X_{31}$	$X_{32}$	$X_{33}$	$+I$
$+I$	$+I$	$-I$	

When restricting to one dimension we recover the classical CSP

Because  $\pm 1$  are the only binary observables is one dimension

**An operator CSP but not yet an NC-CSP**

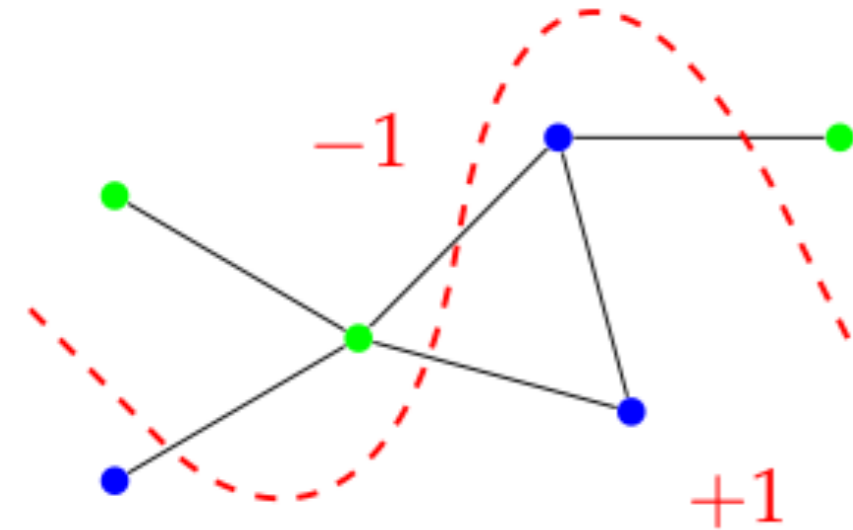
# Max-Cut



maximize: 
$$\sum_{(i,j) \in E} \frac{1 - x_i x_j}{2}$$

subject to:  $x_i \in \{-1, +1\}.$

# Max-Cut

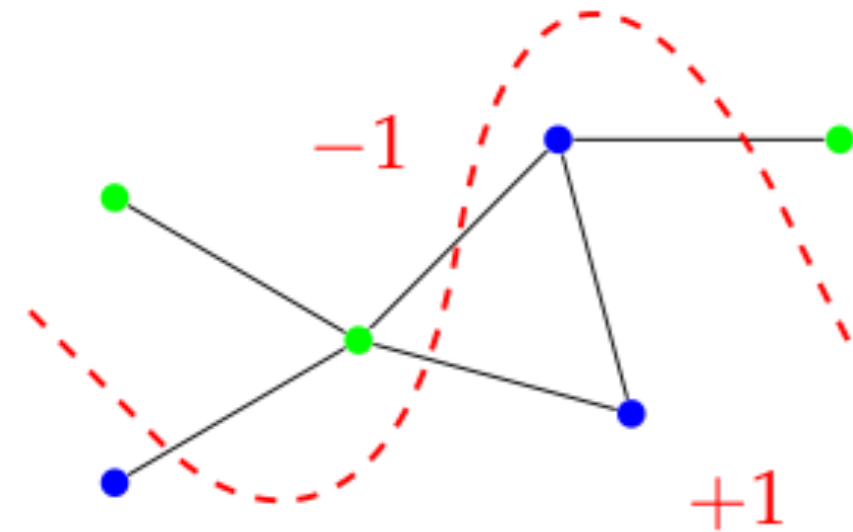


$$\begin{aligned} \text{maximize:} & \quad \sum_{(i,j) \in E} \frac{1 - x_i x_j}{2} \\ \text{subject to:} & \quad x_i \in \{-1, +1\}. \end{aligned}$$

# NC-Max-Cut?

$$\begin{aligned} \text{max} & \quad \sum \frac{I - X_i X_j}{2} \\ \text{s.t.} & \quad X_i \text{ are binary observables} \end{aligned}$$

# Max-Cut

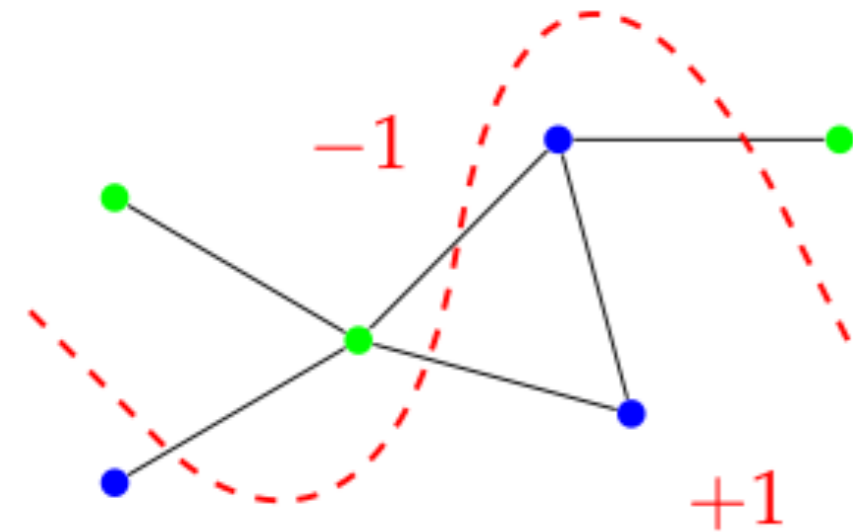


$$\begin{aligned} \text{maximize:} & \quad \sum_{(i,j) \in E} \frac{1 - x_i x_j}{2} \\ \text{subject to:} & \quad x_i \in \{-1, +1\}. \end{aligned}$$

# NC-Max-Cut?

$$\begin{aligned} \text{max} & \quad \langle \phi | \left( \sum \frac{I - X_i X_j}{2} \right) | \phi \rangle \\ \text{s.t.} & \quad X_i \text{ are binary observables} \\ & \quad \text{and } |\phi\rangle \text{ is a state} \end{aligned}$$

# Max-Cut



$$\begin{aligned} \text{maximize:} & \sum_{(i,j) \in E} \frac{1 - x_i x_j}{2} \\ \text{subject to:} & x_i \in \{-1, +1\}. \end{aligned}$$

# NC-Max-Cut

$$\begin{aligned} \max & \sum \frac{1 - \text{tr}(X_i X_j)}{2} \\ \text{s.t.} & X_i \text{ is unitary with } \pm 1 \text{ eigenvalues} \end{aligned}$$



# Noncommutative Max-Cut

$$\max \sum \frac{1 - \text{tr}(X_i X_j)}{2}$$

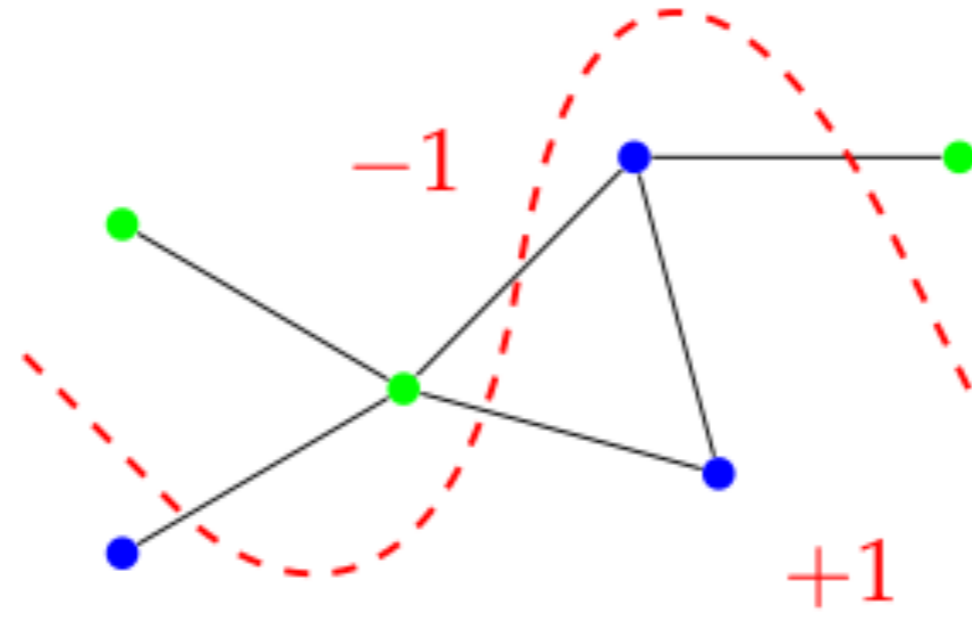
s.t.  $X_i$  is unitary with  $\pm 1$  eigenvalues

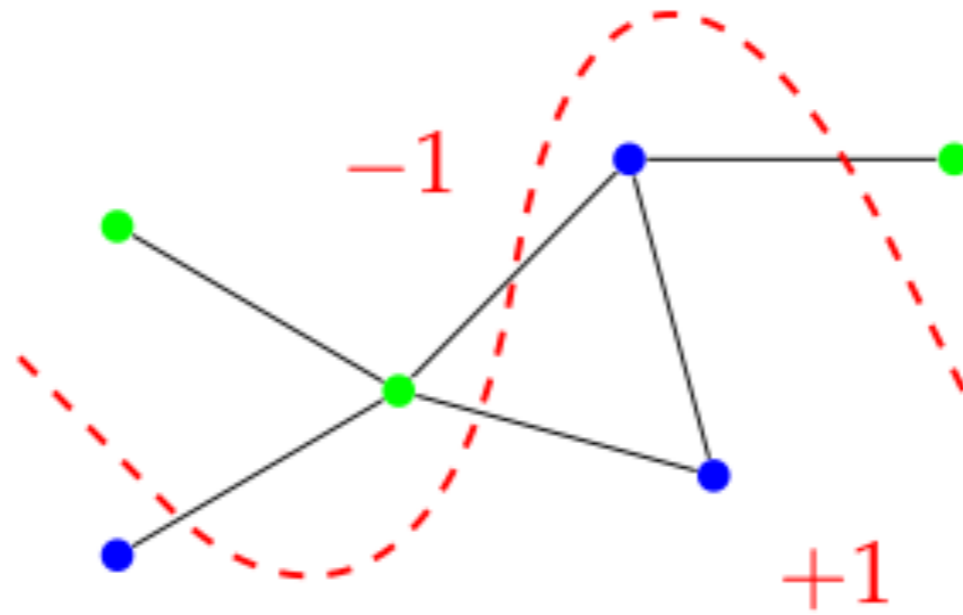
- The Hilbert space is finite-dimensional
- But no bound on the dimension
- $\text{tr}$  is the dimension-normalized trace
- $\text{tr}(XY)$  is always between  $-1$  and  $1$

**There is a state underlying the trace formulation**

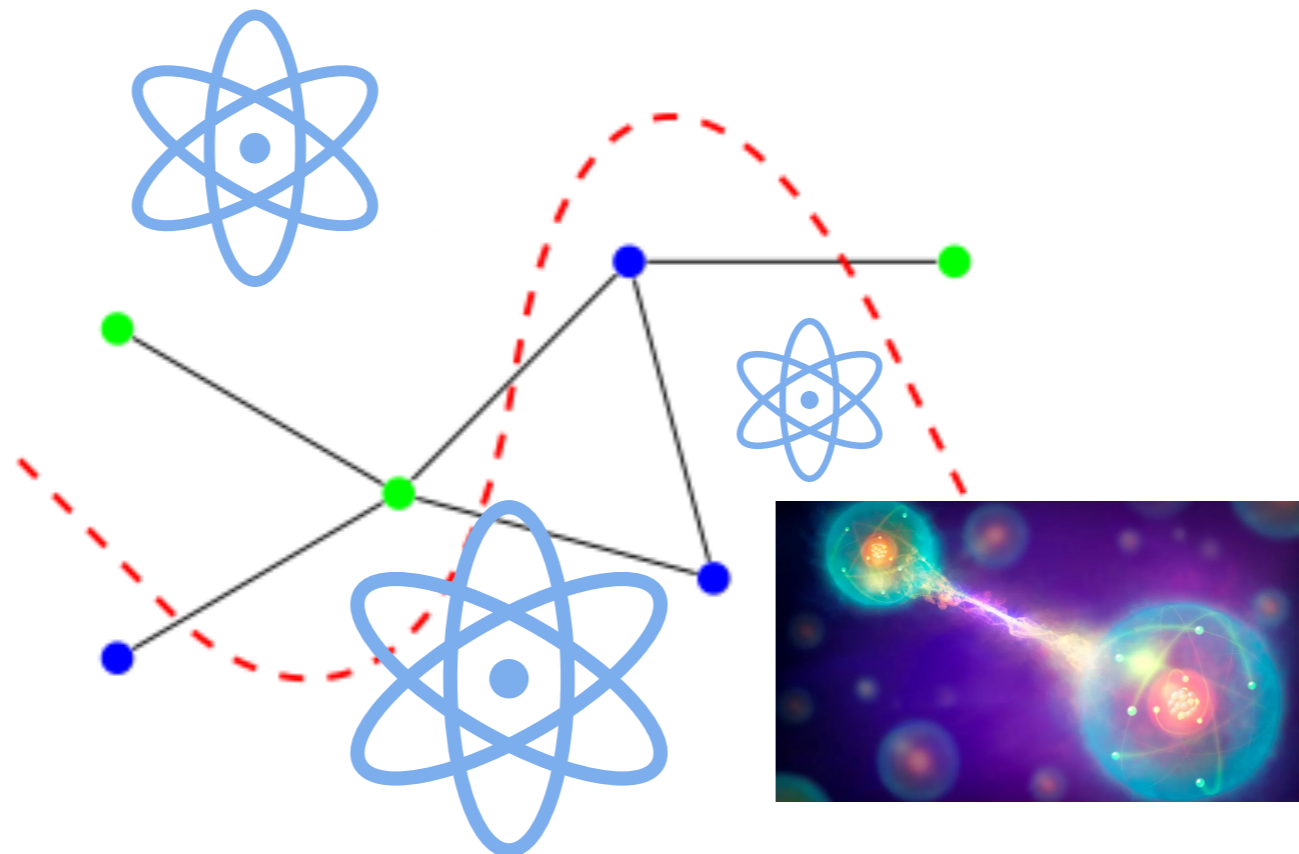
$$\text{tr}(XY) = \langle \psi | (XY \otimes I) | \psi \rangle$$

Where  $|\psi\rangle$  is a maximally entangled state on  
a larger system





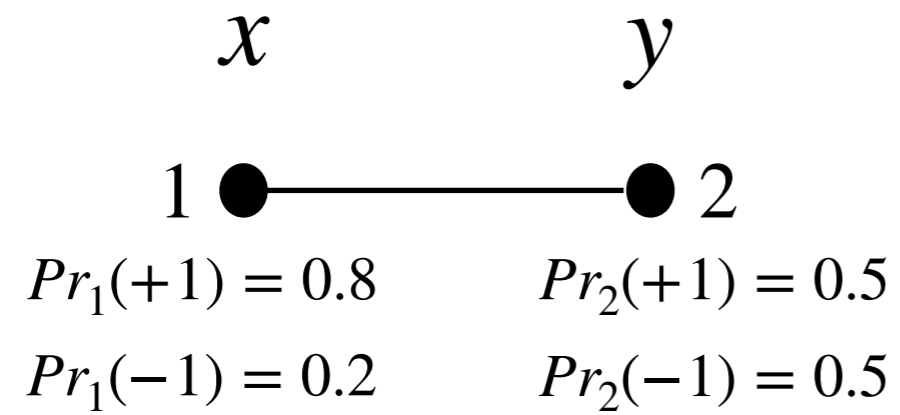
**But what does a noncommutative cut look like?**



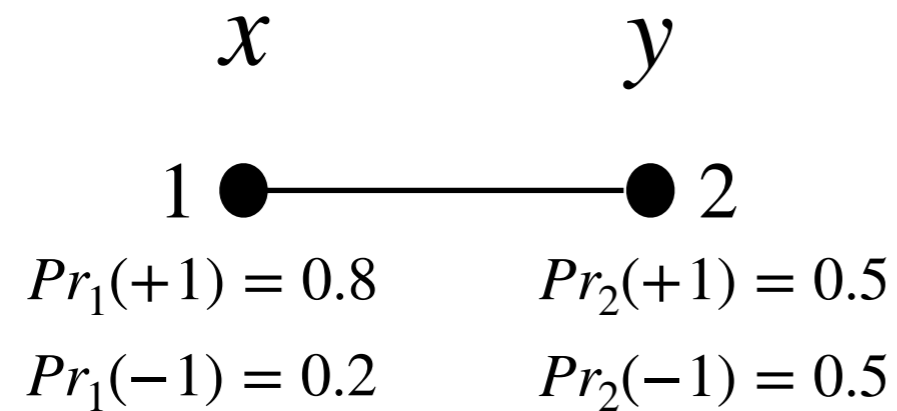
# Probabilistic Cut: an assignment of **binary random variables**



# Probabilistic Cut: an assignment of **binary random variables**



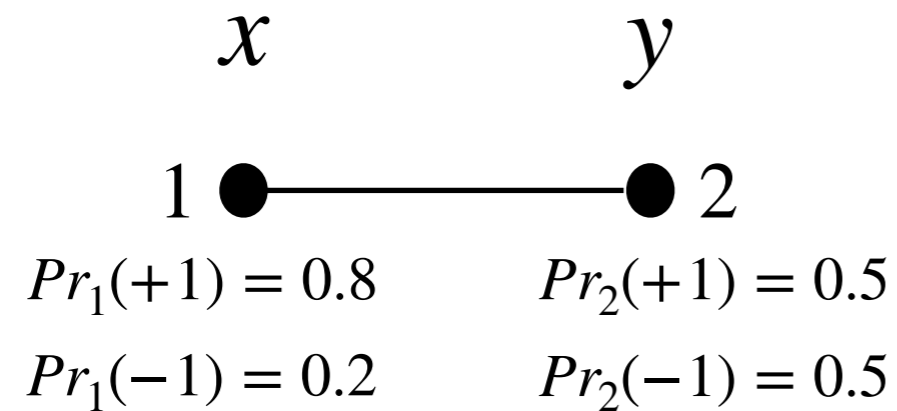
# Probabilistic Cut: an assignment of **binary random variables**



This then induces a probability distribution over cuts

A probabilistic cut: An ensemble of cuts

## Probabilistic Cut: an assignment of **binary random variables**

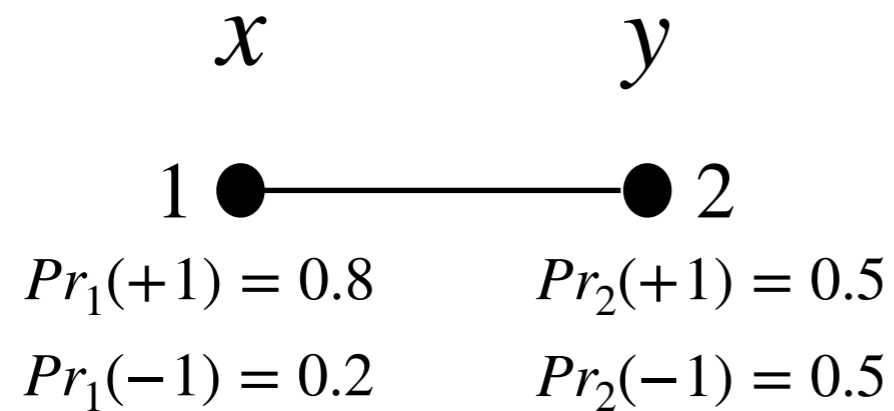


## Noncommutative Cut: an assignment of **binary observables**





## Probabilistic Cut: an assignment of **binary random variables**



## Noncommutative Cut: an assignment of **binary observables**



$$Pr_{12}(+1, +1) = 0.1$$

$$Pr_{12}(+1, -1) = 0.2$$

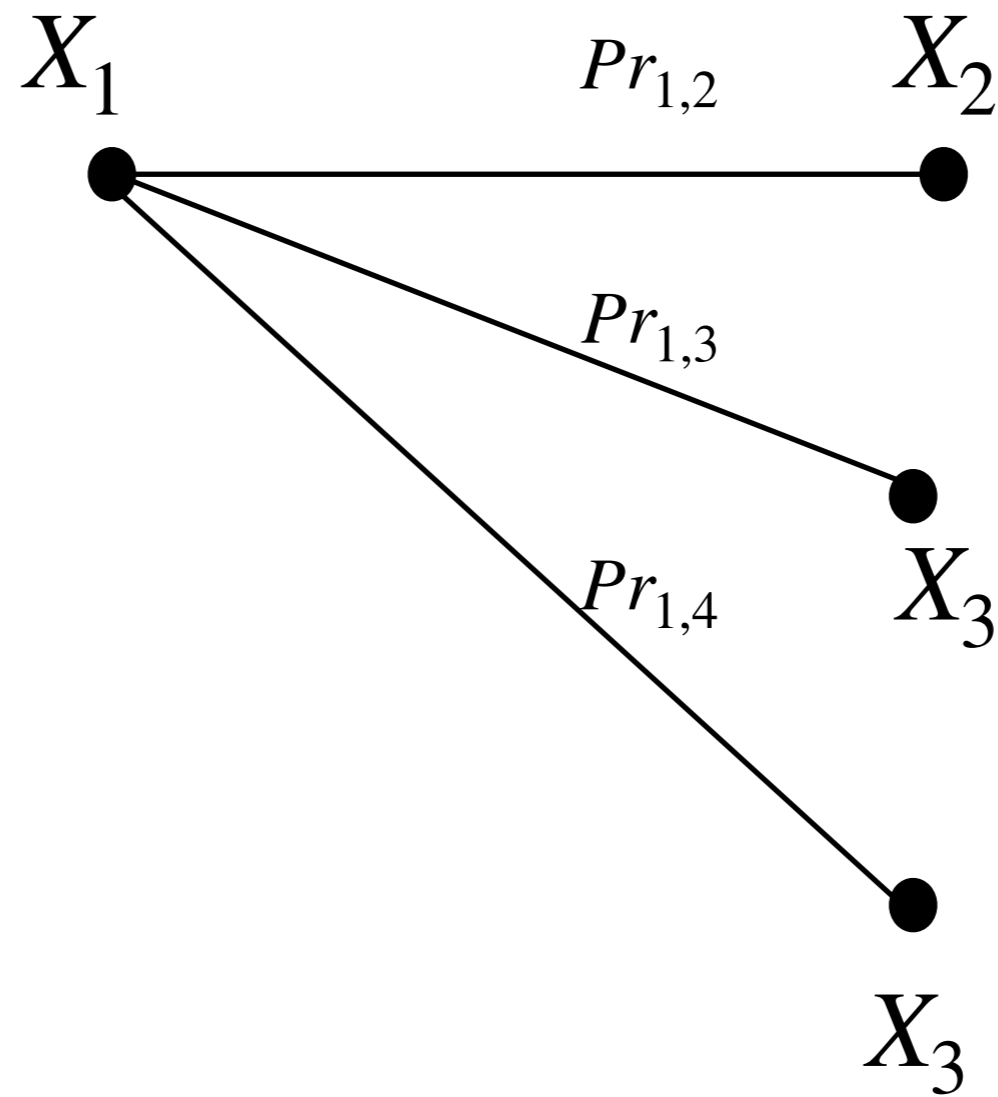
$$Pr_{12}(-1, +1) = 0.3$$

$$Pr_{12}(-1, -1) = 0.4$$

**A probabilistic assignment induces a distribution on cuts**

**An observable assignment doesn't**

# Inconsistencies of Edge Probabilities



**Warning:  $X$  and  $Y$  must commute for them to be simultaneously measurable**



$$Pr_{12}(+1, +1) = 0.1$$

$$Pr_{12}(+1, -1) = 0.2$$

$$Pr_{12}(-1, +1) = 0.3$$

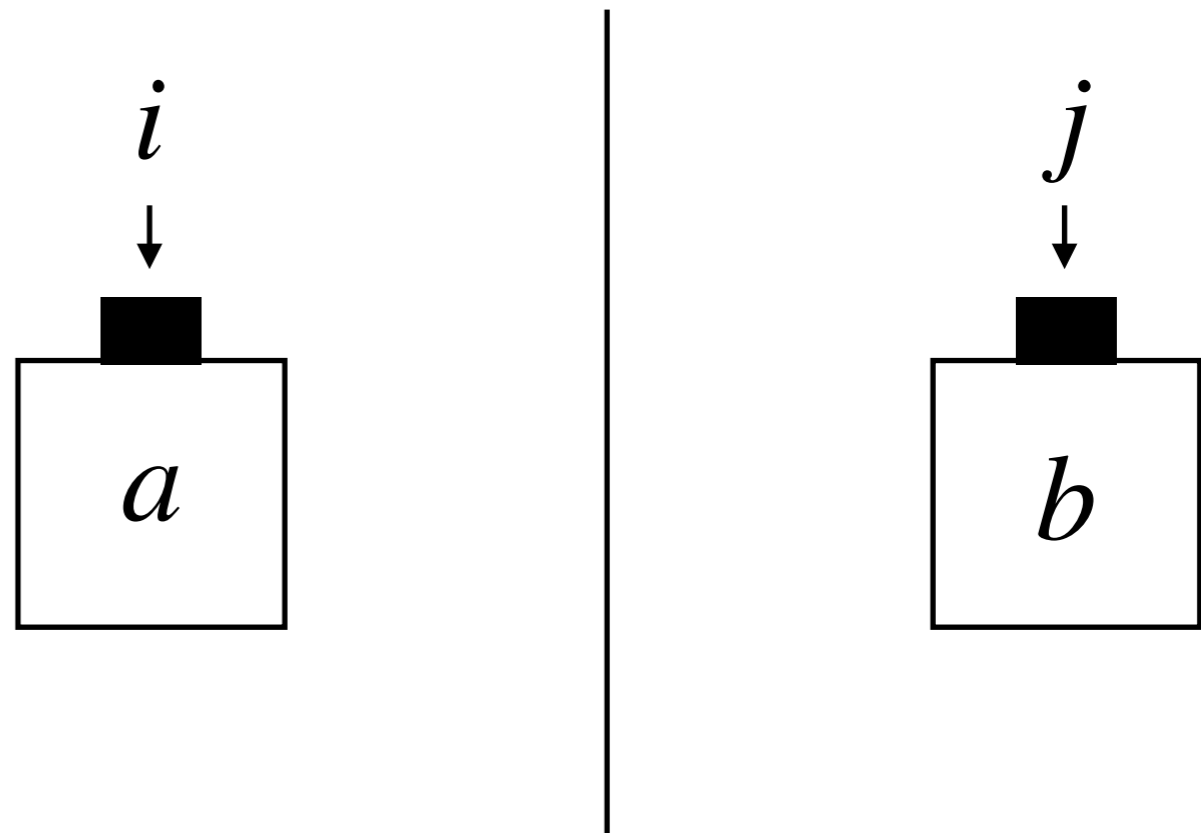
$$Pr_{12}(-1, -1) = 0.4$$

# Warning: $X$ and $Y$ must commute for them to be simultaneously measurable



- Two formulations of noncommutative MaxCut:
  - If there is an edge the observables must commute:  
Quantum correlations: Q-MaxCut
  - Do not impose any commutation:  
The synchronous model of quantum correlations: NC-MaxCut

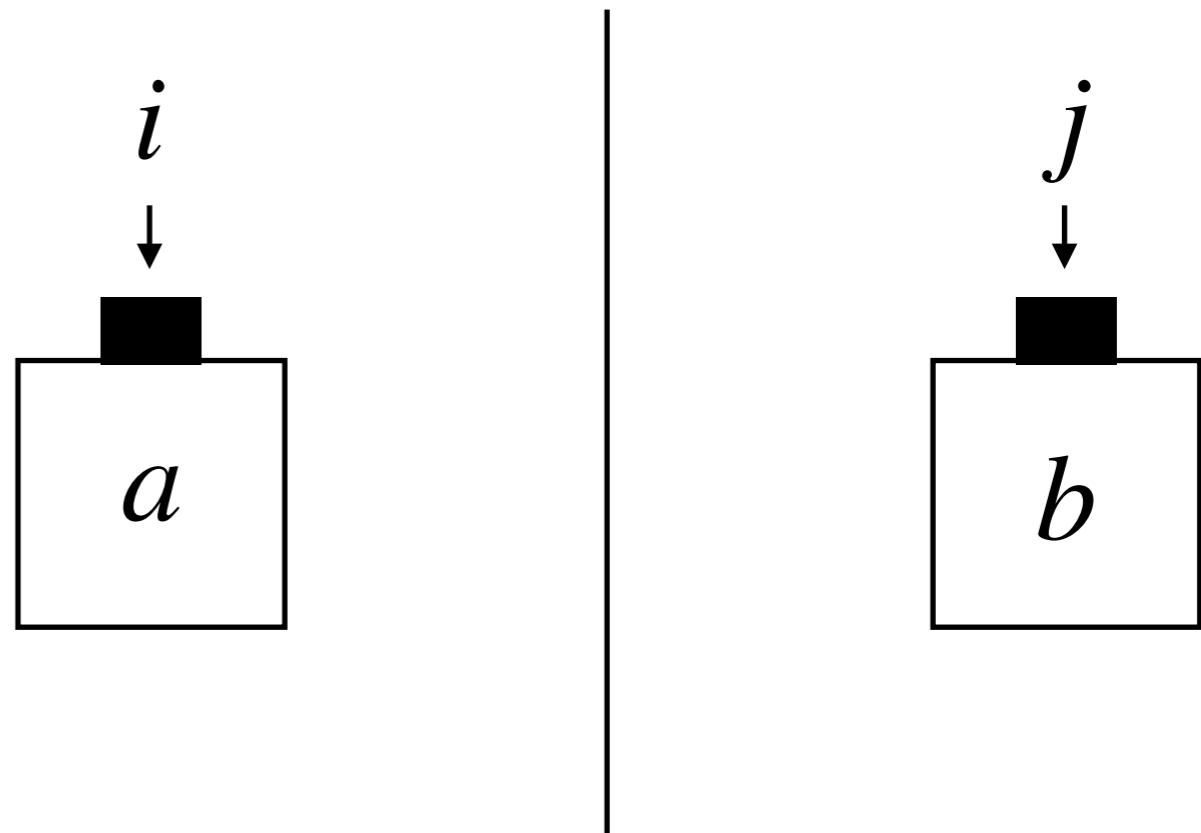
# Operational Interpretation of Noncommutative Cuts



$$i, j \in V,$$

$$a, b \in \{+1, -1\}$$

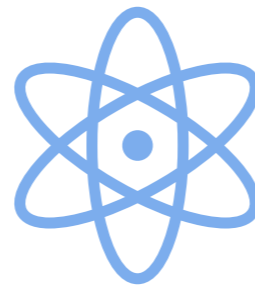
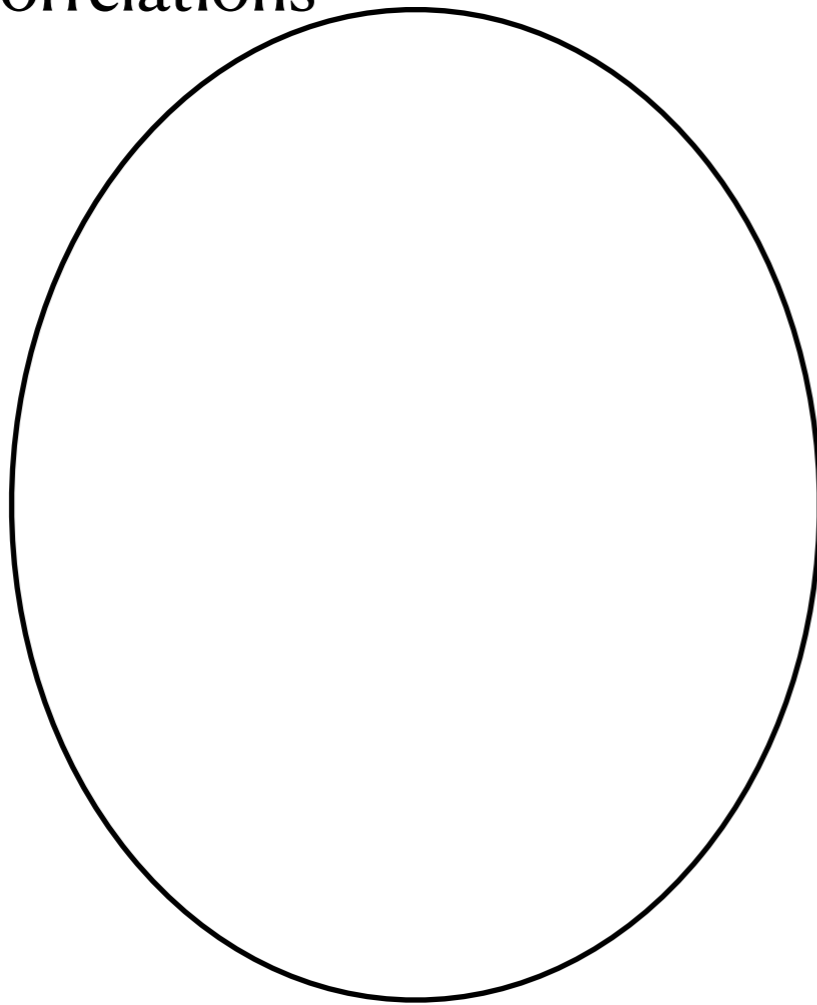
# Correlations



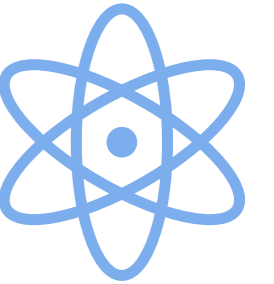
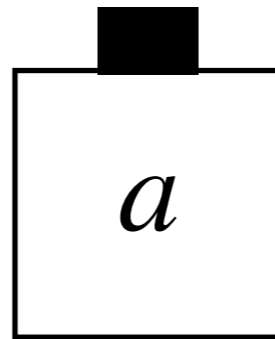
$$P_{i,j}(a, b)$$

# Quantum Correlations

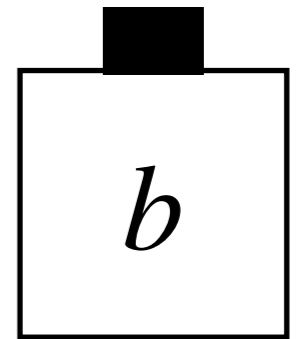
Quantum  
Correlations



$i$



$j$

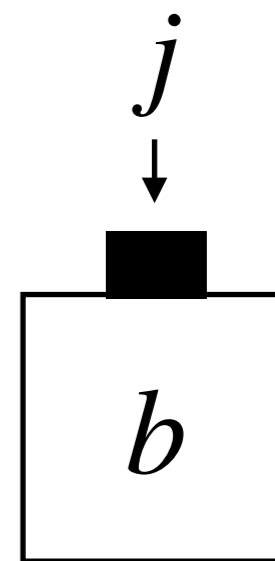
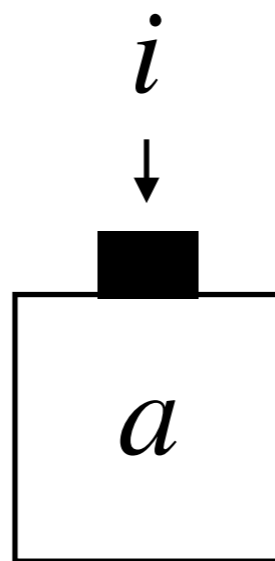
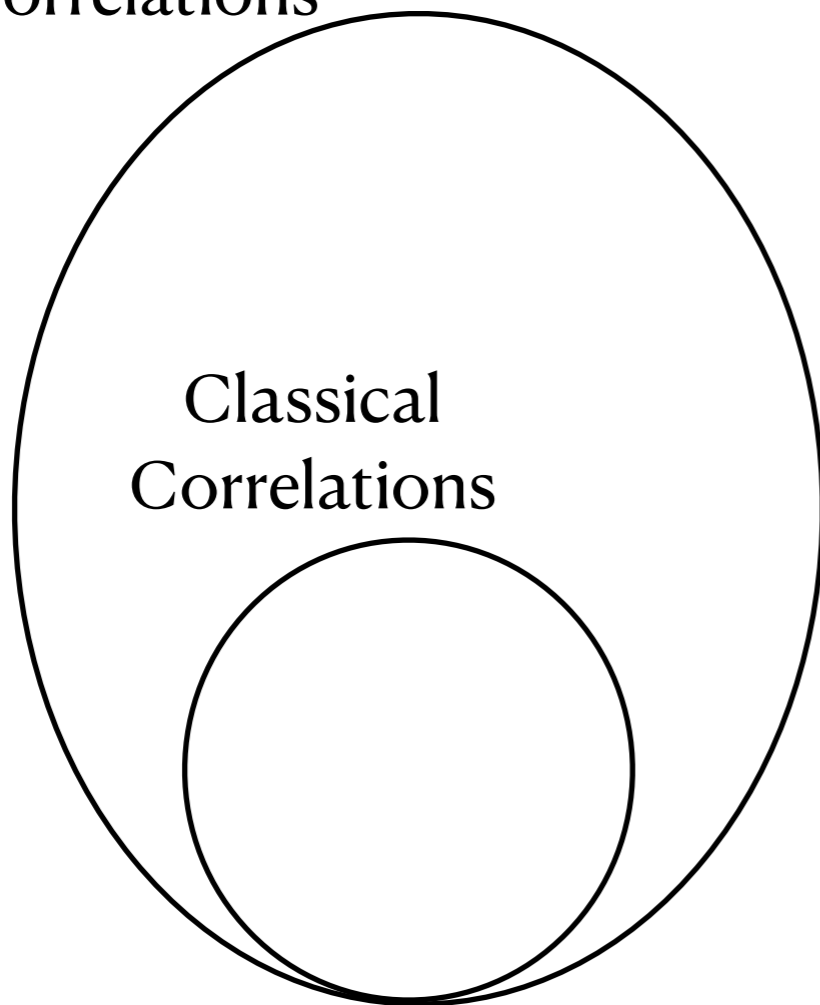


$$P_{i,j}(a, b)$$



# Classical Correlations

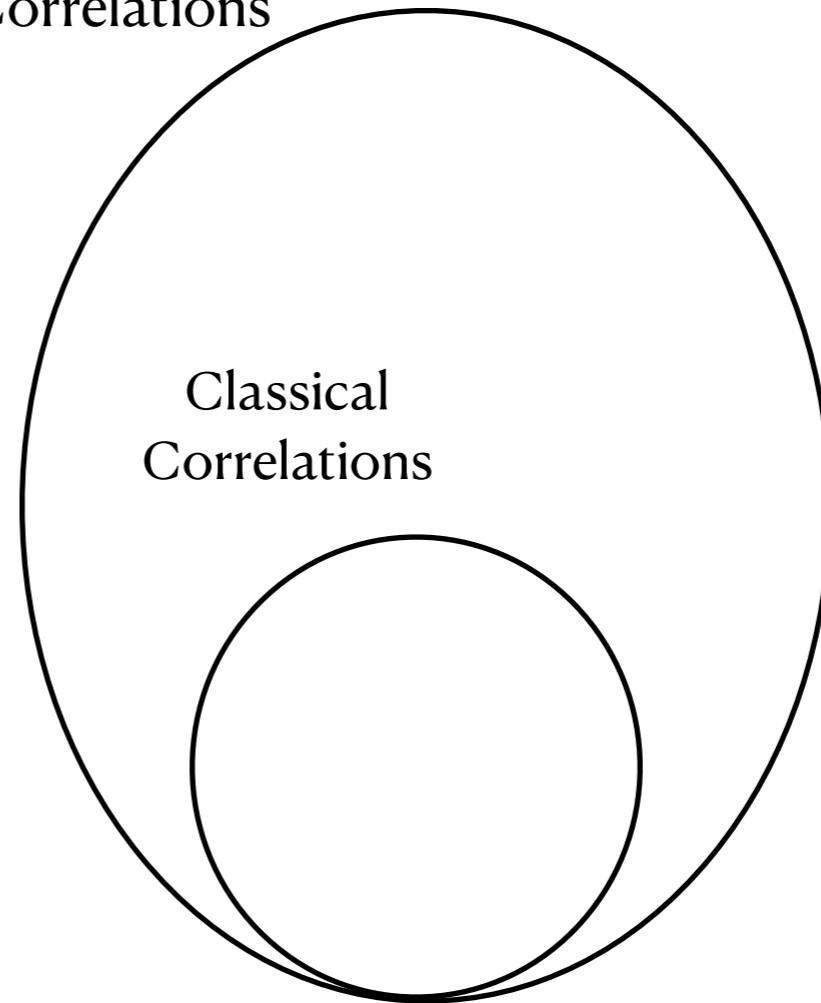
Quantum  
Correlations



$$P_{i,j}(a, b)$$

# Where is MaxCut in this picture?

Quantum  
Correlations

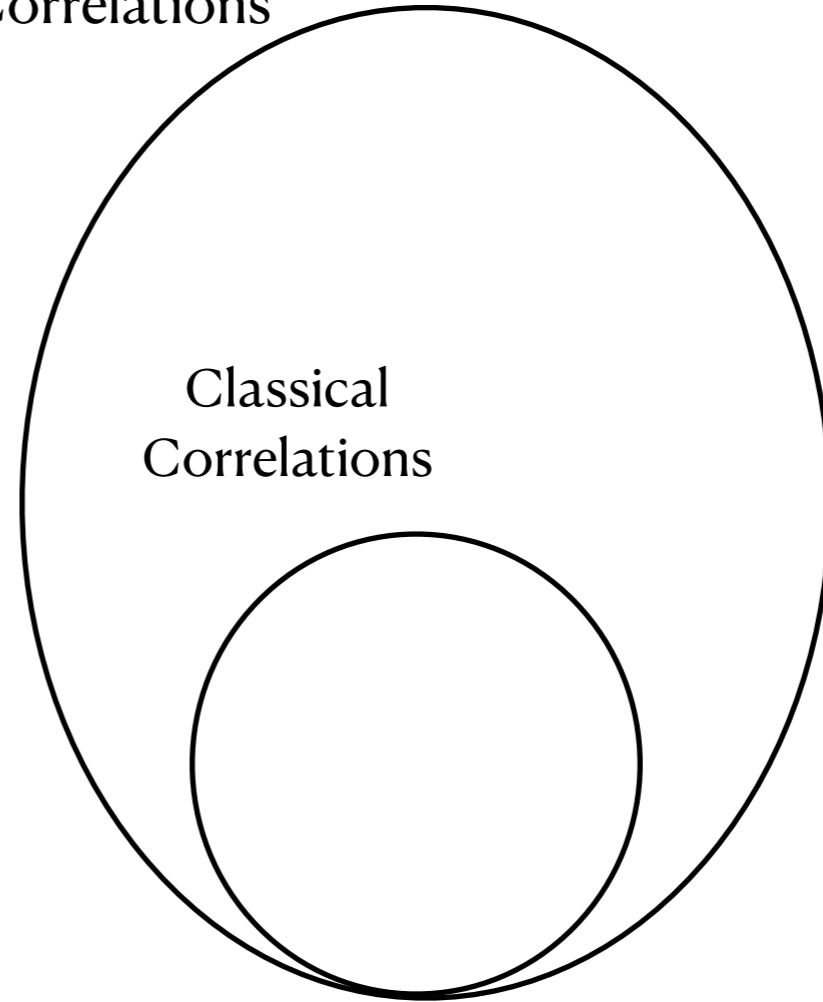


Classical  
Correlations

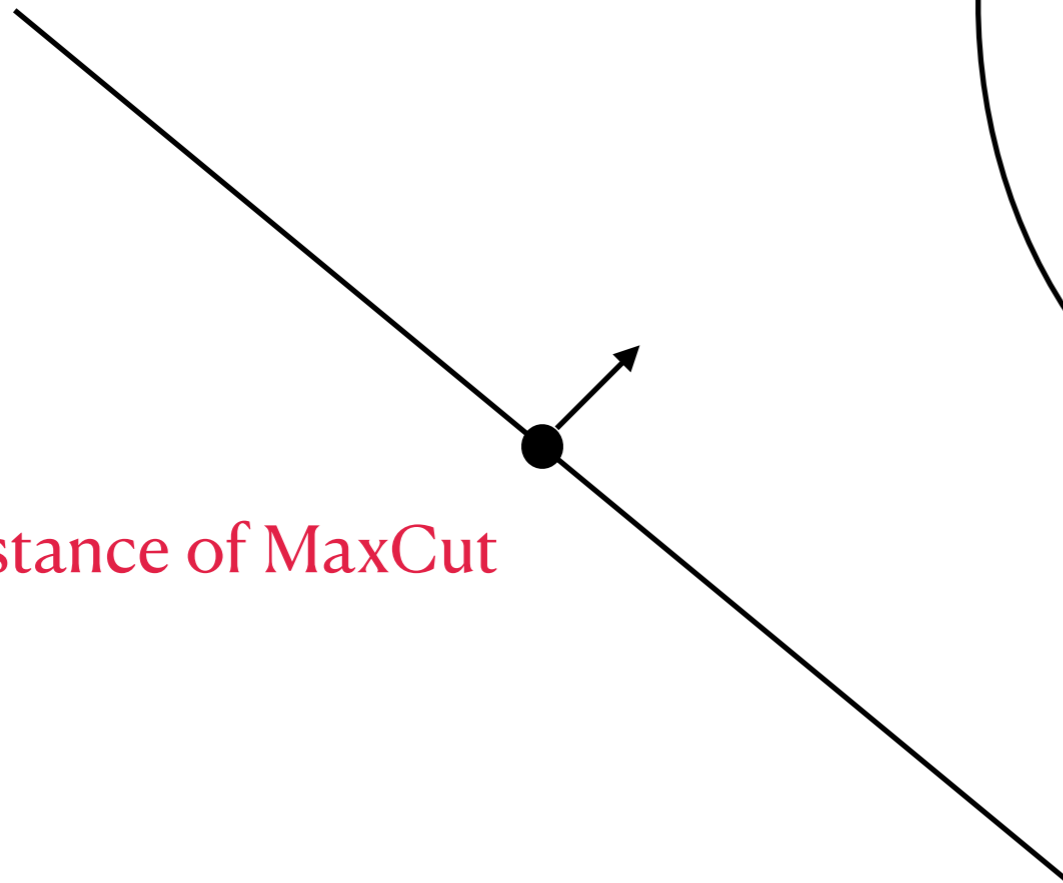
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Quantum  
Correlations

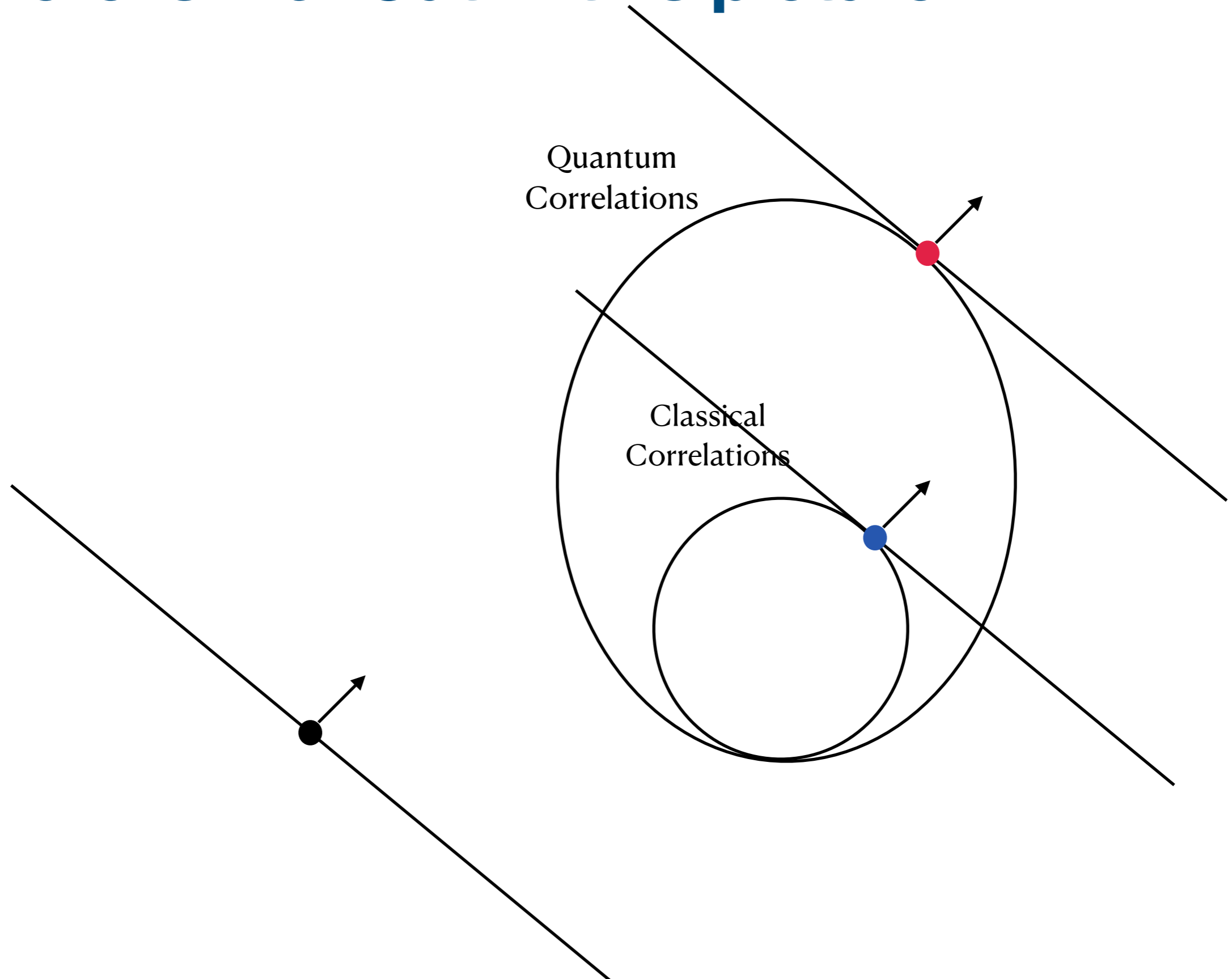
Classical  
Correlations



An instance of MaxCut



# Where is MaxCut in this picture?



# Computational Aspects

# Computational Aspects

- Slofstra 2016: Membership problem for "Quantum Correlations" is undecidable
- In particular optimization over the set is uncomputable
- Ji, Natarajan, Vidick, Wright, Yuen 2020 ( $MIP^*=RE$ ): Even approximation is beyond reach
  
- So generic NC-CSPs are very complex

# Noncommutative MaxCut

$$\max \sum \frac{1 - \operatorname{tr}(X_i X_j)}{2}$$

s.t.  $X_i$  is unitary with  $\pm 1$  eigenvalues

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- Karp 1972: MaxCut is NP-Complete



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- Karp 1972: MaxCut is NP-Complete
- Tsirelson 1980: NC-MaxCut is in P

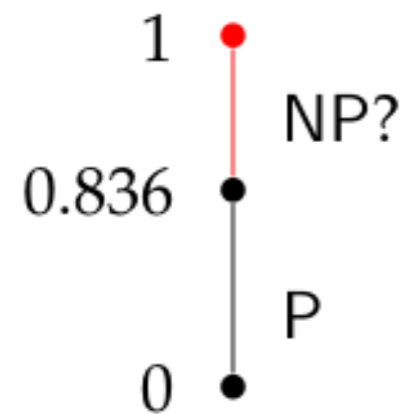
# Noncommutative MaxCut

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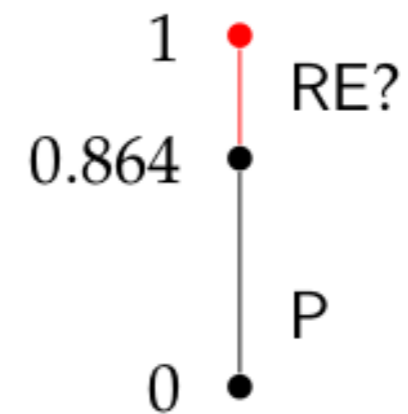
- Karp 1972: MaxCut is NP-Complete
- Tsirelson 1980: NC-MaxCut is in P
- The best classical algorithm is SDP rounding by Goemans and Williamson
- Tsirelson's algorithm is an operator generalization

# What about other NC-CSPs?



(a) Max-3-Cut

Frieze and Jerrum



(b) Noncommutative Max-3-Cut

Culf, M., Spirig

**Proof idea:**

**A strong property of noncommutative matrix algebras (rigidity or self-testing)**

# The power of noncommutative algebras in characterizing optimal solutions

$X_{11}$	$X_{12}$	$X_{13}$	$+I$
$X_{21}$	$X_{22}$	$X_{23}$	$+I$
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$X_{31}$	$X_{32}$	$X_{33}$	$+I$
$+I$	$+I$	$-I$	

Rigidity: In every optimal solution  $X_{12}$  and  $X_{21}$  must anticommute

**This is why in MaxCut and Max3Cut we  
do better in the NC setting**

# Hardness front

- PCP theorem: Approximating Label-Cover is NP-hard  
(Arora, Safra, Lund, Motwani, Sudan, Szegedy, Raz, Håstad)
  
- NC-PCP theorem ( $MIP^*=RE$ ): Approximating NC-Label-Cover is RE-hard  
(Ji, Natarajan, Vidick, Wright, Yuen 2020)



# Hardness front

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- NC-PCP theorem ( $MIP^*=RE$ ): Approximating NC-Label-Cover is RE-hard (Ji, Natarajan, Vidick, Wright, Yuen 2020)
- Compare this with the situation for the Local Hamiltonian problem (LH):
  - Quantum PCP conjecture: Approximating Local Hamiltonian is QMA-hard

# Hardness front

- Similarly UGC has an NC-UGC analogue
- Assuming UGC, approximating MaxCut to better than 0.878 is NP-hard (Khot, Kindler, Mossel, O'Donnell)
- Assuming Q-UGC, approximating Q-MaxCut to better than 0.878 is RE-hard (M., Spirig)

A classical theorem  
involving **NP** and **CSP**

becomes

A theorem that involves  
**RE** and **NC-CSP**

**What is the difference between**

**Local Hamiltonians**

**and**

**CSPs or NC-CSPs?**

# The most general notion of a CSP

- The notion of locale, site, or variable
  - boolean  $\pm 1$  in MaxCut
  - binary observable in NC-MaxCut
  - qubit in Local Hamiltonians

# The most general notion of a CSP

- The notion of locale, site, or variable
  - boolean  $\pm 1$  in MaxCut
  - binary observable in NC-MaxCut
  - qubit in Local Hamiltonians
- Constraints
  - **operations** on variables
    - MaxCut: addition and multiplication (commutative)
    - NC-MaxCut: addition and multiplication (noncommutative)

# The most general notion of a CSP

- The notion of locale, site, or variable
  - boolean  $\pm 1$  in MaxCut
  - binary observable in NC-MaxCut
  - qubit in Local Hamiltonians
- Constraints
  - **operations** on variables
    - MaxCut: addition and multiplication (commutative)
    - NC-MaxCut: addition and multiplication (noncommutative)
  - **interactions** between sites
    - Local Hamiltonians: the Hamiltonian

**CSPs: commutative algebras**

**NC-CSPs: matrix algebras**

**Local Hamiltonians: not algebraic**



**The algebraic nature of CS tools (sum-check protocol, low-degree testing, Fourier analysis on the hypercube)**

**fits**

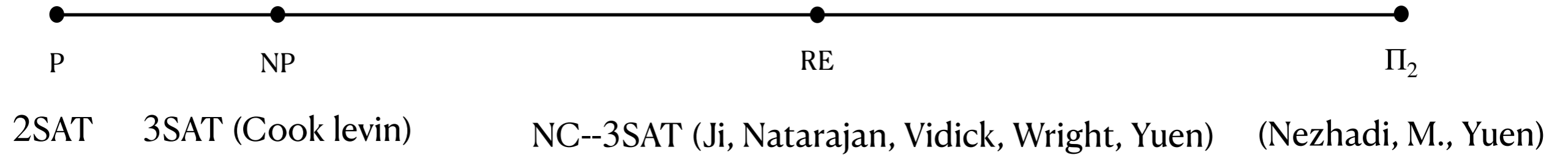
**the algebraic nature of CSPs and NC-CSPs**

A proposal

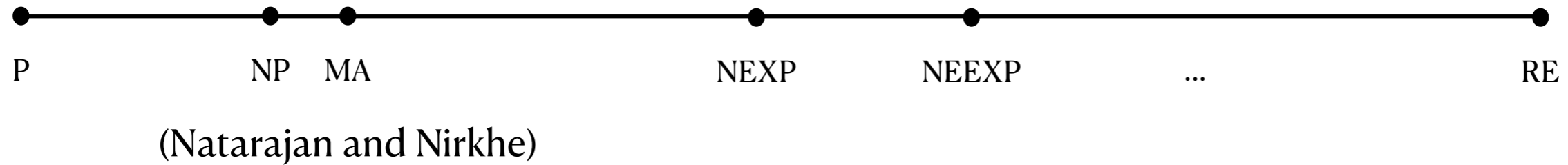
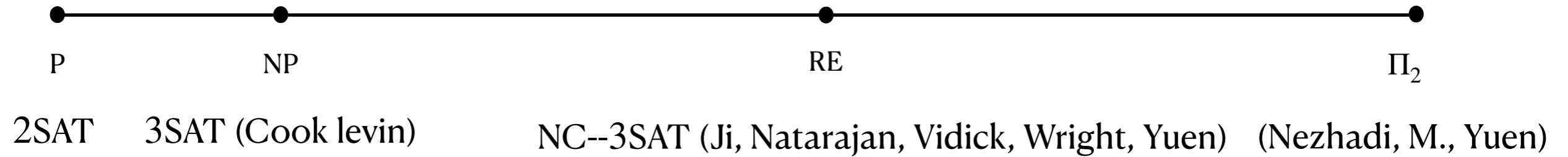
# NC-CSPs are expressive



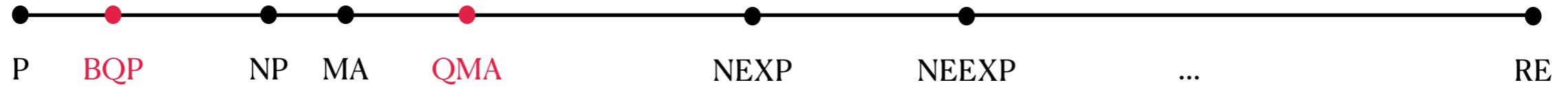
# NC-CSPs are expressive



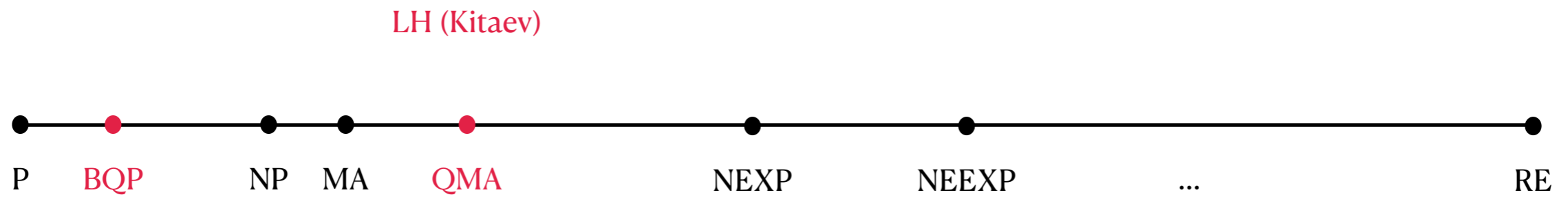
# NC-CSPs are expressive



# But they skip on quantum complexity classes

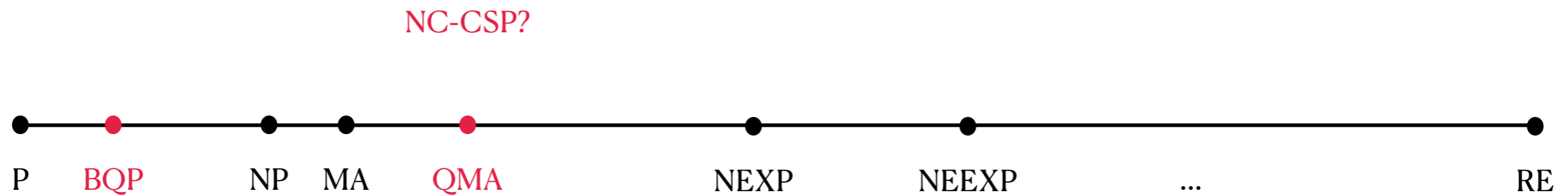


# Local-Hamiltonian fills the gap



Guided-LH (Gharibian, Le Gall)

# Open problem

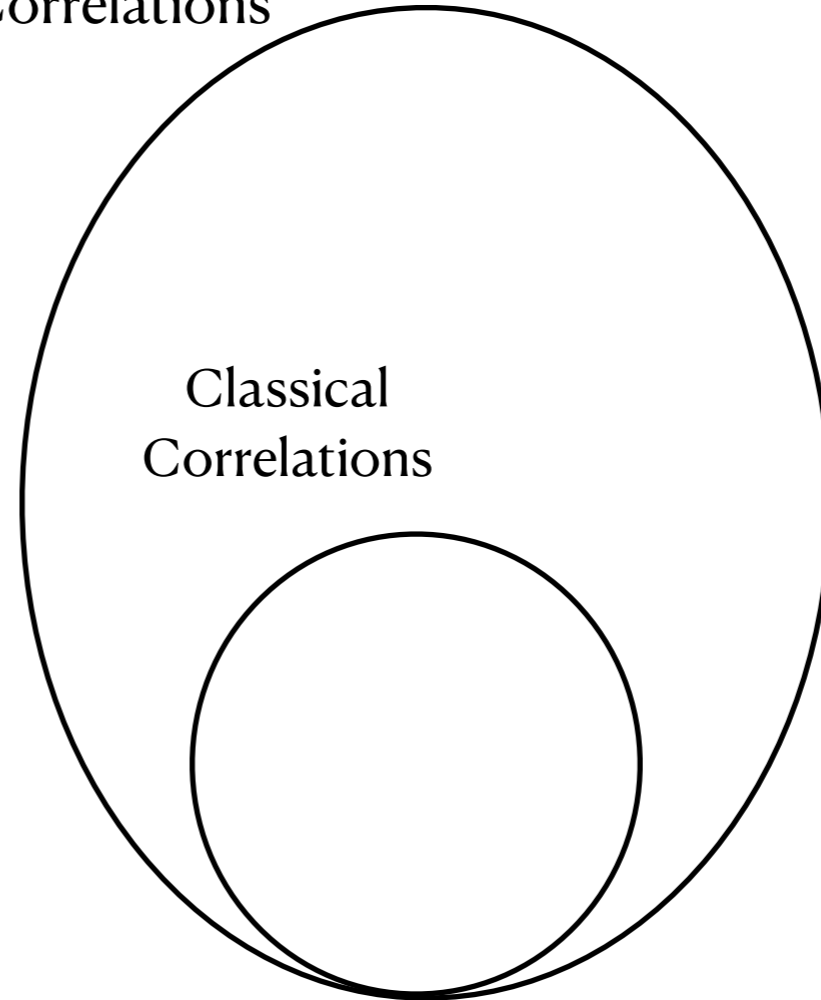


- Restricting the dimension of observable  $\Rightarrow$  nondeterministic classes
- Requiring that the observables are efficiently implementable (in BQP)



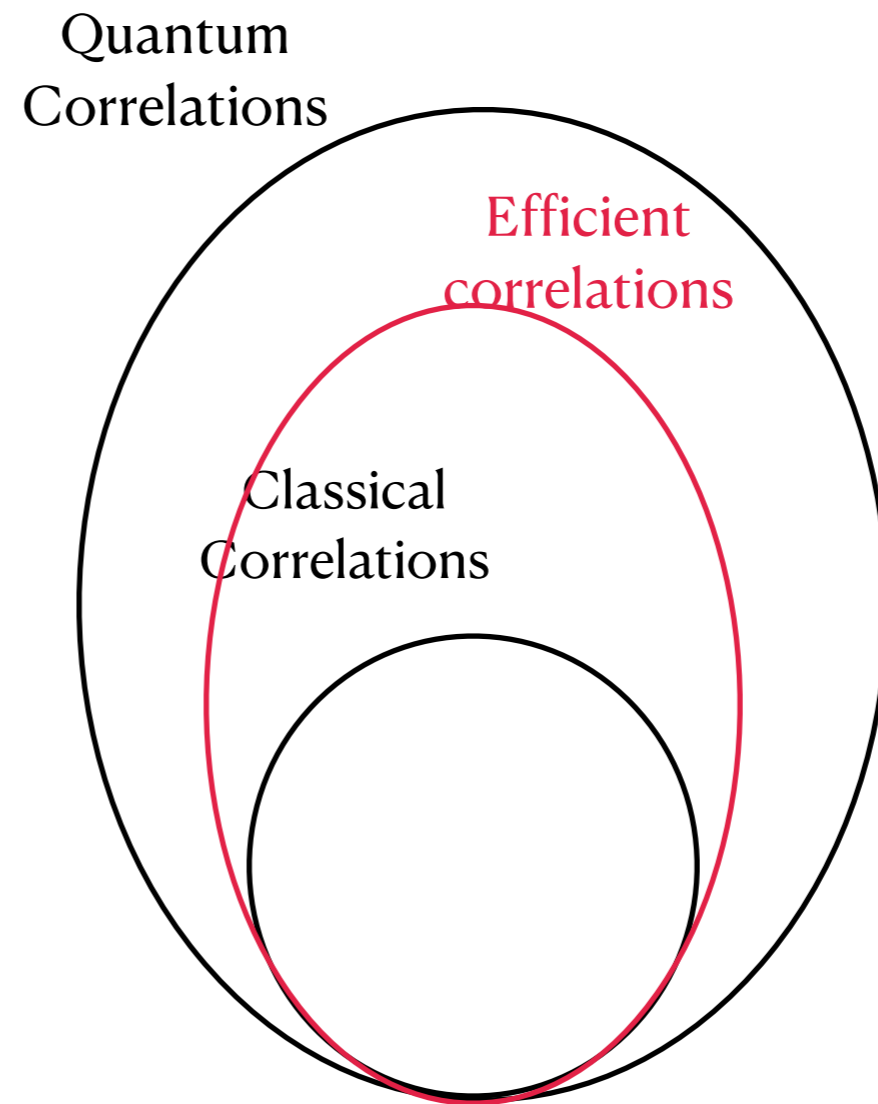
# Remember this picture?

Quantum  
Correlations

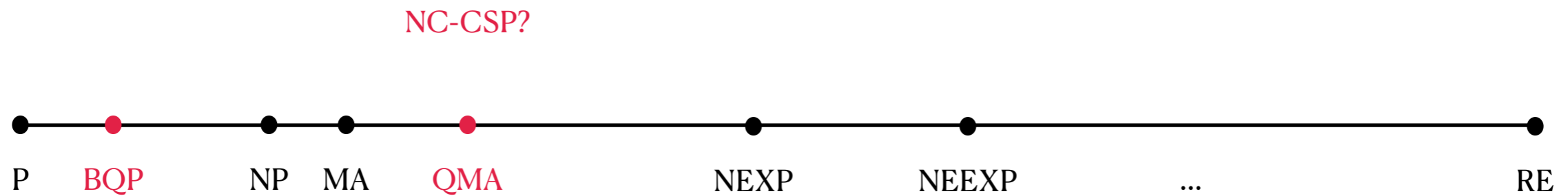


Classical  
Correlations

# Remember this picture?



# Open problem



$$\max \sum \frac{1 - \text{tr}(X_i X_j)}{2}$$

s.t.  $X_i$  is unitary with  $\pm 1$  eigenvalues

and  $X_i$  has an efficient circuit

- Two generalization of CSPs in quantum information
  - Local Hamiltonians
  - NC-CSPs
- NC-CSPs share the algebraicity of classical CSPs
- We have been able to reach almost the same maturity in NC-CSPs
- Many of the CS tools applicable to CSPs are algebraic in nature
- For Local Hamiltonian we need to invent new tools
- But QMA we may be able to understand better
  - if we find an NC-CSP that captures it!