



INSTITUT
POLYTECHNIQUE
DE PARIS

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CANA seminar
September 16th, 2025

Optimal exploration of locally-generated permutations and application to combinatorial optimization

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[arXiv:2505.05981](https://arxiv.org/abs/2505.05981)



With the support of

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MATHÉMATIQUE
JACQUES HADAMARD

FMJH PGMO: P-2023-0009



ANR: HQI-ANR-22-PNCQ-0002

Outline of the presentation

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- ▶ Then, to decompose it into groups that we can *translate* into circuits.

Then:

- ▶ We use these to solve combinatorial optimization problems on permutations.

Optimizing over the permutations: quadratic assignment problems

- We are interested in the approximate resolution of *quadratic assignment problems*:

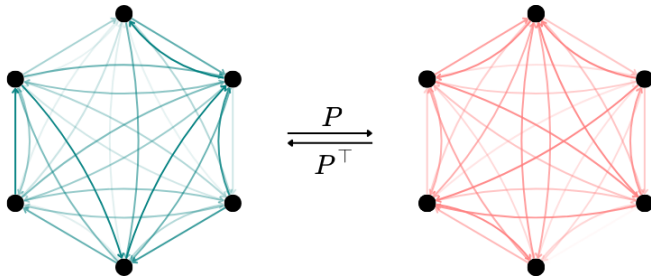


Figure: A 6-vertex instance of QAP.

Optimizing over the permutations: quadratic assignment problems

- We are interested in the approximate resolution of *travelling salesperson problems*:

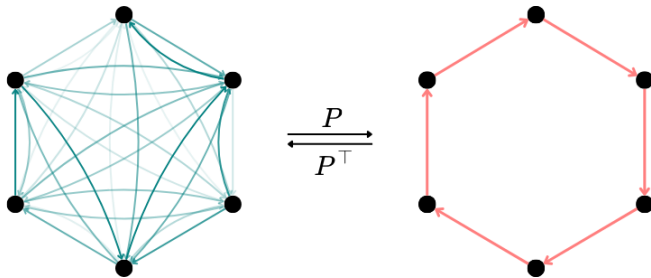


Figure: A 6-vertex instance of TSP.

Optimizing over the permutations: quadratic assignment problems

- We are interested in the approximate resolution of *heaviest k -subgraph problems*:

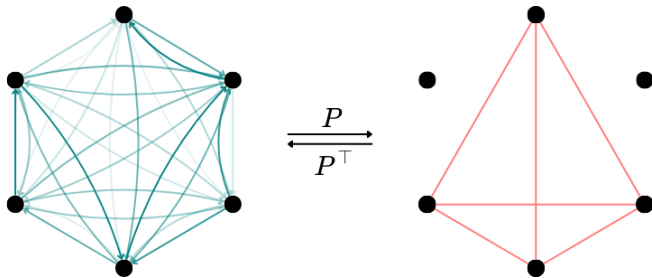


Figure: A 6-vertex instance of heaviest 4-subgraph problem.

Optimizing over the permutations: quadratic assignment problems

- We are interested in the approximate resolution of *graph isomorphism problems*:

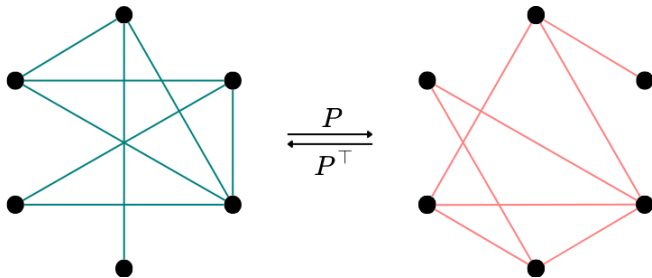


Figure: A 6-vertex instance of QAP.

Combinatorial view of groups

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A group G defined by a set of generators S and relators R is denoted by $G = \langle S \mid R \rangle$, and this is called a *presentation* of G .

Combinatorial view of groups

Example: The *dihedral group* D_N : group of symmetries of regular N -gons.

► A set of generators is

$$S = \{r, f\}.$$

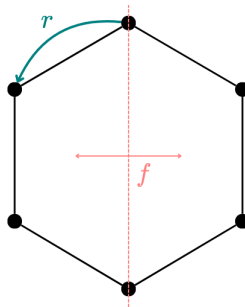


Figure: A regular hexagon and some of its symmetries.

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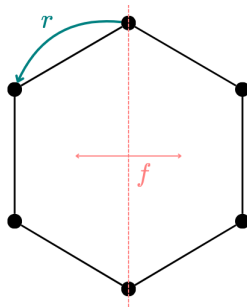


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- ▶ So, we have

$$D_N = \langle r, f \mid r^N, f^2, (rf)^2 \rangle = \mathbb{Z}_N \rtimes \mathbb{Z}_2.$$

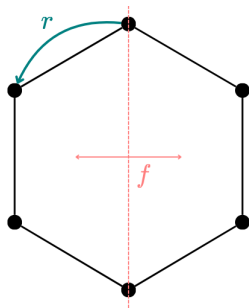


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Combinatorial view of quantum circuits

In our case, we have the following set of generators

$$S_q = \{x_j, cx_{kl} \mid 1 \leq j, k, l \leq q, k \neq l\}.$$

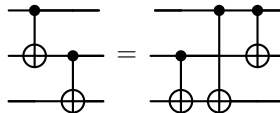
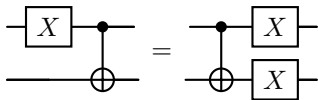
Denote by LX_q the group generated by S_q . What is R_q such that $LX_q = \langle S_q \mid R_q \rangle$?

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How to decompose LX_q ?

- ▷ We want to study the two following groups individually:
 - ▷ X_q , generated by the gates $\{x_j \mid 1 \leq j \leq q\}$;
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The group LX_q decomposes as $X_q \rtimes CX_q$.

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Corollary

Any quantum circuit $\mathcal{C}$ composed solely of x and cx gates can be decomposed into two circuits $\mathcal{C}_X$ and $\mathcal{C}_{CX}$, respectively composed only of x and cx gates, such that

$$\mathcal{C} = \mathcal{C}_X \mathcal{C}_{CX}.$$

The structure of the group X_q

- ▷ Any x gate applies to a *unique* qubit.
- ▷ So, all gates *commute*, and X_q is abelian.
- ▷ Hence, $X_q \simeq \mathbb{Z}_2^q$ and

$$X_q = \langle x_j, 1 \leq j \leq q \mid (x_j x_k)^2, 1 \leq j, k \leq q \rangle.$$

The structure of the group CX_q

Definition

The *general linear group* of degree n over the ring R , denoted by $GL_n(R)$ is the set of $n \times n$ invertible matrices with entries in R , together with the usual matrix product.

Theorem (Bataille, 2022)

The group CX_q is isomorphic to $GL_q(\mathbb{Z}_2)$.

The structure of the group CX_q

Corollary (of Steinberg, 1968 and Bataille, 2022)

If $q \geq 3$, a presentation of CX_q is given by the set of generators

$$\{cx_{kl} \mid 1 \leq k, l \leq q, k \neq l\},$$

and the following set of relations:

$$\begin{aligned} & cx_{kl}^2, \\ & (cx_{kl}cx_{lm})^2 cx_{km}, & \text{for } k, l \text{ and } m \text{ distinct,} \\ & (cx_{kl}cx_{mp})^2, & \text{for } k \neq p \text{ and } l \neq m. \end{aligned}$$

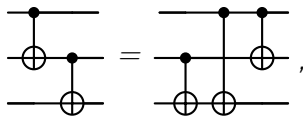
The structure of the group CX_q

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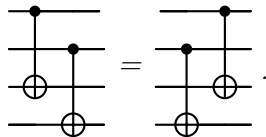
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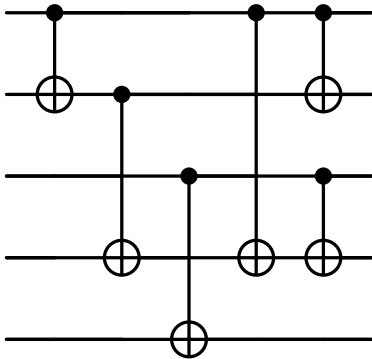
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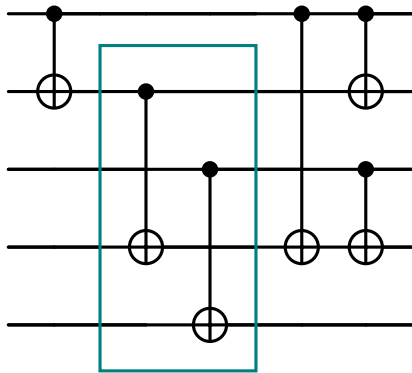
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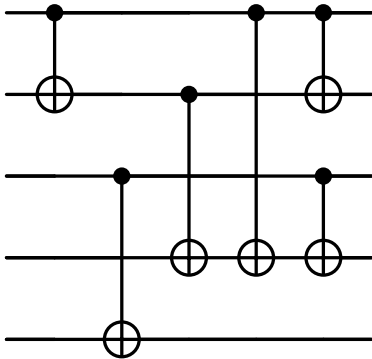
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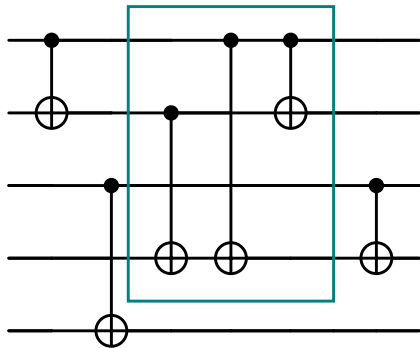
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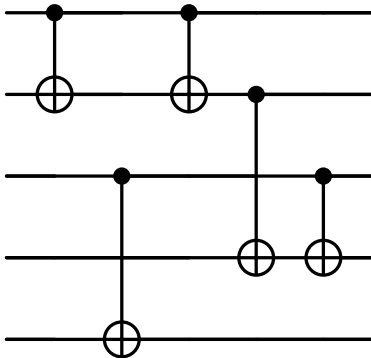
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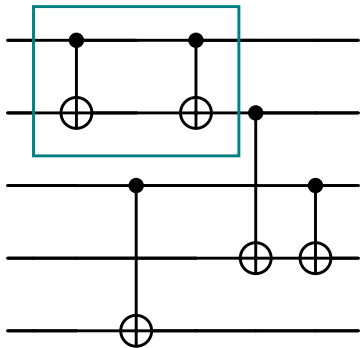
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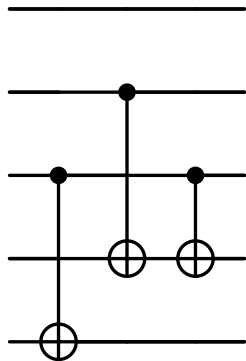
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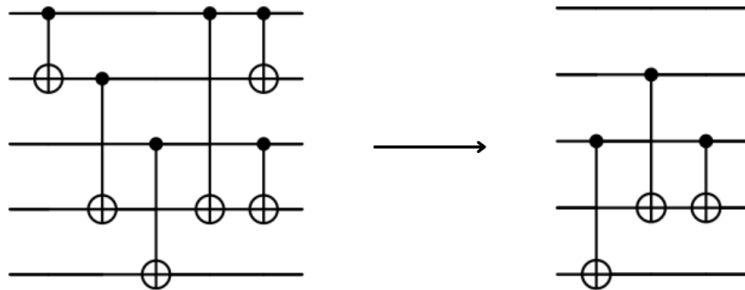
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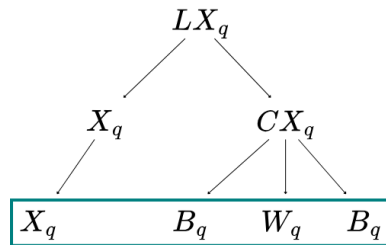
How to further decompose LX_q ?

- ▷ **Borel subgroup:** $B_q < GL_q(\mathbb{Z}_2)$ the subgroup of upper-triangular matrices ;
- ▷ **Weyl subgroup:** $W_q < GL_q(\mathbb{Z}_2)$ the subgroup of permutation matrices.

Theorem (Bruhat and Tits, 1972)

We have $CX_q = B_q W_q B_q$.

This is known as the *Bruhat decomposition*.



A quantum circuit to span X_q

- We showed that $X_q = \mathbb{Z}_2^q$. So, denoting θ for $R_X(\theta)$, we have

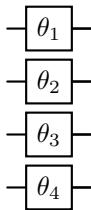


Figure: Circuit spanning X_4 when $\theta \in \{0, \pi\}^4$.

A quantum circuit to span the Borel subgroup B_q

- It is known that upper-triangular matrices over $\mathbb{Z}_2$ are generated by *transvections*:

$$T_{kl} = I + E_{kl} \quad \text{with} \quad [E_{kl}]_{mp} = \begin{cases} 1, & \text{if } (k, l) = (m, p), \\ 0, & \text{otherwise.} \end{cases}$$

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- ▶ Bataille (2022) proved that $\text{GL}_q(\mathbb{Z}_2) \simeq \text{CX}_q$ by showing $\text{cx}_{kl} \longleftrightarrow T_{kl}$.

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- ▶ Multiplying by the matrix T_{kl} adds the l -th row of a matrix to its k -th row.

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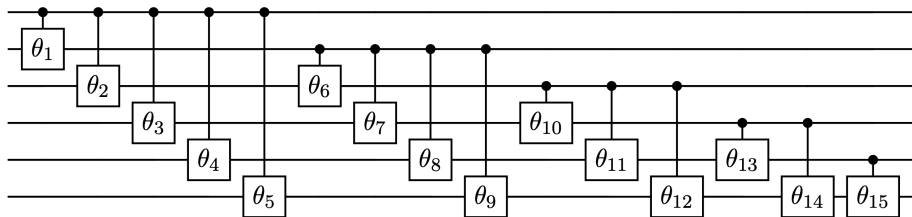
Any element of B_q is uniquely written as a subword of

$$T_{(q-1\ q)} T_{(q-2\ q-1)} T_{(q-2\ q)} \cdots T_{(jq)} \cdots T_{(j\ j-1)} T_{(j-1\ q)} \cdots T_{(23)} T_{(1q)} \cdots T_{(13)} T_{(12)}.$$

A quantum circuit to span the Borel subgroup B_q

Theorem

Any element of B_q can *uniquely* be written as



for adequate parameters $\theta_* \in \{0, \pi\}$. The size scales in $O(q^2)$ and the depth in $O(q)$.

A quantum circuit to span the Weyl subgroup $W_q \simeq S_q$

- ▶ We leverage the *Bruhat order* on the symmetric group.

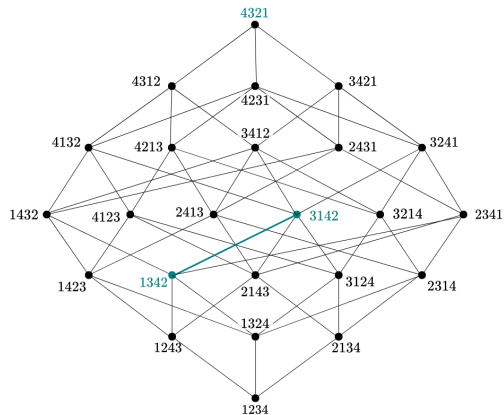
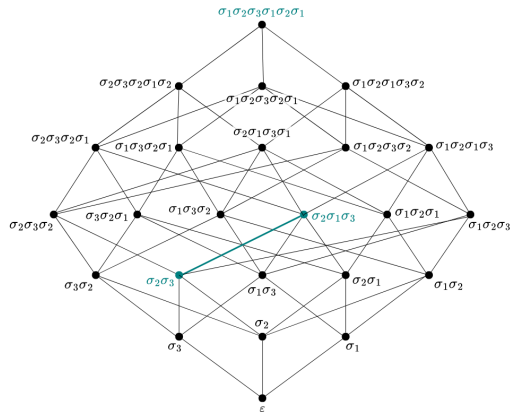
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- ▶ A permutation σ_1 is *lower than or equal to* another permutation σ_2 if there exists a word of σ_1 that is a *subword* of a (or equivalently, any) reduced word of σ_2 .
- ▶ There exists a *unique maximal element* for the Bruhat order on S_q .

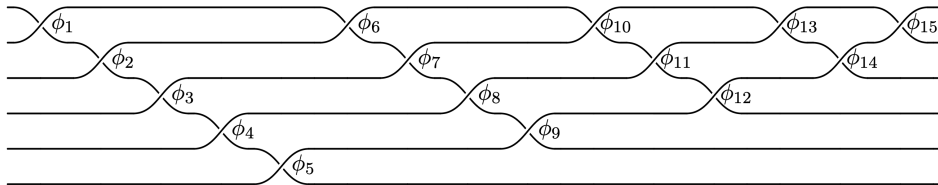
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for adequate parameters $\phi_* \in \{0, \pi\}$. The size scales in $O(q^2)$ and the depth in $O(q)$.

Finally, a quantum circuit to span the entirety of LX_q

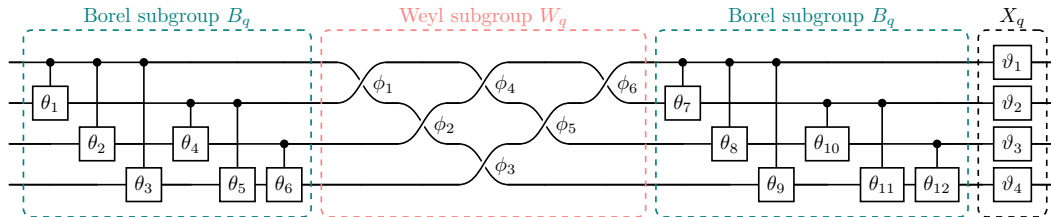


Figure: Circuit spanning LX_4 . The size of such circuits scales in $O(q^2)$, and the depth in $O(q)$.

How many permutations have we reached?

Proposition

This algorithm can span up to p distinct permutations, with

$$p = |X_q| \cdot |CX_q| = 2^{\frac{q(q+1)}{2}} \prod_{k=1}^q (2^k - 1).$$

q	1	2	3	4	5	6
p	2	24	1344	322,560	319,979,520	1,290,157,424,640

Figure: Number p of spanned permutations for some numbers of qubits q .

A circuit spanning all permutations for $q = 2$

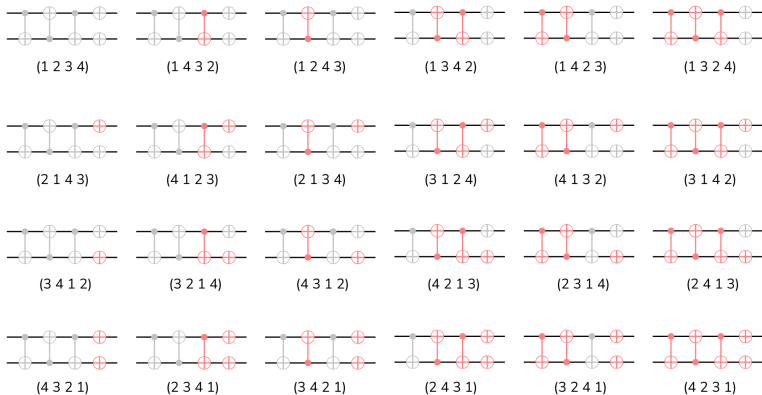


Figure: Permutations of $\{1, 2, 3, 4\}$, each with one of their circuits.

How many permutations do we span?

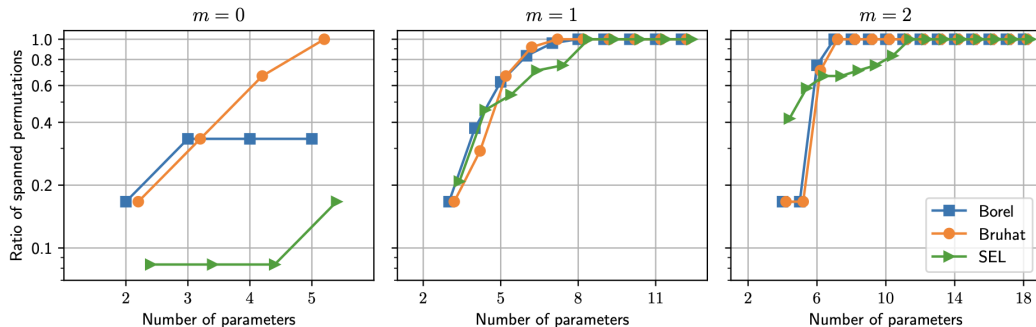


Figure: Ratio of the spanned permutations as a function of the number of parameters for $q = 2$, i.e., $n = 4$. Recall that the Bruhat span of n is 24 and $n! = 24$.

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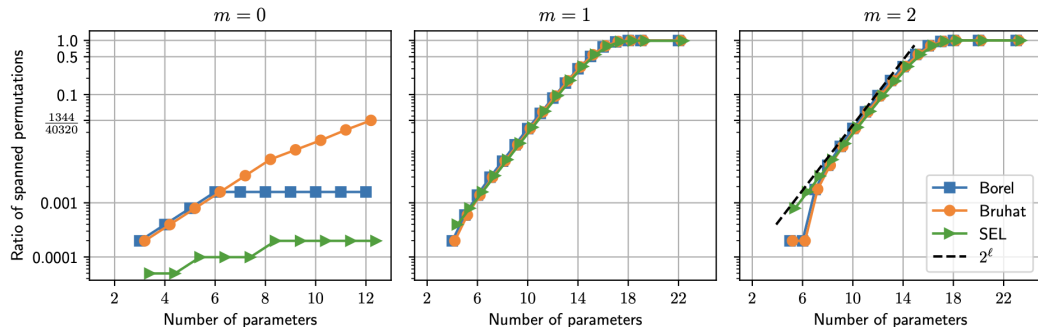


Figure: Ratio of the spanned permutations as a function of the number of parameters for $q = 3$, i.e., $n = 8$. Recall that the Bruhat span of n is 1,344 and $n! = 40,320$.

The quadratic assignment problems

The cost function we aim to optimize is of the form

$$f\left(\hat{P}_\theta\right)=\mathrm{tr}\left(W\hat{P}_\theta D^\top\hat{P}_\theta^\top\right),$$

where W and D are two adjacency matrices in $\mathbb{R}^{n\times n}$.

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- ▶ None of the matrices are assumed to be symmetric.
- ▶ The quadratic assignment problem is NP-hard. The existence of a polynomial time ε -approximation algorithm implies $P = NP$.

Simulations on instances of QAPLib

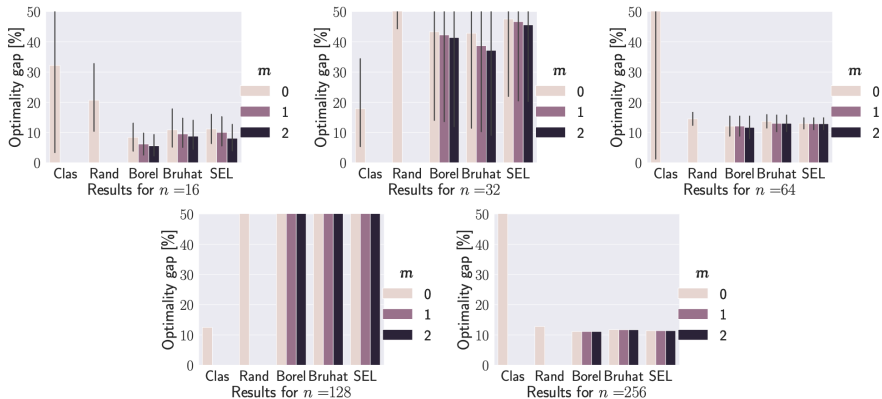


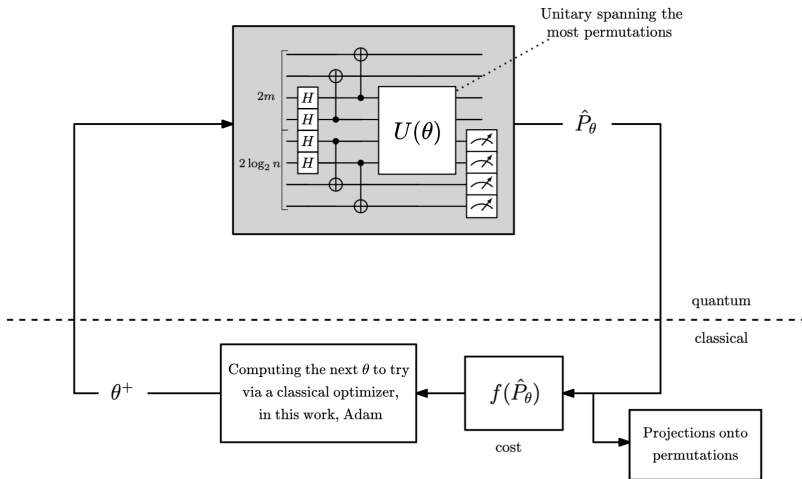
Figure: Numerical comparisons on instances taken from QAPLib. Clas denotes the classical heuristic and Rand the naive random method. We present here the mean over the instances and the standard deviation. We zoom on the range $[0, 50\%]$ for readability.

Thank you for your attention.

arXiv:2505.05981

dylan.laplace.mermoud@protonmail.com

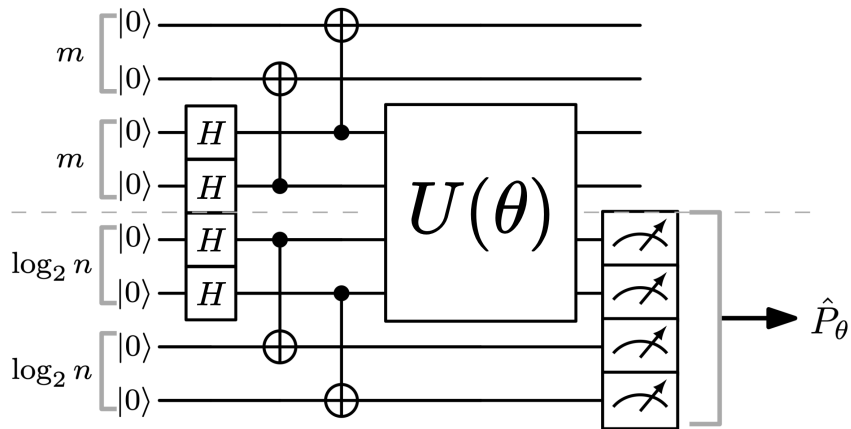
Solving optimization problems



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¹Circuit from Mariella et al. (2024) "Quantum theory and application of contextual optimal transport".

Measuring a superposition of permutations



An algorithm to solve quadratic assignment problems

Algorithm QUPER

Require: Ansatz, number of ancilla qubit m^* , number of iterations I

- 1: Define $\theta^{(0)}$ uniformly in $\frac{\pi}{2} \pm 0.05$ according to the chosen ansatz
 - 2: **for** m in $\{0, \dots, m^*\}$ **do**
 - 3: **while** convergence not reached **do** ▷ We set $I = 300$ iterations
 - 4: $\theta^{(i+1)} \leftarrow \text{ADAM}(\theta^{(i)})$ ▷ ADAM calls the quantum circuit
 - 5: **if** $i \% 10 = 0$ **then**
 - 6: get $\tilde{P}$ by projecting $\hat{P}_{\theta^{(i+1)}}$
 - 7: get $\tilde{v}$ by evaluating the cost classically
 - 8: **if** $\tilde{v} < v$ **then**
 - 9: $v \leftarrow \tilde{v}, P \leftarrow \tilde{P}$
 - 10: **return** v, P ▷ We returned the results for each m
 - 11: pad the final θ with zeros
-

Simulations on random instances

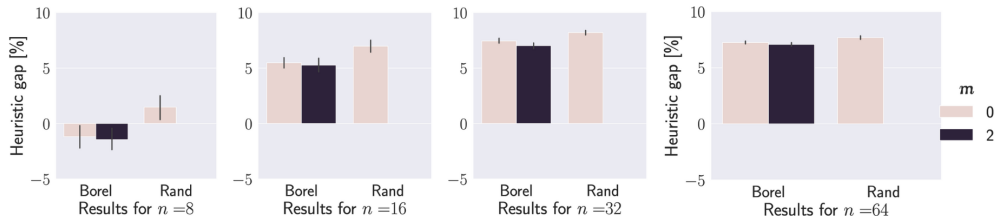


Figure: Numerical comparisons on 25 Gaussian random instances with respect to the classical heuristic. We present here the mean over the instances and the standard deviation.

Simulations on random graph isomorphism problem instances

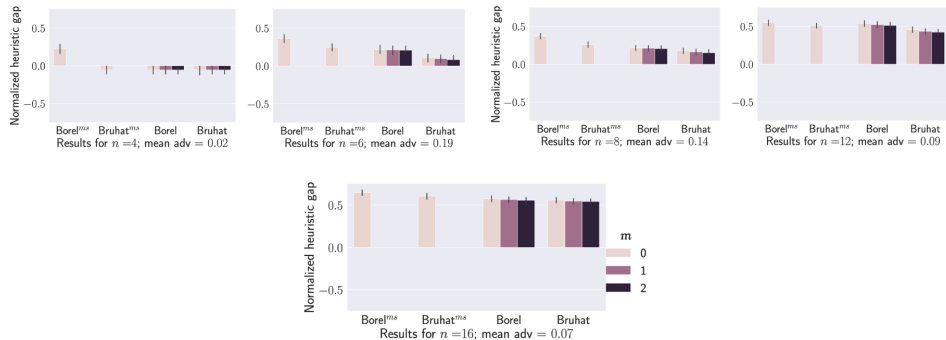


Figure: Numerical comparisons on 100 random instances with respect to the classical heuristic. We present here the mean over the instances and the standard deviation. Borel^{ms} and Bruhat^{ms} represent the approach of Mariella and Simonetto².

²Nicola Mariella and Andrea Simonetto. (2023) “A quantum algorithm for the sub-graph isomorphism problem”.