

Some 0/1 polytopes need exponential size extended formulations

Thomas Rothvoß

Department of Mathematics, M.I.T.



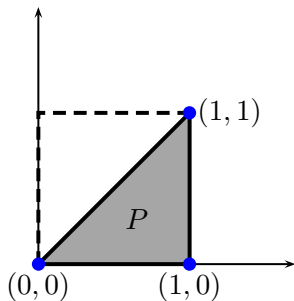
Massachusetts
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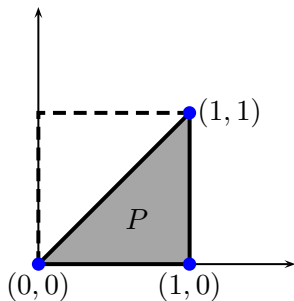
0/1 polytopes

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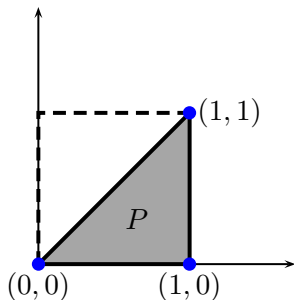
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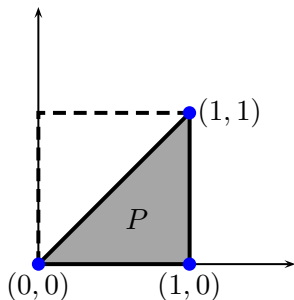
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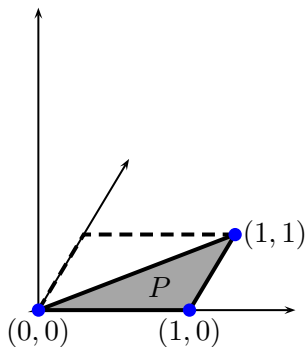
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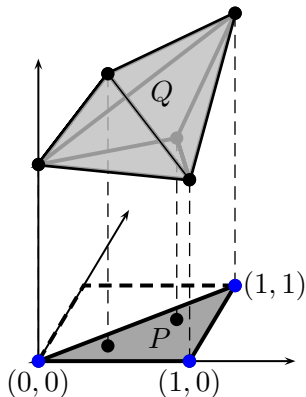
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- ▶ $p : \mathbb{R}^{n+k} \rightarrow \mathbb{R}^n$ linear projection
- ▶ $Q = \{(x, y) \mid Bx + Cy \leq c\}$

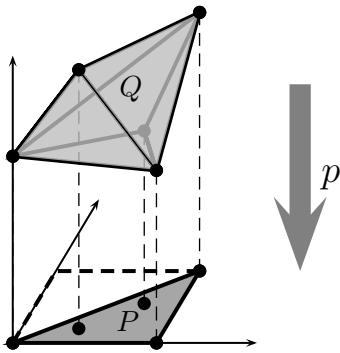


Extension complexity

Definition

Extension complexity:

$$\text{xc}(P) := \min \left\{ \begin{array}{l} \# \text{facets of } Q \mid \\ Q \text{ polyhedron} \\ p \text{ linear projection} \\ p(Q) = P \end{array} \right\}$$



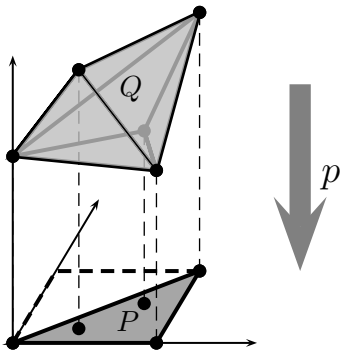
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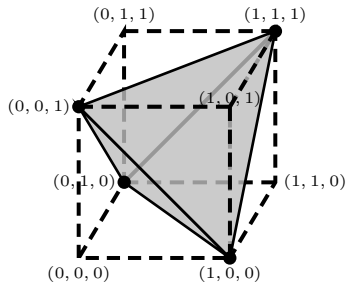
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If $\text{xc}(P) \leq \text{poly}(n) \Rightarrow (Q, p)$ **compact formulation** of P .



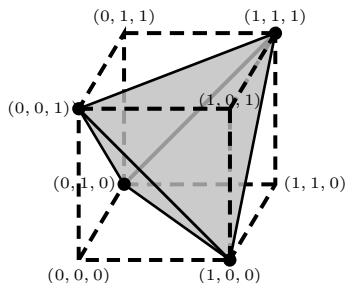
Example: PARITY POLYTOPE

$$P = \text{conv}\{x \in \{0,1\}^n \mid \# \text{ ones in } x \text{ is odd}\}$$



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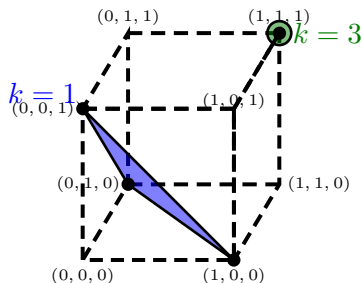
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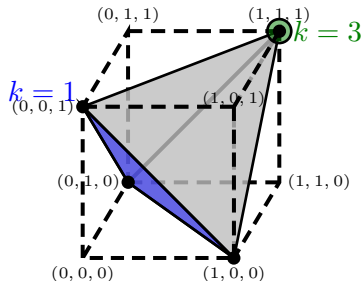
$$\begin{aligned} \mathbf{1}^T z^k &= k & (k \text{ odd}) \\ \mathbf{0} \leq z^k &\leq \mathbf{1} \end{aligned}$$



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$$\begin{aligned} x &= \sum_{k \text{ odd}} z^k \\ \mathbf{1}^T z^k &= k \cdot \lambda_k \quad (k \text{ odd}) \\ \mathbf{0} \leq z^k &\leq \mathbf{1} \cdot \lambda_k \\ \mathbf{1}^T \lambda &= 1 \\ \lambda &\geq \mathbf{0} \end{aligned}$$



What's known?

Compact formulations:

- ▶ PERFECT MATCHING in planar graphs [Barahona '93]
- ▶ PERFECT MATCHING in bounded genus graphs [Gerards '91]
- ▶ $O(n \log n)$ -size for PERMUTAHEDRON [Goemans '10]
(\rightarrow **tight**)
- ▶ $n^{O(1/\varepsilon)}$ -size ε -apx for KNAPSACK POLYTOPE [Bienstock '08]
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Theorem (Yannakakis)

*No **symmetric** compact formulation for TSP POLYTOPE and PERFECT MATCHING POLYTOPE.*

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*No **symmetric** compact formulation for TSP POLYTOPE and PERFECT MATCHING POLYTOPE.*

Theorem (Kaibel, Pashkovich & Theis '10)

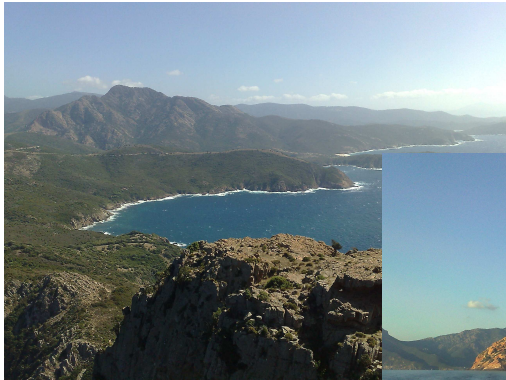
Compact formulation for $\log n$ size matchings, but no symmetric one.

1st Cargèse Workshop on Combinatorial Optim.

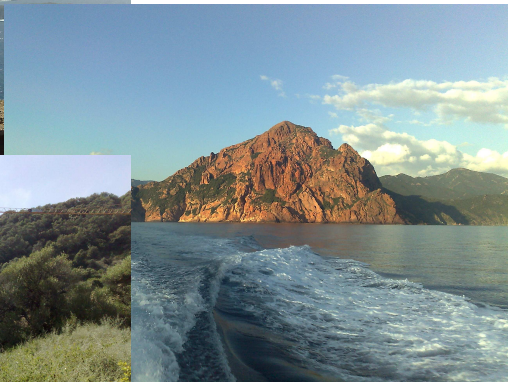
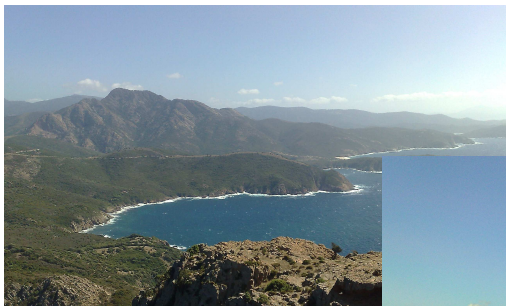
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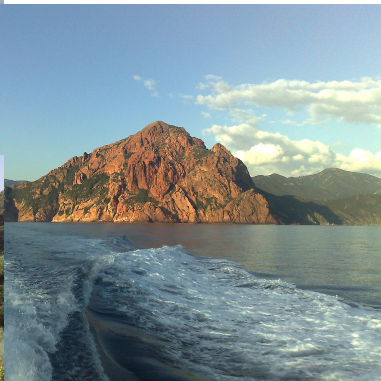
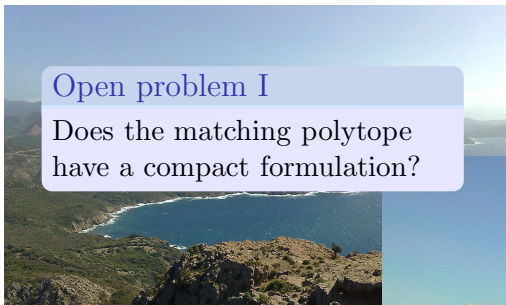
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Open problem I

Does the matching polytope have a compact formulation?

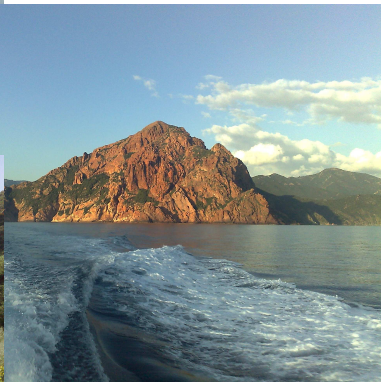
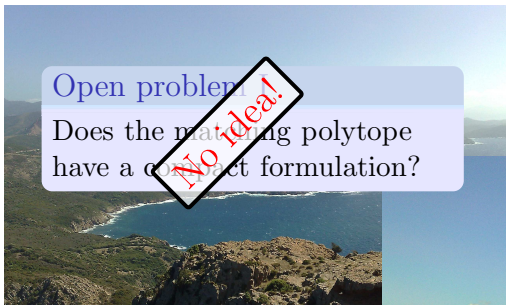


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Open problem II (V. Kaibel)

Is there any 0/1 polytope without a compact formulation?



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Open problem I

Does the matching polytope have a compact formulation?

No Idea!

Open problem II (V. Kaibel)

Is there any 0-1 polytope without a compact formulation?

Yes!

Theorem

For every n there *exists* $X \subseteq \{0, 1\}^n$ s.t.

$$\text{xc}(\text{conv}(X)) \geq 2^{n/2 \cdot (1-o(1))}.$$



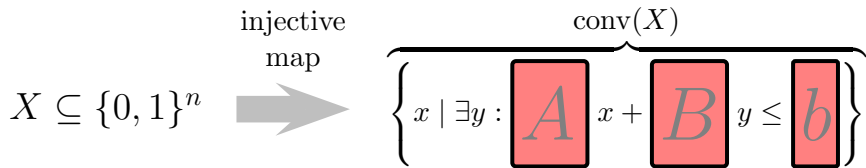
Proof strategy

$$X \subseteq \{0, 1\}^n$$

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$$X \subseteq \{0, 1\}^n \quad \longrightarrow \quad \overbrace{\left\{ x \mid \exists y : \boxed{A} x + \boxed{B} y \leq \boxed{b} \right\}}^{\text{conv}(X)}$$

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$$X \subseteq \{0, 1\}^n \xrightarrow{\substack{\text{injective} \\ \text{map}}} \overbrace{\left\{ x \mid \exists y : \boxed{A} x + \boxed{B} y \leq \boxed{b} \right\}}^{\text{conv}(X)}$$

$$\#0/1 \text{ polytopes} \leq \# \text{ extended form.}$$

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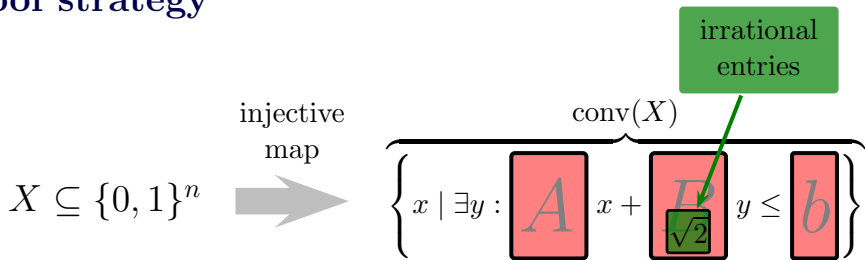
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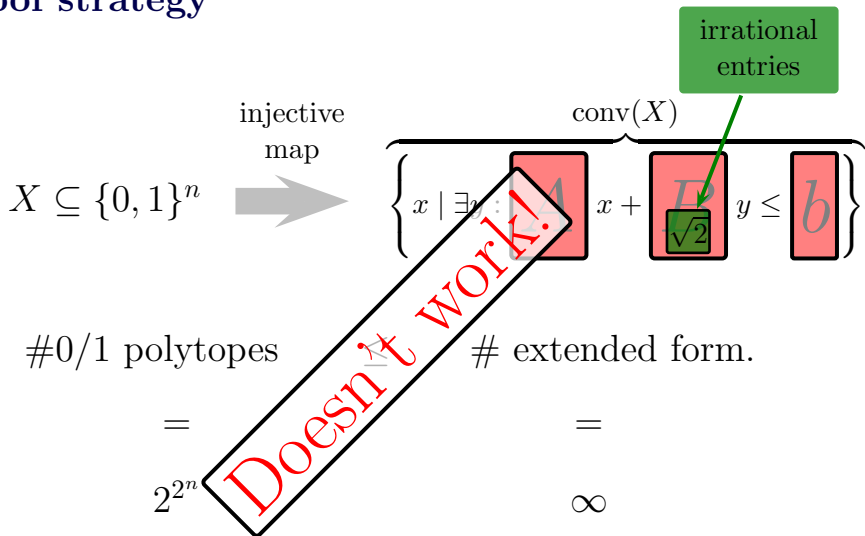
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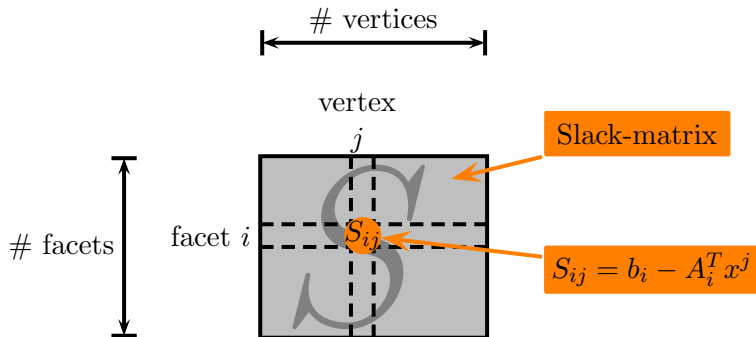


Slack-matrix

Write: $P = \text{conv}(\{x^1, \dots, x^v\}) = \underbrace{\{x \in \mathbb{R}^n \mid Ax \leq b\}}_{\text{non-redundant}}$

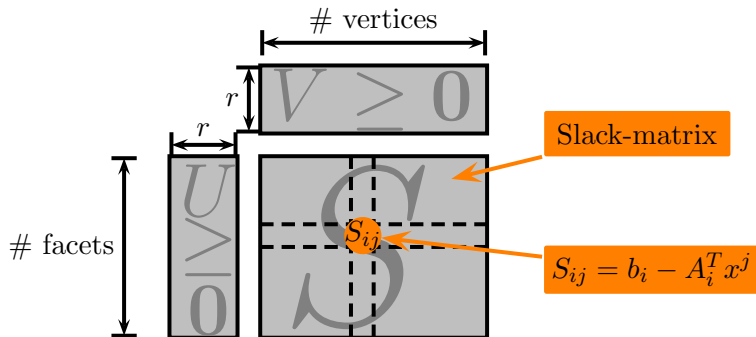
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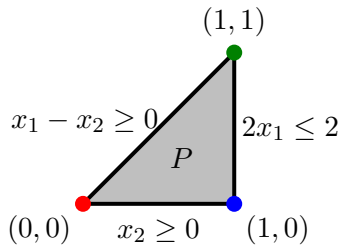
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Non-negative rank:

$$\text{rk}_+(S) = \min\{r \mid \exists U \in \mathbb{R}_{\geq 0}^{f \times r}, V \in \mathbb{R}_{\geq 0}^{r \times v} : S = UV\}$$

Example for slack-matrix



	●	●	●
/	0	1	0
	2	0	0
-	0	0	1

Yannakakis' Theorem

Theorem (Yannakakis '91)

Let S be **slackmatrix** for P :

- ▶ $xc(P) = rk_+(S)$.
- ▶ For any non-neg. factorization $S = UV$:

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- ▶ “ \geq ” follows from an application of duality.

Controlling the coefficients

- ▶ Fix $X \subseteq \{0, 1\}^n$, $P := \text{conv}(X) = \{x \in \mathbb{R}^n \mid Ax \leq b\}$ and Slack-matrix $S = UV$

Valid assumption:

- ▶ A, b integral with $\|A\|_\infty, \|b\|_\infty \leq 2^{n \log(2n)}$

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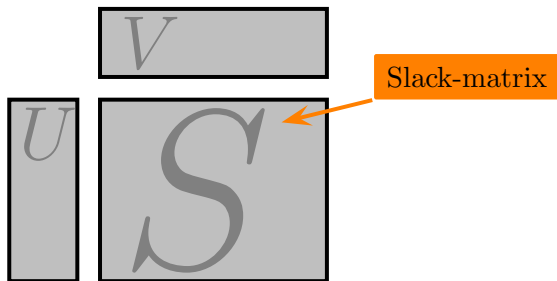
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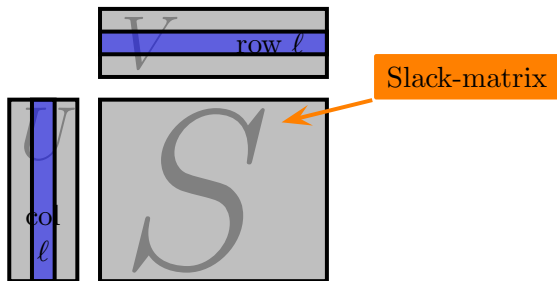


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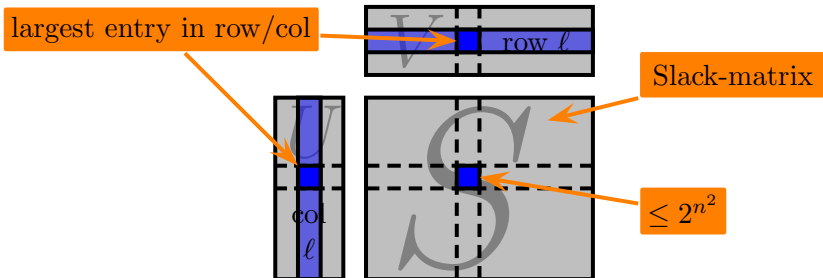


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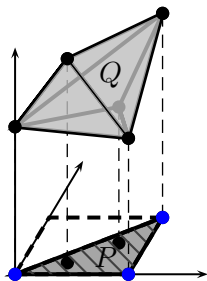
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 - ▶ But $\|S\|_\infty \geq \|U^\ell\|_\infty \cdot \|V_\ell\|_\infty$

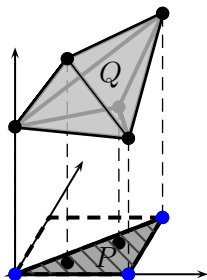


Rounding entries



$$X = \left\{ x \in \{0, 1\}^n \mid \exists \mathbf{0} \leq y \leq \infty : \begin{array}{c} \boxed{A} \cdot x + \boxed{U} \cdot y = \boxed{b} \end{array} \right\}$$

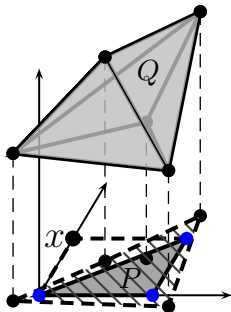
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Rounding entries

- ▶ Consider $x \notin X$.

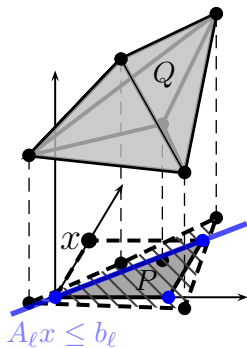


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Rounding entries

- ▶ Consider $x \notin X$.
- ▶ \exists violated constraint: $A_\ell x \geq b_\ell + 1$

▶ $(A_\ell, U_\ell) = \sum_{i \in I} \frac{\det \left(\begin{array}{c} \text{red box} \\ \text{blue box} \\ \text{red box} \end{array} \right)}{\det \left(\begin{array}{c} \text{red box} \\ \text{red box} \\ \text{red box} \end{array} \right)} \cdot (A_i, U_i)$



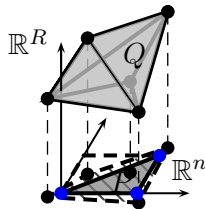
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Conclusion

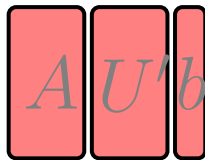
- ▶ Let $R := \max_{X \subseteq \{0,1\}^n} \{\text{xc}(\text{conv}(X))\}$.

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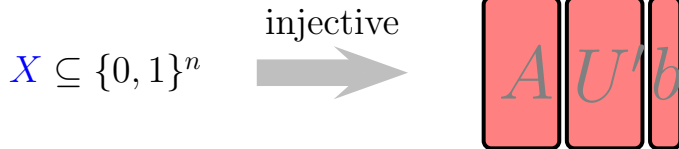
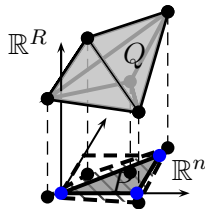


$$X \subseteq \{0, 1\}^n$$



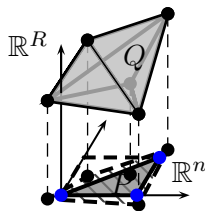
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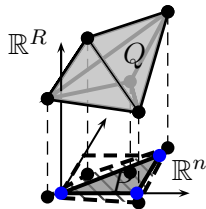


$$X \subseteq \{0, 1\}^n \xrightarrow{\text{injective}} \begin{matrix} \boxed{A} & \boxed{U'} & \boxed{b} \end{matrix}$$

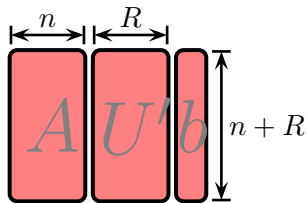
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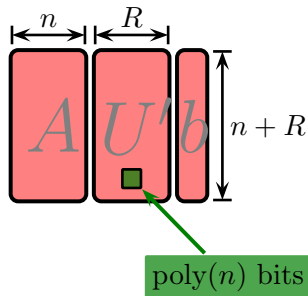
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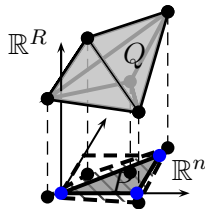
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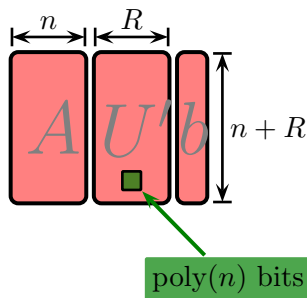
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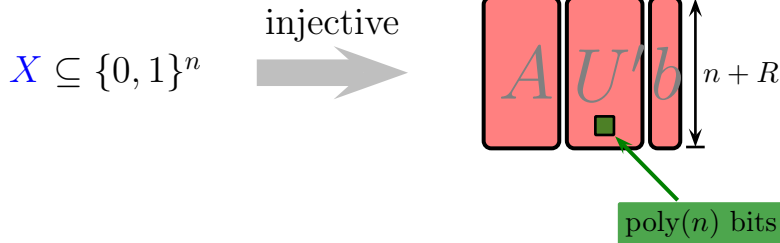
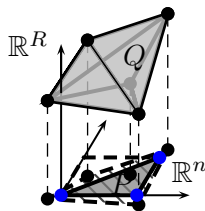
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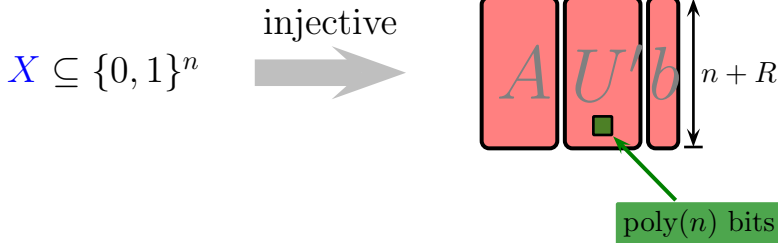
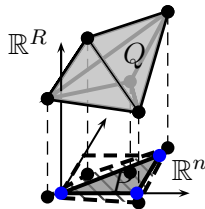


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Consequences for matroids

- ▶ **Fact:** There are $2^{2^n} / \text{poly}(n)$ many matroids on n elements [Duke '03].

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Theorem

For every n there exists a matroid $\mathcal{M} = ([n], \mathcal{I})$ such that

$$\text{xc}(\text{conv}(\chi(\mathcal{I})) \geq 2^{n/2 \cdot (1-o(1))}.$$

Consequences for TSP

Theorem (Folklore)

$\mathbf{NP} \not\subseteq \mathbf{P}_{\text{poly}} \Rightarrow$ no compact formulation for

$$P_{TSP} = \text{conv}\{\chi(C) \mid C \text{ is Hamiltonian in complete graph}\}$$

with polynomially encodable coefficients.

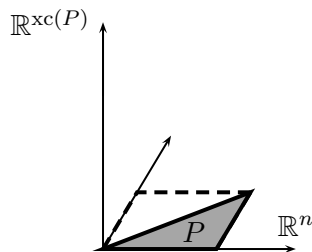
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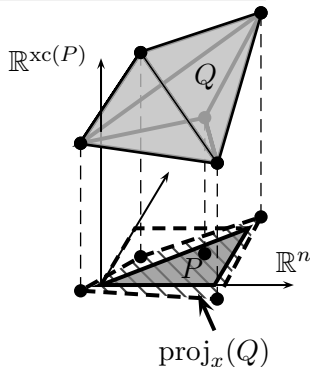
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Given instance $G = (V, E)$ for HAMILTONIAN CYCLE. Optimize

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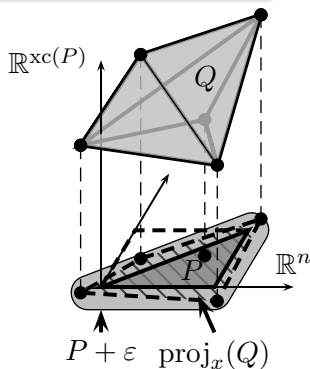
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- ▶ EHC $\Rightarrow OPT \geq n$
- ▶ NO HC $\Rightarrow OPT \leq n - 1 + \varepsilon n \leq n - \frac{1}{2}$



Open problems

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Can one prove a super-polynomial lower bound for any **explicit** 0/1 polytope???

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Thanks for your attention