

Cutting planes from lattice-point-free polyhedra

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Joint work with K. Andersen (Copenhagen), R. Weismantel (Magdeburg)

- **Split cuts**
 - Lattice-point-free polyhedra
 - High-dimensional split cuts and the d -dimensional split closure
 - Some steps to prove that the d -dimensional split closure is a polyhedron
 - Previous work on the 2-dimensional split cuts
 - Conclusion

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The algebra

Based on a disjunction

$$\pi^T x \leq \pi_0 \quad \text{or} \quad \pi^T x \geq \pi_0 + 1$$

is valid for $x \in \mathbb{Z}^n$ when π, π_0 are integer.

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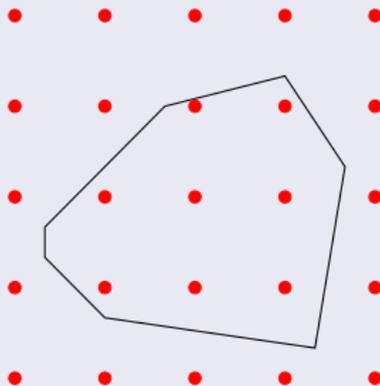
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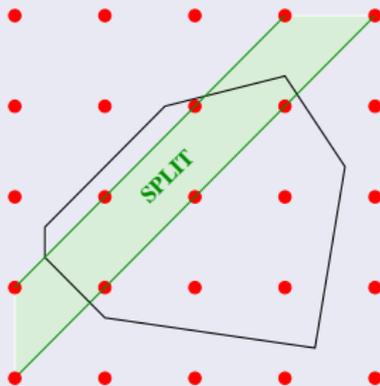
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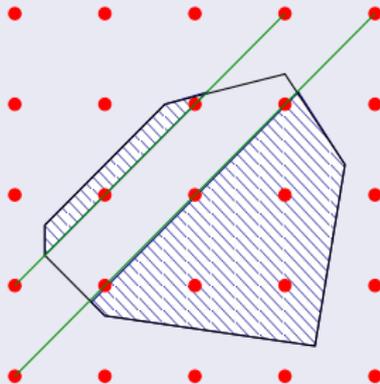
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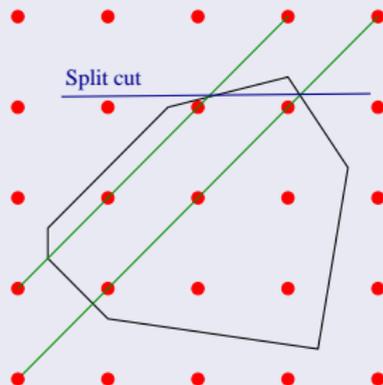
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The split closure

Consider a polyhedron $P \subseteq \mathbb{R}^n$, the intersection of all split cuts of P is called the (first) **split closure** of P , denoted by $SC(P)$.

Some previous results

- Cook, Kannan, Schrijver [1990] The split closure is a **polyhedron**
- Lift-and-project, Chvátal-Gomory cuts are split cuts
- Nemhauser, Wolsey [1988] MIR inequalities are split cuts and **MIR closure and split closure** are equivalent
- Cook, Kannan, Schrijver [1990] The number of rounds of split cuts to apply to obtain the integer hull of a polyhedron might be **infinite**
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Split cuts are **intersection cuts**

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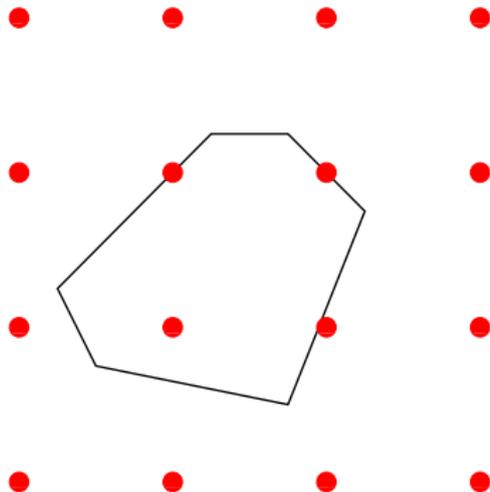
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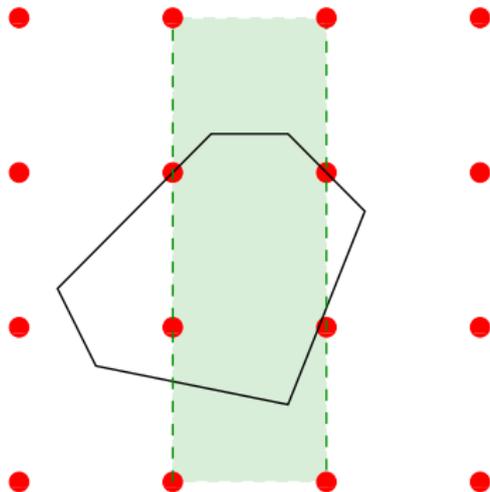
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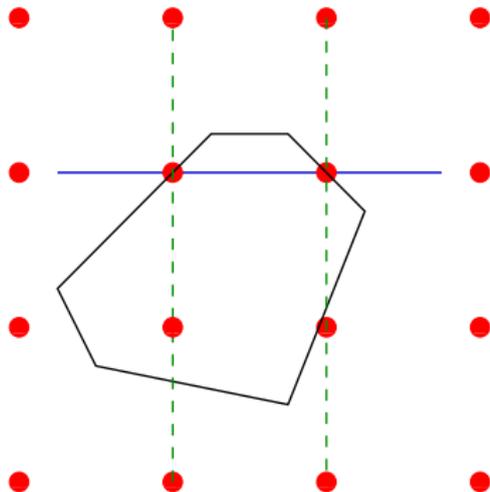
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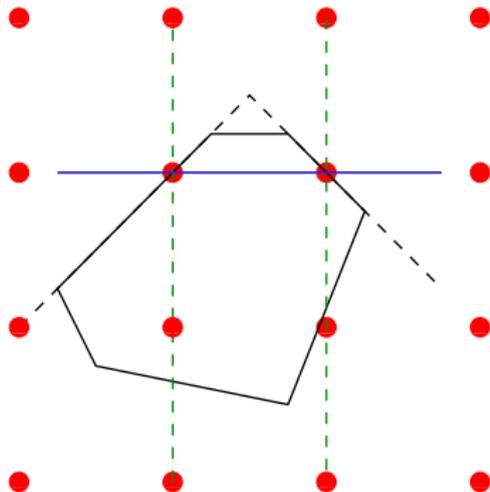
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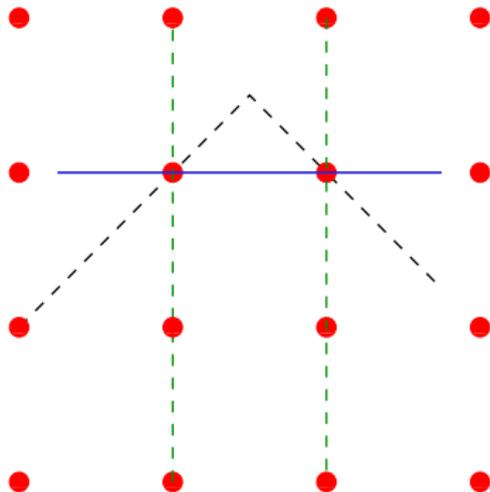
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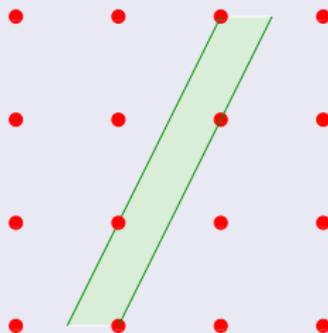


Lattice-point-free polyhedra

A polyhedron P is **lattice-point-free** when there is no integer point **in its interior**.

Lattice-point-free polyhedra

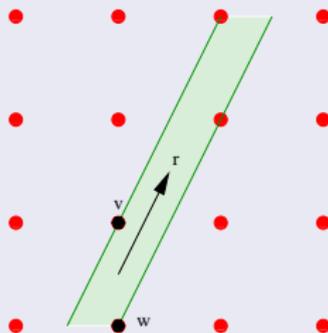
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A basic split set in \mathbb{R}^2 is a lattice-point-free polyhedron

Lattice-point-free polyhedra

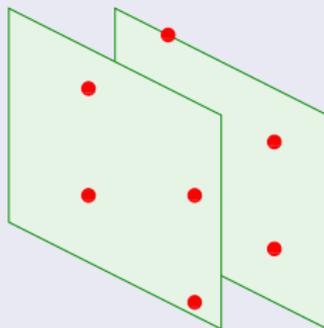
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$$\text{conv}\{v, w\} + \text{span}\{r\}$$

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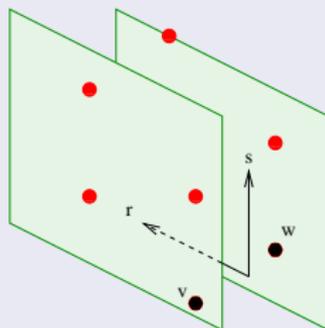
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Lattice-point-free polyhedra

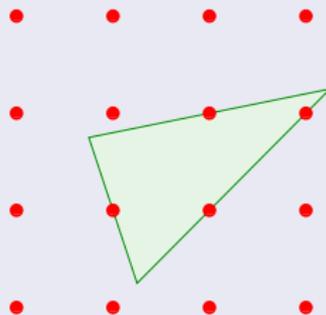
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Lattice-point-free polyhedra

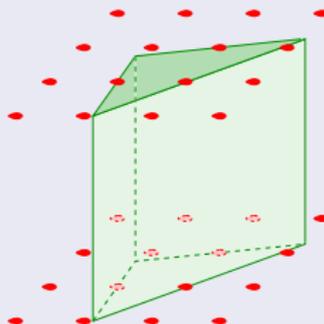
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A triangle in \mathbb{R}^2 can be lattice-point-free

Lattice-point-free polyhedra

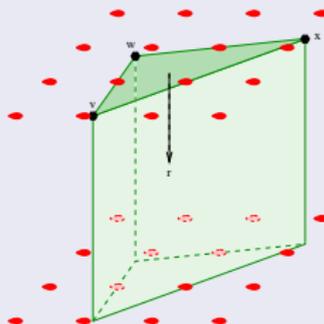
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A triangle in \mathbb{R}^2 can be lattice-point-free
It can be lifted to a lattice-point-free polyhedron in \mathbb{R}^3

Lattice-point-free polyhedra

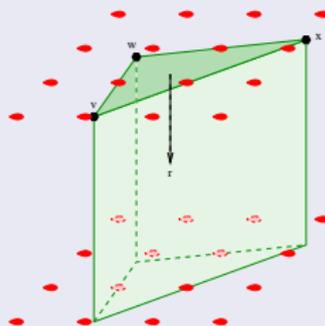
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Definition of the **split dimension**

A lattice-point-free polyhedron $P \subseteq \mathbb{R}^n$ can be written as

$$P = \text{conv}\{v^1, \dots, v^p\} + \text{cone}\{w^1, \dots, w^q\} + \text{span}\{r^1, \dots, r^{n-d}\}.$$

The **split-dimension** of P is d .

The algebra

Let $P \subseteq \mathbb{R}^{n+m}$ be a polyhedron and $L \subseteq \mathbb{R}^n$ be a lattice-point-free polyhedron. We define a set of cuts, valid for $\{(x, y) \in \mathbb{R}^{n+m} \mid x \in P \cap \mathbb{Z}^n\}$ as

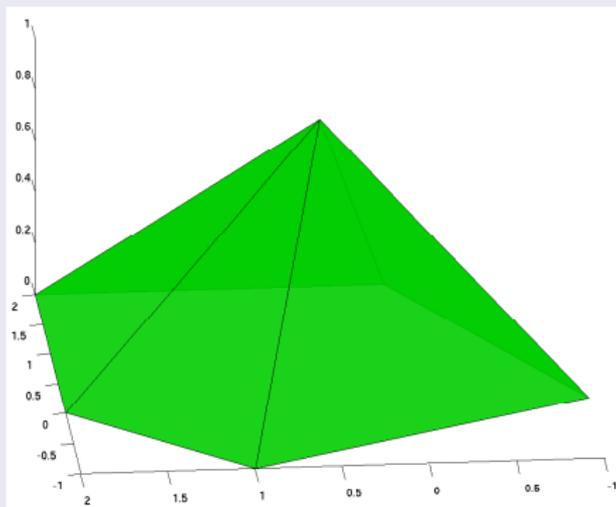
$$\text{cuts}_P(L) = \text{conv}\{(x, y) \in \mathbb{R}^{n+m} \mid (x, y) \in P \text{ and } x \notin \text{int}(L)\}.$$

The geometry

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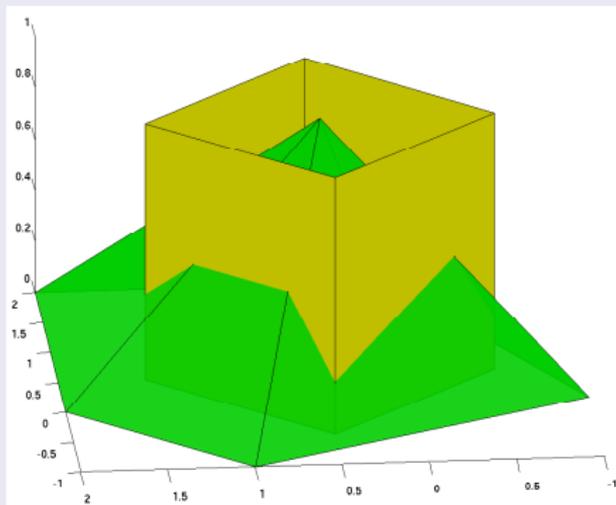
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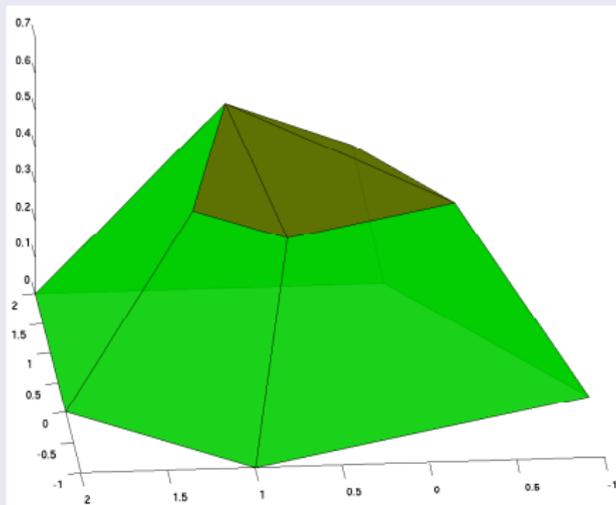
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The geometry



Definition

The d -dimensional split closure of P is the set of points in the intersection of all high-dimensional split cuts obtained from P with a split-dimension less or equal to d .

Steps to prove that the d -dimensional split closure is a polyhedron

- Every d -dimensional split cut can be obtained from a simpler set (but not a basis)
- Some d -dimensional splits generate cuts that are dominating compared to other d -dimensional splits
- Mapping of integer points and edges to dominating splits
- Finiteness on the number of coefficients of a given variable for fixed integer points and edges

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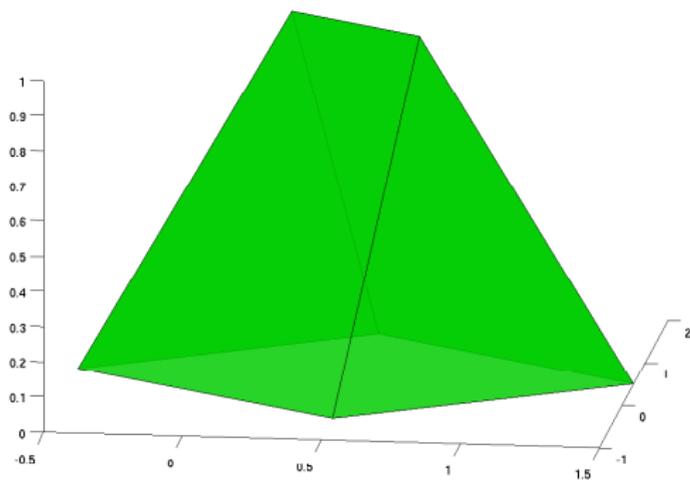
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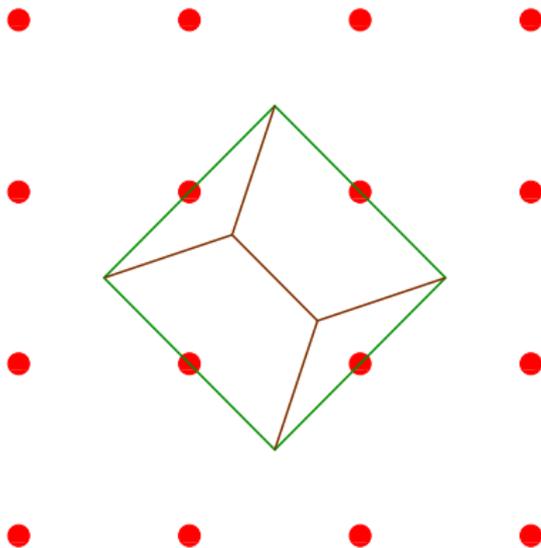
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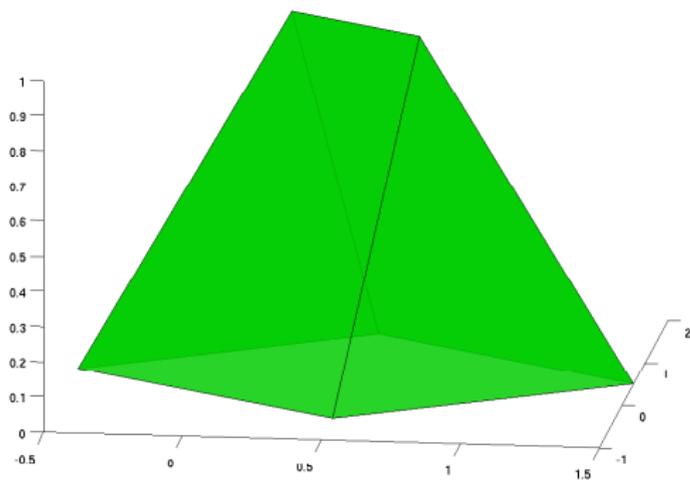
Some d -dimensional split cuts do not come from a basis



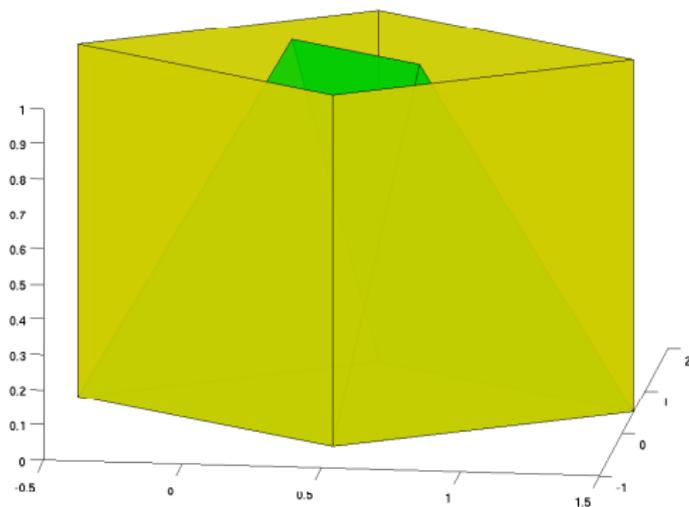
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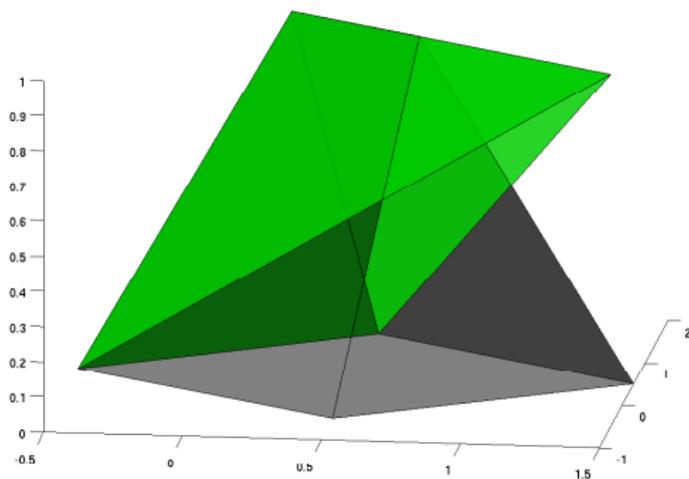


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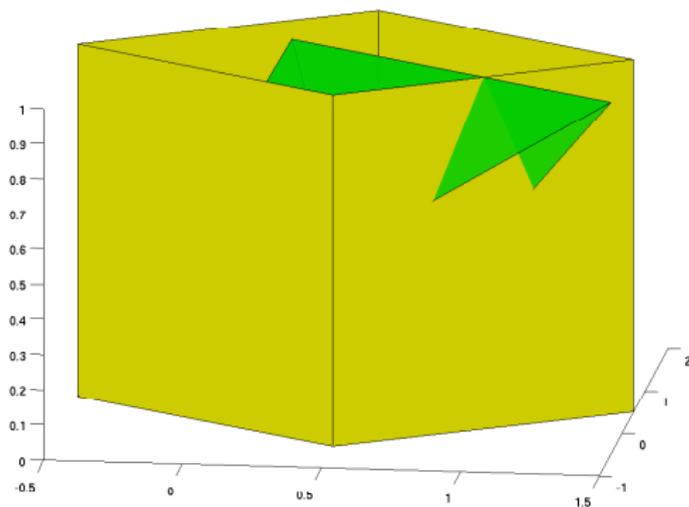
Natural 2-dimensional split cut : $x_3 \leq 0$

Some d -dimensional split cuts do not come from a basis



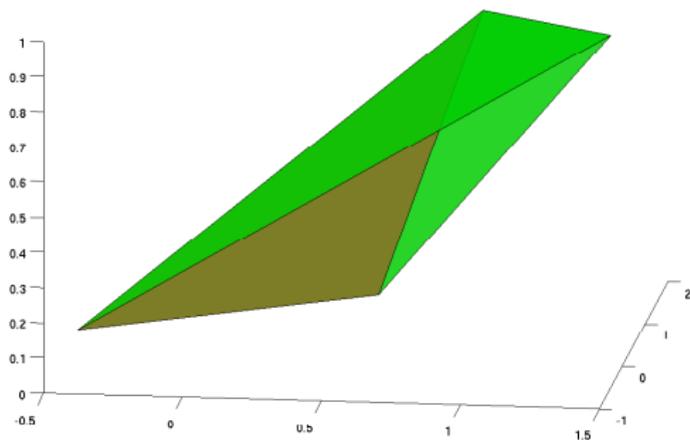
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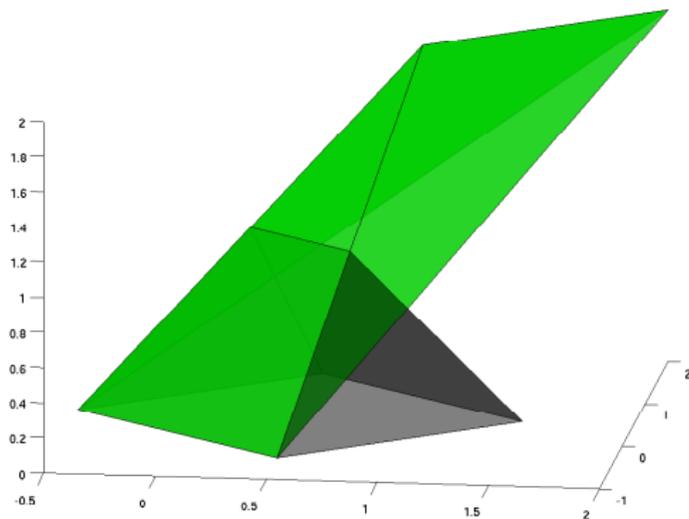
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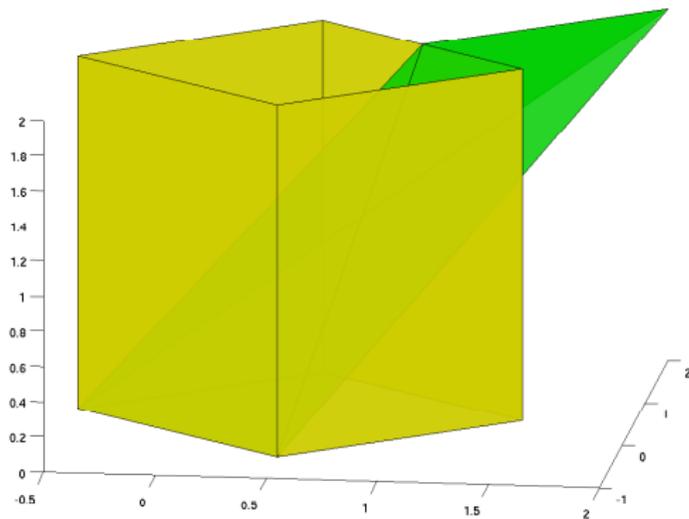
Cut generated : $-x_1 + x_2 + 2x_3 \leq 1$

Some d -dimensional split cuts do not come from a basis



The second basis is infeasible (and there is a symmetric one).

Some d -dimensional split cuts do not come from a basis



The second basis is infeasible (and there is a symmetric one).
No cut generated !