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Linear composition functions (LCF)

A new class of CGF for SOCP-IPs

# Some cut-generating functions for second-order conic sets

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### 1 Introduction and Motivation

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## 1.1 Conic integer programs

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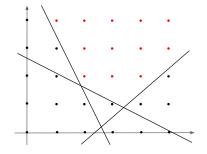
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## Standard integer program

Consider the following integer program:

$$\begin{array}{lll} \min & c^{\top}x & \min & c^{\top}x \\ \text{s.t.} & Ax \ge b & \Leftrightarrow & \text{s.t.} & Ax - b \ge 0 \\ & x \in \mathbb{Z}_{+}^{n} & x \in \mathbb{Z}_{+}^{n} \end{array}$$

where  $A \in \mathbb{R}^{m \times n}$ ,  $b \in \mathbb{R}^m$  and  $c \in \mathbb{R}^n$ .



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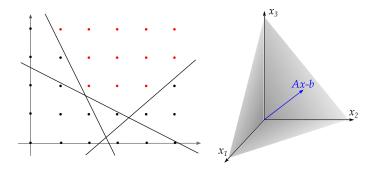
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## Standard conic integer program

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Consider the following conic integer program:

inf 
$$c^{\top}x$$
  
s.t.  $Ax - b \in K$   
 $x \in \mathbb{Z}^{n}_{+},$ 

 $K \subseteq \mathbb{R}^m$  is a *regular cone*: closed, convex, pointed and full dimensional.

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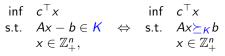
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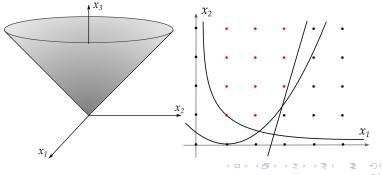
## Conic integer program

Consider the following conic integer program:



 $K \subseteq \mathbb{R}^m$  is a *regular cone*: closed, convex, pointed and full dimensional.

For instance, K is the second-order cone:



## 1.2 Cutting planes: Cut-generating functions

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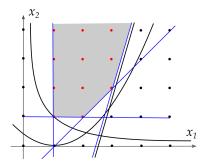
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## Cutting planes approach

Cutting planes are linear inequalities valid for:

$$\operatorname{conv}\{x\in\mathbb{Z}_+^n\,|\,Ax\succeq_{\mathcal{K}} b\},\$$

in order to improve the dual bound over the standard convex relaxation.



How can we generate these cuts in a systematic fashion?

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## Cuts via cut-generating functions

### Cut-generating functions

Let *m* be the number of rows of the *A* matrix. Consider  $f : \mathbb{R}^m \to \mathbb{R}$  such that

- 1.  $f(u) + f(v) \ge f(u + v)$  for all  $u, v \in \mathbb{R}^m$  (subadditive);
- 2.  $u \succeq_{\kappa} v \Rightarrow f(u) \ge f(v)$  (non-decreasing w.r.t. K);
- 3. f(0) = 0.

Denote the set of functions satisfying (1.), (2.), (3.) as  $\mathcal{F}_{\mathcal{K}}$ .

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## Cuts via cut-generating functions

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is given by

$$\sum_{j=1}^{n} f(\mathcal{A}^{j}) x_{j} \ge f(b).$$
Proof:  $\hat{x}$  is feasible  $\Longrightarrow \sum_{j=1}^{n} f(\mathcal{A}^{j}) \hat{x}_{j} \ge f(\mathcal{A}^{j}) f_{j} = \int_{-1}^{n} f(\mathcal{A}^{j}) \hat{x}_{j} = \int_{-1}^{n} f(\mathcal{A}$ 

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## How good are cut-generating functions?

#### Question:

$$\overline{\operatorname{conv}}\left\{x \in \mathbb{Z}_{+}^{n} \mid Ax \succeq_{\mathcal{K}} b\right\} \stackrel{?}{=} \bigcap_{f \in \mathcal{F}_{\mathcal{K}}} \left\{x \in \mathbb{R}_{+}^{n} \mid f(A^{j})x_{j} \geq f(b)\right\}$$
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### Table: Strong Duality

K	Conditions	
$\mathbb{R}^m_+$ (standard IP)	A is rational data matrix	Johnson (1973, 1979), Jeroslow (1978, 1979)

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# How good are cut-generating functions?

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$$\overline{\operatorname{conv}}\left\{x \in \mathbb{Z}_{+}^{n} \mid Ax \succeq_{\mathcal{K}} b\right\} \stackrel{?}{=} \bigcap_{f \in \mathcal{F}_{\mathcal{K}}} \left\{x \in \mathbb{R}_{+}^{n} \mid f(A^{j})x_{j} \geq f(b)\right\}$$
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### Table: Strong Duality

K	Conditions	
$\mathbb{R}^m_+$ (standard IP)	A is rational data matrix	Johnson (1973, 1979), Jeroslow (1978, 1979)
K is arbitrary regular cone	<b>'Discrete Slater'</b> condition: $\exists \hat{x} \in \mathbb{Z}_{+}^{n}$ s.t. $A\hat{x} - b \in int(K)$	Morán, D., Vielma (2012)

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**1** We only need a subset  $C^m \subseteq \mathcal{F}_{\mathbb{R}^m_+}$  (Blair, Jeroslow (1982)):

$$\operatorname{conv}\left\{x \in \mathbb{Z}_{+}^{n} \mid Ax \succeq_{\mathbb{R}_{+}^{m}} b\right\} = \bigcap_{f \in \mathcal{F}_{+}^{m}} \{x \in \mathbb{R}_{+}^{n} \mid f(A^{j})x_{j} \geq f(b)\},$$

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where  $C^m$  is a set of functions:

- C<sup>m</sup> contains (non-decreasing) linear functions.
- $f,g \in C^m$ , then  $\alpha f + \beta g \in C^m$ , where  $\alpha, \beta \ge 0$ .
- $f \in CG^m$ , then  $\lceil f \rceil \in C^M$ .

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- $f \in CG^m$ , then  $\lceil f \rceil \in C^{\overline{M}}$ .

### 2 The simplest function in this family are the famous Chvátal-Gomory cuts:

$$f_{\lambda}(u) = \lceil \lambda u \rceil,$$

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where  $\lambda \in \mathbb{R}^m_+$ .

Question: Can we identify structured sub-family of CGFs that already provide the integer hull for more general K?

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2 Linear composition functions (LCF)

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2.1 Linear composition functions (LCF): Definition

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# Linear composition functions (LCF)

(Dual cone 
$$K^* := \{y \mid \langle x, y \rangle \ge 0 \forall x \in K\}.$$
)

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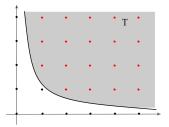
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# Linear composition functions (LCF)

For  $w^1, w^2, \cdots, w^p \in K^*$  define  $f : \mathbb{R}^m \to \mathbb{R}$  as

 $f(\mathbf{v}) = g((w^1)^\top \mathbf{v}, (w^2)^\top \mathbf{v}, \dots, (w^p)^\top \mathbf{v}),$ 

where  $g \in \mathcal{F}_{\mathbb{R}^{p}_{+}}$ . Then,  $f \subseteq \mathcal{F}_{K}$ .



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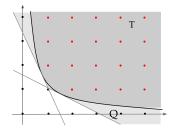
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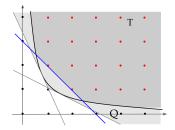
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## 2.2 Linear composition functions and bounded cut-off region

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# Which cuts can we obtain using LCFs

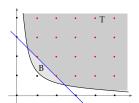
### Theorem

Suppose  $T = \{x \in \mathbb{R}^n \mid Ax \succeq_K b\}$  has non-empty interior. Let  $\pi^\top x \ge \pi_0$  be a valid inequality for the integer hull of T. Assume  $B := \{x \in T \mid \pi^\top x \le \pi_0\}$  is **bounded**. Then, there exist  $w^1, w^2, \ldots, w^p \in K^*$ , such that

**1**  $\pi^{\top} x \ge \pi_0$  is a valid inequality for the integer hull of  $Q = \{x \in \mathbb{R}^n \mid (w^i)^{\top} Ax \ge (w^i)^{\top} b, i \in [p]\}, with$ 

**2**  $(w^i)^{\top}A$  rational and

**3**  $p \le 2^n$ .



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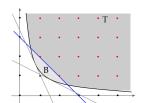
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### **Proof Sketch**

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A new class o CGF for SOCP-IPs 1 Because B is bounded, it is possible to find dual multipliers  $w^1, \ldots, w^q$  such that

$$G := \underbrace{\left\{ x \mid (w^{i})^{\top} A x \ge (w^{i})^{\top} b \right\}}_{\text{Outer approx of T}} \cap \underbrace{\left\{ x \mid \pi^{\top} x \le \pi_{0} \right\}}_{\text{Cut-off region}} \text{ is bounded.}$$

- If int(G) ∩ Z<sup>n</sup> ≠ Ø, add additional finite separating hyperplanes and update G.
- Standard parity argument to say that we need only 2<sup>n</sup> these inequalities to obtain Q.

### Lemma

Let C be a closed convex set. If int  $((\text{rec.cone}(C))^*) \neq \emptyset$  and  $z \notin C$ , then there exists  $\pi \in \mathbb{Q}^n$  such that

$$\pi^{\top} z < \pi_0 \leq \pi^{\top} x \ \forall x \in C.$$

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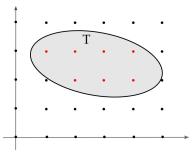
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# Linear composition functions are sufficient for compact sets

In particular, if T is compact and has non-empty interior, then linear composition functions describe the integer hull of T, using no more than  $2^n$  dual multipliers at a time.



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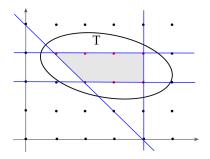
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2.2 Linear composition functions are not enough

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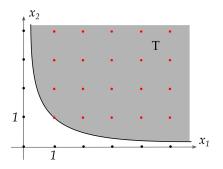
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## Epigraph of a standard hyperbola

$$T = \{(x_1, x_2) \in \mathbb{R}^2_+ : x_1 x_2 \ge 1\}.$$



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This set is conic representable.

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### Second-order cone

 $x_2$ 

$$\mathcal{L}^m := \left\{ x \in \mathbb{R}^m \mid \sqrt{x_1^2 + x_2^2 + \dots + x_{m-1}^2} \le x_m \right\}$$

If 
$$K = \mathcal{L}^3$$
, then

$$T = \{ (x_1, x_2) \in \mathbb{R}^2_+ : x_1 x_2 \ge 1 \} = \{ x \in \mathbb{Z}^2_+ : Ax \succeq_K b \},\$$

 $x_1$ 

where

$$A = \begin{bmatrix} 0 & 0 \\ 1 & -1 \\ 1 & 1 \end{bmatrix}, \quad b = \begin{bmatrix} -2 \\ 0 \\ 0 & 0 \end{bmatrix}.$$

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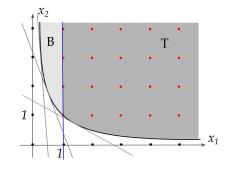
Definition LCF and bounded cut-of region

LCFs are not sufficient

A new class of CGF for SOCP-IPs

# Epigraph of a standard hyperbola (cont.)

Clearly,  $x_1 \ge 1$  is valid inequality for the integer hull of T.



However, every linear outer approximation for T contains integer points of the form (0, k). Thus, linear composition functions will never produce the cut  $x_1 \ge 1!$  3 A new class of cuts

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3.1 A new class of cuts: Description

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## The new CGF

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Description of function  $f_{\gamma}$  in  $\mathbb{R}^2$ 

Theorem Consider the function  $f_{\gamma} : \mathbb{R}^m \to \mathbb{R}$  defined as:

$$f_{\gamma}(v) = \begin{cases} \gamma^{\top}v + 1 & \text{if } v_{j} \neq 0 \text{ and } \gamma^{\top}v \in \mathbb{Z}, \\ \lceil \gamma^{\top}v \rceil & \text{otherwise}, \end{cases}$$

where  $\gamma \in \Gamma_j \cup \text{interior} (\mathcal{L}^m)$  with  $j \in \{1, 2, \cdots, m-1\}$  and

$$\Gamma_j := \{ \gamma \in \mathbb{R}^m \mid \gamma_m \ge \sum_{i=1}^{m-1} |\gamma_i|, \ \gamma_m > |\gamma_j| \}.$$

Then,  $f_{\gamma} \in \mathcal{F}_{\mathcal{L}^m}$ .

# The new CGF

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Some cut-generating

functions for second-order conic sets

Description of function  $f_{\gamma}$  in  $\mathbb{R}^2$ 

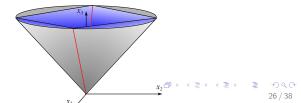
## Theorem Consider the function $f_{\gamma} : \mathbb{R}^m \to \mathbb{R}$ defined as:

 $f_{\gamma}(\mathbf{v}) = \begin{cases} \gamma^{\top}\mathbf{v} + \mathbf{1} & \text{if } \mathbf{v}_{j} \neq 0 \text{ and } \gamma^{\top}\mathbf{v} \in \mathbb{Z}, \\ [\gamma^{\top}\mathbf{v}] & \text{otherwise.} \end{cases}$ 

where  $\gamma \in \Gamma_i \cup \text{interior} (\mathcal{L}^m)$  with  $j \in \{1, 2, \cdots, m-1\}$  and

$$\Gamma_j := \{ \gamma \in \mathbb{R}^m \mid \gamma_m \ge \sum_{i=1}^{m-1} |\gamma_i|, \ \gamma_m > |\gamma_j| \}.$$

Then,  $f_{\gamma} \in \mathcal{F}_{\mathcal{L}^m}$ .



## Example

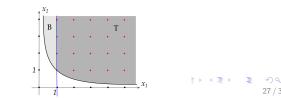
Consider again the hyperbola  $T = \{x \in \mathbb{Z}^2_+ : Ax \succeq_{\mathcal{K}} b\}$ , where

$$A = \begin{bmatrix} 0 & 0 \\ 1 & -1 \\ 1 & 1 \end{bmatrix}, \quad b = \begin{bmatrix} -2 \\ 0 \\ 0 \end{bmatrix}$$

Choose j = 1 and  $\gamma = (0, 0.5, 0.5)$ . Then,

 $f_{\gamma}(v) = egin{cases} 0.5v_2+0.5v_3+1 & ext{ if } v_1 
eq 0 ext{ and } 0.5v_2+0.5v_3 \in \mathbb{Z}, \ \left\lceil 0.5v_2+0.5v_3 
ight
ceil & ext{ otherwise.} \end{cases}$ 

Thus,  $f_{\gamma}(A^1) = 1$ ,  $f_{\gamma}(A^2) = 0$ ,  $f_{\gamma}(b) = 1$ , which yields  $f_{\gamma}(A^1)x_1 + f_{\gamma}(A^2)x_2 \ge f_{\gamma}(b) \iff x_1 \ge 1.$ 



Some cut-generating functions for second-order conic sets

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## Subadditivity

# Proposition For all $j \in \{1, 2, \dots, m-1\}$ and $\gamma \in \Gamma_j \cup interior(\mathcal{L}^m)$ ,

$$f_{\gamma}(\mathbf{v}) = \begin{cases} \gamma^{\top}\mathbf{v} + 1 & \text{if } \mathbf{v}_{j} \neq 0 \text{ and } \gamma^{\top}\mathbf{v} \in \mathbb{Z}, \\ \lceil \gamma^{\top}\mathbf{v} \rceil & \text{otherwise}, \end{cases}$$

is subbaditive, i.e.,  $u, v \in \mathbb{R}^m \Rightarrow f_{\gamma}(u+v) \leq f_{\gamma}(u) + f_{\gamma}(v)$ . **Proof:** If u or v fits the first clause, then we have

$$f_\gamma(u\!+\!v) \leq \Big[\gamma^ op(u+v)\Big]\!+\!1 \leq \Big[\gamma^ op u\Big]\!+\!\Big[\gamma^ op v\Big]\!+\!1 \leq f_\gamma(u)\!+\!f_\gamma(v).$$

Suppose *u* and *v* do not satisfy the first clause. Two cases: **1.** u + v does not fit in the first clause: it follows from subadditivity of  $\lceil \cdot \rceil$ ;

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# Subadditivity (cont)

(b)

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**2.** u + v satisfies the first clause:

$$u_j + v_j \neq 0, \quad \gamma^\top (u + v) = \gamma^\top u + \gamma^\top v \in \mathbb{Z}.$$
 (a)

Then,  $u_j \neq 0$  or  $v_j \neq 0$ . WLOG assume  $u_j \neq 0$ . Hence  $\gamma^{\top} u \notin \mathbb{Z}$ ,

since *u* doesn't fit in the first clause. It follows from (a) and (b)  $\gamma^{\top} v \notin \mathbb{Z}.$  (c)

Combining (a), (b) and (c) we conclude  $f_{\gamma}(u) + f_{\gamma}(v) = \left[\gamma^{\top}u\right] + \left[\gamma^{\top}v\right] = \gamma^{\top}u + \gamma^{\top}v + 1 = f_{\gamma}(u+v).$ 

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Description of function  $f_{\gamma}$  in  $\mathbb{R}^2$ 

## Non-decreasing w.r.t. $\mathcal{L}^m$

## Proposition

For all  $j \in \{1, 2, \cdots, m-1\}$  and  $\gamma \in \Gamma_j \cup \text{interior} (\mathcal{L}^m)$ ,

$$f_{\gamma}(v) = egin{cases} \gamma^{ op} v + 1 & \textit{if } v_{j} 
eq 0 \textit{ and } \gamma^{ op} v \in \mathbb{Z}, \ \left\lceil \gamma^{ op} v 
ight
ceil & \textit{otherwise}, \end{cases}$$

is non-decreasing w.r.t.  $\mathcal{L}^m$ , i.e.,  $u \succeq_{\mathcal{L}^m} v \Rightarrow f_{\gamma}(v) \leq f_{\gamma}(u)$ .

**Proof:** Let  $w \in \mathcal{L}^m$  and  $j \in [m-1]$ . If  $\gamma \in \mathcal{L}^m$ , then  $\gamma^\top w \ge 0$ . If, in addition,  $\gamma \in \Gamma_j \cup$  interior  $(\mathcal{L}^m)$  and  $w_j \ne 0$ , then one can prove that  $\gamma^\top w > 0$ . Suppose  $u \succeq_{\mathcal{L}^m} v$ . For w := u - v we find

$$\gamma^{\top} u \ge \gamma^{\top} v, \qquad (\star)$$

which holds strictly whenever  $u_j - v_j \neq 0$ . Two cases:

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Description of function  $f_{\gamma}$  in  $\mathbb{R}^2$ 

Non-decreasing w.r.t.  $\mathcal{L}^m$  (cont) **1.** u fits in the first clause: using (\*) we obtain  $f_{\gamma}(v) \leq \gamma^{\top} v + 1 \leq \gamma^{\top} u + 1 = f_{\gamma}(u).$ 

2. *u* does not fit in the first clause: (i) *v* does not fit in the first clause: using (\*) we obtain  $f_{\gamma}(v) = \lceil \gamma^{\top} v \rceil \leq \lceil \gamma^{\top} u \rceil = f_{\gamma}(u).$ 

(ii) v fits in the first clause: so  $v_j \neq 0$  and  $\gamma^{\top} v \in \mathbb{Z}$ .

- If  $u_j = 0$ , then  $u_j - v_j \neq 0$  and hence (\*) holds strictly. Thus,

$$f_{\gamma}(\mathbf{v}) = \gamma^{ op} \mathbf{v} + 1 \leq \lceil \gamma^{ op} u 
ceil = f_{\gamma}(u).$$

- If  $u_j \neq 0$ , then  $\gamma^{\top} u \notin \mathbb{Z}$  (since *u* does not satisfy the first clause), and using (\*) we obtain

 $\gamma^{\top} \mathbf{v} \leq \gamma^{\top} \mathbf{u} < \lceil \gamma^{\top} \mathbf{u} \rceil \Rightarrow f_{\gamma}(\mathbf{v}) = \gamma^{\top} \mathbf{v} + 1 \leq \lceil \gamma^{\top} \mathbf{u} \rceil = f_{\gamma}(\mathbf{u}).$ 

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Description of function  $f_{\gamma}$  in  $\mathbb{R}^2$ 

 $f_\gamma$  does not belong to  $\mathcal{F}_{\mathcal{R}^m_+}$ 

Note that  $f_{\gamma}$  is not necessarily non-decreasing with respect to  $\mathbb{R}^3_+$ .

Indeed, let j = 1 and  $\gamma = (0, \rho, \rho)$  where  $\rho$  is a positive scalar. Then

$$f_{\gamma}(v_1, v_2, v_3) = \begin{cases} \rho(v_2 + v_3) + 1 & \text{ if } v_1 \neq 0 \text{ and } \rho(v_2 + v_3) \in \mathbb{Z}, \\ \lceil \rho(v_2 + v_3) \rceil & \text{ otherwise.} \end{cases}$$

Consider the vectors  $u = (0, 0, 1/\rho)$  and  $v = (-1, 0, 1/\rho)$ . Then  $u \ge_{\mathbb{R}^3_+} v$ , however

$$f_{\gamma}(u)=1<2=f_{\gamma}(v).$$

# 3. $f_{\gamma}$ in $\mathbb{R}^2$

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Linear composition functions (LCF)

A new class of CGF for SOCP-IPs Description of function

 $f \sim \text{ in } \mathbb{R}^2$ 

$$W = \bigcap_{i=1}^{m} W^{i},$$

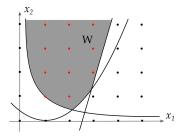
Conic sections in  $\mathbb{R}^2$ 

#### where

Consider

$$W^{i} = \{ x \in \mathbb{R}^{2} \mid A^{i}x \succeq_{\mathcal{L}^{m_{i}}} b^{i} \},\$$

where  $A^i \in \mathbb{R}^{m_i \times 2}$ ,  $b^i \in \mathbb{R}^{m_i}$  and  $\mathcal{L}^{m_i}$  is the second-order cone in  $\mathbb{R}^{m_i}$ . ( $W^i$  is a parabola, ellipse, branch of hyperbola, half-space)



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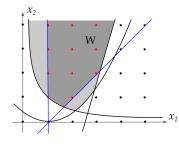
Description function  $f\gamma$  in  $\mathbb{R}^2$ 

## Theorem

Assume interior  $W \neq \emptyset$  and each constraint  $A^i x \succeq_{\mathcal{L}^{m_i}} b^i$  in the description of W is either a half-space or a single conic section. Then the following statements hold:

(i) If W ∩ Z<sup>2</sup> = Ø, then this fact can be certified with the application of at most two inequalities generated from linear composition functions or some f<sub>γ</sub>;

(ii) Assume interior(W)  $\cap \mathbb{Z}^2 \neq \emptyset$ . Every face  $\pi^\top x \ge \pi_0$  of the integer hull of W, where  $\pi \in \mathbb{Z}^2$  is non-zero, can be obtained with exactly one composition function or one  $f_{\gamma}$ .



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# Conclusions

Some cut-generating functions for second-order conic sets

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Description of function  $f_{\gamma}$  in  $\mathbb{R}^2$ 

- Given a conic set with non-empty interior and a valid inequality for its integer hull, if the set cut-off is bounded, then the valid inequality can be obtained via composition functions;
- If the conic set is compact, then its integer hull can be described by composition functions;
- For sets that are second-order conic representable, we introduced a new interesting family of cut-generating functions, f<sub>γ</sub>;
- In R<sup>2</sup>, the family f<sub>γ</sub> combined with linear composition functions are enough to describe the integer hull of the underlying conic set, under minor assumptions.

## Research questions

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 $f \sim \text{ in } \mathbb{R}^2$ 

**1** Is the closure wrt  $f_{\gamma}$  locally polyhedral?

**2** Is the rank wrt  $f_{\gamma}$  finite?

**3** Is there any sort of natural generalization of  $f_{\gamma}$  to other cones?

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## Thank you!