

A Verification Based Method to Generate Cutting Planes for IPs

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Outline

Cutting Plane Operators

Generating Cutting Plane Differently: Design and Verify

Verification Closure and Basic Properties

Ranks using Verification Cuts

Upper Bound on Ranks using Verification Cuts

Lower Bound on Ranks using Verification Cuts

1 Cutting Plane Operators

A basic question in integer programming

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2. Typically we are happy to obtain **relaxation** of the convex hull of $P \cap \mathbb{Z}^n$, i.e., $T \subseteq \mathbb{R}^n$ s.t.

$$P \supseteq T \supseteq P_I. \tag{1}$$

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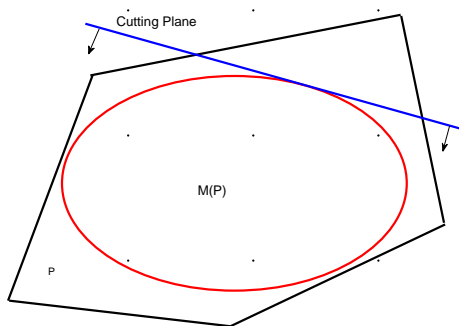
$$P \supseteq T \supseteq P_I. \quad (1)$$

3. Let M be an **cutting plane operator** applied to P to obtain a (closed) convex relaxation of $(P \cap \mathbb{Z}^n)$, i.e.

$$P \supseteq M(P) \supseteq P_I. \quad (2)$$

Cutting planes: the way we use these operators

- ▶ If $\langle a, x \rangle \leq b$ is a valid inequality for $M(P)$, then it is a valid inequality for $(P \cap \mathbb{Z}^n)$.



Examples of some well-known cutting-plane operators

- ▶ In this presentation, " $P \subseteq \mathbb{R}^n$ " is always a rational polytope.
- ▶ Some operators for general integer programs:
 1. Gomory-Chvátal closure (GC)
 2. Split disjunctive closure (SC)
- ▶ Some operators for 0 – 1 integer programs, i.e, $P \subseteq [0, 1]^n$ (Lovász-Schrijver operators):
 1. Lift-and-project operator (N_0)
 2. N
 3. N_+

Admissible cutting-plane procedures for 0-1 polytopes

All known '*reasonable*' cutting plane operators satisfy the following properties:

Definition

A cutting-plane procedure M defined for a rational polytope

$P := \{x \in [0, 1]^n \mid Ax \leq b\}$ is *admissible* if the following holds:

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6. COMMUTING WITH COORDINATE FLIPS AND DUPLICATIONS: $\tau_i(M(P)) = M(\tau_i(P))$, where τ_i is either one of the following two operations: (i) Coordinate flip: $\tau_i : [0, 1]^n \rightarrow [0, 1]^n$ with $(\tau_i(x))_i = (1 - x_i)$ and $(\tau_i(x))_j = x_j$ for $j \in [n] \setminus \{i\}$; (ii) Coordinate Duplication: $\tau_i : [0, 1]^n \rightarrow [0, 1]^{n+1}$ with $(\tau_i(x))_{n+1} = x_i$ and $(\tau_i(x))_j = x_j$ for $j \in [n]$.

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7. SHORT VERIFICATION: There exists a polynomial p such that for any inequality $\langle c, x \rangle \leq d$ that is valid for $M(P)$ there is a set $I \subseteq [m]$ with $|I| \leq p(n)$ such that $\langle c, x \rangle \leq d$ is valid for $M(\{x \in \mathbb{R}^n \mid \langle a_i, x \rangle \leq b_i, i \in I\})$.

Definition is modified from [Pokutta and Schulz (2009)]

Admissible cutting-plane procedures for general polytopes

Definition

If M is defined for general rational polytopes $P \subseteq \mathbb{R}^n$, then we say M is admissible if

- ▶ M satisfies (1.)-(7.) when restricted to polytopes contained in $[0, 1]^n$ and
- ▶ for general polytopes $P \subseteq \mathbb{R}^n$, M satisfies VALIDITY, INCLUSION PRESERVATION, SHORT VERIFICATION and HOMOGENEITY is replaced by
 8. STRONG HOMOGENEITY: If $P \subseteq F^{\leq} := \{x \in \mathbb{R}^n \mid \langle a, x \rangle \leq b\}$ and $F = \{x \in \mathbb{R}^n \mid \langle a, x \rangle = b\}$ where $(a, b) \in \mathbb{Z}^n \times \mathbb{Z}$, then $M(F \cap P) = M(P) \cap F$.

Definition

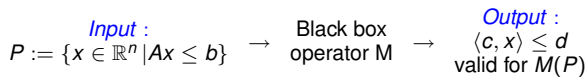
If M satisfies all required properties for being admissible except SHORT VERIFICATION, then we say M is *almost admissible*.

Definition is modified from [Pokutta and Schulz (2009)]

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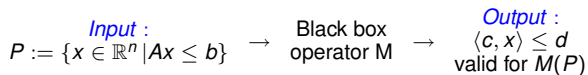
Generating Cutting Plane Differently: Design and Verify

The Computation Scheme



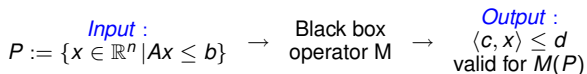
Computation vs. Verification Scheme

Computation Scheme

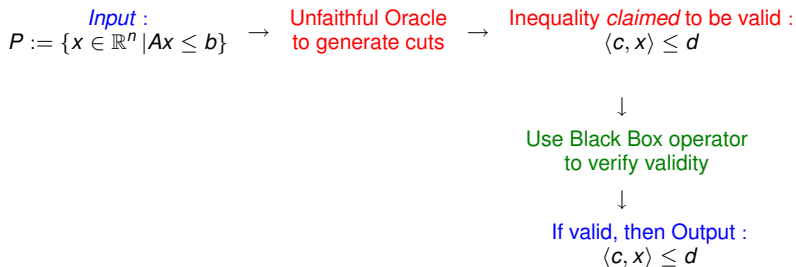


Computation vs. Verification Scheme

Computation Scheme



Verification Scheme



A similar idea discussed in [Cook, Coullard, Turán \(1987\)](#).

How to verify validity of cut using black box operator

Assuming $c \in \mathbb{Z}^n$, $d \in \mathbb{Z}$:

$\langle c, x \rangle \leq d$ is valid for P_I

\Leftrightarrow

$$(P \cap \{x \in \mathbb{R}^n \mid \langle c, x \rangle \geq d + 1\})_I = \emptyset$$

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$$M(P \cap \{x \in \mathbb{R}^n \mid \langle c, x \rangle \geq d + 1\}) = \emptyset$$

So if $M(P \cap \{x \in \mathbb{R}^n \mid \langle c, x \rangle \geq d + 1\}) = \emptyset$, then we declare $\langle c, x \rangle \leq d$ is a valid inequality.

Question:

How much do we gain (*if at all?*) from having to *only verify that a given inequality is valid* for P_1 , *rather than actually computing it*.

Why is verification scheme interesting

Sufficient condition for $\langle c, x \rangle \leq d$ to be valid for P_j :

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(verification)

Why is verification scheme interesting

Sufficient condition for $\langle c, x \rangle \leq d$ to be valid for P :

(i) $M(P) \cap \{x \mid \langle c, x \rangle \geq d + 1\} = \emptyset$ (computation)

(ii) $M(P \cap \{x \mid \langle c, x \rangle \geq d + 1\}) = \emptyset$ (verification)

The strength of the verification scheme lies in the following inclusion that is satisfied by every "reasonable" cutting plane operator.

$$M(P \cap \{x \in \mathbb{R}^n \mid \langle c, x \rangle \geq d + 1\}) \subseteq M(P) \cap \{x \in \mathbb{R}^n \mid \langle c, x \rangle \geq d + 1\}.$$

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This inclusion can be strict!

1. That is, suppose there exists $(c^0, d^0) \in \mathbb{Z}^{n+1}$ such that

$$M(P \cap \{x \mid \langle c^0, x \rangle \geq d^0 + 1\}) = \emptyset \quad \text{and} \quad (3)$$

$$M(P) \cap \{x \mid \langle c^0, x \rangle \geq d^0 + 1\} \neq \emptyset \quad (4)$$

2. Then $\langle c^0, x \rangle \leq d^0$ is verifiable but not computable.
-

3

Verification Closure and Basic Properties

Verification Closure: Definition and Basic Property

Verification Closure

Definition

Let M be admissible. Then

$$\partial M(P) := \bigcap_{(c,d) \in \mathbb{Z}^{n+1}} \{ \langle c, x \rangle \leq d \mid M(P \cap \{ \langle c, x \rangle \geq d + 1 \}) = \emptyset \} \quad (5)$$

is the *verification scheme closure* of M .

We add all inequalities whose validity can be verified with application of M .

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Theorem

If M is admissible, then ∂M is almost admissible.

Comparing closures

Properties of general admissible M

Theorem

1. $\partial M(P) \subseteq M(P)$ for all rational polytopes P . There exists a rational polytope Q , such that $\partial M(Q) \subsetneq M(Q)$.
2. $\partial M(P) \subseteq GC(P) \cap N_0(P)$ for all rational polytopes P . There exists a rational polytope Q , such that $\partial M(Q) \subsetneq GC(Q) \cap N_0(Q)$.

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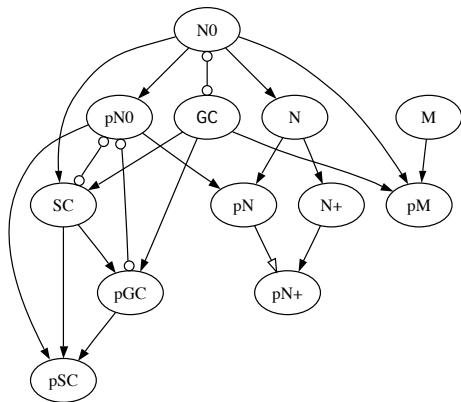
Comparing specific closures

Theorem

Let L and M be admissible cutting plane operators such that $L(P) \subseteq M(P)$ for all rational polytopes P . Then $\partial L(P) \subseteq \partial M(P)$ for all rational polytopes P . Moreover,

1. $\partial GC(P) \subseteq SC(P)$ for all rational polytopes P . There exists a rational polytope Q , such that $\partial GC(Q) \subsetneq SC(Q)$.
2. There exist polytopes Q^1 and Q^2 , such that $\partial N_0(Q^1) \subsetneq \partial GC(Q^1)$ and $\partial N_0(Q^2) \supsetneq \partial GC(Q^2)$.
3. There exist polytopes Q^1 and Q^2 , such that $\partial N_0(Q^1) \subsetneq SC(Q^1)$ and $\partial N_0(Q^2) \supsetneq SC(Q^2)$.
4. There exists a rational polytope Q , such that $\partial N(Q) \subsetneq \partial N_0(Q)$.

Comparing closures



4.1

Upper Bound on Ranks using Verification Cuts

Theorem

$\partial GC(P) = P_I$ for all rational polytopes $P \subseteq \mathbb{R}^2$, that is $rk_{\partial M}(P) = 1$ for all rational polytopes $P \subseteq \mathbb{R}^2$.

"Mimicking" the N_+ operator

Lemma

Let M be admissible and $P \subseteq [0, 1]^n$. Further let $(c, d) \in \mathbb{Z}_+^{n+1}$. If $\langle c, x \rangle \leq d$ is valid for $P \cap \{x \mid x_i = 1\}$ for every $i \in [n]$ with $c_i > 0$, then $\langle c, x \rangle \leq d$ is valid for $\partial M(P)$.

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Stable Set Polytope

Given a graph $G := (V, E)$, let $\text{FSTAB}(G) := \{x \in [0, 1]^n \mid x_u + x_v \leq 1 \ \forall (u, v) \in E\}$.

Theorem

Clique Inequalities, odd hole inequalities, odd anti-hole inequalities, and odd wheel inequalities are valid for $\partial M(\text{FSTAB}(G))$ with M being an admissible operator.

Proof uses previous lemma and ideas from [Lovász Schrijver (1991)].

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Monotone Polytope

We say $P \subseteq [0, 1]^n$ is *monotone* (or of *anti-blocking type*) if $y \in P$ whenever $y \leq x$ and $x \in P$.

Theorem

Let M be admissible and $P \subseteq [0, 1]^n$ be a monotone polytope with $\max_{x \in P} ex = k$.
Then $rk_{\partial M}(P) \leq k + 1$.

Proof uses previous lemma and ideas from [Cook Dash (2001)].

4.2

Lower Bound on Ranks using Verification Cuts

Not the paragon of perfection: lower bound on rank of A_n

$$A_n := \left\{ x \in [0, 1]^n \mid \sum_{i \in I} x_i + \sum_{i \notin I} (1 - x_i) \geq \frac{1}{2} \quad \forall I \subseteq [n] \right\}.$$

Lemma

Let M be admissible and let $\ell \in \mathbb{N}$ such that $rk_M(A_n) \geq \lfloor \frac{n}{\ell} \rfloor$. If $n > 2\ell + 1$, then

$$rk_{\partial M}(A_n) \geq \left\lfloor \frac{n-1}{2\ell+1} \right\rfloor.$$

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Corollary

Let $M \in \{GC, N_0, N, N_+, SC\}$ and $n \in \mathbb{N}$ with $n \geq 4$. Then $rk_{\partial M}(A_n) \geq \left\lfloor \frac{n-1}{3} \right\rfloor$.

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Traveling Salesman Polytope

Let $G = (V, E)$ be the undirected complete graph on n vertices. The *subtour elimination polytope* $H_n \subseteq [0, 1]^{|E|}$ is the set

$$\begin{aligned}x(\delta(\{v\})) &= 2 & \forall v \in V \\x(E(W)) &\leq |W| - 1 & \forall \emptyset \subsetneq W \subsetneq V \\x_e &\in [0, 1] & \forall e \in E.\end{aligned}$$

Theorem

Let $M \in \{GC, SC, N_0, N, N_+\}$. For $n \in \mathbb{N}$ and H_n as defined above we have

$$\left\lfloor \frac{\lfloor n/8 \rfloor - 1}{3} \right\rfloor \leq \text{rk}_{\partial M}(H_n) \leq n + 1.$$

Proof uses results from [Chvátal, Cook, Hartmann (1989)] [Cook Dash (2001)].