# Complexity of branch-and-bound and cutting planes in mixed-integer optimization 

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Motivation:

- BB and CP are (among) the main general-purpose techniques for mixed-integer optimization, but little is known on their relative strength
- Computationally, BC tends to be far more efficient and effective than $B B$ and $C P$ alone


## The setting

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\begin{array}{r}
\min \quad c^{\top} x \\
\text { s.t. } x \in C \\
x \in S
\end{array}
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where

- $C \subseteq \mathbb{R}^{n}$ is a closed convex set
- $S \subseteq \mathbb{R}^{n}$ models some non-convexity


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Typical case: (mixed) integer linear programming: $\min c^{\top} x$
s.t. $A x \leq b$
$x \in \mathbb{Z}^{n}$

- $C$ is a polyhedron $\left\{x \in \mathbb{R}^{n}: A x \leq b\right\}$
- $S=\mathbb{Z}^{n}$


## Disjunctions

Variable disjunction: $D=\left\{x: x_{i} \leq b\right.$ or $\left.x_{i} \geq b+1\right\}$, where $b \in \mathbb{Z}$


## Disjunctions

Split disjunction: $D=\left\{x: a^{\top} x \leq b\right.$ or $\left.a^{\top} x \geq b+1\right\}$, where $a \in \mathbb{Z}^{n}$ and $b \in \mathbb{Z}$.


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Split disjunction: $D=\left\{x: a^{\top} x \leq b\right.$ or $\left.a^{\top} x \geq b+1\right\}$, where $a \in \mathbb{Z}^{n}$ and $b \in \mathbb{Z}$.


General disjunction: a finite union of polyhedra that cover $S$.

## Branch-and-bound



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We assume that the best-node strategy is used: then the first feasible solution found is optimal.

## Cutting planes



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- A branch-and-cut algorithm generates a tree in which every non-leaf node can have one child (cutting node) or more than one child (branching node).
We compare the number of nodes (length) produced by these algorithms based on the same families of disjunctions, assuming optimal choices.


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Similarly for branch-and-bound and branch-and-cut.
Every $C P / B B / B C$ algorithm is a $C P / B B / B C$ proof.
Proofs are stronger than algorithms, even in dimension 2 (Owen \& Mehrotra 2001).

## Summary of comparison between BB and CP

|  | variable disjunctions |  | split disjunctions |  |
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|  | $\mathrm{CP} \leq \mathrm{BB}$ |  |  |  |
| Fixed <br> dim. | $\mathrm{BB} O(1)$ |  |  |  |

## $0 / 1$ convex sets, variable disjunctions

Theorem (Dash 2003/Chvátal 1973)
Let $P \subseteq[0,1]^{n}$ be a polytope. If a valid inequality for $P \cap \mathbb{Z}^{n}$ has a $B C$ proof/algorithm of length $N$ based on variable disjunctions, then it has a CP proof/algorithm of length $N$ based on variable disjunctions.

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Theorem (BCDJ 2022)
Let $C \subseteq[0,1]^{n}$ be a closed convex set. If a valid inequality $c x \leq \gamma$ for $C \cap \mathbb{Z}^{n}$ has a $B C$ proof/algorithm of length $N$ based on variable disjunctions, then $c x \leq \gamma+\epsilon$ has a CP proof/algorithm of length $N$ based on variable disjunctions, for any $\epsilon>0$.

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Question
Can $\epsilon$ be removed?

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For 0/1 polytopes and variable disjunctions, CP can be exponentially better than $B B$.

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(This example can be made less pathological.)


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- The best BB tree has 4 nodes.


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- The best BB tree has 4 nodes.
- CP only converges in infinitely many iterations.


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| Variable <br> dim. | $\mathrm{CP} \leq \mathrm{BB}$ <br> CP poly $(n)$ <br> vs <br> vB $\exp (n)$ | (1) <br> $\mathrm{CP} \infty$ <br> CP poly $(n)$ <br> vs |  |  |
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## General split disjunctions

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Let $C$ be a closed convex set. If a valid inequality for $C$ has a $C P$ proof of length $N$ based on general split disjunctions, then it has a BB proof of length $3 N$ based on general split disjunctions.

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This can be extended to arbitrary disjunctions, provided that all split disjunctions are included.

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## Polynomial-gap instances

Theorem (Conforti, Del Pia, DS, Faenza, Grappe 2015)
For general polytopes and general split disjunctions in fixed dimension, there are examples in which BB takes in $O(1)$ iterations while CP needs poly(data) iterations.

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Instance: in $\mathbb{R}^{3}$, max $x_{3}$ over the convex hull of
$(0,0,0),(2,0,0),(0,0,2),(0.5,0.5, h)$.

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Is the split rank polynomial in variable/fixed dimension?

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| Variable dim. | $\begin{gathered} \mathrm{CP} \leq \mathrm{BB} \\ \mathrm{CP} \operatorname{poly}(n) \\ \text { vs } \\ \mathrm{BB} \exp (n) \end{gathered}$ | $\begin{gathered} \mathrm{BB} O(1) \\ \text { vs } \\ \mathrm{CP} \infty \\ \mathrm{CP} \operatorname{poly}(n) \\ \text { vs } \\ \mathrm{BB} \exp (n) \end{gathered}$ | $\mathrm{BB} \leq 3 \cdot \mathrm{CP}$ | $\begin{gathered} \mathrm{BB} \leq 3 \cdot \mathrm{CP} \\ \mathrm{BB} O(1) \\ \text { vs } \\ \mathrm{CP} \text { poly(data) } \end{gathered}$ |
| Fixed dim. | $\mathrm{BB} O(1)$ $\mathrm{CP} O(1)$ | $\begin{gathered} \text { BB poly (CP) } \\ \text { BB } O(1) \\ \text { vs } \\ \text { CP } \infty \end{gathered}$ | $\text { BB } O(1)$ $\mathrm{CP} O(1)$ | $\begin{gathered} \mathrm{BB} \leq 3 \cdot \mathrm{CP} \\ \mathrm{BB} O(1) \\ \text { vs } \\ \mathrm{CP} \mathrm{poly(data)} \end{gathered}$ |

## Summary of comparison between BB and CP

|  | variable disjunctions |  | split disjunctions |  |
| :---: | :---: | :---: | :---: | :---: |
|  | 0/1 sets | general sets | 0/1 sets | general sets |
| Variable dim. | $\begin{gathered} \mathrm{CP} \leq \mathrm{BB} \\ \mathrm{CP} \operatorname{poly}(n) \\ \text { vs } \\ \mathrm{BB} \exp (n) \end{gathered}$ | $\begin{gathered} \mathrm{BB} O(1) \\ \text { vs } \\ \mathrm{CP} \infty \\ \mathrm{CP} \operatorname{poly}(n) \\ \text { vs } \\ \mathrm{BB} \exp (n) \end{gathered}$ | $\mathrm{BB} \leq 3 \cdot \mathrm{CP}$ | $\begin{gathered} \mathrm{BB} \leq 3 \cdot \mathrm{CP} \\ \mathrm{BB} O(1) \\ \text { vs } \\ \mathrm{CP} \text { poly(data) } \end{gathered}$ |
|  | BB $O(1)$ | BB poly (CP) | BB $O(1)$ | $\mathrm{BB} \leq 3 \cdot \mathrm{CP}$ |
| Fixed dim. | CP O(1) | $\begin{gathered} \mathrm{BB} O(1) \\ \text { vs } \\ \mathrm{CP} \infty \\ \hline \end{gathered}$ | $\mathrm{CP} O(1)$ | $\begin{gathered} \mathrm{BB} O(1) \\ \text { vs } \\ \text { CP poly(data) } \\ \hline \end{gathered}$ |

## Superiority of Branch-and-Cut

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## Theorem (BCDJ 2022; here informal)

Under the above complementarity assumption, there are instances where $B C$ does exponentially better than $B B$ and $C P$ alone.

## Further open questions

- Q1: Is BC superior to BB and CP alone precisely when BB and $C P$ are complementary?


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