# Split Rank of Triangle and Quadrilateral Inequalities 

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Joint work with Santanu Dey (CORE)

## Outline

- Cuts from two rows of the simplex tableau
- The different cases to consider
- Split cuts and split ranks
- Finiteness proofs for the triangles
- The ideas for the quadrilaterals
- Conclusion


## Cuts from two rows of the simplex tableau

Consider a mixed-integer program

$$
\begin{aligned}
& \min c^{T} x \\
& \text { s.t. } A x=b \\
& \quad x \in \mathbb{Z}_{+}^{n_{1}} \times \mathbb{R}_{+}^{n_{2}}
\end{aligned}
$$

We consider the problem of finding valid inequalities cutting off the linear relaxation optimum.

We consider the simplex tableau

$$
-\bar{a}_{11} s_{1}-\cdots-\bar{a}_{1 n} s_{n}=\bar{b}_{1}
$$



- Select two rows
- Relax the integrality requirements of the non-basic variables
- Relax the nonnegativity requirements of the basic variables but keeping integrality


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\ddots & \vdots \\
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The 2 row-model

The model

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\binom{x_{1}}{x_{2}}=\binom{f_{1}}{f_{2}}+\sum_{j=1}^{n}\binom{r_{1}^{j}}{r_{2}^{j}} s_{j}, \quad x_{1}, x_{2} \in \mathbb{Z}, s_{j} \in \mathbb{R}_{+}
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Model studied in [Andersen, Louveaux, Weismantel, Wolsey, IPCO2007] (for the finite case) and [Cornuéjols, Margot, 2009] (for the infinite case).

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The geometry

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\binom{x_{1}}{x_{2}}=\binom{1 / 4}{1 / 2}+\binom{2}{1} s_{1}+\binom{1}{1} s_{2}+\binom{-3}{2} s_{3}+\binom{0}{-1} s_{4}+\binom{1}{-2} s_{5}
$$



## The geometry

The projection picture

$$
2 s_{1}+2 s_{2}+4 s_{3}+s_{4}+\frac{12}{7} s_{5} \geq 1
$$

- We project the $n+2$-dim space onto the $x$-space
- The facet is represented by a polygon $L_{\alpha}$
- There is no integer point in the interior of $L_{\alpha}$
- The coefficients are a ratio of distances on the figure


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Classification of all possible facet-defining inequalities
Theorem : All facets are projected to triangles and quadrilaterals [Andersen et al 2007].


Split Cut


Triangle Cut


Disection Triangle Disection Quadrilateral

## The split rank question

- Split cut : applying a disjunction $\pi^{T} x \leq \pi_{0} \vee \pi^{T} x \geq \pi_{0}+1$ to a polyhedron $P$

$$
\begin{gathered}
x=f+R S \\
s_{1} \geq 0 \\
\vdots \\
s_{n} \geq 0 \\
\pi^{T} x \leq \pi_{0}
\end{gathered}
$$

- The first split closure $P^{1}$ of $P$ is what you obtain after having applied all possible split disjunctions $\pi$.
- The split rank of a valid inequality is the minimum $i$ such that the inequality is valid
- Most inequalities used in commercial softwares are split cuts
- Question : what is the split rank of the 2 row-inequalities? In how many rounds of split cuts only can we generate the inequalities?
- The Cook-Kannan-Schrijver has infinite rank and we prove that the other triangles have finite rank.


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## Useful properties of the split rank

- The split rank is invariant up to integer translation and unimodular transformation
- (Lifting) Consider a triangle (or quadrilateral) inequality for a 3 -variable problem. If we keep the same shape of the polygon and consider an $n$-variable problem, the split rank does not increase.
- (Projection) Let $\sum_{i=1}^{n} \alpha_{i} s_{i} \geq 1$ be an inequality with split rank $\eta$. Then the projected inequality $\sum_{i=1}^{n-1} \alpha_{i} S_{i} \geq 1$ has a split rank of at most $\eta$ for the projected problem.

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## The triangle case

Several cases to consider, after suitable unimodular transformation


## An illustration of the proof in this talk

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Idea of the proof of upper bounds

- We prove an upper bound on the split rank.
- Procedure : We apply a sequence of two split disjunctions. Successively: $x_{1} \leq 0 \vee x_{1} \geq 1$ and $x_{2} \leq 0 \vee x_{2} \geq 1$
- At step $i$, we keep one inequality of rank at most $i$ and proceed to the next disjunction.
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One proof for a non-degenerate non-maximal triangle


Rank 0

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Rank 0

One proof for a non-degenerate non-maximal triangle


Rank 1

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One proof for a non-degenerate non-maximal triangle


Rank 2

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One proof for a non-degenerate non-maximal triangle


Rank 4

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One proof for a non-degenerate non-maximal triangle


Rank 5

One proof for a non-degenerate non-maximal triangle


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One proof for a non-degenerate non-maximal triangle


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## One proof for a non-degenerate non-maximal triangle



One proof for a non-degenerate non-maximal triangle


The goal inequality has a rank of at most 6

The geometry behind the convergence


The geometry behind the convergence


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Assumptions for the following

- We have "proven" that a non-maximal triangle where the upward ray points to the left has a finite rank.
- We can prove that the constructed bound is logarithmic in the number of bits of the input.
- The proof for the upward ray pointing to the right works similarly (but not identically).
- In the following, we assume that any non-maximal triangle has a finite rank.


## The maximal triangles



The maximal triangles


This inequality is a non-maximal triangle $\Rightarrow$ finite rank!

## The maximal triangles



The maximal triangles


The goal inequality is valid for the disjunction.

The maximal triangles


The goal inequality has a finite rank

## The disection triangle

Disection $\equiv$ each side is tight at exactly one integer point


The disection triangle
Disection $\equiv$ each side is tight at exactly one integer point


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The disection triangle
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Similarly this inequality has a finite rank!

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Brown line : set of points with a representation that satisfy both inequalities with equality

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$\bullet$


The disection triangle
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The disection cut has a finite rank

## The quadrilateral cuts

- Two cases : non-maximal quadrilateral and disection quadrilateral.
- By the projection Lemma, we can deal with most non-maximal quadrilaterals
- One exception : if the lifted triangle has infinite rank.


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## Conclusion

- All triangles except the Cook-Kannan-Schrijver have a finite rank.
- We provide a constructive split proof of that fact.
- Split cuts can essentially achieve all triangles in relatively few rounds.
- In constrast with the results of Basu et al. on the triangle closure compared to the split closure.
- Ongoing work : (almost ?) all quadrilaterals have a finite rank.
- Open (and difficult) question : lower bounds on the split rank.


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