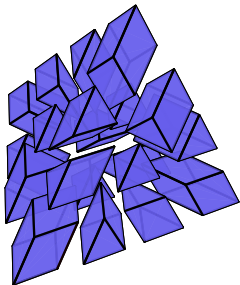


# Combinatorics of Tropical Linear Programming

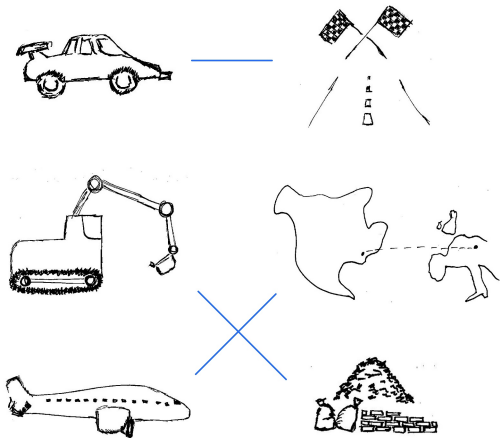
Georg Loho



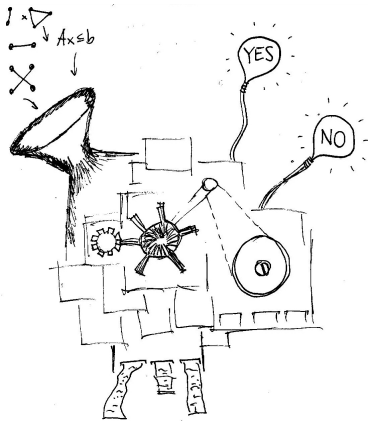
Berlin, September 5th 2017

# Related Problems

## (Combinatorial) Optimization



## Complexity Questions



# Motivation

- Connection with *Classical Linear Programming / Simplex Method* (Allamigeon, Benchimol, Gaubert, Joswig 2014+)
- *Oriented Matroid Programming* (Bland '77, Fukuda '82, Todd '85, Terlaky '85)

# Motivation

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- *Oriented Matroid Programming* (Bland '77, Fukuda '82, Todd '85, Terlaky '85)
- Equivalence of Tropical Linear Programming and *Mean Payoff Games* (Akian, Gaubert, Guterman 2012)
- Unclear complexity of Tropical Linear Programming in  $NP \cap co-NP$  (Jurdziński '98)

# Simplex Method (Dantzig '63, Bland '77,...)

Given  $A \in \mathbb{R}^{n \times d}$ ,  $b \in \mathbb{R}^n$ . Consider

$$A \cdot x \leq b . \tag{1}$$

Problem: Find a *feasible point*  $y \in \mathbb{R}^d$  fulfilling system (1).

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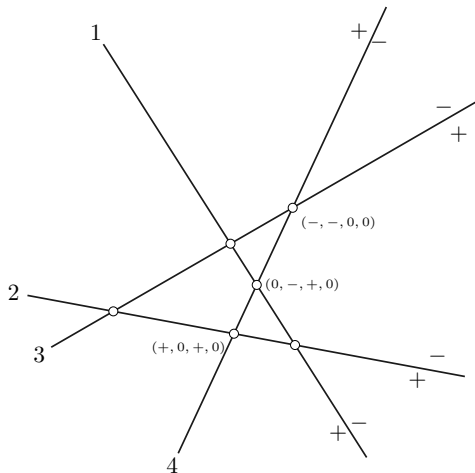
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---

- 1:  $I \leftarrow$  appropriate  $d$ -elem. subset of  $[n]$  (*basis* of rows)
- 2:  $y \leftarrow$  solution of  $A_I \cdot x = b_I$
- 3: **while**  $y$  does not fulfill (1) and no certificate for infeasibility found **do**
- 4:      $f \leftarrow$  particular element of  $[n] \setminus I$
- 5:      $e \leftarrow$  particular element of  $I$
- 6:      $I \leftarrow I \cup \{f\} \setminus \{e\}$  (again a *basis*)
- 7:      $y \leftarrow$  solution of  $A_I \cdot x = b_I$
- 8: **end while**
- 9: **return**  $y$

Use dual objective vector, reduced cost vector

# Halfspace Arrangement in $\mathbb{R}^2$



Classically: Abstraction by sign vectors, dual sign vectors (Oriented Matroid)

# From Classical to Tropical Linear Programming

- Linear Programming over field of rational functions (Jeroslow '73)
- Tropical polyhedra are exactly the images of polyhedra over Puiseux series under valuation map (Develin, Yu 2007)
- Tropicalization of the Simplex Method (ABGJ 2014)
- Field of Puiseux Fractions suitable for computations (polymake) (Joswig, L, Lorenz, Schröter 2016)

## Theorem (JLLS 2016)

*The combinatorial type of a real polyhedron obtained by substituting a sufficiently large real number for the parameter equals the combinatorial type of the corresponding polyhedron of Puiseux fractions.*

- Dequantization through logarithmic limit (Maslov '86)



# Cramer Theorems

Fix  $I \subset [n]$  of size  $d$ .

Classical (Cramer 1750)

$$(A_I | -b_I) \cdot x = 0 .$$

Solution vector given by  $d \times d$ -subdeterminants of  $(A_I | -b_I)$ .

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## Tropical ('Max Plus' '97, AGG 2014)

min attained twice per row in  $M_I \odot_{\min} x = (\min_{j \in [d+1]} (m_{ij} + x_j))_{i \in I}$

- Solution given by tropical  $d \times d$ -subdet. of  $M \in (\mathbb{R} \cup \infty)^{n \times (d+1)}$ .
- Tropical determinants are minimal  $d \times d$  matchings.

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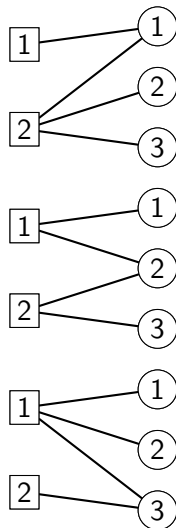
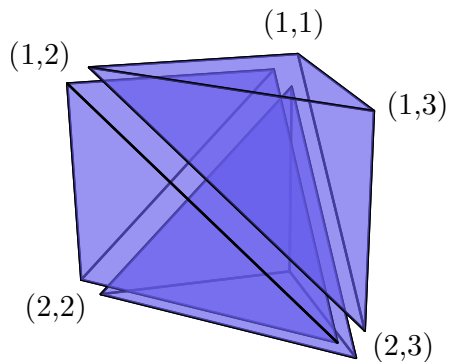
## Abstract Tropical (L 2017)

*Cramer covector of  $I$* : Bipartite tree on  $[d+1] \sqcup [n]$  such that  $d$  nodes in  $I \subset [n]$  have degree 2 (and the others are of degree 1).

- Generalization of 'min attained twice', special *covector graphs*.

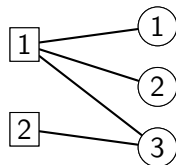
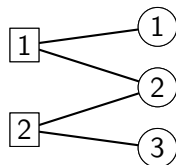
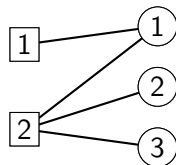
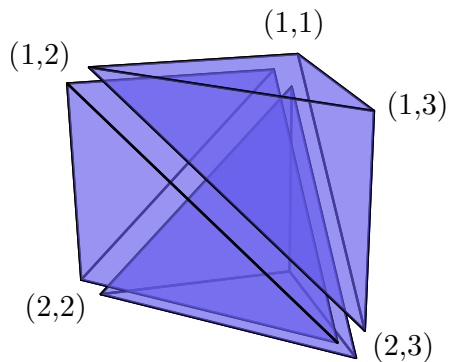
# Subpolytopes of $\Delta_d \times \Delta_{n-1}$ and Bipartite Graphs

$$\Delta_1 \times \Delta_2$$



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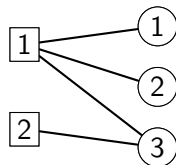
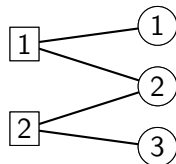
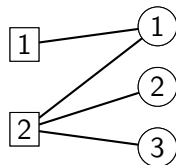
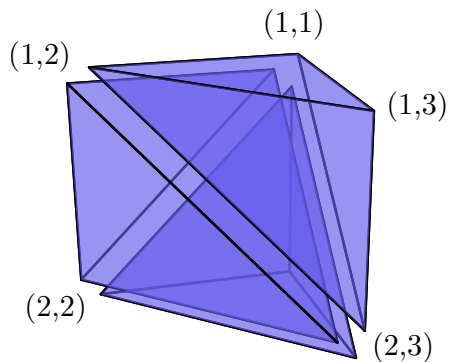


Theorem (DS 2004, FR 2015, JL 2016)

The covector graphs describe a *regular subdivision* of a subpolytope of  $\Delta_d \times \Delta_{n-1}$ .

# Subpolytopes of $\Delta_d \times \Delta_{n-1}$ and Bipartite Graphs

$$\Delta_1 \times \Delta_2$$



Definition (Signed tropical matroid (L 2017))

Bipartite graphs, which form a *not-necessarily regular subdivision* of a subpolytope of  $\Delta_d \times \Delta_{n-1}$ , with signs on the edges.

# Abstract Tropical Cramer Theorem

Theorem (Postnikov 2009, L 2017)

*For a given  $d$ -set  $I \subseteq [n]$ , there is exactly one full-dimensional cell in a triangulation of  $\Delta_d \times \Delta_{n-1}$  so that in the corresponding bipartite graph the  $d$  nodes in  $I$  have degree 2 and the nodes in  $[n] \setminus I$  have degree 1. The bipartite graph is composed of  $d \times d$ - and  $(d+1) \times (d+1)$ - matchings.*

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## Proof.

- Statement holds for more general degree vectors.
- The polytope  $\Delta_d \times \Delta_{n-1}$  is equidecomposable.
- The number of full-dimensional simplices equals the number of compositions of  $n+d$ .
- There is at most one cell per degree sequence.





# Signed Edges and Feasibility

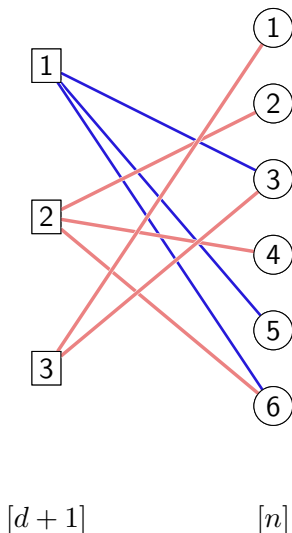
## Signed tropical matroid (L 2017)

Axiomatic description of combinatorics of a generalization of tropical linear inequality system (building on work by Ardila, Develin 2009, Oh, Yoo 2011, Horn 2012).

A distinguished subset of  $[d + 1] \times [n]$  (considered as edges) is **negative** (red). The other edges are **positive** (blue).

A Cramer covector is **feasible** if each node in  $[n]$  is incident with a positive edge.

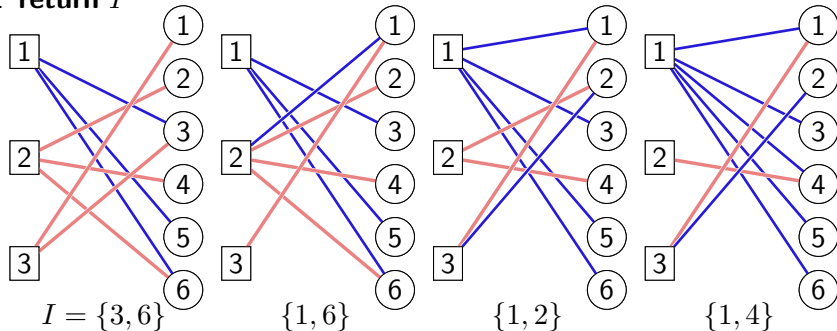
Otherwise it is **infeasible**.



# Abstract Tropical Feasibility Algorithm

Problem: Find feasible Cramer covector

- 1:  $I \leftarrow$  appropriate  $d$ -elem. subset of  $[n]$
- 2: **while** There is  $j \in [n]$  only incident with negative edges in Cramer covector of  $I$  (and it is not totally infeasible) **do**
- 3:      $k \leftarrow$  node in  $[n]$  incident with same node in  $[d+1]$  via negative edge
- 4:      $I \leftarrow I \setminus \{k\} \cup \{j\}$
- 5: **end while**
- 6: **return**  $I$

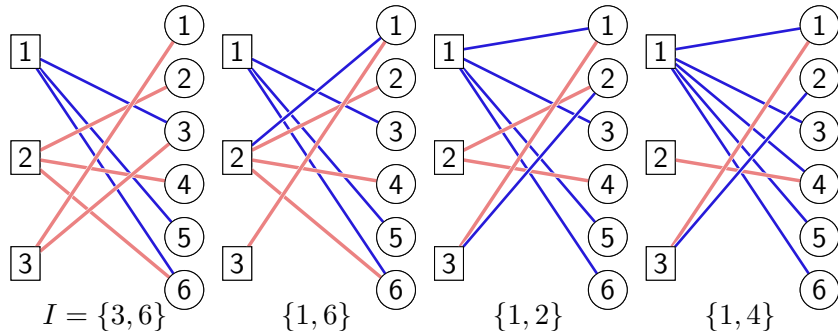


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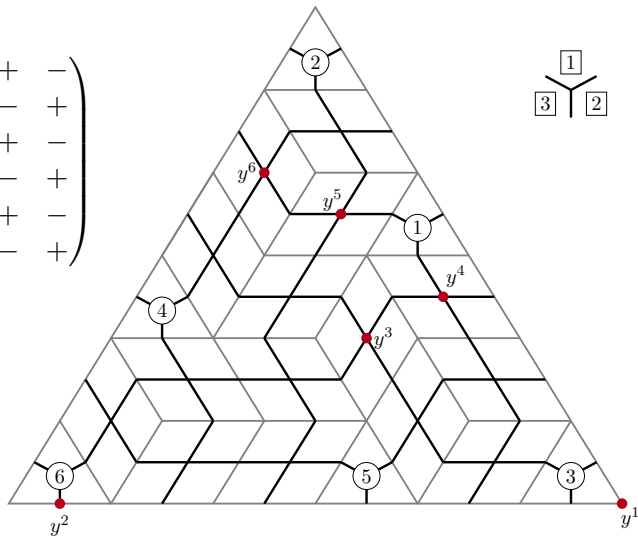
Theorem (L 2017)

The algorithm works in a *not-necessarily regular triangulation* of  $\Delta_d \times \Delta_{n-1}$  and returns a feasible Cramer covector or a witness that there is no feasible Cramer covector.



# TLP in a Non-Regular Triangulation of $\Delta_2 \times \Delta_5$

$$\begin{pmatrix} + & + & - \\ + & - & + \\ + & + & - \\ + & - & + \\ + & + & - \\ + & - & + \end{pmatrix}$$



# Ingredients

- Description of tropical inequality systems by covector graphs (JL 2016)
- Decomposition of tropical projective spaces with augmented (signed) covector graphs (JL 2016)
- Better understanding of the matching structure of covector graphs (JL 2016, L 2017)
- Combinatorial ‘increase’ lemma in not-necessarily regular triangulations of  $\Delta_d \times \Delta_{n-1}$  (L 2017)
- Polyhedral constructions to deal with non-genericity and subpolytopes (De Loera, Rambau, Santos 2010, Horn 2012, ABGJ 2014, L 2017)

# Runtime Analysis and the Secondary Fan of $\Delta_{d-1} \times \Delta_{n-1}$

## Theorem (L 2017)

*The algorithm takes  $\mathcal{O}(d\omega)$  steps for a tropical linear inequality system given by a matrix  $M \in (\mathbb{Z} \cup \{\infty\})^{n \times (d+1)}$ .*

*Here,  $\omega$  is the maximal finite entry of a fixed non-negative integer matrix which induces the same regular subdivision of  $\Delta_d \times \Delta_{n-1}$  as  $M$ .*

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## Proof.

- Control flow of the algorithm depends only on the combinatorial structure of the subdivision.
- Coordinate increase in each step.



# Conclusion and Further Work

## Summary

- Extension of the theory of tropical covectors for inequality systems, boundary of tropical projective spaces, non-genericity.
- Tropical analogue of 'oriented matroid programming' as generalization of tropical linear programming.
- New tools to study the relation between classical and tropical linear programming.



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## Further Work

- Study 'long minimal integer vectors' in the cones of the secondary fan of  $\Delta_{d-1} \times \Delta_{n-1} \rightarrow$  hard instances.
- Investigate implications for classical linear programming.
- Matching structures.