

# A max-flow algorithm for positivity of Littlewood-Richardson coefficients

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*Die Universität der Informationsgesellschaft*

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- 1 Littlewood-Richardson coefficients
- 2 LR-coefficients in terms of flows
- 3 Algorithmic idea
- 4 The Residual Network
- 5 Ideas behind the Shortest Cycle Theorem
- 6 Extensions

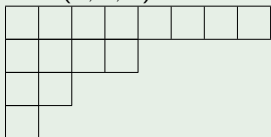
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## Definition

Given partitions  $\lambda, \mu, \nu$ , then the sequence of Kronecker coefficients  $(k_{\lambda(n), \mu(n), \nu(n)})$  stabilizes, where  $\lambda(n) := (n - |\lambda|, \lambda)$  denotes the partition of  $n$  that equals  $\lambda$  with additional first row.

## Example

$\lambda = (4, 2, 1)$ ,  $n = 15$ . Then  $\lambda(n)$  has the following Young diagram:

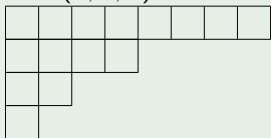


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- Brion 1993, Vallejo 1999 and Briand, Orellana and Rosas 2009 gave upper bounds for  $n$  from which on the sequence is stable.

## Definition

Given partitions  $\lambda, \mu, \nu$  with  $|\nu| = |\lambda| + |\mu|$ , then  $(k_{\lambda(n), \mu(n), \nu(n)})$  stabilizes to the **Littlewood-Richardson coefficient**  $c_{\lambda\mu}^{\nu}$ .

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- No polynomial-time algorithm for the computation of  $c_{\lambda\mu}^{\nu}$  unless **P = NP** (Narayanan 2006).



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- Problem  $\text{LR}_{>t}$ :  
“For a given integer  $t$ , do we have  $c_{\lambda\mu}^{\nu} > t$ ?”.

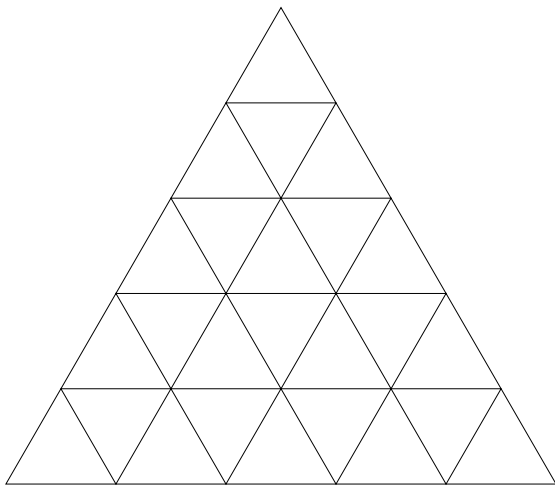
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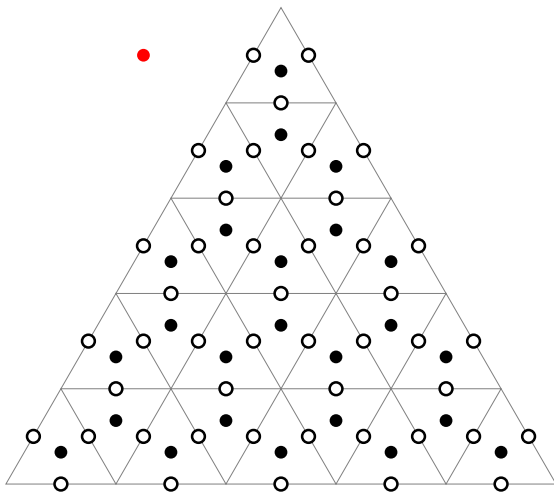
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- Our contribution: A polynomial-time max-flow-type algorithm for  $LR_{>0}$  like requested by Mulmuley and Sohoni in 2005.
- Furthermore we developed an algorithm to decide  $LR_{>t}$  in time  $\mathcal{O}(t^2 \text{poly}(n))$ .

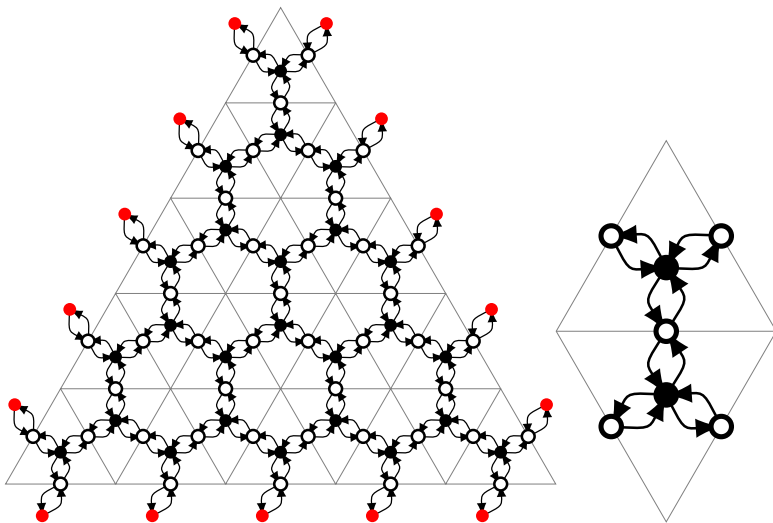
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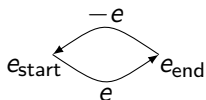
The graph  $\Delta$ .







The digraph  $G$ .

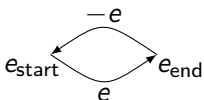


## Definition (Flow)

A real mapping  $f : E(G) \rightarrow \mathbb{R}$  satisfies the **flow constraints**, if for all vertices  $v \in V(G)$  we have

$$\sum_{\substack{e \in E(G) \\ e_{\text{end}}=v}} f(e) = \sum_{\substack{e \in E(G) \\ e_{\text{start}}=v}} f(e).$$

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$$N(G) := \{f \in \mathbb{R}^{E(G)} \mid \forall e \in E(G) : f(e) = f(-e)\} \subset U(G)$$

generated by the 2-cycles. We set  $\tilde{F}(G) := U(G)/N(G)$ .

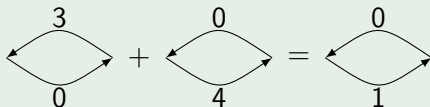
## Definition (Flow)

Note that each coset of  $\tilde{F}(G)$  contains **exactly one** element  $f$  that has

- only nonnegative flow values
- and  $f(e) = 0$  or  $f(-e) = 0$  for all edges  $e$ .

We call this system of representatives the **vector space  $F(G)$  of flows on  $G$** .

## Example



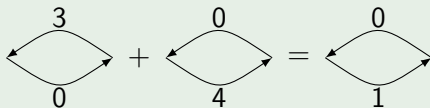
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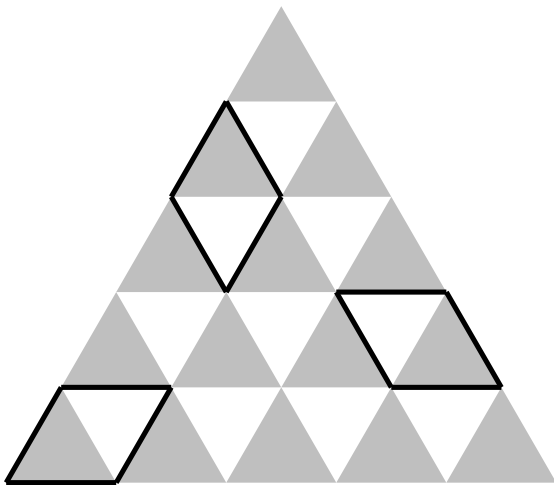
We call this system of representatives the **vector space  $F(G)$  of flows on  $G$** .

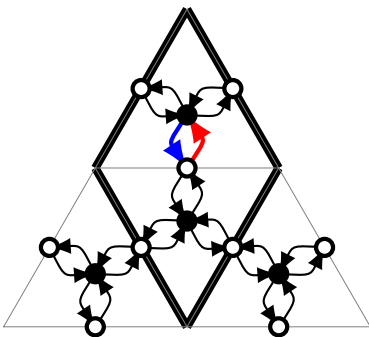
## Example



- Canonical injection: (Oriented) cycles  $C(G) \rightarrow$  Flows  $F(G)$   
(flow value of 1 on all cycle edges)







Define the throughput  $\diamond_{\downarrow\uparrow}$  w.r.t. a flow  $f \in F(G)$  as

$$\diamond_{\downarrow\uparrow}(f) := f(\text{blue}) - f(\text{red}).$$

Analogously define  $\diamond_{\nearrow}$ ,  $\diamond_{\searrow}$  and so on.



Define the **slack**  $\sigma$  of a rhombus  $\diamond$  w.r.t. a flow  $f$  as

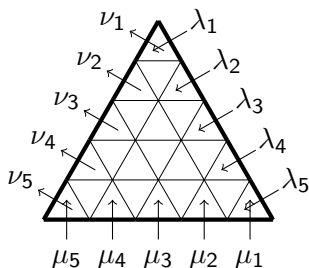
$$\begin{aligned} \sigma(\diamond, f) &:= \overset{\swarrow}{\diamond}(f) + \overset{\searrow}{\diamond}(f) \\ &= \overset{\swarrow}{\diamond}(f) + \overset{\searrow}{\diamond}(f). \end{aligned}$$

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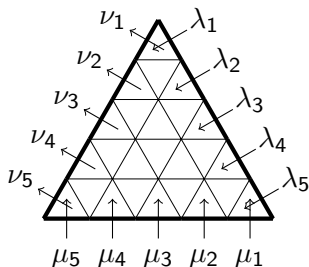
### Definition (Hive flow)

We call a flow  $f$  a **hive flow**, if its slack w.r.t. all rhombi is nonnegative.



### Theorem (Hive flow description)

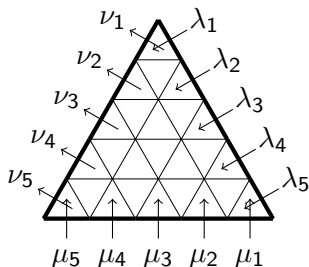
Given three partitions  $\lambda$ ,  $\mu$  and  $\nu$  with  $|\nu| = |\lambda| + |\mu|$ , then the Littlewood-Richardson coefficient  $c_{\lambda\mu}^{\nu}$  equals the number of **integral** hive flows  $f$  with throughputs as in the figure.



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Proof: Integral hive flows  $\xleftrightarrow{\text{bij.}}$  integral hives by Knutson & Tao, Buch.  $\square$



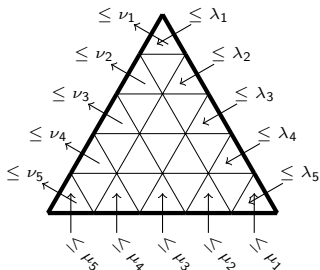
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**Flow description suitable for optimization techniques!**

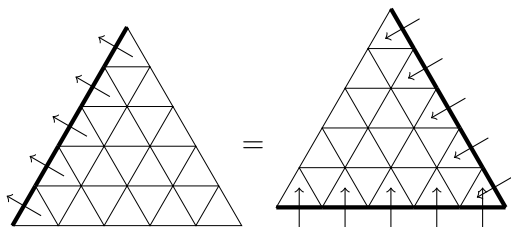
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### Definition ( $b$ -bounded hive flow)

Given a vector of three partitions  $b=(\lambda, \mu, \nu)$  with  $|\nu| = |\lambda| + |\mu|$ , then a hive flow  $f$  is called  **$b$ -bounded**, if its throughputs satisfy the constraints in the figure.

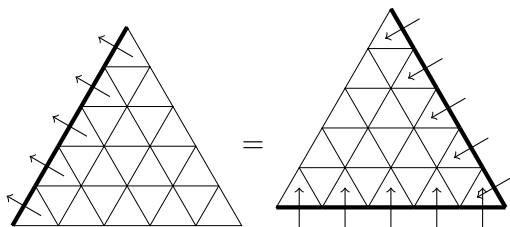
$P^b$  denotes the polyhedron of all  $b$ -bounded hive flows.



### Definition (Overall throughput)

For a flow  $f$  on  $G$  we define  $\delta(f)$  as the sum of throughputs in the figure.





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## Lemma

- 1 For all  $f \in P^b$  we have  $\delta(f) \leq |\nu|$ .
- 2  $c_{\lambda\mu}^\nu$  equals the number of **integral**  $f \in P^b$  with  $\delta(f) = |\nu|$ .

## Lemma

- ① For all  $f \in P^b$  we have  $\delta(f) \leq |\nu|$ .
- ②  $c_{\lambda\mu}^\nu$  equals the number of **integral**  $f \in P^b$  with  $\delta(f) = |\nu|$ .

## Algorithmic idea

$f \leftarrow 0$ .

**while**  $f$  is not maximal w.r.t.  $\delta$  in  $P^b$  **do**

adjust  $f \in P^b$  such that  $f$  **stays integral** and in  $P^b$  and  $\delta(f)$  increases by at least a fixed amount.

**end while**

*We have that  $f$  is maximal w.r.t.  $\delta$  in  $P^b$  and integral.*

**return** whether  $\delta(f) = |\nu|$ .

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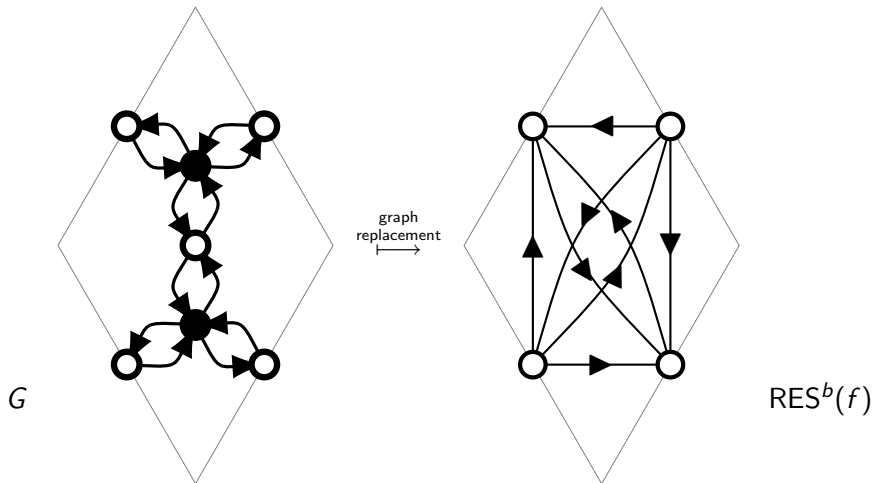
## Lemma

*For a given integral flow  $f \in P^b$  one can algorithmically find an integral flow  $g \in P^b$  with the same throughput and with **no overlapping rhombi that have zero slack**.*

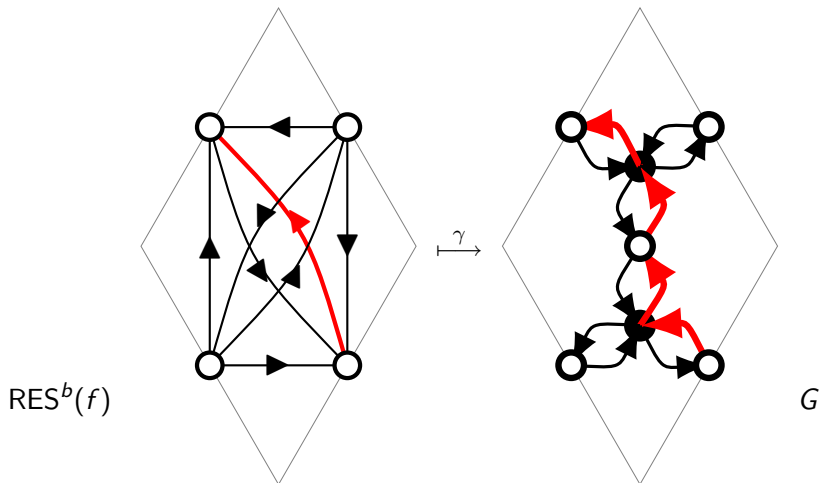
Proof mainly according to A. S. Buch 2000.

So assume for this talk that rhombi with zero slack **do not overlap**.

Replace each rhombus that has zero slack with the following graph:

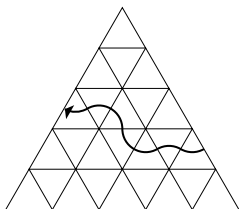


A flow on  $\text{RES}^b(f)$  induces a flow on  $G$  via a canonical map  $\gamma$ , which preserves the throughputs on all vertices:

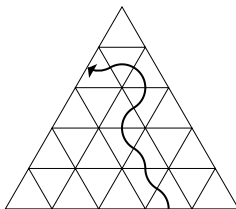


When does  $\delta(f)$  increase by adding  $\gamma(c)$ ?

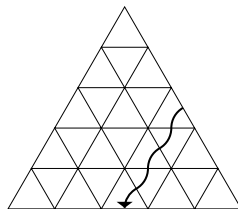
$\delta(f + \gamma(c)) > \delta(f) \iff \delta(\gamma(c)) > 0 \iff c$  is  **$\delta$ -positive**



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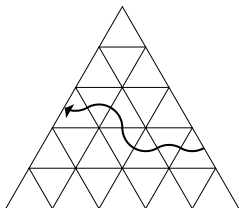
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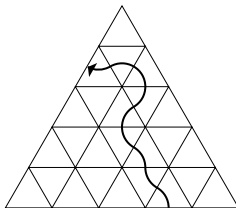
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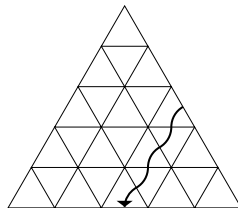
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### Theorem (Shortest Cycle Theorem)

Given an integral flow  $f \in P^b$  and a  $\delta$ -positive cycle  $c$  on  $\text{RES}^b(f)$ , **shortest** among all  $\delta$ -positive cycles on  $\text{RES}^b(f)$ , then  $f + \gamma(c) \in P^b$ .



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## Algorithm LRPA

$f \leftarrow 0$ .

**while** there is a  $\delta$ -positive cycle on  $\text{RES}^b(f)$  **do**  
     search for a shortest  $\delta$ -positive cycle  $c$  on  $\text{RES}^b(f)$ .

$f \leftarrow f + \gamma(c)$ .

**end while**

**return** whether  $\delta(f) = |\nu|$ .

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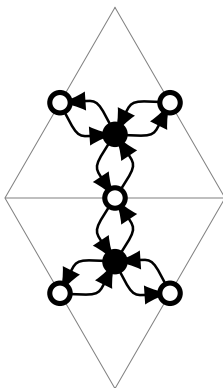
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## Lemma (Optimality Test)

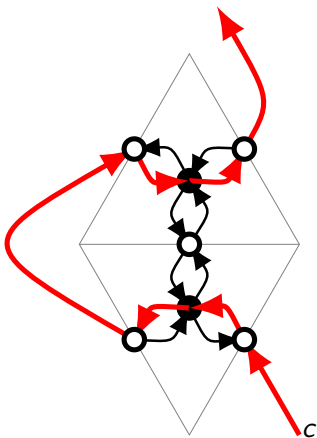
*Given a flow  $f \in P^b$ , then  $f$  maximizes  $\delta$  in  $P^b$  iff on  $\text{RES}^b(f)$  there is no  $\delta$ -positive cycle.*

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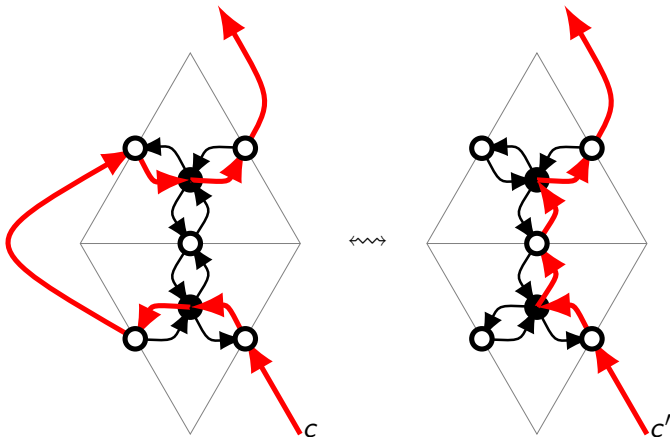


Assume that there is no rhombus with zero slack and thus no subgraph replacement.

Let  $\diamond$  have slack  $\sigma(\diamond, f) = 1$ .



$\sigma(\diamond, f) = 1$ . Recall  $\sigma(\diamond, c) = \cancel{\diamond}(c) + \cancel{\diamond}(c) = -2$ .  
 Hence  $\sigma(\diamond, f + c) = \sigma(\diamond, f) + \sigma(\diamond, c) = -1 < 0$   
 and thus  $f + c$  is **not a hive flow**.

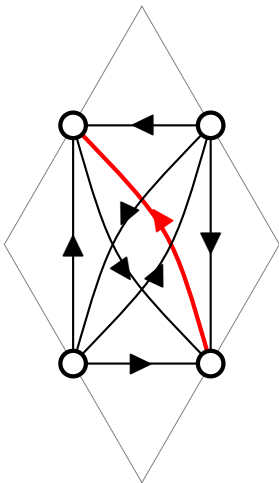


$f + c$  is not a hive flow, but  $c$  was not a **shortest** cycle.

$\sigma(\diamond, c') = \cancel{\diamond}(c') + \cancel{\diamond}(c') = -1$  and  $f + c'$  is a hive flow, because

$\sigma(\diamond, f + c') = 0$ .

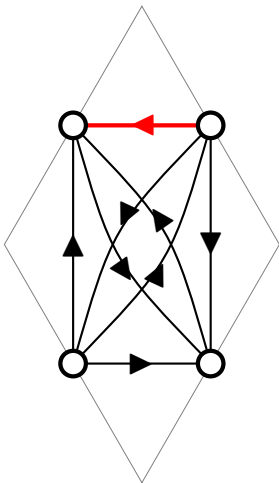
Now let  $\sigma(\diamond, f) = 0$  and thus the subgraph is replaced:



$c$  on  $\text{RES}^b(f)$

$$\sigma(\diamond, \gamma(c)) = \cancel{\diamond}(c) + \cancel{\diamond}(c) = 0.$$

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## Lemma

*The graph replacement ensures that all rhombi with  $\sigma(\diamond, f) = 0$  have  $\sigma(\diamond, f + \gamma(c)) \geq 0$  for all cycles  $c$  on  $\text{RES}^b(f)$ .*

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- There are more involved cases.
- Other problems arise when we have overlapping rhombi with zero slack.

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## Capacity scaling method (without technicalities)

$f \leftarrow 0.$

**for**  $k$  down to 0 **do**

**while** there is a  $\delta$ -positive cycle on  $\text{RES}_{2^k}^b(f)$  **do**  
 search for a shortest  $\delta$ -positive cycle  $c$  on  $\text{RES}_{2^k}^b(f).$

$f \leftarrow f + 2^k \cdot \gamma(c).$

**end while**

**end for**

**return** whether  $\delta(f) = |\nu|.$

## Theorem (Main Theorem)

*The capacity scaling version of the LRPA decides  $LR_{>0}$  in polynomial time.*

For strictly decreasing partitions:

### Corollary (Multiplicity freeness)

Let  $f \in P^b$  integral with  $\delta(f) = |\nu|$ .

Then  $c_{\lambda\mu}^\nu > 1$  iff there exists a cycle on  $\text{RES}^b(f)$ .

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Then  $c_{\lambda\mu}^\nu > 1$  iff there exists a cycle on  $\text{RES}^b(f)$ .

### Corollary

The capacity scaling version of the LRPA combined with the check for multiplicity freeness can decide whether  $c_{\lambda\mu}^\nu = 0$ ,  $c_{\lambda\mu}^\nu = 1$  or  $c_{\lambda\mu}^\nu > 1$  in polynomial time.



For strictly decreasing partitions:

### Corollary (Multiplicity freeness)

Let  $f \in P^b$  integral with  $\delta(f) = |\nu|$ .

Then  $c_{\lambda\mu}^\nu > 1$  iff there exists a cycle on  $\text{RES}^b(f)$ .

### Corollary (Fulton's Conjecture)

The following three conditions are equivalent:

- ①  $c_{\lambda\mu}^\nu = 1$ ,
- ②  $\exists N : c_{N\lambda N\mu}^{N\nu} = 1$ ,
- ③  $\forall N : c_{N\lambda N\mu}^{N\nu} = 1$ .

First proved by Knutson, Tao and Woodward in 2004.

Not yet published:

We can define a more general residual network RES that allows to reach all  $\delta$ -maximal flows in  $P^b$  by adding cycles in RES.

Efficient enumerating of these cycles results in:

### Theorem

- *There exists an algorithm for deciding  $LR_{>t}$  in time  $\mathcal{O}(t^2 \text{poly}(n))$ .*
- *There exists an algorithm for computation of  $c_{\lambda\mu}^\nu$  in time  $\mathcal{O}\left((c_{\lambda\mu}^\nu)^2 \text{poly}(n)\right)$ .*

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### Theorem

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These algorithms efficiently enumerate all hive flows with maximal throughput for given  $\lambda, \mu, \nu$ .

They can also be used for efficient enumeration of all hive flows with maximal throughput for fixed  $\lambda, \mu$  and variable  $\nu$ .

Thank you.