

# Iterative rounding approximation algorithms for degree-bounded node-connectivity network design

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Joint work with R. Ravi (CMU), Z. Nutov (Open University of Israel)

July 30, 2013 @ FND workshop

# Survivable network design (SND)

## Problem

### Input:

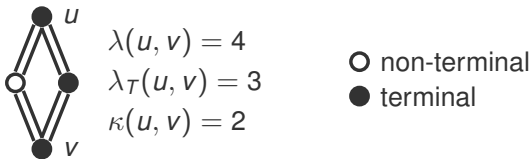
- an undirected or directed graph  $G = (V, E)$
- edge-cost  $c : E \rightarrow \mathbb{Q}_+$
- terminal set  $T \subseteq V$
- connectivity requirements  $r : T \times T \rightarrow \mathbb{N}$

**Solution:** a minimum cost subgraph of  $G$

**Constraints:**  $\forall u, v \in T : (\text{connectivity between } u \text{ and } v) \geq r(u, v)$

# Connectivity

- **edge-connectivity**  $\lambda$ : max # of **edge-disjoint** paths
- **element-connectivity**  $\lambda_{\mathcal{T}}$ :  
max # of paths **disjoint in edges and non-terminals**
- **node-connectivity**  $\kappa$ : max # of paths **disjoint in inner-nodes**



Many special cases are defined according to  $r$   
(e.g., uniform req., rooted req., subset req.)

# Degree-bounded SND

## Degree bounds

- Undirected graphs: Given  $B \subseteq V$  and  $b : B \rightarrow \mathbb{N}$ ,

$$\text{degree of } \forall v \in B \leq b(v)$$

- Digraphs: Given  $B^-, B^+ \subseteq V$ ,  $b^- : B^- \rightarrow \mathbb{N}$  and  $b^+ : B^+ \rightarrow \mathbb{N}$ ,

$$\text{in-degree of } \forall v \in B^- \leq b^-(v)$$

$$\text{out-degree of } \forall v \in B^+ \leq b^+(v)$$

Feasible solutions of Degree-bounded SND are Hamiltonian paths

- connectivity requirements: an undirected connected graph
- degree bounds:  $B = V$ , and  $b(v) = 2$  for  $\forall v$

→ NP-hard to find a feasible solution

# Multi-criteria approximation

## Approximation for undirected degree-bounded SND

- $\alpha \in \mathbb{Q}$
- $\beta : \mathbb{N} \rightarrow \mathbb{N}$

An algorithm achieves  $(\alpha, \beta)$ -**approximation** if it outputs  $F \subseteq E$  such that

- $c(F) \leq \alpha \text{OPT}$  (edge-cost approx)
- **degree of  $v \leq \beta(b(v))$**  for  $\forall v \in B$  (degree bounds approx)

for each instance that has a feasible solution.

## Key idea: iterative rounding

Iterative rounding is a powerful tool

- Jain '01: 2-approx algorithm for edge-connectivity SND
- Fleischer, Jain, Williamson '01: Extended [Jain '01] to element-connectivity SND and node-connectivity SND w/  $k \leq 2$   
( $k := \max_{u,v} r(u, v)$ )
- Breakthrough around '07: Applied to degree-bounded spanning tree and degree-bounded SND w/ edge-connectivity req.

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But, **iterative rounding did NOT work well** for

- element-connectivity SND w/ degree-bounds on arbitrary nodes
- node-connectivity SND even w/o degree-bounds if  $k \geq 3$

# Situation

	no degree-bounds	degree-bounds on terminals	degree-bounds on arbitrary nodes
edge	blue	blue	blue
element	blue	blue	red
uniform node	red	red	red
out node	blue	red	red

O.K. ?



# Situation

no degree-bounds      degree-bounds on terminals      degree-bounds on arbitrary nodes

edge

element

uniform node

out node

O.K.

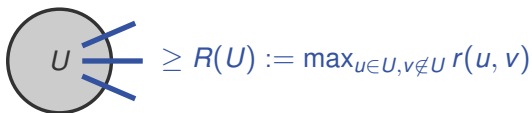
?

- uniform node-conn. req.: undirected graph,  $r(u, v) = k, \forall u, v \in V$
- out node-conne. req.: directed graph, root  $s \in V$ ,

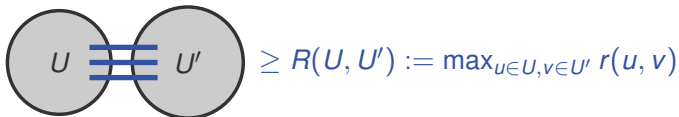
$$r(u, v) = \begin{cases} k & \text{if } u = s, \\ 0 & \text{otherwise.} \end{cases}$$

## Why were they difficult?

- edge-connectivity SND  $\rightarrow$  covering **set functions** by edges



- node-connectivity SND  $\rightarrow$  covering **set-pair functions** by edges



There was no good analysis of iterative rounding for covering set-pair functions except a few restricted cases.

## What did we do?

- We gave two definitions of laminarity for set-pairs
  - Laminarity of set-pairs
  - Strongly laminarity of set-pairs

## What did we do?

- We gave two definitions of laminarity for set-pairs
  - Laminarity of set-pairs
  - Strongly laminarity of set-pairs
  
- We characterized structure on tight set-pair families of element-connectivity and node-connectivity SND
  - Iterative rounding was known to work
    - ➔ strongly laminar family (undirected graphs)  
or laminar family, one direction (directed graphs)
  - Iterative rounding was NOT known to work
    - ➔ laminar family (undirected graphs)  
or laminar family, both directions (directed graphs)

# What did we do?

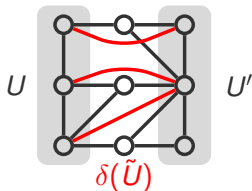
- We gave a new analysis for
  - laminar families (both in undirected and in directed graphs)
  - strongly laminar families w/ degree-bounds
  - no edge-cost case

## Our ideas

- ① New token counting method for laminar family of set-pairs
- ② Using two different counting methods according to # of tight set-pairs v.s. # of tight degree nodes

# Set-pair

- **set-pair** (= biset): ordered pair  $\tilde{U} = (U, U')$  of disjoint node sets
- $U :=$  **tail**,  $U' :=$  **head**
- $\delta(\tilde{U}) := \{uv \in E : u \in U, v \in U'\}$
- $\Gamma(\tilde{U}) := V \setminus (U \cup U')$  (**boundary**)



## LP relaxation

- $R(\tilde{U}) := \max_{u \in U, v \in U'} r(u, v) - |\Gamma(\tilde{U})|$
- $R(\tilde{U}) > 0 \Rightarrow |\Gamma(\tilde{U})| < k$
- $\mathcal{F}$  : a family of set-pairs defined depending on the connectivity

### Set-pair relaxation for undirected graphs

$$\begin{array}{ll} \min & c^T x \\ \text{s.t.} & x(\delta(\tilde{U})) \geq R(\tilde{U}) \quad \forall \tilde{U} \in \mathcal{F} \\ & x(\delta(v)) \leq b(v) \quad \forall v \in B \\ & 0 \leq x(e) \leq 1 \quad \forall e \in E \end{array}$$

# Laminarity of set-pairs

## Laminar family of set-pairs

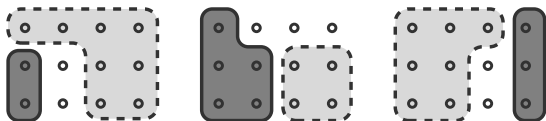
$\mathcal{L}$  is a **laminar** family of set-pairs if

- $\{U : (U, U') \in \mathcal{L}\}$  is a laminar set family,
- $\forall (U, U'), (W, W') \in \mathcal{L} : U \subseteq W \Rightarrow W' \subseteq U'$ .

## Strongly laminar family of set-pairs

$\mathcal{L}$  is a **strongly laminar** family of set-pairs if

- $\mathcal{L}$  is a laminar family of set-pairs,
- $\forall \tilde{U} = (U, U'), \tilde{W} = (W, W') \in \mathcal{L} :$   
 $U \cap W = \emptyset \Rightarrow U \cap \Gamma(\tilde{W}) = \emptyset, \Gamma(\tilde{U}) \cap W = \emptyset.$



Laminar  
NOT strongly laminar



## Results via structure of tight constraints

	no degree-bounds	degree-bounds on terminals	degree-bounds on arbitrary nodes
element	blue	blue	red
uniform node	red	red	red
out node	blue	red	red

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element	← strongly →	laminar →	laminar
uniform node	←	laminar, if $n > 3k - 3$	→
out node	laminar, only entering arcs	← laminar →	→

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	no degree-bounds	degree-bounds on terminals	degree-bounds on arbitrary nodes
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uniform node	← laminar, if $n > 3k - 3$ →	← laminar, if $n > 3k - 3$ →	← laminar →
out node	laminar, only entering arcs	← laminar →	← laminar →

1

1. Laminar, undirected  $\rightarrow (O(k), O(k) \cdot b(v))$ -approx

## Results via structure of tight constraints

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2

1. Laminar, undirected  $\rightarrow (O(k), O(k) \cdot b(v))$ -approx
2. Laminar, directed  $\rightarrow (2, k, 2b^+(v) + O(k))$ -approx

## Results via structure of tight constraints

	no degree-bounds	degree-bounds on terminals	degree-bounds on arbitrary nodes	
element	← strongly laminar →	← laminar →	laminar	3
uniform node	← laminar →	laminar, if $n > 3k - 3$	← laminar →	
out node	laminar, only entering arcs	← laminar →	← laminar →	

1. Laminar, undirected  $\rightarrow (O(k), O(k) \cdot b(v))$ -approx
2. Laminar, directed  $\rightarrow (2, k, 2b^+(v) + O(k))$ -approx
3. Strongly laminar w/ degree-bounds, undirected  $\rightarrow (4, 4b(v) + O(k))$ -approx

# Approximation factors: SND w/o degree bounds

## node-connectivity

$k \leq 2$	2-approx	[Fleischer et al. 06]	<b>iterative rounding</b>
general	$O(k^3 \log n)$ -approx	[Chuzhoy, Khanna 09]	<b>decomposition</b>
rooted	$O(k \log k)$ -approx	[Nutov 09]	<b>decomposition</b>
subset	$O(k^2)$ -approx	[Nutov 09]	<b>decomposition</b>
uniform	$O(\log^2 k)$ -approx	[Fakcharoenphol, Laekhanukit 08]	
		[Nutov 09]	<b>decomposition</b>
	$O(\sqrt{n/\epsilon})$ -approx	[Cheriyani et al. 06]	<b>iterative rounding</b>
	$\Omega(\sqrt{k})$ -fractionality	[Aazami et al. 10]	<b>iterative rounding</b>
uniform ( $n > 3k - 3$ )	<b><math>O(k)</math>-approx</b>	<b>This talk</b>	<b>iterative rounding</b>

# Approximation factors: Edge- and element-connectivity SND w/ degree-bounds

## edge-connectivity

	edge-cost	degree	
spanning tree	1	$b(v) + 1$	[Singh, Lau 07]
general	2	$b(v) + O(k)$	[Lau et al. 07]

## element-connectivity

edge-cost	deg terminals	deg non-terminals	
2	$b(v) + O(k)$	$+\infty$	[Lau et al. 07]
$O(\log k)$	$O(\log k \cdot b(v) + k)$	$O(2^k) \cdot b(v)$	[Nutov 12]
<b>4</b>	<b><math>4b(v) + O(k)</math></b>	<b><math>4b(v) + O(k)</math></b>	<b>This talk</b>

# Approximation factors: Node-connectivity SND w/ degree-bounds

node-connectivity, undirected graphs

	edge-cost	degree	
general	$O(k^3 \log k \log  T )$	$O(2^k k^3 \log  T ) \cdot b(v)$	[Nutov 12]
	<b><math>O(k^3 \log  T )</math></b>	<b><math>O(k^3 \log  T ) \cdot b(v)</math></b>	<b>This talk</b>
rooted	$O(k^2 \log k \log  T )$	$O(2^k k^2 \log  T ) \cdot b(v)$	[Nutov 12]
	<b><math>O(k \log k)</math></b>	<b><math>O(k \log k) \cdot b(v)</math></b>	<b>This talk</b>
subset	$O(k^2 \log k \log  T )$	$O(2^k k^2 \log  T ) \cdot b(v)$	[Nutov 12]
$ T  = O(k)$	$O(k^2)$	$O(k^2)$	trivial
<b><math> T  = \omega(k)</math></b>	<b><math>O(k \log k)</math></b>	<b><math>O(k \log k) \cdot b(v)</math></b>	<b>This talk</b>

**Note:**  $(+\infty, 2^{\log^{1-\epsilon} n} b(v))$ -approx hardness is known for subset node-connectivity SND when  $k$  is large [Lau et al. 09]



# Approximation factors: Degree-bounded SND for digraphs

node-connectivity, digraphs

	edge-cost	in-degree	out-degree	
out-conn	$O(\log k)$	$+\infty$	$O(2^k) \cdot b^+(v)$	[Nutov 12]
	<b>2</b>	<b><math>k</math></b>	<b><math>2b^+(v) + O(k)</math></b>	<b>This talk</b>
uniform	$O(k)$	$+\infty$	$O(2^k) \cdot b^+(v)$	[Nutov 12]
	<b><math>O(k)</math></b>	<b><math>O(k\sqrt{k})</math></b>	<b><math>2b^+(v) + O(k\sqrt{k})</math></b>	<b>This talk</b>

implications for undirected graphs

	edge-cost	degree	
out-conn	$O(\log k)$	$O(2^k) \cdot b(v)$	[Nutov 12]
	<b>4</b>	<b><math>2b(v) + O(k)</math></b>	<b>This talk</b>
uniform	$O(k)$	$O(2^k) \cdot b(v)$	[Nutov 12]
	<b><math>O(k)</math></b>	<b><math>2b(v) + O(k\sqrt{k})</math></b>	<b>This talk</b>

# Result 1

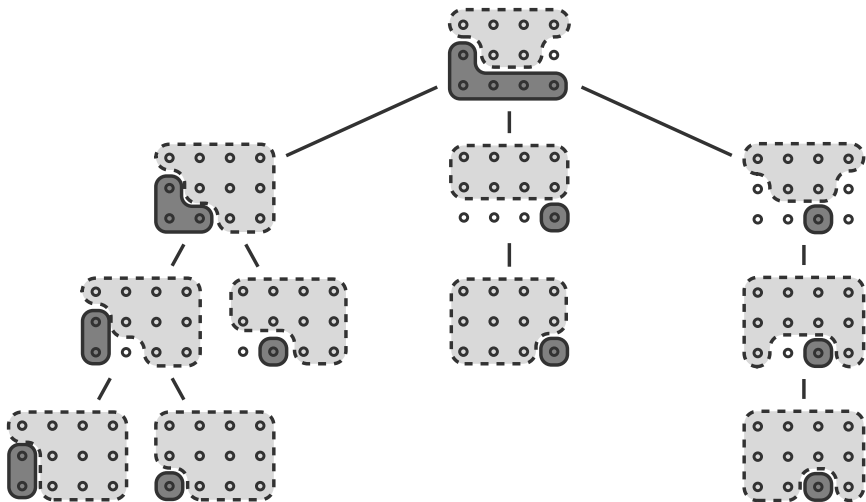
	no degree-bounds	degree-bounds on terminals	degree-bounds on arbitrary terminals
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uniform node	← →	laminar, if $n > 3k - 3$ →	← →
out node	laminar, only entering arcs	← →	← →

1

1. Laminar, undirected  $\rightarrow (O(k), O(k) \cdot b(v))$ -approx

## Laminar family of set-pairs defines a forest

$(U, U')$  is the parent of  $(W, W')$  if  $W \subset U$  or if  $W = U$  and  $U' \subset W'$ .



## Token distribution

We prove

### Theorem

If  $x^*$  is uniquely defined from the laminar family of tight set-pairs, one of the following holds:

- $\exists e \in E : x^*(e) = 0$
- $\exists e \in E : x^*(e) \geq 1/(4k - 1)$
- $\exists v \in B : |\delta(v)| \leq 4k - 1$

Assume  $0 < x^*(e) < 1/(4k - 1)$  for  $\forall e \in E$ , and  $|\delta(v)| \geq 4k$  for  $\forall v \in B$ .

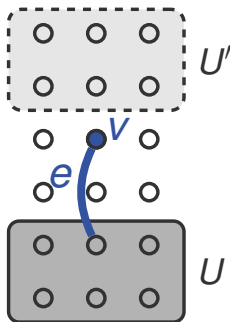
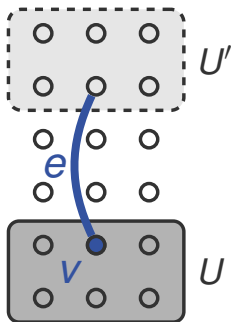
1. We make each edge distributes at most 2 tokens to set-pairs.
2. We show each set-pair receives  $\geq 2$  tokens, and the root receives  $\geq 4$  tokens.

## Initial distribution

### Token distribution rule

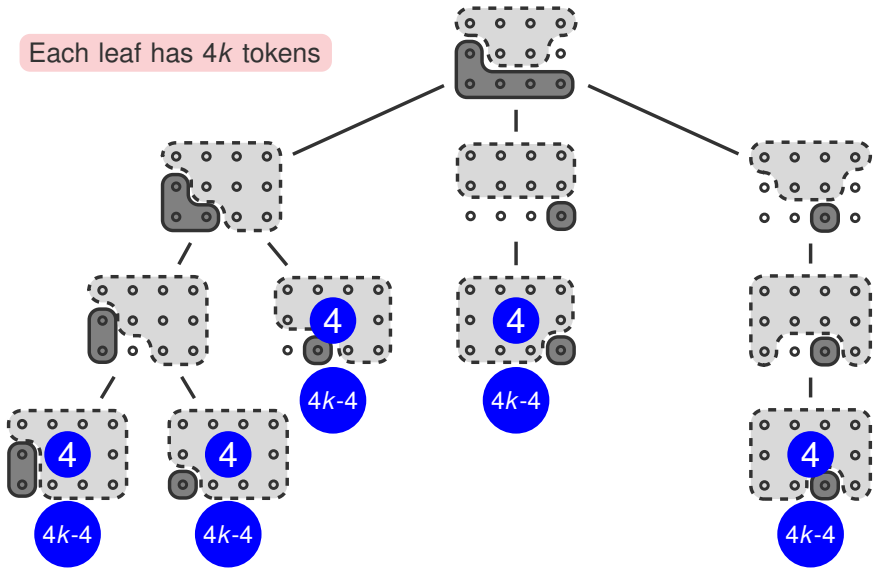
For each  $e = uv$  and its end-node  $v$ ,  $e$  gives a token to

1. minimal  $(U, U')$  s.t.  $e \in \delta(U, U')$  and  $v \in U$  if it exists,
2. minimal  $(U, U')$  s.t.  $e \notin \delta(U, U')$  and  $u \in U$  otherwise.



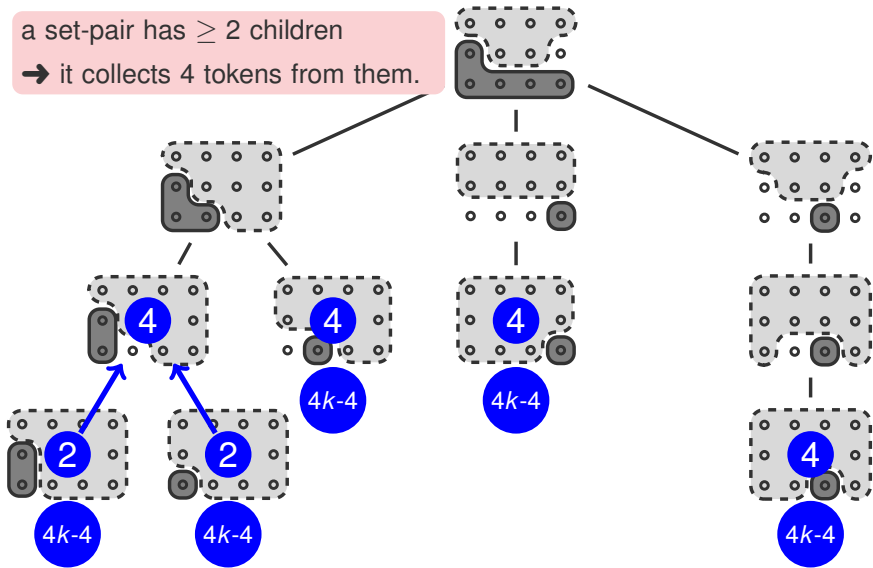
# Inductive distribution

Each leaf has  $4k$  tokens

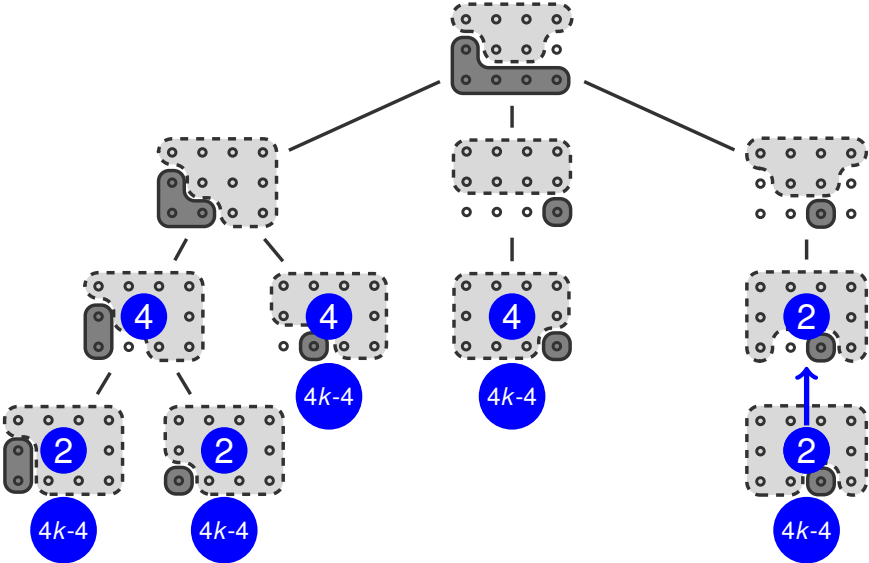


# Inductive distribution

a set-pair has  $\geq 2$  children  
→ it collects 4 tokens from them.



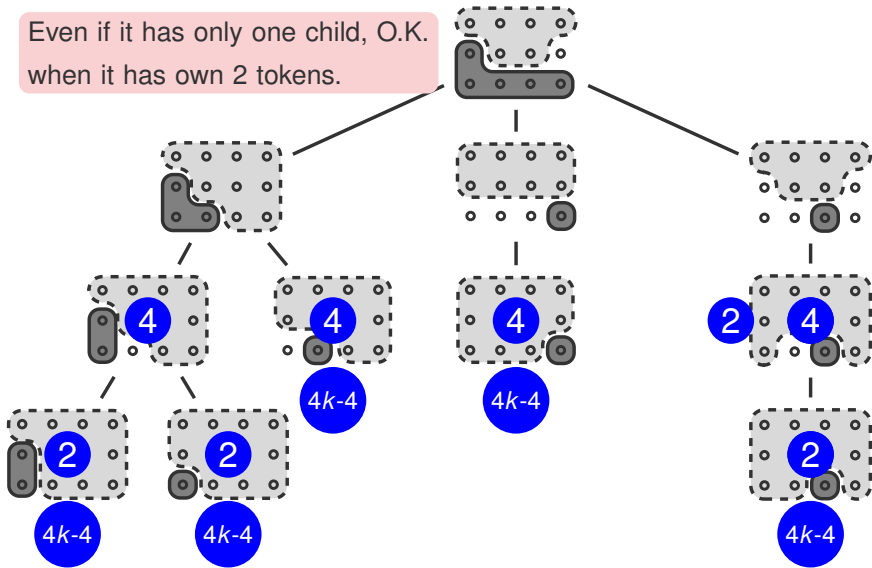
# Inductive distribution



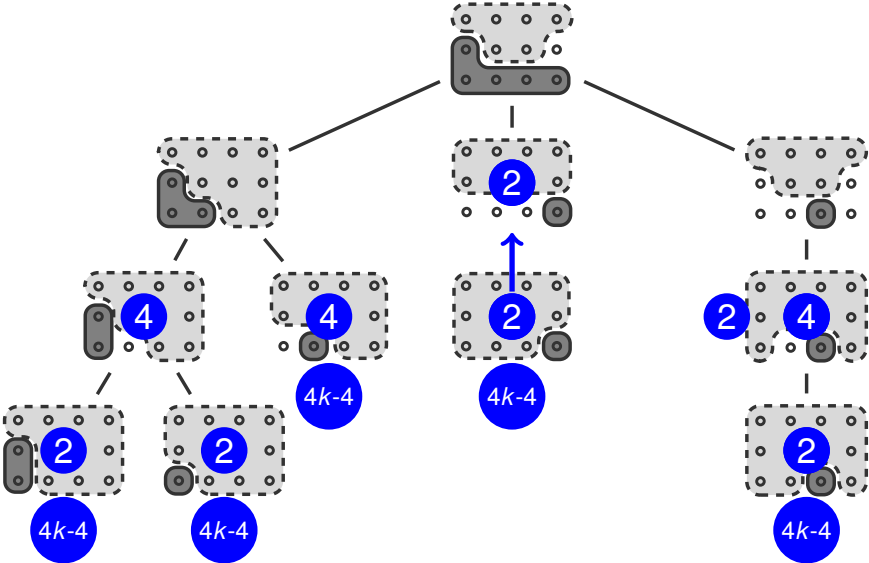


# Inductive distribution

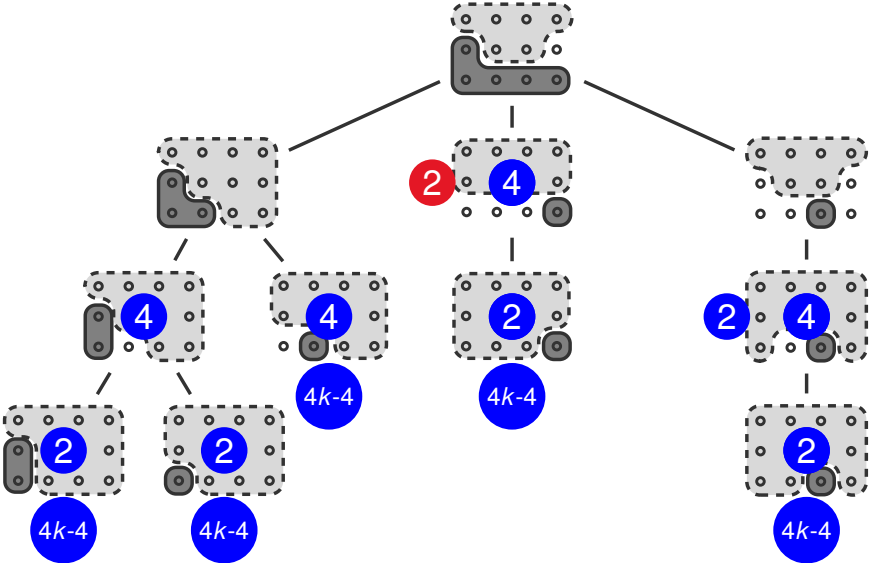
Even if it has only one child, O.K. when it has own 2 tokens.



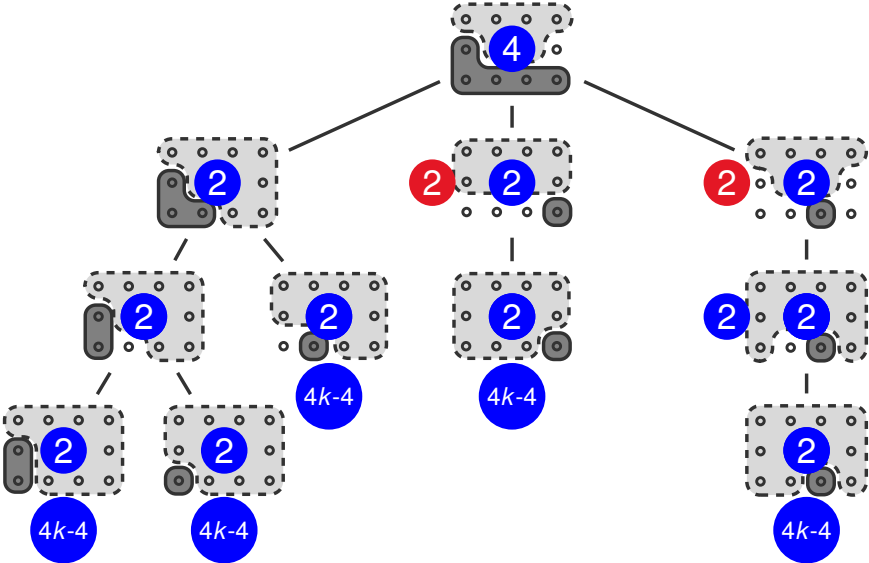
# Inductive distribution



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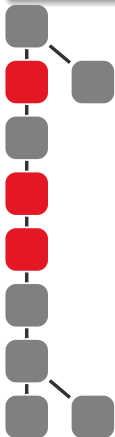
# Inductive distribution



## How many red tokens?

### Theorem

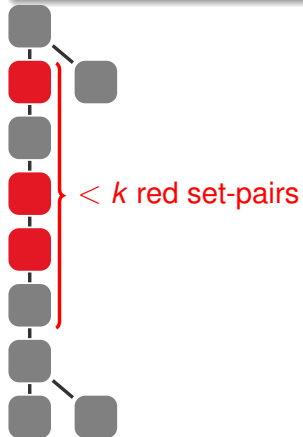
# of red tokens in the forest  $< 4(k - 1) \times$  (# of leaves)



# How many red tokens?

## Theorem

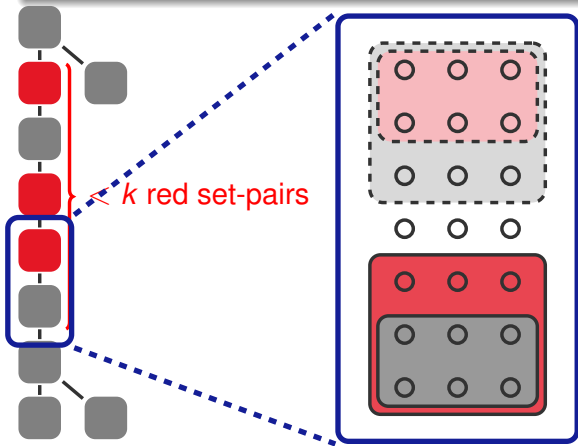
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# How many red tokens?

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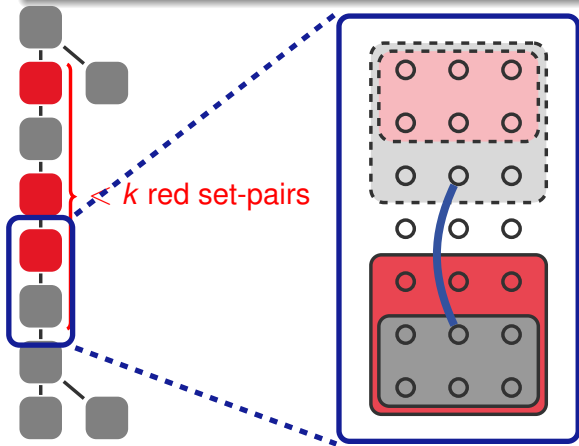
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# How many red tokens?

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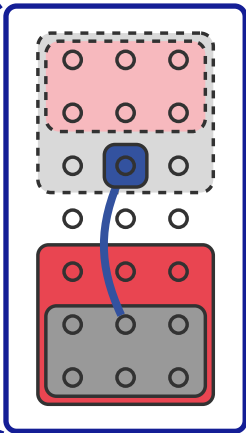
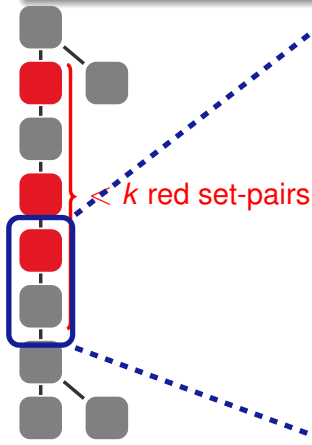




# How many red tokens?

## Theorem

# of red tokens in the forest  $< 4(k - 1) \times (\# \text{ of leaves})$



blue set remains in the boundary of the last set-pair on the path



#red set-pairs on the path  $\leq k - 1$



#red set-pairs in the forest  $< 2(k-1) \times \# \text{leaves}$

## Result 3

	no degree-bounds	degree-bounds on terminals	degree-bounds on arbitrary terminals	
element	← strongly	laminar →	laminar	3
uniform node	←	laminar, if $n > 3k - 3$	→	
out node	laminar, only entering arcs	← laminar →	→	

3. Strongly laminar w/ degree-bounds, undirected →  
 $(4, 4b(v) + O(k))$ -approx

# Strongly laminar family of set-pairs with degree-bounds

## Theorem

If  $x^*$  is defined from a **strongly laminar** family of tight set-pairs and **tight degree-bounds**, then one of the following holds:

- $\exists e \in E : x^*(e) = 0$
- $\exists e \in E : x^*(e) \geq 1/4$
- $\exists v \in B : |\delta(v)| < 2.5k + 6.25$

## Idea 2: Using two different counting methods

$\mathcal{L}$  := strongly laminar family of set-pairs

$C$  := set of tight degree-bounded nodes

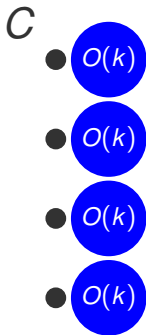
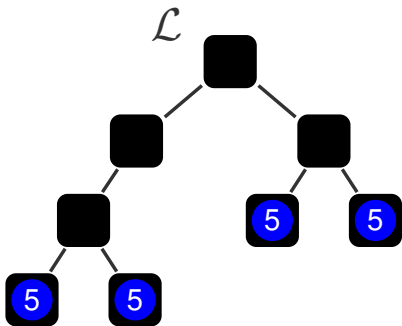
**Case (i):  $C$  is small** (i.e.  $2|C| \leq \# \text{ leaves}$ )

A leaf gives tokens to nodes in  $C$ , and follow the 2-approx proof without  $C$

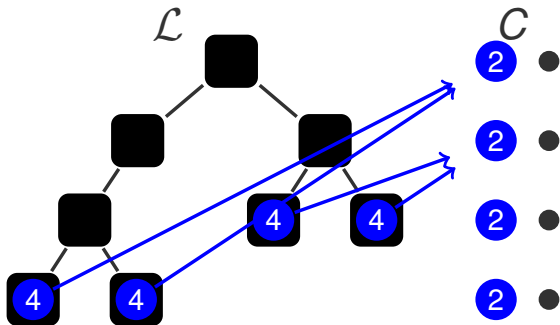
**Case (ii):  $C$  is large** (i.e.  $2|C| > \# \text{ leaves in } \mathcal{L}$ )

Nodes in  $C$  give tokens to leaves, and follow the proof for the laminar set-pair family in undirected graphs

# Token distribution



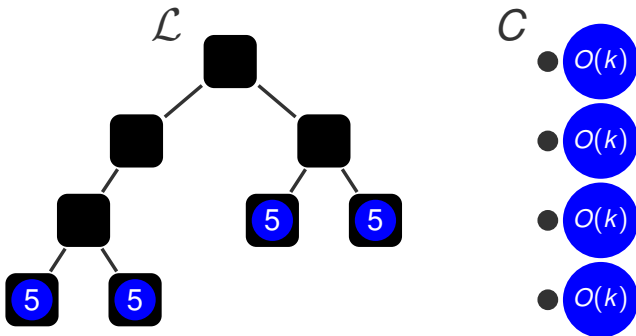
## Token distribution



When  $2|C| \leq \# \text{ leaves of } \mathcal{L}$

- each leaf gives 2 tokens to a node in  $C$
- nodes in  $C$  release their tokens

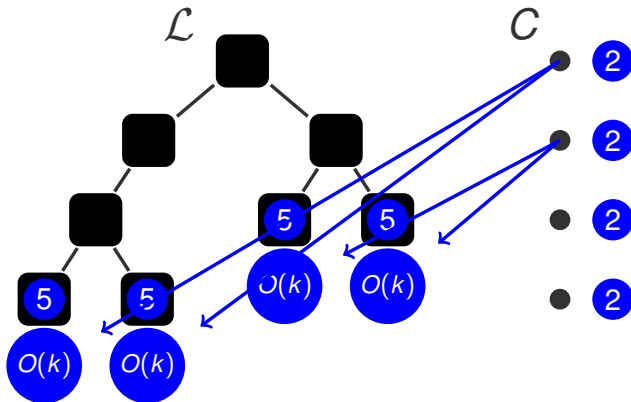
## Token distribution



When  $2|C| \geq \# \text{ leaves of } \mathcal{L}$

- each node in  $C$  keeps 2 tokens
- nodes in  $C$  give the other tokens to leaves of  $\mathcal{L}$

## Token distribution



When  $2|C| \geq \# \text{ leaves of } \mathcal{L}$

- each node in  $C$  keeps 2 tokens
- nodes in  $C$  give the other tokens to leaves of  $\mathcal{L}$



## Conclusion

- Laminar, undirected  $\rightarrow (O(k), O(k) \cdot b(v))$ -approx
- Laminar, directed  $\rightarrow (2, k, 2b^+(v) + O(k))$ -approx
- Strongly laminar w/ degree-bounds, undirected  $\rightarrow (4, 4b(v) + O(k))$ -approx
- Laminar, undirected  $\rightarrow (+\infty, 6b(v) + O(k^2))$ -approx
- Strongly laminar w/ degree-bounds, undirected  $\rightarrow (+\infty, 2b(v) + O(k^2))$ -approx

## Future works

- Narrow the gap between  $O(k)$  and  $\Omega(\sqrt{k})$  for uniform node-connectivity req. by iterative rounding
- Iterative rounding for other cases of node-connectivity