## Linearity versus contiguity for encoding graphs

Tien-Nam Le ENS de Lyon

### With Christophe Cresspele, Kevin Perrot, and Thi Ha Duong Phan

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3 Sketch of proof



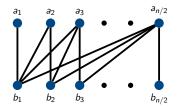
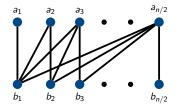


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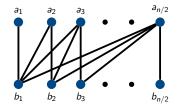


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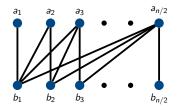


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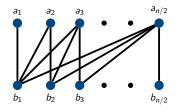


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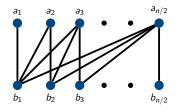


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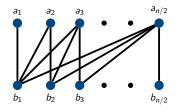


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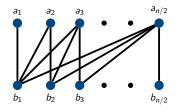


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#### Adjacency-intervals scheme:

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Space complexity = O(n).

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- **②** For every vertex u, store all neighbor-intervals of u in  $\sigma$  (store the first and last nodes).



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- Complexity  $\leq n + 2k_{\sigma}n$ , where  $k_{\sigma} = \max_{u}(\# \text{ intervals of } u \text{ in } \sigma)$ .
- The smaller  $k_{\sigma}$ , the better encoding.

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**Question:** Which graphs have small contiguity?

# Contiguity of cographs

### Theorem (Crespelle, Gambette' 2014)

• Contiguity of any **cograph** on *n* vertices is  $O(\log n)$ .

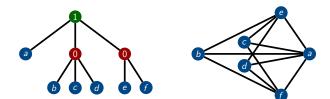


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- Contiguity of any cograph corresponding to some complete binary cotree is ⊖(log n).

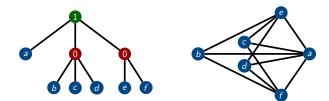


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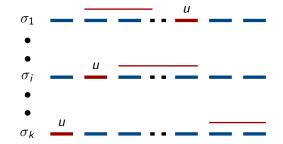
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### Alternative adjacency-intervals scheme

• Store a collection of permutations  $\Sigma = \{\sigma_1, \sigma_2, ..., \sigma_k\}$ .

**2** For each  $u \in V$  and  $\sigma_i \in \Sigma$ , store **one** neighbor-interval of u per  $\sigma_i$ .



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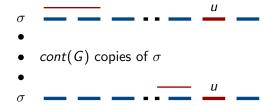
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### Direct corollary

For any cograph G on n vertices corresponding to some complete binary cotree,  $lin(G) = O\left(\frac{cont(G)}{\log \log n}\right) = o(cont(G)).$ 









# Sketch of proof

### Definition: Double factorial tree

The **double factorial tree**  $F^k$  is defined by induction:

•  $F^0$  is a singleton.

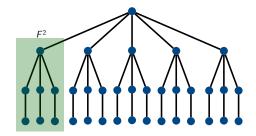


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- The root of F<sup>k</sup> has exactly 2k 1 children, each is the root of a copy of F<sup>k-1</sup>.

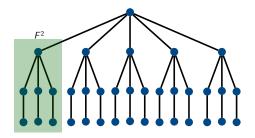


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### Definition: Rank

Let T be a rooted tree.

- The rank of T is the maximum k such that  $F^k$  is a minor of T.
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#### Definition: Critical node

A node u in T is **critical** if its rank is strictly greater than the rank of all its children.

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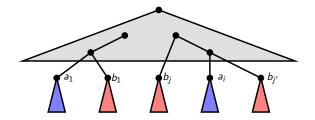
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Combine with (i) in key lemma,  $lin(G) = O\left(\frac{\log n}{\log \log n}\right)$ .

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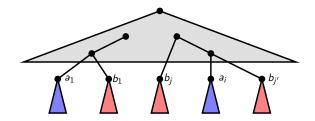
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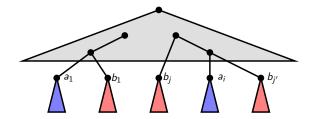
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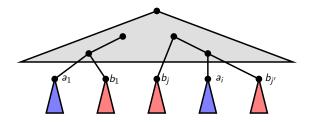
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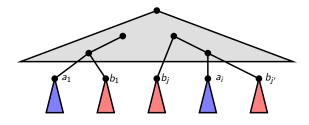
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- $A = \{a_1, a_2, ...\}$ : critical nodes of rank k (blue).
- B = {b<sub>1</sub>, b<sub>2</sub>, ...}: nodes of rank k 1, whose parent is non-critical of rank k (red).



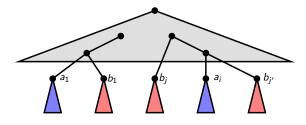
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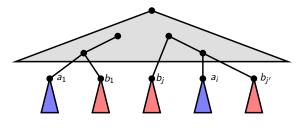
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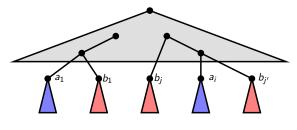
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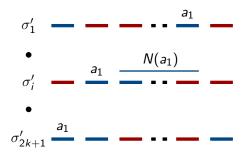
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- Contract T<sub>ai</sub> (res. T<sub>bj</sub>) into a<sub>i</sub> (res. b<sub>j</sub>), we get a new cotree T' of a cograph G'. G' has |A| + |B| vertices, each represents a component of G.



### Claim

There exists an encoding of G' by  $\Sigma' = \{\sigma'_1, ..., \sigma'_{2k+1}\}$  such that:

- Neighbor set of each a<sub>i</sub> is encoded by only **one interval**.
- Neighbor set of each b<sub>j</sub> is encoded by at most **two intervals** in two distinct permutations.

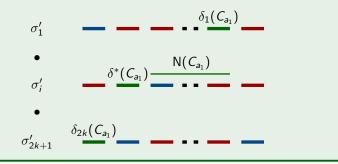


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Replace  $a_1$  by  $\delta_1(C_{a_1}), ..., \delta_{2k}(C_{a_1})$ : (Note that all vertices in  $C_{a_1}$  have the same neighbors outside  $C_{a_1}$ ).



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The lemma is proved.



### 2 Linearity

3 Sketch of proof



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- When temporary storage is full, re-encode G.

### Definition:

Let f be a function of n. A graph G is **nearly** f-contiguous if there exists a graph G' such that

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Question: Which graphs are nearly log *n*-contiguous?

Thank you.