

# Algorithmic Aspects of Modular Decomposition

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Habilitation (in French) available at [www.lirmm.fr/~paul](http://www.lirmm.fr/~paul)

## Joint work with

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- A. Bretscher, D. Corneil (U. of Toronto),
- M. Habib, F. de Montgolfier (LIAFA),
- L. Viennot (INRIA Rocquencourt)

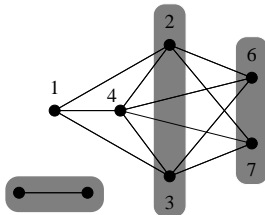
## Some motivations

- A very natural operation on discrete structures (used in the proof of the perfect graph theorem)
- Help to capture the structure of many graph families (basis of a theory for comparability graphs)
- Divide and conquer paradigm for optimization problems
- Provide compact representation of graphs (even for dynamic graphs)
- ...

- 1 Definitions and preliminaries
- 2 Ehrenfeucht et al.'s algorithm
  - Principle
  - Computation of  $\mathcal{M}(G, v)$
  - Computation of  $MD(G/\mathcal{M}(G, v))$
- 3 New algorithmic trends
  - Factoring permutation
  - LexBFS

## Modules

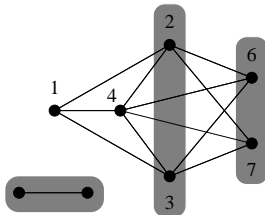
A subset of vertices  $M$  of a graph  $G = (V, E)$  is a **module** iff  
 $\forall x \in V \setminus M$ , either  $M \subseteq N(x)$  or  $M \cap N(x) = \emptyset$



Examples of modules

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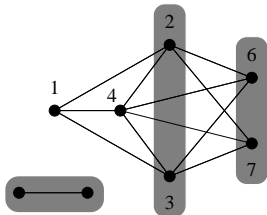


### Examples of modules

- connected components
- connected components of  $\overline{G}$

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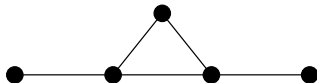


### Examples of modules

- connected components
- connected components of  $\overline{G}$
- any vertex subset of the complete graph (or the stable)

## Prime graphs and degenerate graphs

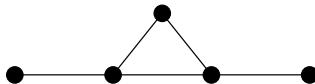
- A graph is **prime** if all its modules are trivial: e.g. the  $P_4$ .
- A graph is **degenerate** if any subset of vertices is a module: cliques and stables.





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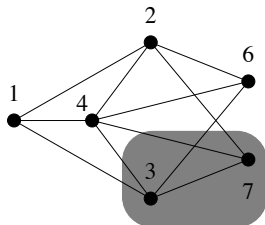


## Lemma (Cournier, Ille 91)

*If  $G$  is a prime graph, then any vertex but at most one belongs to a  $P_4$ .*

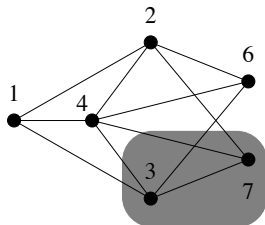
## Splitter

For a graph  $G = (V, E)$ , the vertex  $x$  is a **splitter** for a set  $S$  of vertices if  $\exists y, z \in S$  with  $xy \in E$  and  $xz \notin E$ . We say that  $x$  **separate**  $y$  and  $z$ .



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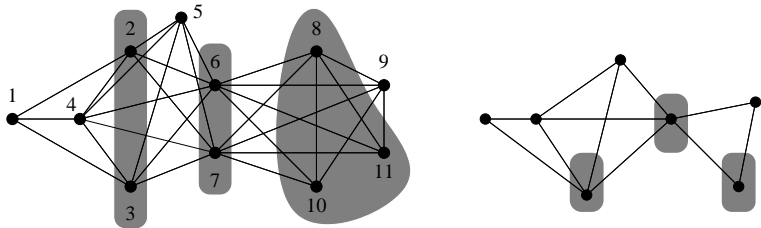


## Lemma

*If  $x$  is a splitter for the set  $S$ , then any module  $M$  containing  $S$  must also contain  $x$ .*

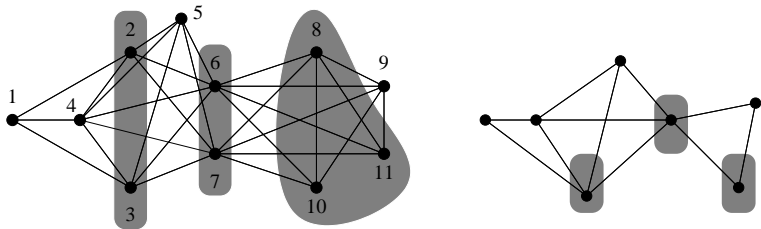
## Modular partition

A partition  $\mathcal{P}$  of the vertex set of a graph  $G = (V, E)$  is a **modular partition** of  $G$  if any part is a module of  $G$ .



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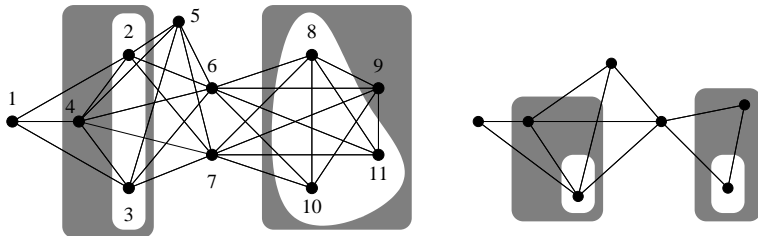


Let  $\mathcal{P}$  be a modular partition of a graph  $G = (V, E)$ . The **quotient graph**  $G_{/\mathcal{P}}$  is the induced subgraph obtained by choosing one vertex per part of  $\mathcal{P}$ .

## Lemma (MR84)

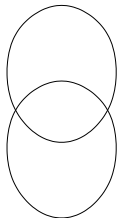
Let  $\mathcal{P}$  be a modular partition of  $G = (V, E)$ .

$\mathcal{X} \subseteq \mathcal{P}$  is a module of  $G/\mathcal{P}$  iff  $\cup_{M \in \mathcal{X}} M$  is a module of  $G$ .



## Lemma

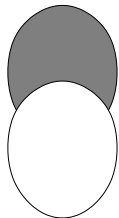
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- *$M \setminus M'$  is a module*

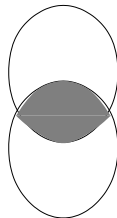




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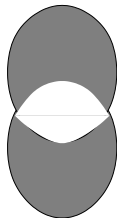
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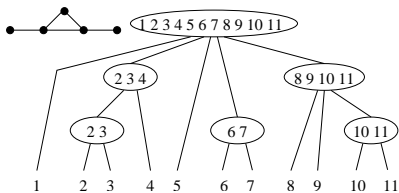
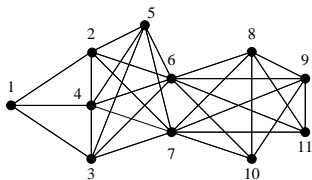
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- $M \cap M'$  is a module
- $M \Delta M'$  is a module



- The set of modules of a graph defines a **partitive family**
- A module is **strong** if it does not overlap any other module

The set of strong modules is nested into an inclusion tree (called the **modular decomposition tree**  $MD(G)$  of  $G$ ).



## Theorem (Gal'67,CHM81)

Let  $G = (V, E)$  be a graph. Then either

- 1  $G$  is not connected, or
- 2  $\overline{G}$  is not connected, or
- 3  $G_{/\mathcal{M}(G)}$  is a prime graph, with  $\mathcal{M}(G)$  the modular partition containing the maximal strong modules of  $G$ .

$\Rightarrow$  "Brut force" algorithm in  $O(n^3)$  time

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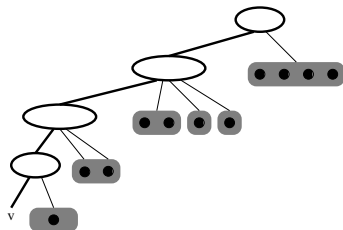
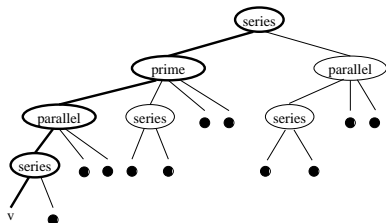
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**That was only for undirected graphs!!!**

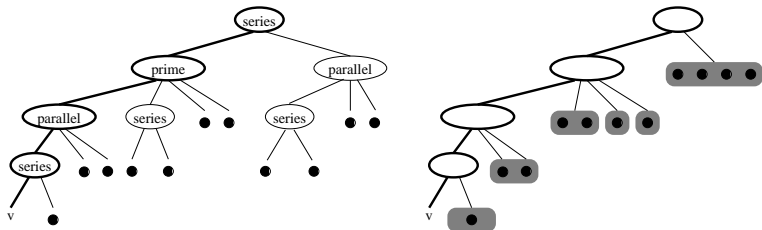


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$\mathcal{M}(G, v)$  is composed by  $\{v\}$  and the maximal modules of  $G$  not containing  $v$ .



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## Principle of the Ehrenfeucht et al.'s algorithm

- 1 Compute  $\mathcal{M}(G, v)$
- 2 Compute  $MD(G/\mathcal{M}(G, v))$
- 3 For each  $\mathcal{X} \in \mathcal{M}(G, v)$  compute  $MD(G[\mathcal{X}])$

## Lemma

*If  $x$  is a splitter of a set  $S$ , then for any module  $M$  contained in  $S$  either  $M \subseteq S \cap N(x)$  or  $M \subseteq M \cap \overline{N}(x)$*

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$\Rightarrow O(n + m \log n)$  time using vertex partitioning algorithm.



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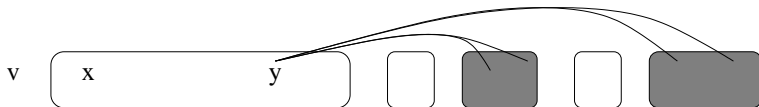


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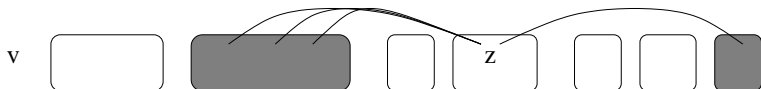


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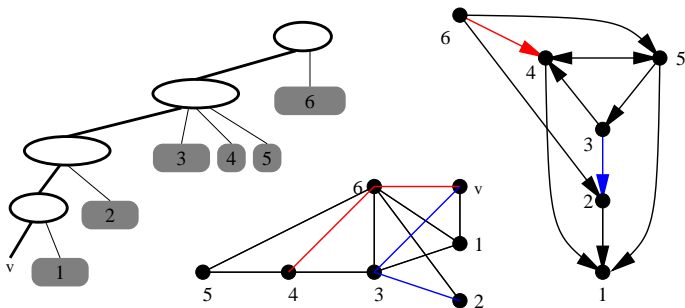






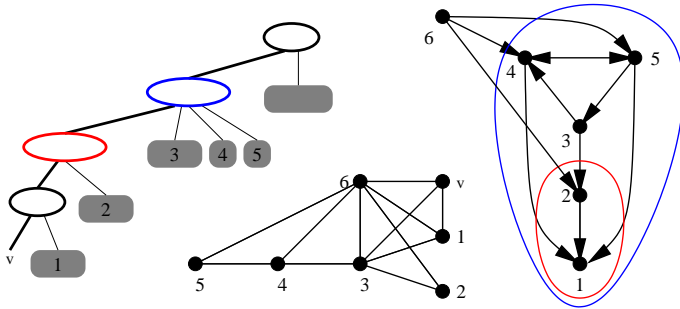
## Computation of $MD(G/\mathcal{M}(G, v))$

- The modules of  $G/\mathcal{M}(G, v)$  are linearly nested:  
 any non-trivial module contains  $v$
- The forcing graph  $\mathcal{F}(G, v)$  has edge  $\overrightarrow{xy}$  iff  $y$  separates  $x$  and  $v$



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## Complexity

- [Ehrenfeucht et al.'94] gives a  $O(n^2)$  complexity.
- [MS00] gives a very simple  $O(n + m \log n)$  algorithm based on vertex partitioning.
- [DGM'01] proposes a  $O(n + m \cdot \alpha(n, m))$  and a more complicated  $O(n + m)$  implementation.

## Other algorithms

- [CH94] and [MS94] present the first linear algorithms.
- [MS99] present a new linear time algorithm which extend to transitive orientation.

## Still open

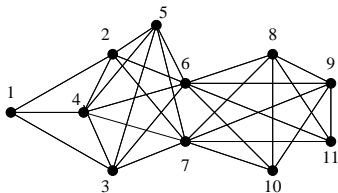
Find a simple linear time modular decomposition algorithm.

## [Spinrad'03]

The new [linear time] algorithm [MS99] is currently too complex to describe easily [...]. The first  $O(n^2)$  partitioning algorithms were similarly complex; I hope and believe that in a number of years the linear algorithm can be simplified as well.

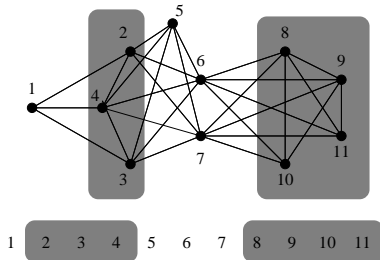
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A **factoring permutation** of a graph  $G = (V, E)$  is a permutation of  $V$  in which any strong module of  $G$  is a factor. [Capelle 97]



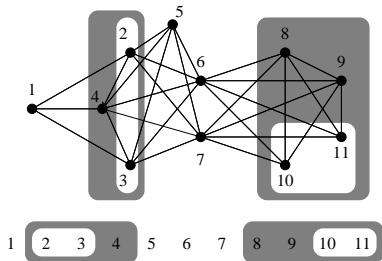
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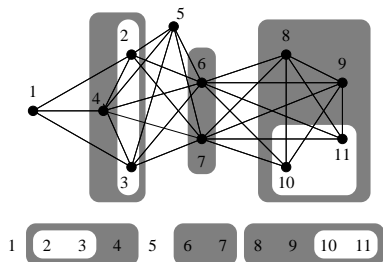




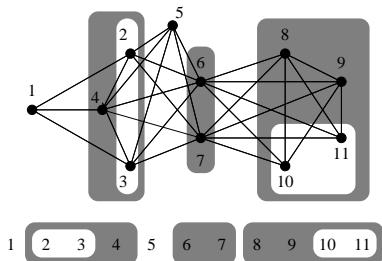
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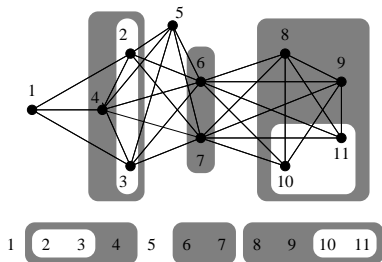


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- From  $G$  to factoring permutation:  
 $O(n + m \log n)$  [HPV99]

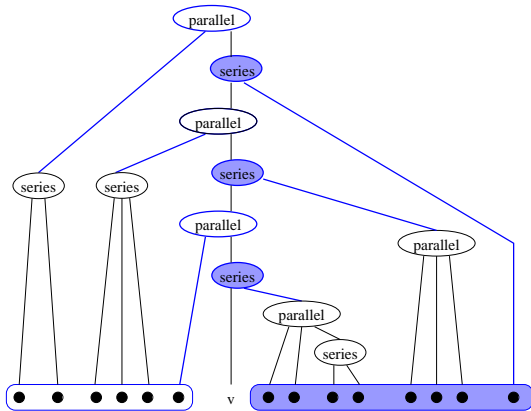
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- From  $G$  to factoring permutation:  
 $O(n + m \log n)$  [HPV99]
- From factoring permutation to  $MD(G)$ :  
 $O(n + m)$  [CdMH01]  
 [UY00] [BXHP05]

## Factoring permutation (of cographs) via vertex partitioning

At each step, the partition can be refined into a factoring permutation.

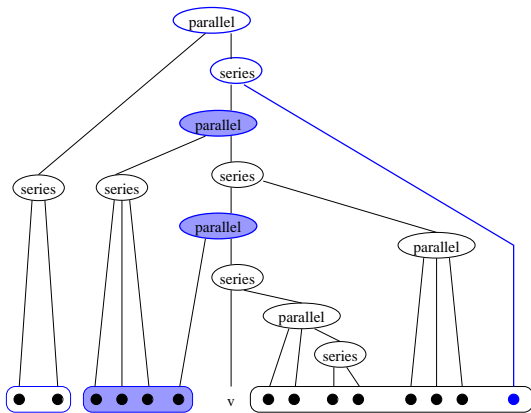


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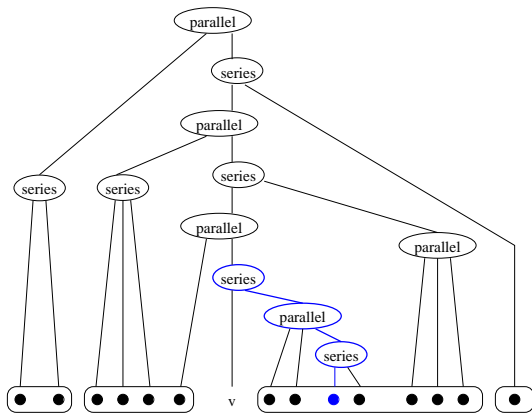
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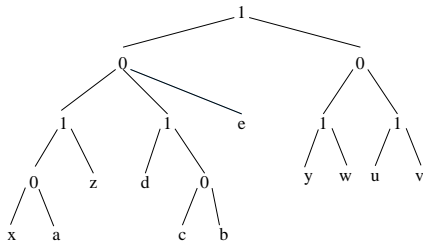
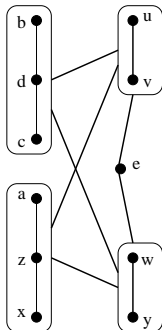
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- 3 For some graph families, computing  $MD(G)$  from a factoring permutation costs  $O(n)$  time

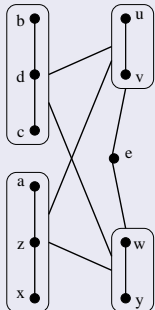
- 1 Best known complexity:  $O(n + m \log n)$  and  $O(n + m)$  for cographs
- 2 Recent algorithmic results around this notion [UY00] [BXHP05] [BCdMR05]
- 3 For some graph families, computing  $MD(G)$  from a factoring permutation costs  $O(n)$  time
- 4 Generalization for other decomposition like for example the split decomposition ?...

## A cograph recognition algorithm [BCHP03]

- 1  $\sigma \leftarrow \text{LexBFS}(G)$
- 2  $\bar{\sigma} \leftarrow \text{LexBFS}^-(\bar{G}, \sigma)$
- 3 **If**  $\sigma$  and  $\bar{\sigma}$  both have the NS-property **then**
  - 1 Answer "  $G$  is a cograph"
  - 2 Build  $MD(G)$
- 4 **Else** Output a  $P_4$



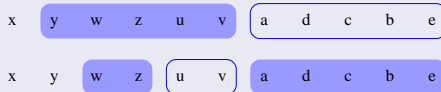
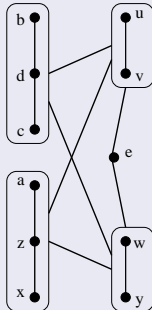
## Computing a LexBFS ordering $\sigma$



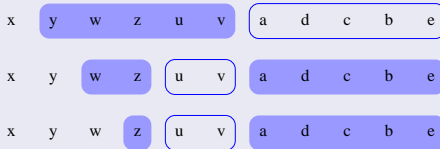
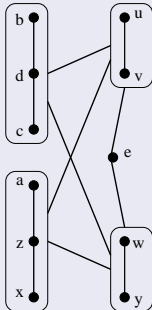
x    y   w   z   u   v    a   d   c   b   e



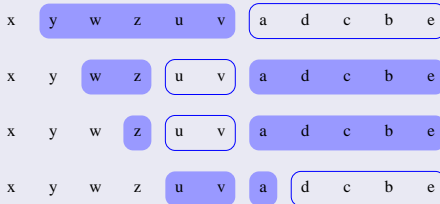
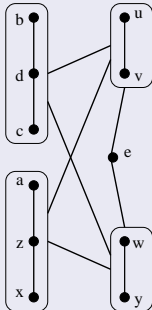
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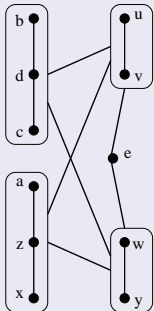
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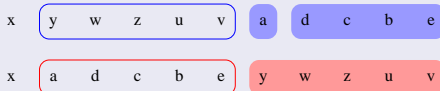
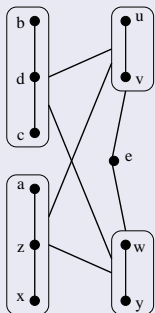


## Computing a LexBFS ordering $\sigma$

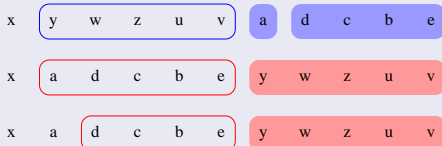
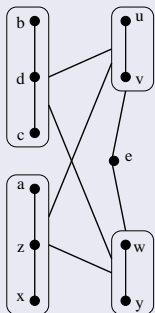


x	y	w	z	u	v	a	d	c	b	e
x	y	w	z	u	v	a	d	c	b	e
x	y	w	z	u	v	a	d	c	b	e
x	y	w	z	u	v	a	d	c	b	e
x	y	w	z	u	v	a	d	c	b	e

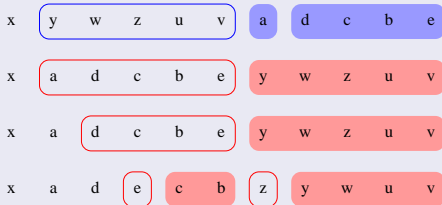
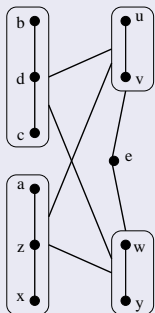
## Computing $\bar{\sigma} = \text{LexBFS}^-(\bar{G}, \sigma)$

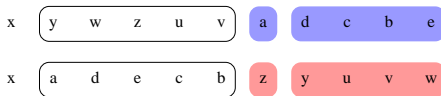
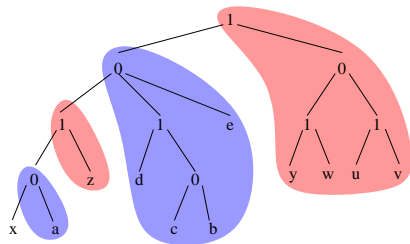
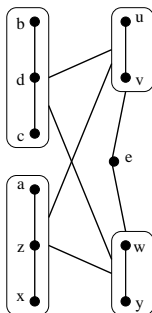


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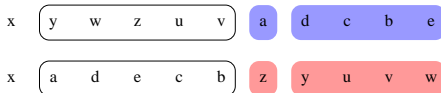
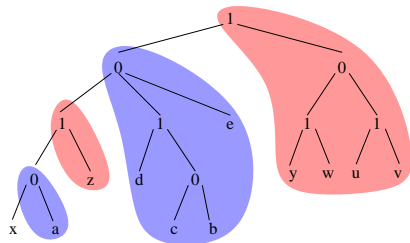
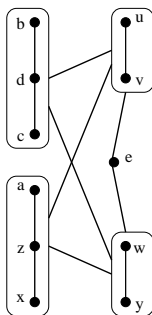




### Lemma

$\mathcal{M}(G, x)$  is composed by the slices  $S_i(x)$  of  $\sigma$  and  $\overline{S}_j(x)$  of  $\overline{\sigma}$ .





## Theorem

*If  $G$  is a cograph, then  $MD(G)$  can be retrieved from the slice structure of  $\sigma$  and  $\bar{\sigma}$ .*

## Generalisation to arbitrary graphs ?

- 1 There are many similarities between two-LexBFS-sweep algorithm and the linear implementation of Ehrenfeucht et al.'s algorithm [DGM01]
- 2 LexBFS is useful for the transitive orientation problem. Could it lead to a simple linear time algorithm for this problem ?

## Miscellaneous : other works related to modular decomposition

- 1 Representation of dynamic graphs (cf. C. Crespelle's PhD-thesis)
  - cographs, permutation graphs ...

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- 1 Representation of dynamic graphs (cf. C. Crespelle's PhD-thesis)
  - cographs, permutation graphs ...
- 2 Perfect sorting by reversals
  - efficient parametrized algorithm based on the modular decomposition tree
  - characterization of the permutations having perfect parsimonious scenarios

Thank you...