

# Chordal graphs MPRI 2017–2018

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# Schedule

Chordal graphs

Representation of chordal graphs

LBFS and chordal graphs

More structural insights of chordal graphs

Other classical graph searches and chordal graphs

Greedy colorings

## Definition

A graph is chordal iff it has no chordless cycle of length  $\geq 4$  or equivalently it has no induced cycle of length  $\geq 4$ .

- ▶ Chordal graphs are hereditary
- ▶ Interval graphs are chordal

## Applications

- ▶ Many NP-complete problems for general graphs are polynomial for chordal graphs.
- ▶ Graph theory :  
Treewidth (resp. pathwidth) are very important graph parameters that measure distance from a chordal graph (resp. interval graph).
- ▶ Perfect phylogeny<sup>1</sup>

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1. In fact chordal graphs were first defined in a biological modelisation perspective !

G.A. Dirac,  
On rigid circuit graphs,  
Abh. Math. Sem. Univ. Hamburg, 38 (1961), pp. 71–76

## About Representations

- ▶ Interval graphs are chordal graphs
- ▶ How can we represent chordal graphs?
- ▶ As an intersection of some family?
- ▶ This family must generalize intervals on a line

## Fundamental objects to play with

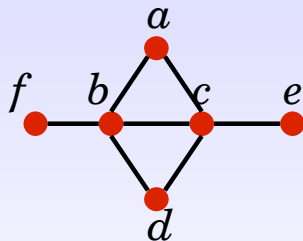
- ▶ Maximal Cliques under inclusion
- ▶ We can have exponentially many maximal cliques :  
A complete graph  $K_n$  in which each vertex is replaced by a pair of false twins has exactly  $2^n$  maximal cliques.
- ▶ Every edge is included in at least one maximal clique

## Minimal Separators

A subset of vertices  $S$  is a **minimal separator** if  $G$  if there exist  $a, b \in G$  with  $ab \notin G$ , such that  $a$  and  $b$  are not connected in  $G - S$ .  
and  $S$  is minimal for inclusion with this property .



## An example



3 minimal separators  $\{b\}$  for  $f$  and  $a$ ,  $\{c\}$  for  $a$  and  $e$  and  $\{b, c\}$  for  $a$  and  $d$ .

If  $G = (V, E)$  is connected then for every  $a, b \in V$  such that  $ab \notin E$

then there exists at least one minimal separator.

But there could be an **exponential number of minimal separators**.

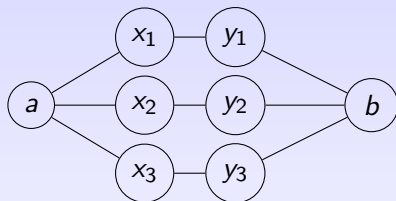


FIGURE: A graph with  $2^n$  minimal  $ab$ -separators

## VIN : Maximal Clique trees

A maximal clique tree (clique tree for short) is a tree  $T$  that satisfies the following three conditions :

- ▶ Vertices of  $T$  are associated with the maximal cliques of  $G$
- ▶ Edges of  $T$  correspond to minimal separators.
- ▶ For any vertex  $x \in G$ , the cliques containing  $x$  yield a subtree of  $T$ .

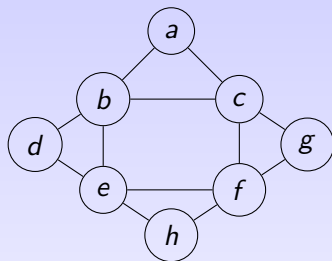
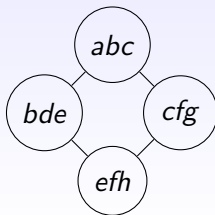


FIGURE: A graph and the intersection graph of its maximal cliques



No tree on these 4 maximal cliques satisfies the third condition of maximal clique trees.

## Helly Property

### Definition

A subset family  $\{T_i\}_{i \in I}$  satisfies Helly property if  
 $\forall J \subseteq I$  et  $\forall i, j \in J$   $T_i \cap T_j \neq \emptyset$  implies  $\bigcap_{i \in J} T_i \neq \emptyset$

### Exercise

Subtrees in a tree satisfy Helly property.

## Démonstration.

Suppose not. Consider a family of subtrees that pairwise intersect. For each vertex  $x$  of the tree  $T$ , if  $x$  belongs to every subtree of the family, it contradicts the hypothesis. Therefore at least one subtree does not contain  $x$ . If the subtrees belongs to two different components of  $T-x$  this would contradict the pairwise intersection of the subtrees. Therefore all the subtrees are in exactly one component of  $T-x$  (N.B. some subtrees may contain  $x$ ).

Direct exactly one edge of  $T$  from  $x$  to this component.

This yields a directed graph  $G$ , which has exactly  $n$  vertices and  $n$  directed edges. Since  $T$  is a tree, it contains no cycle, therefore it must exist a pair of symmetric edges in  $G$ , which contradicts the pairwise intersection.





## Main chordal graphs characterization theorem

Using results of Dirac 1961, Fulkerson, Gross 1965, Buneman 1974, Gavril 1974 and Rose, Tarjan and Lueker 1976 :

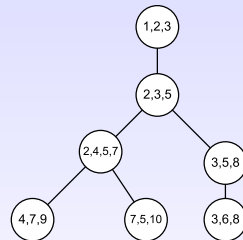
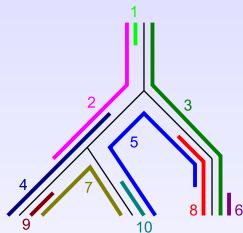
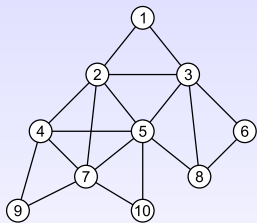
For a connected graph, the following statements are equivalent and characterize chordal graphs :

- (0)  $G$  has no induced cycle of length  $> 3$
- (i)  $G$  admits a simplicial elimination scheme
- (ii) Every minimal separator is a clique
- (iii)  $G$  admits a maximal clique tree.
- (iv)  $G$  is the intersection graph of subtrees in a tree.
- (v) Any MNS (LexBFS, LexDFS, MCS) provides a simplicial elimination scheme.

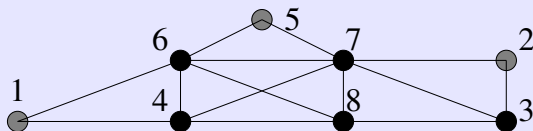
Two subtrees intersect iff they have at least one vertex in common,  
not necessarily an edge in common.

By no way, these representations can be uniquely defined!

## An example



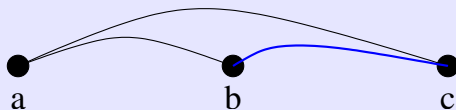
## Chordal graph



A vertex is simplicial if its neighbourhood is a clique.

## Simplicial elimination scheme

$\sigma = [x_1 \dots x_i \dots x_n]$  is a simplicial elimination scheme if  $x_i$  is simplicial in the subgraph  $G_i = G[\{x_i \dots x_n\}]$



## Lexicographic Breadth First Search (LBFS)

**Data:** a graph  $G = (V, E)$  and a start vertex  $s$

**Result:** an ordering  $\sigma$  of  $V$

Assign the label  $\emptyset$  to all vertices

$label(s) \leftarrow \{n\}$

**for**  $i \leftarrow n \text{ à } 1$  **do**

    Pick an unnumbered vertex  $v$  **with lexicographically largest label**

$\sigma(i) \leftarrow v$

**foreach** *unnumbered vertex  $w$  adjacent to  $v$*  **do**

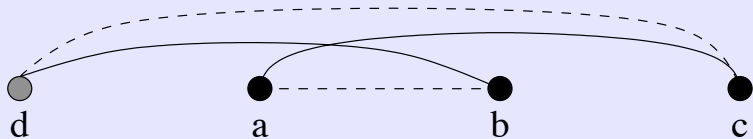
$label(w) \leftarrow label(w). \{i\}$

**end**

**end**

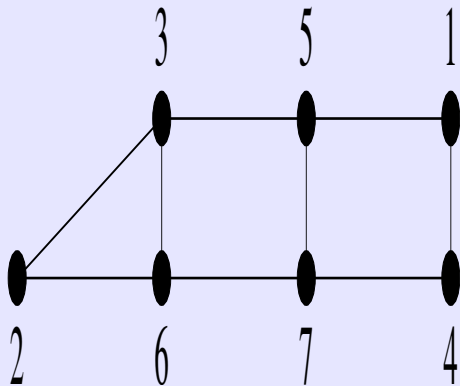
## Property (LexB)

For an ordering  $\sigma$  on  $V$ , if  $a <_{\sigma} b <_{\sigma} c$  and  $ac \in E$  and  $ab \notin E$ , then it must exist a vertex  $d$  such that  $d <_{\sigma} a$  et  $db \in E$  et  $dc \notin E$ .



## Theorem

For a graph  $G = (V, E)$ , an ordering  $\sigma$  on  $V$  is a LBFS of  $G$  iff  $\sigma$  satisfies property (LexB).



## Theorem [Tarjan et Yannakakis, 1984]

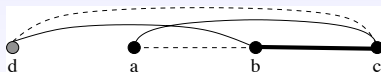
$G$  is chordal iff **every** LexBFS ordering yields a simplicial elimination scheme.

### Proof :

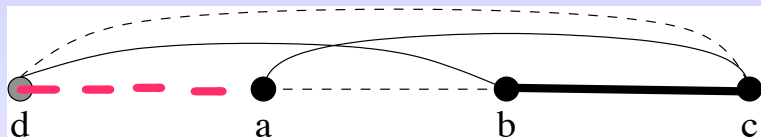
Let  $c$  be a non simplicial vertex.

There exist  $a < b \in N(c)$  avec  $ab \notin E$ .

Using characterization of LexBFS orderings, it exists  $d < a$  with  $db \in E$  and  $dc \notin E$ . Since  $G$  is chordal, necessarily  $ad \notin E$ .







But then from the triple  $d, a, b$ , it exists  $d' < d$  with  $d'a \in E$  and  $d'b \notin E$ . Furthermore  $d'd \notin E \dots$

And using the triple  $d', d, a$ , we start an infinite chain .....

### Remark

Most of the proofs based on some characteristic ordering of the vertices are like that, with no extra reference to the algorithm itself.

## Main chordal graphs characterization theorem

Using results of Dirac 1961, Fulkerson, Gross 1965, Buneman 1974, Gavril 1974 and Rose, Tarjan and Lueker 1976 :

For a connected graph, the following statements are equivalent and characterize chordal graphs :

- (0)  $G$  has no induced cycle of length  $> 3$
- (i)  $G$  admits a simplicial elimination scheme
- (ii) Every minimal separator is a clique
- (iii)  $G$  admits a maximal clique tree.
- (iv)  $G$  is the intersection graph of subtrees in a tree.
- (v) Any MNS (LexBFS, LexDFS, MCS) provides a simplicial elimination scheme.

## Back to the proof of the main chordal characterization theorem

- ▶ Clearly (iii) implies (iv)
- ▶ For the converse, each vertex of the tree corresponds to a clique in  $G$ .  
But the tree has to be pruned of all its unnecessary nodes, until in each node some subtree starts or ends. Then nodes correspond to maximal cliques.
- ▶ We need now to relate these new conditions to chordal graphs.
  - (iii) implies (i) since a maximal clique tree yields a simplicial elimination scheme.
  - (iv) implies chordal since a cycle without a chord generates a cycle in the tree.
  - (iv) implies (ii) since each edge of the tree corresponds to a minimal separator which is a clique as the intersection of two cliques.

from (i) to (iv)

### Démonstration.

By induction on the number of vertices. Let  $x$  be a simplicial vertex of  $G$ .

By induction  $G - x$  can be represented with a family of subtrees on a tree  $T$ .

$N(x)$  is a clique and **using Helly property, the subtrees corresponding to  $N(x)$  have a vertex in common  $\alpha$ .**

To represent  $G$  we just add a pending vertex  $\beta$  adjacent to  $\alpha$ .  $x$  being represented by a path restricted to the vertex  $\beta$ , and we add to all the subtrees corresponding to vertices in  $N(x)$  the edge  $\alpha\beta$ . □

## Exercises

1. Can we use efficiently this representation of chordal graphs as intersection of subtrees ?
2. Same question for path graphs ? (intersection graph of paths in a tree)
3. How to recognize a chordal graph ?

## Which kind of representation to look for for special classes of graphs ?

- ▶ Easy to manipulate (optimal encoding, easy algorithms for optimisation problems)
- ▶ Geometric in a wide meaning (ex : permutation graphs = intersection of segments between two lines)
- ▶ Examples : disks in the plane, circular genomes ...

## First remark

### Proposition

Every undirected graph can be obtained as the intersection of a subset family

### Proof

$$G = (V, E)$$

Let us denote by  $E_x$  the set of edges adjacent to  $x$ .

$$xy \in E \text{ iff } E_x \cap E_y \neq \emptyset$$

We could also have taken the set  $C_x$  of all maximal cliques which contains  $x$ .

$$C_x \cap C_y \neq \emptyset \text{ iff } \exists \text{ one maximal clique containing both } x \text{ and } y$$

Starting from a graph in some application, find its characteristic :

1. 2-intervals on a line (biology), intersection of disks (or hexagons) in the plane (radio frequency), filament graphs, trapezoid graphs . . .
2. A whole book on this subject :  
J. Spinrad, Efficient Graph Representations, Fields Institute Monographs, 2003.
3. A website on graph classes :  
[http ://www.graphclasses.org/](http://www.graphclasses.org/)



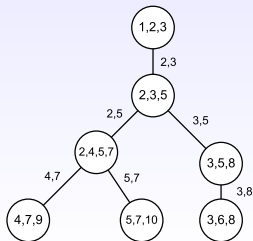
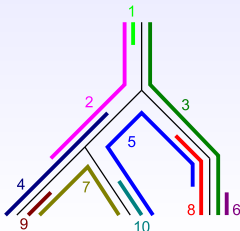
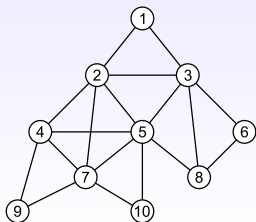
## Clique tree

*clique tree* of  $G$  = a minimum size tree model of  $G$

for a clique tree  $T$  of  $G$  :

- ▶ vertices of  $T$  correspond precisely to the maximal cliques of  $G$
- ▶ for every maximal cliques  $C, C'$ , each clique on the path in  $T$  from  $C$  to  $C'$  contains  $C \cap C'$
- ▶ for each edge  $CC'$  of  $T$ , the set  $C \cap C'$  is a *minimal separator* (an inclusion-wise minimal set separating two vertices)

Note : we label each edge  $CC'$  of  $T$  with the set  $C \cap C'$ .



## Consequences of maximal clique tree

### Theorem

Every minimal separator belongs to every maximal clique tree.

### Lemma

Every minimal separator is the intersection of at least 2 maximal cliques of  $G$ .

### Corollary

There are at most  $n$  minimal separators.

## proof

Since  $G$  is chordal, every minimal separator  $S$  is a clique. Suppose  $S$  is an  $(x, y)$  minimal separator. Let us consider  $G_1$  the connected component of  $G \setminus S$  containing  $x$ .

If  $G_1$  is reduced to  $x$ , then  $x$  must be universal to  $S$ , since  $S$  is a minimal separator, and  $S + x$  is a maximal clique of  $G$ . Similarly if there exists  $z \in G_1$  is universal to  $S$  then  $S + z$  is contained in some maximal clique of  $G$ .

Else, suppose there is no vertex in  $G_1$  universal to  $S$ . Consider two vertices  $x, w \in G_1$  having different maximal neighborhoods in  $G_1$ . Such vertices always exist unless  $S$  is not minimal.

Therefore both  $x, w$  have a private neighbor  $t, u$  respectively in  $S$ .

## proof II

So by assumption  $wu, xu \notin E(G)$ . Considering a shortest path  $\mu \in G_1$  going from  $x$  to  $w$ . Then the cycle  $[x, \mu, w, u, t]$  has no chord, a contradiction. Therefore there must exist some vertex of  $w \in G_1$  universal to  $S$ , and  $S + w$  contained in some maximal clique  $C$  of  $G$ . We finish the proof by considering the connected component of  $G \setminus S$  containing  $y$ . This yields another maximal clique  $C'$ .

By construction  $C \cap C' = S$ .

## Proof of the theorem

### Démonstration.

Therefore  $S = C' \cap C''$ . These two maximal cliques belong to any maximal clique tree  $T$  of  $G$ . Let us consider the unique path  $\mu$  in  $T$  joining  $C'$  to  $C''$ .

All the internal maximal cliques in  $\mu$  must contain  $S$ . Suppose that all the edges of  $\mu$  are labelled with minimal separators strictly containing  $S$ , then we can construct a path in  $G$  from  $C' - S$  to  $C'' - S$  avoiding  $S$ , a contradiction. So at least one edge of  $\mu$  is labelled with  $S$ .



## Maximal Cardinality Search : MCS

**Data:** a graph  $G = (V, E)$  and a start vertex  $s$

**Result:** an ordering  $\sigma$  of  $V$

Assign the label 0 to all vertices

$label(s) \leftarrow 1$

**for**  $i \leftarrow n$  **à** 1 **do**

    Pick an unnumbered vertex  $v$  **with largest label**

$\sigma(i) \leftarrow v$

**foreach** *unnumbered vertex  $w$  adjacent to  $v$*  **do**

$label(w) \leftarrow label(w) + 1$

**end**

**end**

## Maximal Neighbourhood Search (MNS)

### MNS

**Data:** a graph  $G = (V, E)$  and a start vertex  $s$

**Result:** an ordering  $\sigma$  of  $V$

Assign the label  $\emptyset$  to all vertices

$label(s) \leftarrow \{0\}$

**for**  $i \leftarrow 1$  **to**  $n$  **do**

    Pick an unnumbered vertex  $v$  with a maximal under inclusion  
    label

$\sigma(i) \leftarrow v$

**foreach** unnumbered vertex  $w$  adjacent to  $v$  **do**

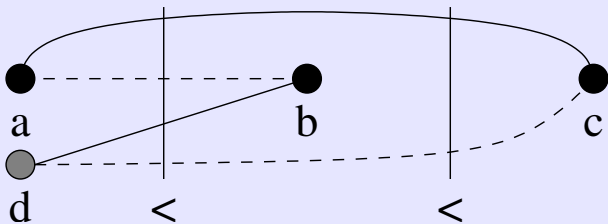
$label(w) \leftarrow \{i\} \cup label(w)$

**end**

**end**

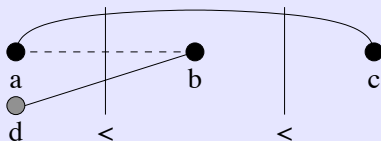
## MNS property

Let  $\sigma$  be a total ordering  $V(G)$ , if  $a < b < c$  and  $ac \in E$  and  $ab \notin E$ , then it exists  $d$  such that  $d < b$ ,  $db \in E$  and  $dc \notin E$ .





## Generic search



## MNS

MNS is a kind of completion of Generic search similar to BFS versus LBFS (resp. DFS versus LDFS). This explains why MNS was first named LexGen.

## Theorem [Tarjan et Yannakakis, 1984]

$G$  is a chordal graph iff every MNS computes a simplicial ordering.

### Proof :

Let  $c$  be a non simplicial vertex (to the left). Thus it exists  $a < b < c \in N(c)$  with  $ab \notin E$ . Using MNS property, it exists  $d < b$  with  $db \in E$  and  $dc \notin E$ . Since  $G$  is chordal, necessarily  $ad \notin E$ .

Either  $d < a$ , considering the triple  $d, a, b$ , it exists  $d' < a$  such that  $d'a \in E$  and  $d'b \notin E$ . Furthermore  $d'd \notin E$ .

Or  $a < d$ , considering the triple  $a, d, c$ , it exists  $d' < d$  such that  $d'd \in E$  and  $d'c \notin E$ . Furthermore  $ad' \notin E$ .

In both cases a pattern is propagating to the left, a contradiction.

## Corollary

$G$  is a chordal graph iff every MCS, LBFS, LDFS computes a simplicial ordering.

## Proof

Maximal for the cardinality, or maximal lexicographically are particular cases of maximality under inclusion.

## Implementation

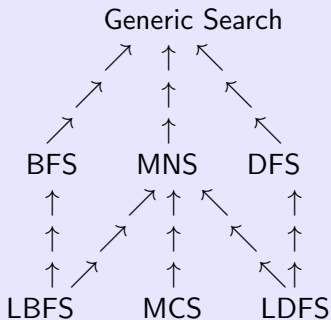
MCS, LBFS provide linear time particular implementation of MNS. But there are many others, less famous.

But in its full generality no linear time implementation is known.

## Conclusions

Using the 4-points configurations we can prove the following inclusion ordering between searches

### Strict inclusions



## Playing with the elimination scheme

### Easy Exercises :

1. Find a minimum Coloring (resp. a clique of maximum size) of a chordal graph in  $O(|V| + |E|)$ .

Consequences : **chordal graphs are perfect.**

At most  $|V| - 1$  maximal cliques (best upper bound, since stars have exactly  $|V| - 1$  maximal cliques).

2. Find a minimum Coloring (resp. a clique of maximum size) of an interval graph in  $O(|V|)$  using the interval representation.

## Greedy colorings

### Definitions

Clique number  $\omega(G)$  = maximum size of a clique in  $G$

Chromatic number  $\chi(G)$  = minimum coloring of  $G$ .

$\forall G, \chi(G) \geq \omega(G)$

### Greedy colorings

Color with integers from  $[1, k]$

Following a vertex ordering, process successively the vertices using the greedy rule :

Take the minimum color not already in the neighbourhood

## Chordal graphs

Apply LexBFS from  $n$  down to 1

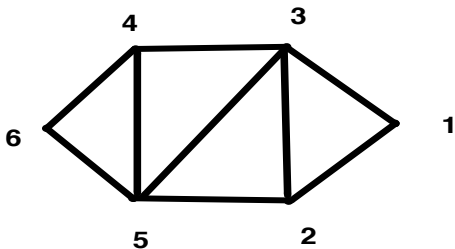
Use the ordering  $n$  down to 1 for the greedy coloring.

Let  $k = \omega(G)$ .

Since every added vertex  $x$  is simplicial and  $|N(x)| \leq k - 1$ , it exists at least one missing color in its neighbourhood of the already colored subgraph.

The value  $k$  is reached for the last vertex belonging to each maximum clique of  $G$ .

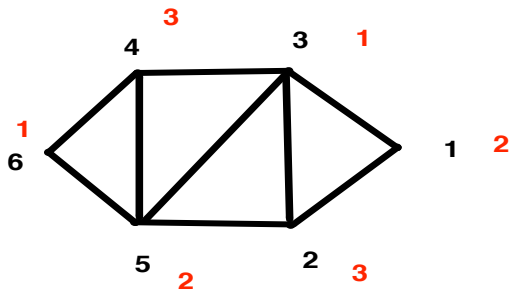
## Bad ordering for greedy coloring



**6, 5, 4, 3, 2, 1 LexBFS ordering**



## Good ordering for greedy coloring



**6, 5, 4, 3, 2, 1 LexBFS ordering**

## Perfect Graphs

$G$  such that for every induced subgraphs  $H \subseteq G$

$$\omega(G) = \chi(G)$$

## Consequences

Therefore  $\omega(G) = \chi(G)$  for chordal graphs.

Since being chordal graphs is an hereditary property, chordal graphs are perfect.

## Perfectly orderable graphs

Although  $\omega(G)$  and  $\chi(G)$  can be computed in polynomial time for perfect graphs using the ellipsoid method, greedy coloring does not work for all perfect graphs.

A graph  $G$  is said to be **perfectly orderable** if there exists an ordering  $\pi$  of the vertices of  $G$ , such that any induced subgraph is optimally colored by the greedy algorithm using the subsequence of  $\pi$  induced by the vertices of the subgraph.

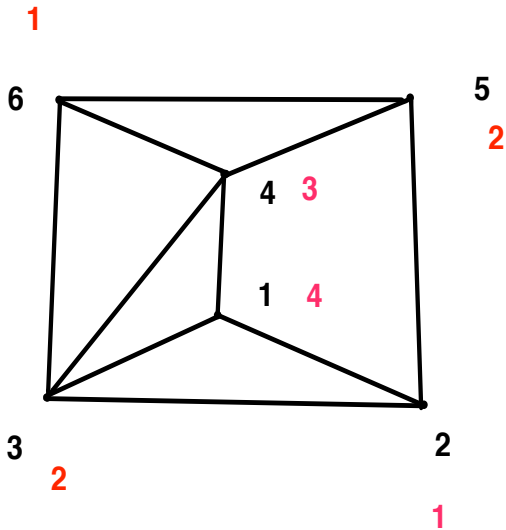
Chordal graphs are perfectly orderable.

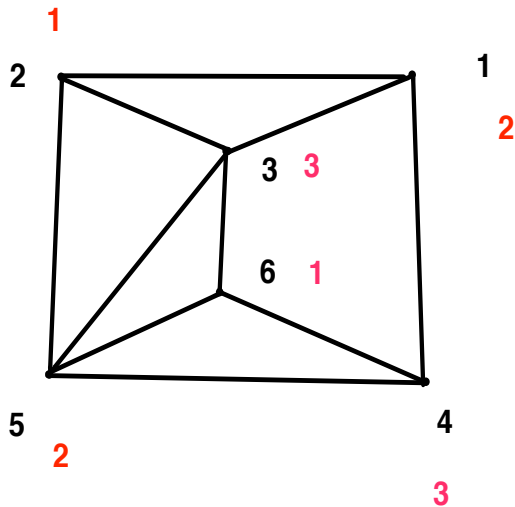
## For which graphs the greedy coloring works ?

Bad news :

NP-complete to recognize perfectly orderable graphs.

Greedy coloring can be far from the optimum, even for subclasses of perfect graphs.





The study of the relationships between  $\omega(G)$  and  $\chi(G)$  is fundamental for algorithmic graph theory.

1. 1930 Wagner's conjecture and treewidth
2. 1950 Shannon Problem and Perfect graphs and semi-definite programming