

# On the Power of Graph Searching

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- Overview of Graph Searching
- Maximal (Maximum?) Independent Set Algorithm
- Cocomparability Graphs, Comparability Graphs and Posets
- Comments, New Results and Concluding Remarks

# Overview of Graph Searching

- Algorithms for visiting all vertices of a given graph.
- BFS and DFS discovered in the late 1890s for maze traversal.
- Desire for simple, efficient, easily implementable algorithms.
- In the 1960s and 1970s BFS and DFS were shown to have many applications in computer science.
- In 1976 Rose, Tarjan and Lueker presented LBFS as a way of recognizing chordal graphs (no induced cycle of size greater than 3).
- Many applications of LBFS were later found including easier linear time algorithms for modular and split decomposition.
- There is a vertex ordering characterization of LBFS orderings [Golumbic; Brandstadt, Dragan and Nicolai].
- The study of such VOCs lead to the discovery of LDFS [C. and Krueger].

# Maximal (Maximum?) Independent Set Algorithm

## Maximal (Maximum?) Independent Set (MIS):

**Input:** A connected graph  $G = (V, E)$  and vertex ordering  $\sigma$

**Output:** Set  $I$  containing the vertices of an IS

$I \leftarrow \emptyset$ ;  $V' \leftarrow V$  { $V'$  stores the unprocessed vertices};  $j \leftarrow 0$ ;

**while**  $V' \neq \emptyset$  **do**

$j \leftarrow j + 1$ ;

$x_j \leftarrow$  the rightmost vertex of  $V'$ , as ordered by  $\sigma$ ;

$I \leftarrow I \cup \{x_j\}$ ;  $V' \leftarrow V' \setminus N[x_j]$ ;

**end**

**return** ( $I$ )

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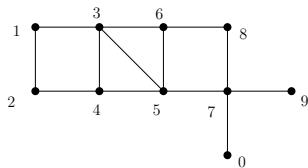
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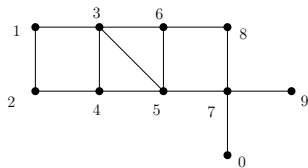
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- How could we “Certify” that  $I$  is a maximum IS?
- *Find a clique cover of the same cardinality. Note that for any graph  $G$ ,  $\alpha(G) \leq \kappa(G)$  where  $\alpha$  is the maximum cardinality IS and  $\kappa$  is the minimum cardinality clique cover. If the graph is perfect, then equality holds.*

# Example



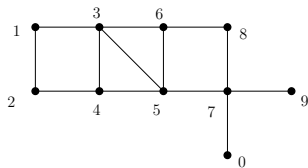
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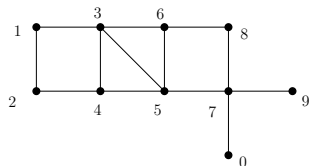
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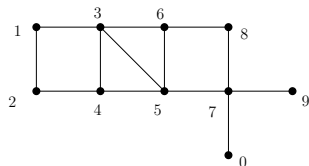
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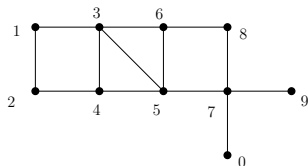
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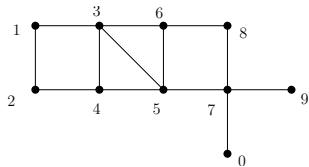
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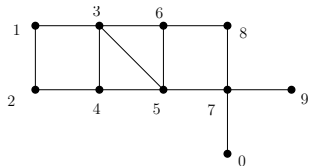


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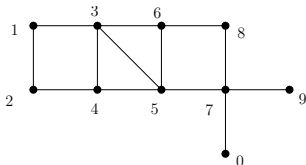


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- $\sigma = 0\ 7\ 9\ 8\ 6\ 5\ 3\ 4\ 2\ 1$



- $\sigma = I = 0\ 9\ 6\ 4\ 1$
- $\sigma = 0\ 7\ 9\ 8\ 6\ 5\ 3\ 4\ 2\ 1$
- Note that  $I$  is of maximum cardinality, as shown by the clique cover (from right to left):  $\{2, 1\}, \{5, 3, 4\}, \{8, 6\}, \{7, 9\}, \{0\}$

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- A comparability graph together with an acyclic transitive orientation of its edges can be equivalently represented by a linear extension of partially ordered set (also called a **poset**).
- A poset consists of a set  $V$  together with an irreflexive, antisymmetric and transitive binary relation  $<$  that imposes a “precedes” relationship on certain pairs of elements of  $V$ . Two elements  $x, y \in V$  are said to be **comparable** if  $x < y$ , or  $y < x$ ; otherwise the elements are called **incomparable**. A **linear extension** of a poset is a total ordering of  $V$  that respects the ordering of all comparable pairs.

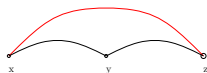
- DEFINITION:  $G(V, E)$  is a **interval graph** if it is the intersection graph of subpaths of a path; namely, each vertex represents a subpath and two vertices are adjacent iff their subpaths intersect. Note that interval graphs are a strict subset of cocomparability graphs.



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# Definitions Continued

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- THEOREM:  $G$  is cocomparability iff there is an ordering of  $V$  such that for all  $x < y < z$ ,  $xz \in E$  implies  $xy \in E$  OR  $yz \in E$  OR both (**COCOMP order**)



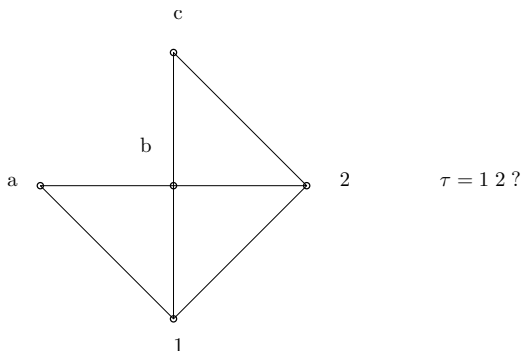
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- Note that from the poset perspective, this algorithm is computing a maximum sized set of mutually comparable elements.

# Lexicographic Depth First Search (LDFS)

Roughly speaking, LDFS is a DFS where ties are broken by favouring vertices with adjacencies to most recently visited vertices.

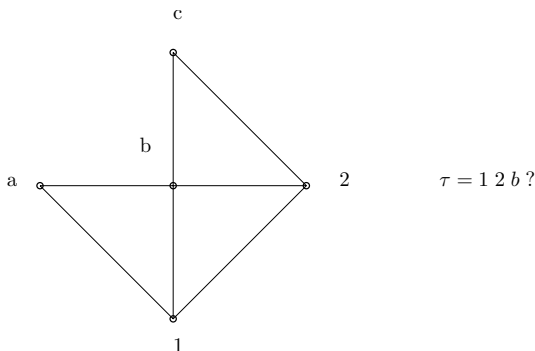
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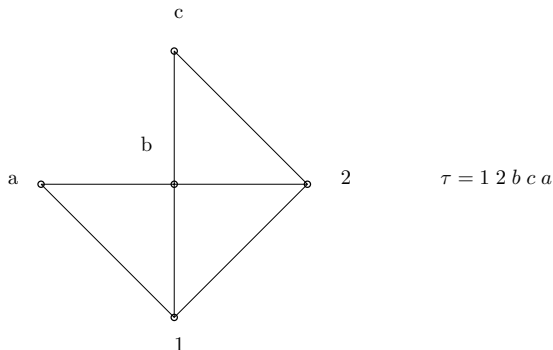
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IMPLEMENTATION:  $O(\min\{n^2, n + m \log \log n\})$  Spinrad and ???

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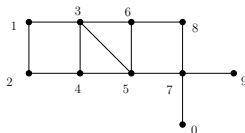
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- A  $+$  sweep breaks ties by choosing the rightmost tied vertex as ordered by  $\tau$ .

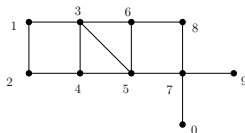
# Example of LDFS<sup>+</sup>



Consider this graph and cocomp order  $\tau = 1\ 2\ 3\ 4\ 5\ 6\ 7\ 8\ 9\ 0$

- $\sigma = 0\ 7\ 9\ 8\ 6\ 5\ 3\ 4\ 2\ 1$  - This ordering is the one used in the example of the MIS algorithm.

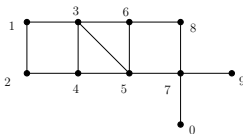
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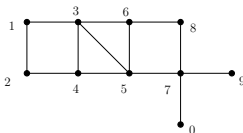
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- The next vertex is 6 - now LDFS forces 5 and then 3, followed by 4, 2, 1.



- By having a certification step, we will either guarantee that we have a maximum IS or will output a message that the given ordering is not a cocomp ordering. Note that we do not confirm that our given ordering  $\tau$  is a cocomp ordering.
- THEOREM (C. + K.):  
An ordering  $\sigma$  is an LDFS ordering iff for all  $a <_{\sigma} b <_{\sigma} c$  where  $ac \in E$ ,  $ab \notin E$ , there exists  $a <_{\sigma} d <_{\sigma} b$  such that  $db \in E$ ,  $dc \notin E$ .
- Similar LDFS<sup>+</sup> modified interval graph algorithms work for:
  - Minimum Path Cover (equivalent to the bump number problem on posets) [C., Dalton, H.]
  - Longest Path [Mertzios, C.]
- These algorithms give us insight into the “LDFS structure of posets”.

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- We have a characterization of the searches  $\mathcal{S}$  such that  $\sigma = \mathcal{S}^+(\tau)$  is a cocomp order whenever  $\tau$  is a cocomp order.

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- Very recently Lalla Mouatadid and E.K. have found a linear time algorithm to find the maximum **weighted** independent set in a cocomp graph. They have also shown how to find an LDFS cocomp order in linear time, given an arbitrary cocomp order.

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- New insights into the structure of posets? What about other areas of mathematics?
- Can these results extend to AT-free graphs?
- Can we use graph searching for heuristic algorithms? Already used for the diameter of the giant component of the Facebook Graph.

Thank you for your attention