# Graphs can be succinctly indexed for pattern matching in $O(|E|^2 + |V|^{5/2})$ time

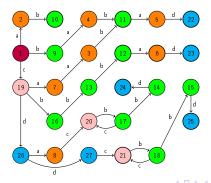
Nicola Cotumaccio

GSSI, L'Aquila, Italy

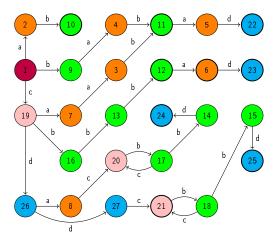
Wheeler graphs generalize the nice properties of De Bruijn graphs.

- A Wheeler graph on the alphabet Σ with n nodes and e edges can be stored using only 2(e + n) + e log |Σ| + |Σ| log e + o(n + e log |Σ|) bits.
- This representation allows to decide whether a string  $\alpha$  matches the graph in only  $O(|\alpha| \log |\Sigma|)$  time.

- Wheeler graphs are graphs endowed with a TOTAL order ≤ on the set of all nodes.
- We assume that all edges entering the same node have the same label.
- Here are the properties that the total order  $\leq$  must satisfy.

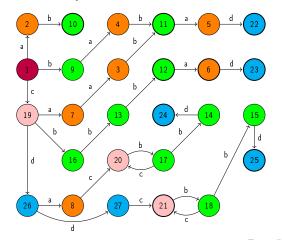


Nodes without incoming edges come first.



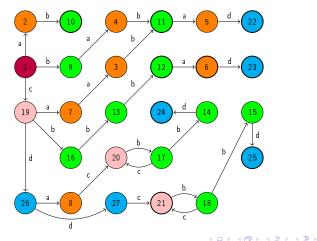
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All nodes reached by a come before all nodes reached by b, which come before all nodes reached by c...



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Equally-labeled edges must respect the total order (think of (7, 3, a), (9, 4, a), (6, 23, d), (15, 25, d)).



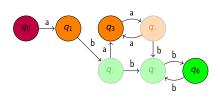
#### Limitations

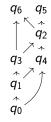
- Expressive power: most graphs are not Wheeler.
- Tractability: deciding whether a graph admits a total order with the desired properties is an NP-hard problem.

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#### Expressive power

- Even if most graphs do not admit a total order with the desired properties, every graph admits a PARTIAL order with the desired properties (a *co-lex order*).
- A string  $\alpha$  can be matched in  $O(p^2 |\alpha| \log |\Sigma|)$  time, where p is the width of the partial order.
- Again intractability: finding the minimum p is NP-hard.





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## Tractability

- In this paper, we show that we can make the problem tractable, while retaining the expressive power (and improving space and time bounds).
- Why deciding whether a graph is Wheeler is difficult? Intuitively, because 2-SAT is an easy problem, while 3-SAT is NP-complete!

$$\begin{array}{ll} x_{u < v} & \forall u \neq v \text{ with } \lambda(u) \prec \lambda(v) \text{ (Axiom 1)} \\ x_{u' < v'} \implies x_{u < v} & \forall (u', u, a), (v', v, a) \in E, u' \neq v', u = v \\ & (Axiom 2) \\ x_{u < v} \lor x_{v < u} & \forall u \neq v \text{ (Comparability)} \\ x_{u < v} \implies \neg x_{v < u} & \forall u \neq v \text{ (Antisymmetry)} \\ & (x_{u < v} \land x_{v < z}) \implies x_{u < z} & \forall u \neq v, v \neq z, u \neq z \text{ (Transitivity)} \end{array}$$

## Tractability

- Do we really need antisymmetry? The answer is no.
- Do we really need transitivity? The answer is no.
- The solution is to consider ARBITRARY RELATIONS with the desired properties (a *co-lex relation*).

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- Now algebraically everything becomes cleaner.
- Every graph admits a co-lex relation containing all co-lex relations on the graph (the *maximum co-lex relation*).
- Most importantly, the maximum co-lex relation can be computed in polynomial time ( in  $O(|E|^2)$  time).
- Furthermore, the maximum co-lex relation is always transitive (so it is a preorder), but in general it is not antisymmetric.

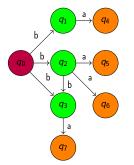
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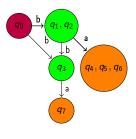
- But can we still solve pattern matching queries?
- Not only the answer the yes, but we can also compress the graph!
- The idea is the following: starting from the graph, collapse some nodes in such a way that:
  - There is a correspondence between patterns on the original graph and patterns on the quotient graph.
  - Apply the results on co-lex orders (that is, PARTIAL ORDERS) in the quotient graph.
  - Prove that the problem of determining the minimum width *p* is easy on a quotient graph (we know that it is NP-complete on general graphs).

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#### Co-lex relations

- We need a quotient graph because the maximum co-lex relation need not be antisymmetric.
- Intuitively, if two nodes are comparable in both directions in the maximum co-lex relation R, then we can read the same strings when we proceed backward (for example both (q<sub>4</sub>, q<sub>5</sub>) ∈ R and (q<sub>5</sub>, q<sub>4</sub>) ∈ R).

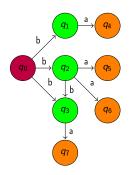


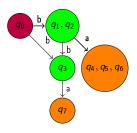


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#### Co-lex relations

- As a consequence, from a pattern matching perspective we can simply collapse two nodes comparable in both directions.
- It can be proved that every node obtained by collapsing two or more nodes hat at most one ingoing edge in the quotient graph.





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- Quotient graphs admit a co-lex order (a PARTIAL ORDER) which contains all co-lex orders on the graphs, the *maximum co-lex order* (this is NOT true for general graphs: every graph admits the maximum co-lex *relation* but in general a graph does not admit the maximum co-lex *order*).
- The maximum co-lex order is automatically the best co-lex order: the one yielding the minimum width *p*.
- Such a best co-lex order can be computed in polynomial time on quotient graphs, because it is naturally induced by the maximum co-lex relation on the original graph (while determing a best co-lex order on a general graph is NP-hard).

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We can index a graph G for pattern matching as follows.

- Compute the maximum co-lex relation on G (which always exists).
- Build a quotient graph by collapsing the nodes of G comparable in both directions.
- Compute the maximum co-lex order on the quotient graph (which always exists on quotient graphs, and it is induced by the maximum co-lex relation on G).
- Apply the previously known results on co-lex orders to the quotient graph.
- Map a pattern matching query on G to the quotient graph.

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The class of Wheeler graphs is (strictly) contained in the class of all graphs such that the maximum co-lex relation has width equal to 1.

	Max. co-lex relation with $p=1$	Wheeler
Representation	succinct	succinct
Pattern matching	$O( \alpha \log \Sigma )$	$O( \alpha  \log  \Sigma )$
Decision problem	$O( E ^2)$	NP-complete





# Graphs can be succinctly indexed for pattern matching in $O(|E|^2 + |V|^{5/2})$ time

Nicola Cotumaccio

GSSI, L'Aquila, Italy