

# Topological Sorting under Regular Constraints

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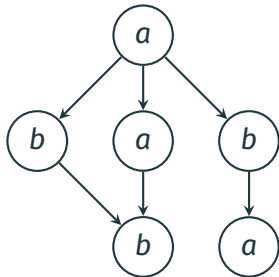
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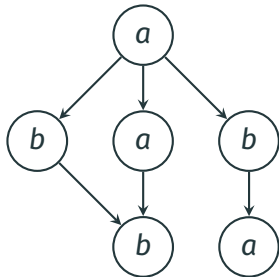
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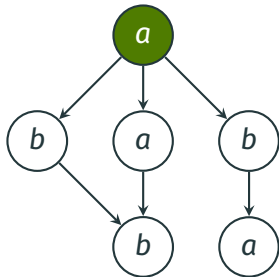
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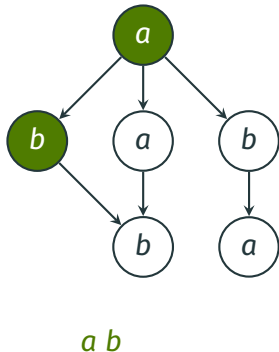
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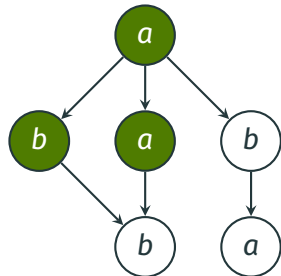
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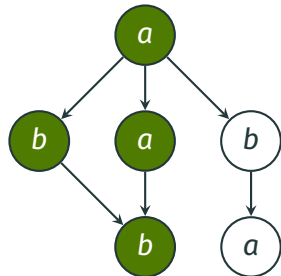
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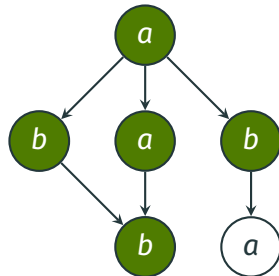
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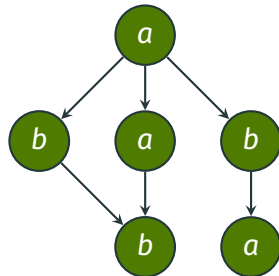
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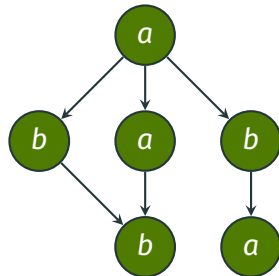
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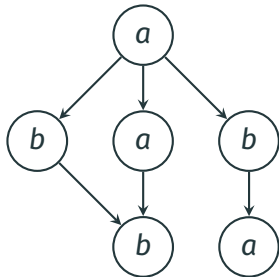


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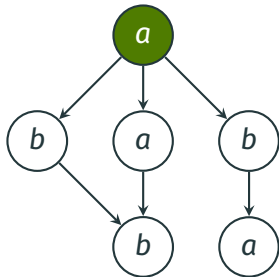
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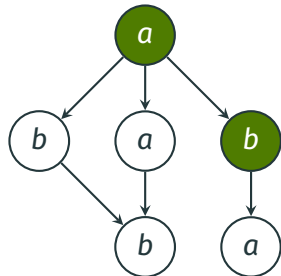
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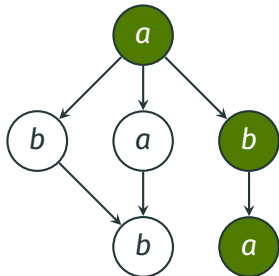


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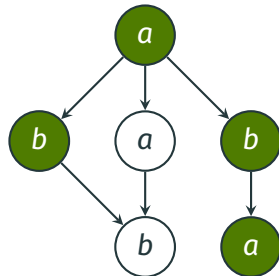
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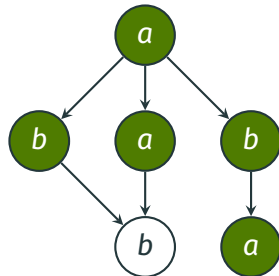
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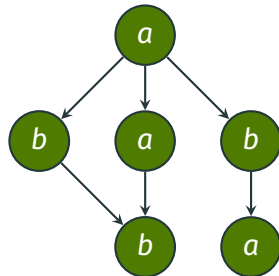
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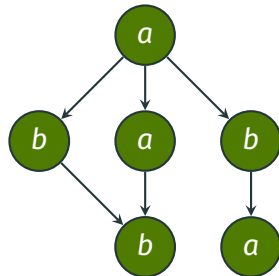
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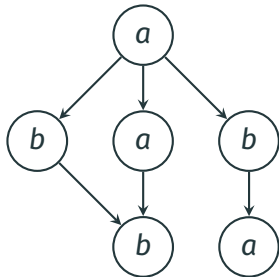
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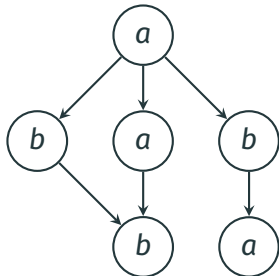
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- **Question**: when is this problem **tractable**?



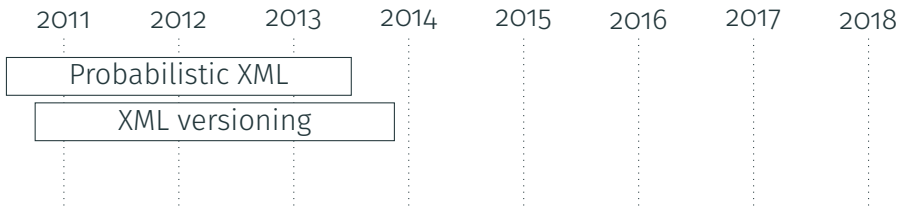
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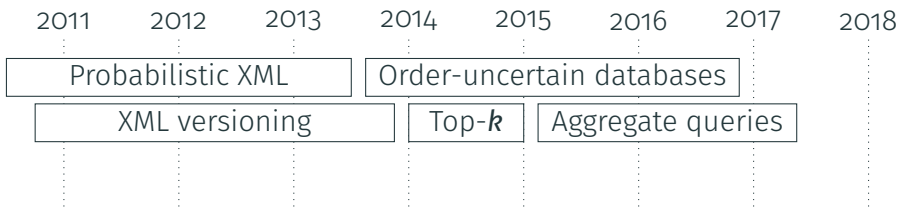
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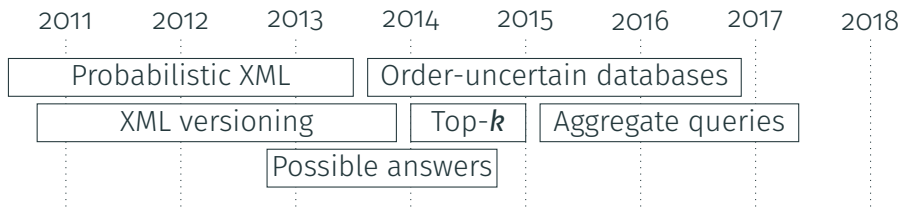
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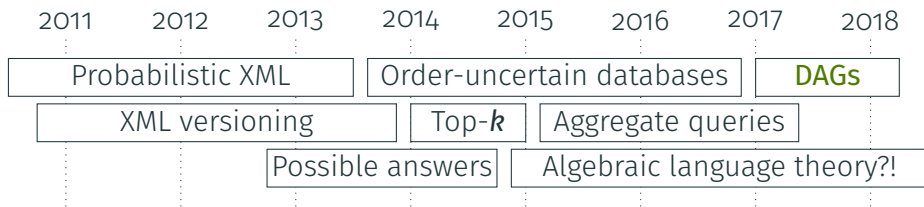
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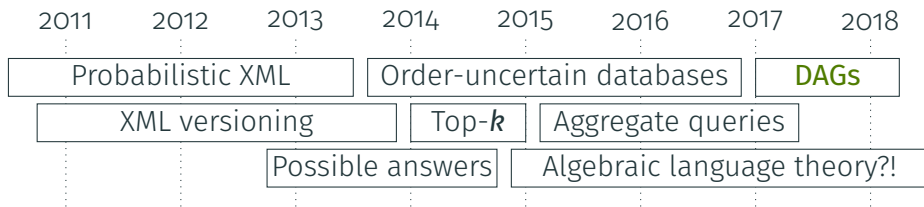
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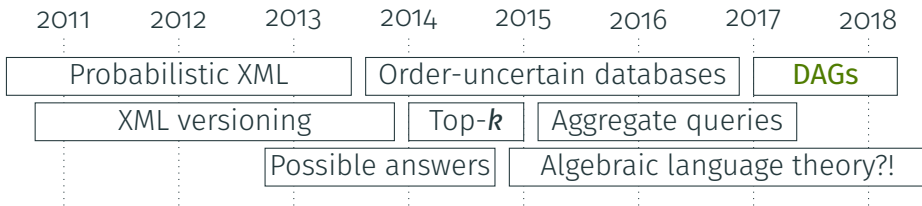
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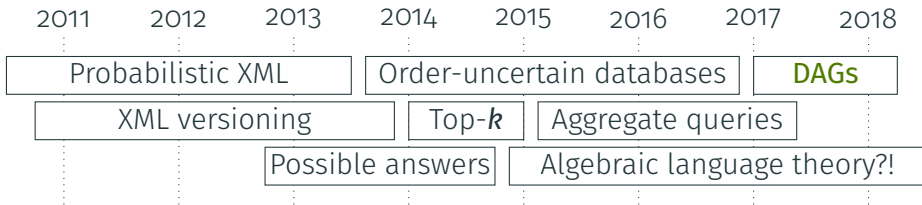


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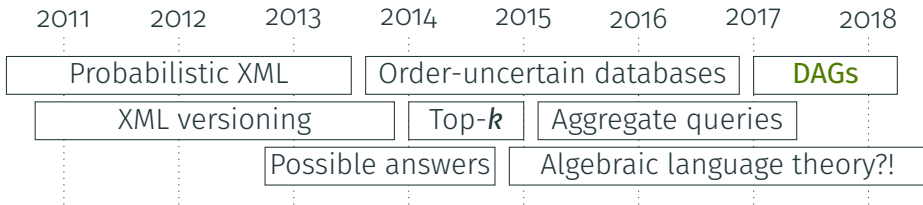


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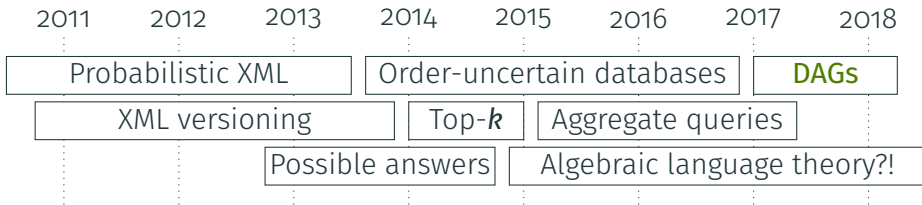
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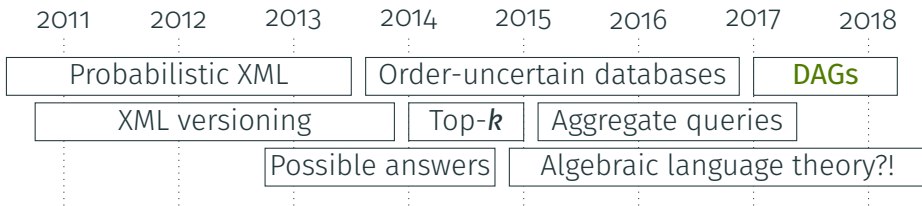
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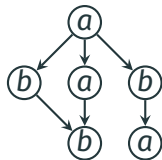
→ **Natural** problem and apparently **nothing** was known about it!

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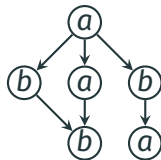
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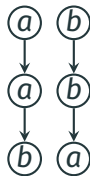
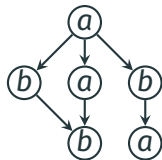
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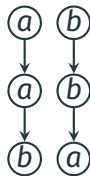
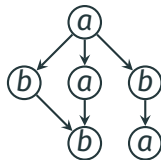
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  - This is like **CTS** but the input DAG is an **union of paths**
- **Question:** What is the **complexity** of  $\text{CTS}(L)$  and  $\text{CSh}(L)$ , depending on the fixed language  $L$  ?



# Dichotomy

For every *regular language*  $L$ , exactly one of the following holds:

- $L$  has [some nice property] and  $\text{CTS}(L)$  is *in NL*
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  - They are **in NL** for **some language families** (monomials, groups)
  - Some languages are tractable for **seemingly unrelated** reasons
- **Very mysterious landscape!** (to us)

## Hardness Results

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JOURNAL OF COMPUTER AND SYSTEM SCIENCES **28**, 345–358 (1984)

### On the Complexity of Iterated Shuffle\*

MANFRED K. WARMUTH<sup>†</sup> AND DAVID HAUSSLER<sup>‡</sup>

*Department of Computer Science,  
University of Colorado, Boulder, Colorado 80309*

It is demonstrated that the following problems are *NP* complete:

- (1) Given words  $w$  and  $w_1, w_2, \dots, w_n$ , is  $w$  in the shuffle of  $w_1, w_2, \dots, w_n$ ?

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→ Does not directly apply for us, because we **fix** the target language

## Hardness for CTS

- We can reduce their problem to CSh for the language  $(aA + bB)^*$
- To determine if the shuffle of  $aab$  and  $bb$  contains  $ababb$  ...

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# Tractability Results

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**Remark:** For the language  $L = b\Sigma^* + aa\Sigma^* + (ab)^*$

- $\text{CTS}(L)$  is **NP-hard** because  $(ab)^{-1}L = (ab)^*$
- $\text{CSh}(L)$  is **in NL**: trivial if there is more than one word

## Tractability Based on Width

- $\text{CSh}(L)$  is in NL for any regular language  $L$  if we assume that there are at most  $k$  input words  $w_1, \dots, w_k$  for a constant  $k \in \mathbb{N}$

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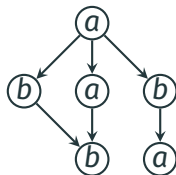
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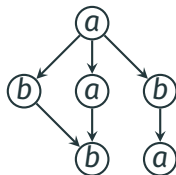
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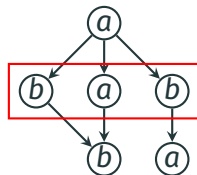
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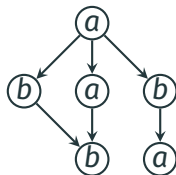
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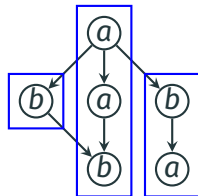
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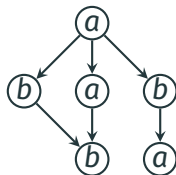
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→ These results are making an additional assumption, but...

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- **Unknown** for  $L + \Sigma^*a^k\Sigma^*$  with arbitrary  $L$  and  $k > 2$ !  $\neg \_ (\text{ツ}) \_ /$

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  - What about **similar languages** like  $(aa + bb + ab)^*$ ?  $\neg\_(\text{ツ})\_ \neg$
- $(caa)^*d(cbb)^*d\Sigma^* + \Sigma^*cc\Sigma^*$  is **in NL** for CSh but **NP-hard** for CTS
  - Tractability argument: another **ad hoc greedy algorithm**
  - Hardness argument: from **k-clique** encoded to a **bipartite graph**

# Conclusion

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# Summary and Future Work

Language	CSh (shuffle)	CTS (top. sort)
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Essentially all other languages...	$\neg \_ (\_ \_ ) \_ \_$	$\neg \_ (\_ \_ ) \_ \_$

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$(ab)^*, u^* w$			NP-hard
Monomials	Informations	<b>Topological Sorting under Regular Constraints</b>  By <a href="#">Antoine Amarilli</a> and <a href="#">Charles Paperman</a> .  This page presents the constrained topological sorting and constrained shuffle problems, and some of our results and open questions related to these problems. It is a complement to our <a href="#">paper</a> , which will be presented at <a href="#">ICALP'18</a> .	in NL
Groups, dis	Recherches	<b>Problem definitions</b>  Fix an alphabet $A$ . An $A$ -DAG is a <i>directed acyclic graph</i> $G$ where each vertex is labeled by a letter of $A$ . A <i>topological sort</i> of $G$ is a linear ordering of the vertices that respects the edges of the DAG, i.e., for every edge $(u, v)$ of $G$ , the vertex $u$ is enumerated before $v$ . The topological sort achieves the word of $A^*$ formed by concatenating the labels of the vertices in the order where they are enumerated.	
$b\Sigma^* + aa\Sigma^*$	Enseignement	Fix a language $L \subseteq A^*$ . The <i>constrained topological sort problem</i> for $L$ , written $\text{CTS}[L]$ asks, given an $A$ -DAG $G$ , whether there is a topological sort of $G$ that achieves a word of $L$ .	NP-hard
$L + \Sigma^*(a^k$	Production logicielle	One problem variant is the <i>multi-letter setting</i> where the input DAG is an $A^k$ -DAG, where the vertices are labeled by a word of $A^k$ , i.e., a topological sort achieves the word obtained by concatenating the labels of the vertices, but the words labeling each vertex cannot be interleaved with anything else. However in this page we mostly focus on the <i>single-letter settings</i> , i.e., $A$ -DAGs.	in NL
$(ab)^* + \Sigma^*$	Problèmes ouverts	Our current main results on the CTS-problem are presented in our <a href="#">paper</a> . We show that $\text{CTS}[L]$ is in NL for some regular languages $L$ , and is NP-hard for some other regular languages.	in NL
$L + \Sigma^* a^k \Sigma^*$		<b>Main dichotomy conjecture:</b> For every regular language $L$ , either $\text{CTS}[L]$ is in NL or $\text{CTS}[L]$ is NP-hard.	
$(aa + bb)^*$		<b>Restrictions on the input DAG</b>  When the input DAG $G$ is an union of <a href="#">paths</a> , the problem is called <i>constrained shuffle problem</i> (CSh), because a topological sort of $G$ corresponds to an interleaving of the strings represented by the paths.	NP-hard
$(aa + b)^*$		We can consider the problem where the input DAG has bounded <i>height</i> , where the height of a DAG is defined as the length of the longest directed path.	
$(a^k + b)^*$		We can consider the problem where the input DAG has bounded <i>width</i> , where the <i>width</i> of a DAG is the size of its largest <i>antichain</i> , i.e., subset of pairwise incomparable vertices. In the case of the CSh problem, the width is the number of paths.	
Essentially all other languages...			

# Summary and Future Work

## Language

$(ab)^*$ ,  $u^*$  with

Monomials  $A_1^*$

Groups, distributive

$b\Sigma^* + aa\Sigma^* +$

$L + \Sigma^*(a^k + b^k)$

$(ab)^* + \Sigma^*a^2\Sigma^*$

$L + \Sigma^*a^k\Sigma^*$

$(aa + bb)^*$ ,  $(a$

$(aa + b)^*$

$(a^k + b)^*$



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CTS (top. sort)

NP-hard

in NL

$\neg\_(\neg)\_$

NP-hard

in NL

in NL

$\neg\_(\neg)\_$

NP-hard

$\neg\_(\neg)\_$

$\neg\_(\neg)\_$

Essentially all other languages...

$\neg\_(\neg)\_$

$\neg\_(\neg)\_$

# Summary and Future Work

Language	CSh (shuffle)	CTS (top. sort)
$(ab)^*$ , $u^*$ with different letters	NP-hard	NP-hard
Monomials $A_1^* a_1 \cdots A_n^* a_n A_{n+1}^*$	in NL	in NL
Groups, direct group monomials	in NL	$\neg \_ (\text{ツ}) \_ \neg$
$b\Sigma^* + aa\Sigma^* + (ab)^*$	in NL	NP-hard
$L + \Sigma^*(a^k + b^k)\Sigma^*$	in NL	in NL
$(ab)^* + \Sigma^* a^2 \Sigma^*$	in NL	in NL
$L + \Sigma^* a^k \Sigma^*$	$\neg \_ (\text{ツ}) \_ \neg$	$\neg \_ (\text{ツ}) \_ \neg$
$(aa + bb)^*$ , $(ab + a)^*$	NP-hard	NP-hard
$(aa + b)^*$	in NL	$\neg \_ (\text{ツ}) \_ \neg$
$(a^k + b)^*$	$\neg \_ (\text{ツ}) \_ \neg$	$\neg \_ (\text{ツ}) \_ \neg$
Essentially all other languages...	$\neg \_ (\text{ツ}) \_ \neg$	$\neg \_ (\text{ツ}) \_ \neg$

Thanks for your attention!

# References



Amarilli, A. and Paperman, C. (2018).

**Topological Sorting under Regular Constraints.**

In *ICALP*.



Warmuth, M. K. and Haussler, D. (1984).

**On the complexity of iterated shuffle.**

*JCSS*, 28(3).

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