

# CHASE TERMINATION BEYOND POLYNOMIAL TIME

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# Introduction

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Chase: 'apply rules until nothing new follows'

→ but might run forever

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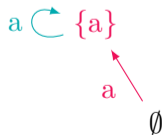
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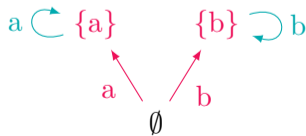
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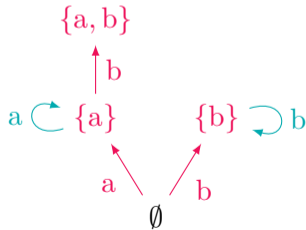
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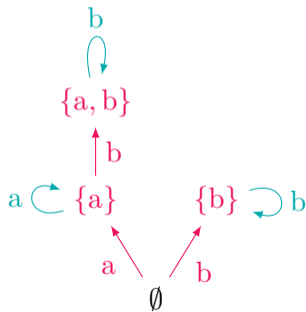
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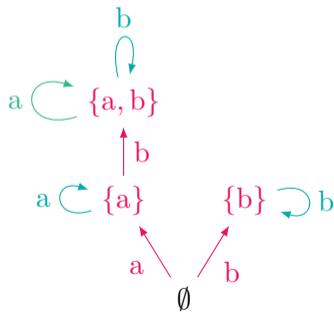
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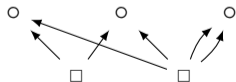
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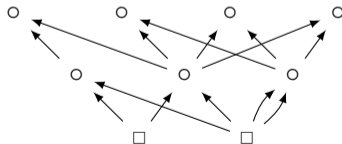
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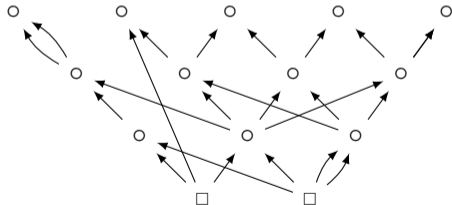
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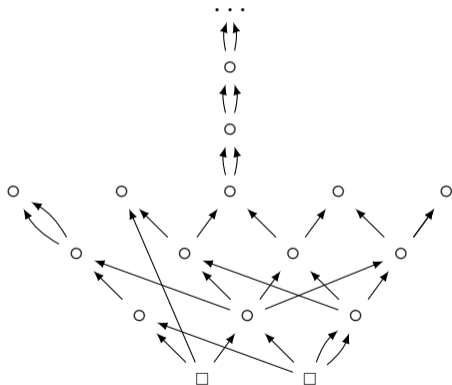
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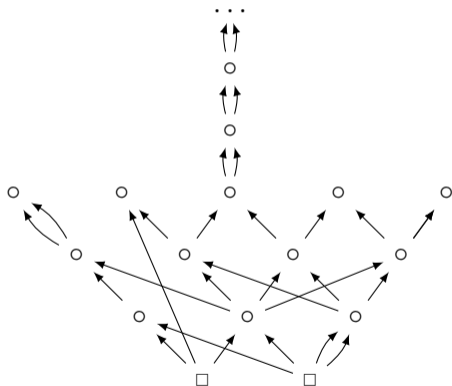
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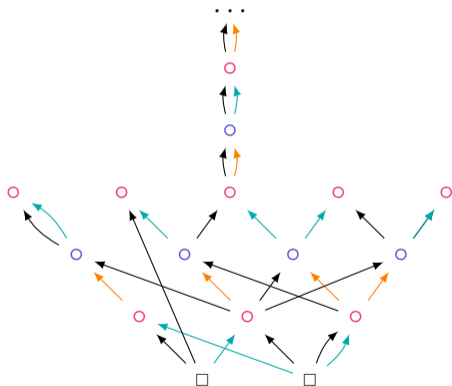
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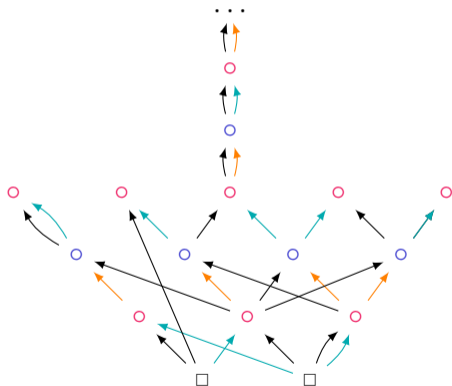
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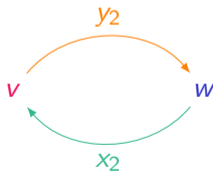


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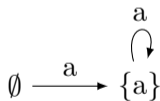
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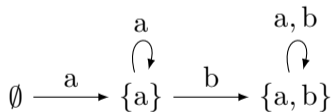
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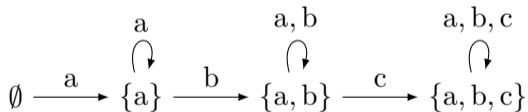
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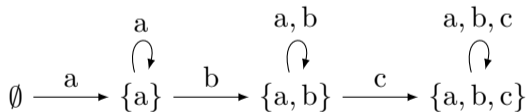
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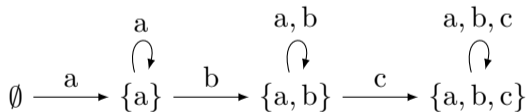
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Tgd (3) 'blocks' application along a path for previously added elements



## Generalising this idea

$$elem(e) \wedge set(S) \rightarrow \exists V. add(e, S, V)$$

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→ **Datalog-entailment checks**, based on tgds and dependency graph

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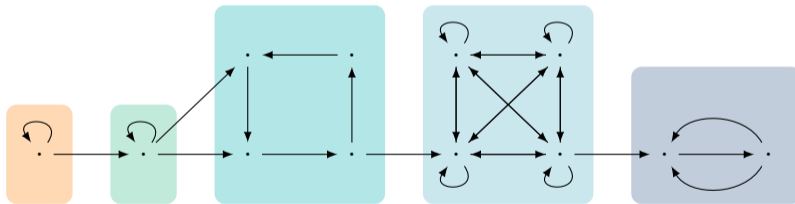


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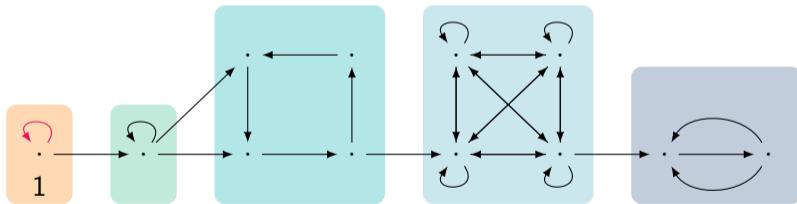


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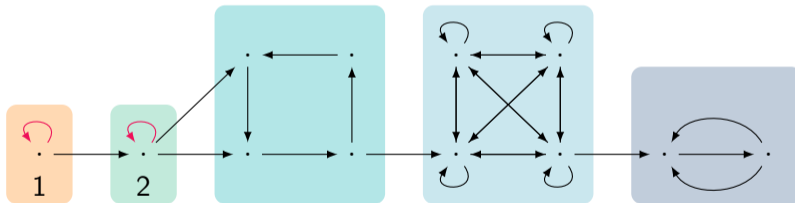


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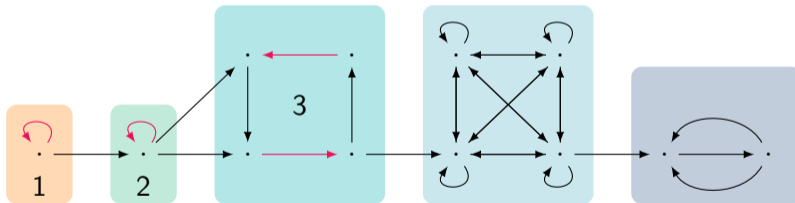


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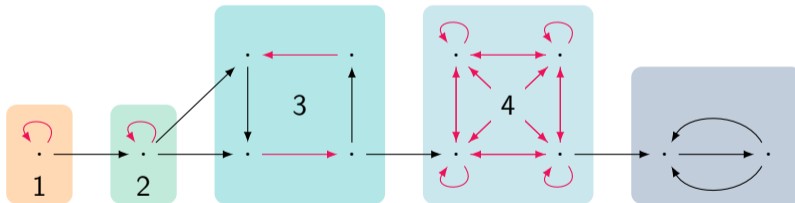


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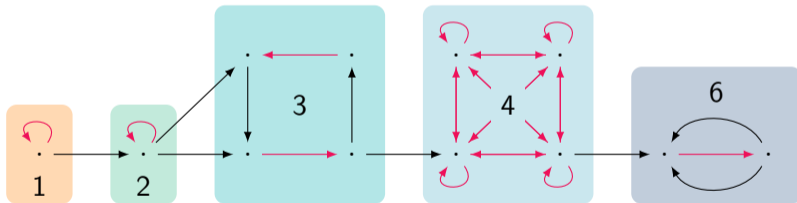


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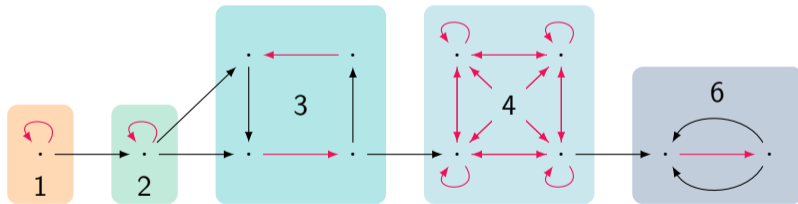


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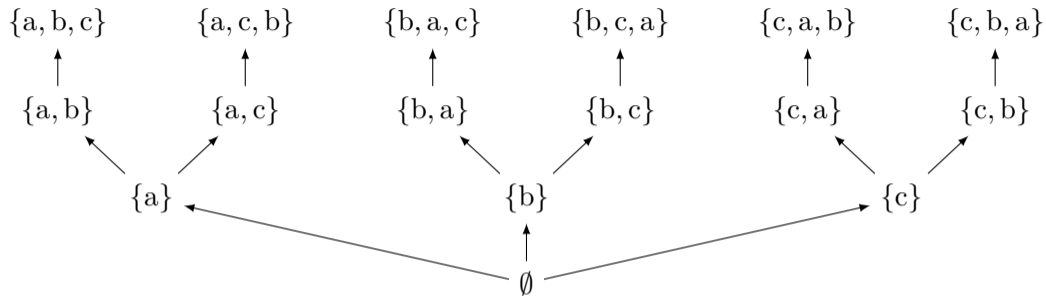
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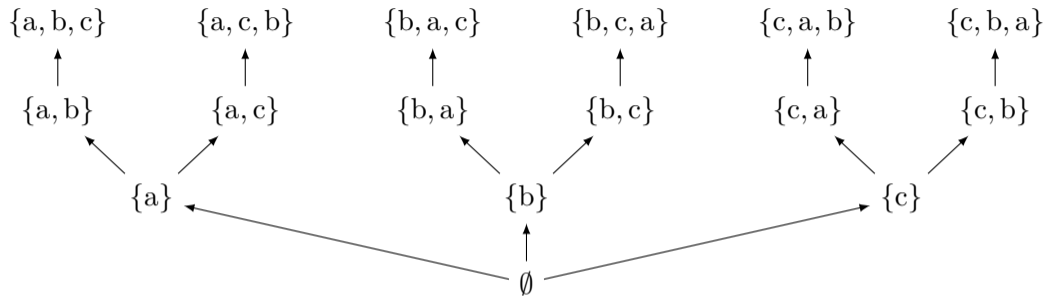


**The saturation criteria define decidable classes of tgds with  $k$ -EXPTIME-complete data complexity for every  $k$ .**

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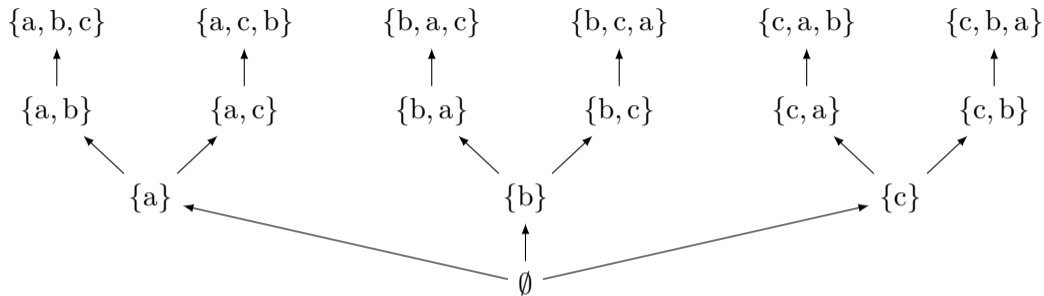


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There are exponentially many nulls, but they form a tree:  
→ query answering might be possible in PSPACE.

## Teaser

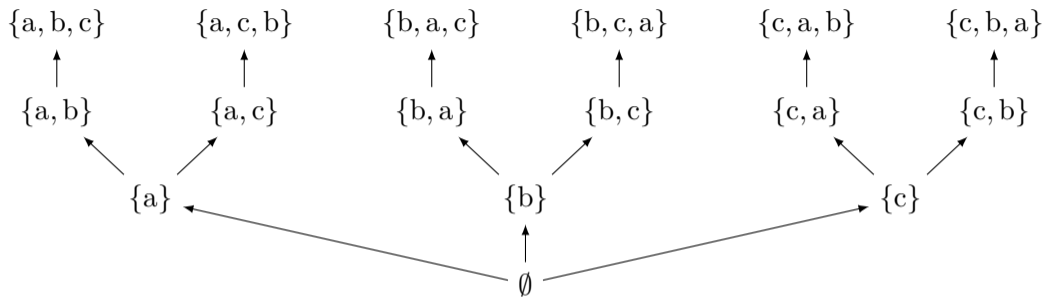


There are exponentially many nulls, but they form a tree:

→ query answering might be possible in PSPACE.

We define a **syntactic condition** and a **chase** that realises this complexity.

## Teaser



There are exponentially many nulls, but they form a tree:  
→ query answering might be possible in PSPACE.

We define a **syntactic condition** and a **chase** that realises this complexity  
**and obtain decidable classes of tgds with PSPACE- and  $k$ -EXPSPACE-complete data complexity for all  $k$ .**

# Summary

## Main results:

- decidable classes of tgds with  $PSPACE$ ,  $k\text{-EXPSpace}$ ,  $k\text{-EXPTIME}$  data complexity for all  $k$
- new methods for analysing the structure of the standard chase
- new chase procedures that are optimal for space-bound complexity classes

## Open questions:

- refinement of criteria for further complexity classes
- capturing of queries in the covered complexity classes