

# Automated Termination Proving: Contributions to Graph Rewriting via Extended Weighted Type Graphs and Morphism Counting

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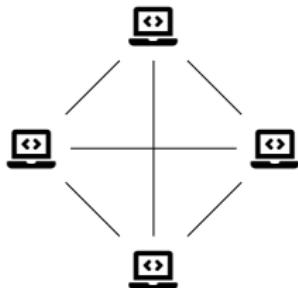


Université Claude Bernard



# Motivation & Goal

Distributed systems:



Ensuring correctness is difficult.

- ▶ The Needham-Schroeder protocol proved insecure 17 years after its publication.

Failures can be catastrophic: **ICU**

This thesis: automated verification.

- ▶ Minimal user effort
- ▶ No expertise required
- ▶ Mathematically rigorous

# Graph Transformation



Modelization of distributed systems

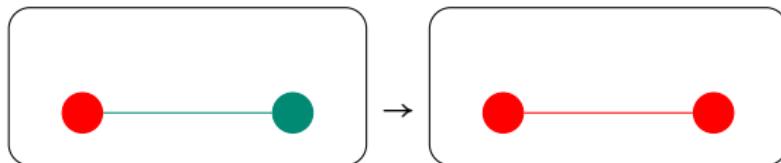
System configurations: graphs

Algorithm behaviors:

graph transformation according to local knowledge

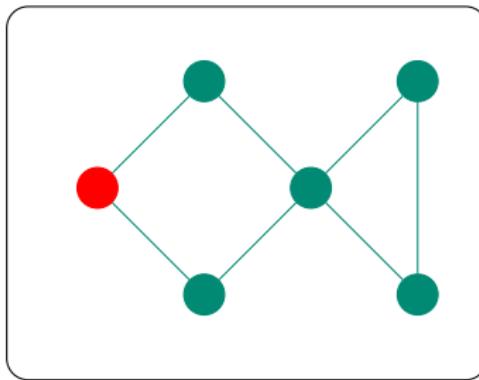
# Graph Transformation

Graph transformation rule:



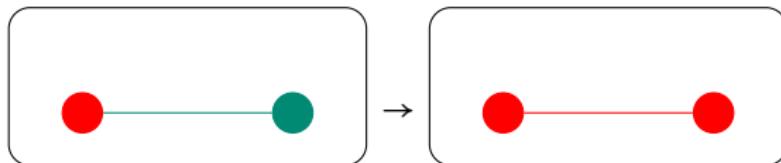
Replace the left-hand side by the right-hand side.

Spanning-tree construction:



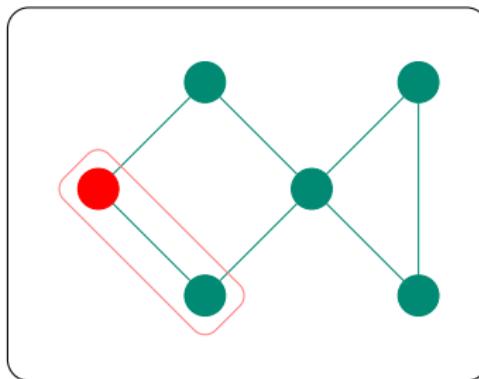
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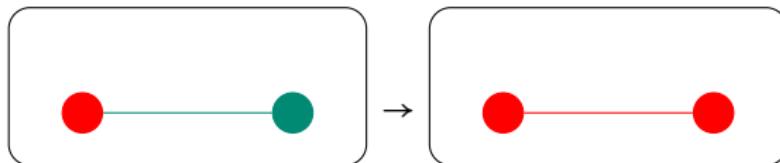
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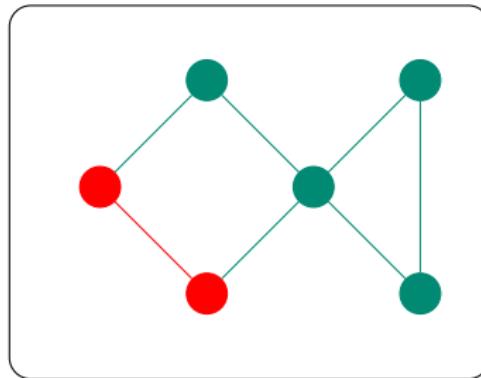
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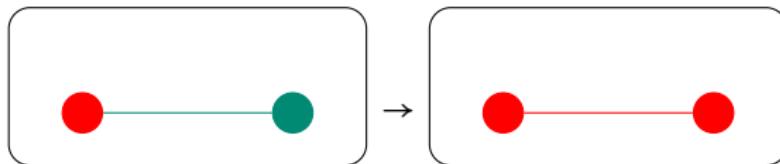
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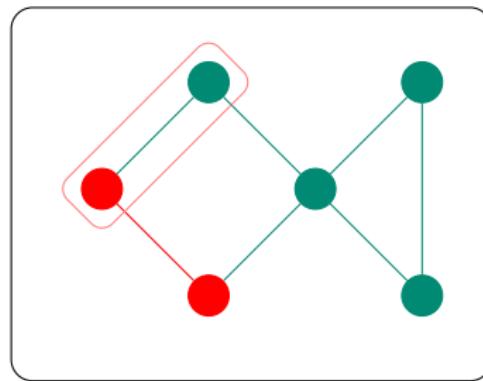
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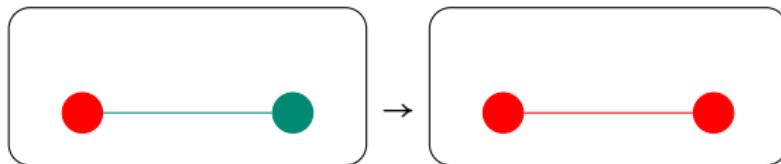
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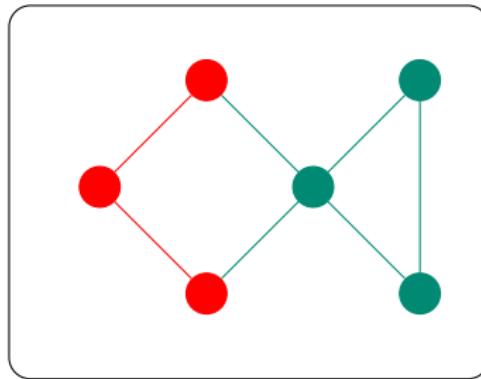
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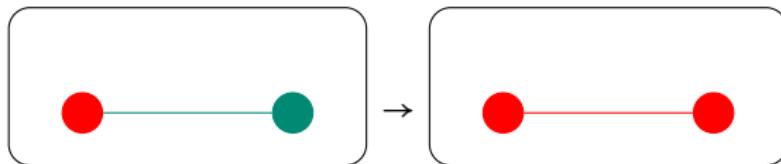
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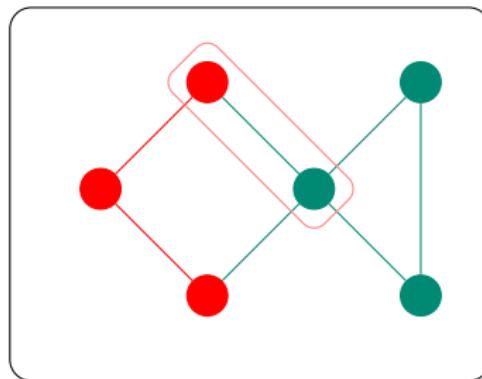
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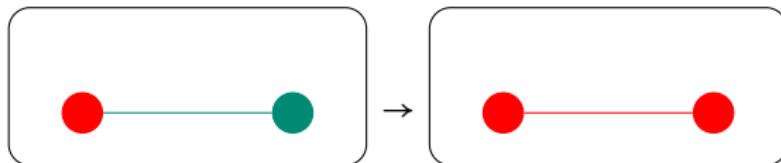
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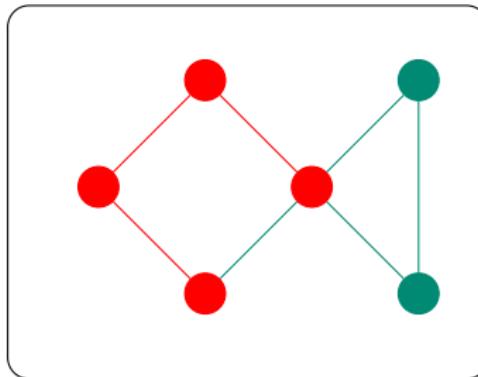
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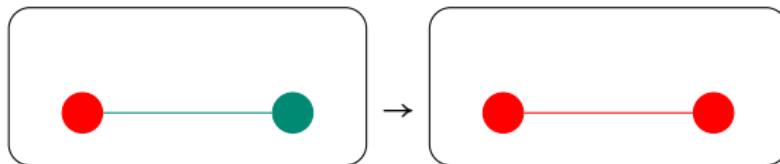
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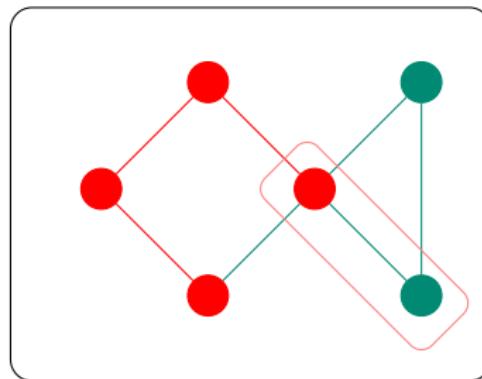
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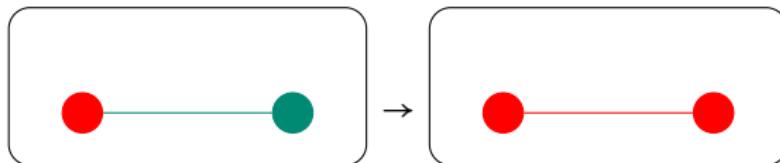
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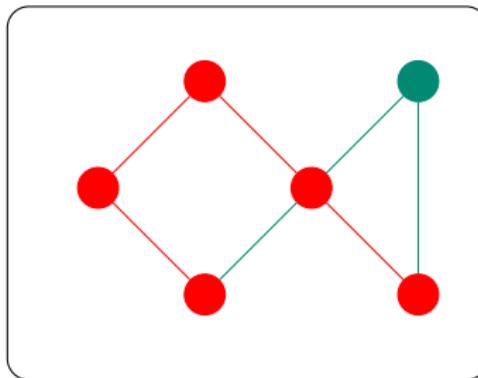
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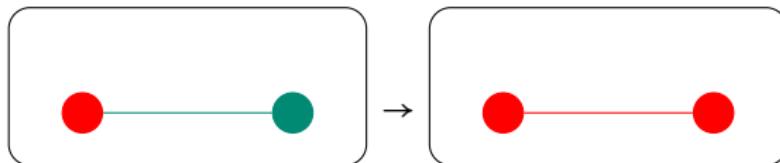
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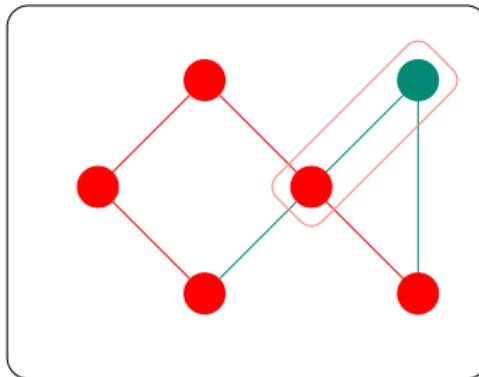
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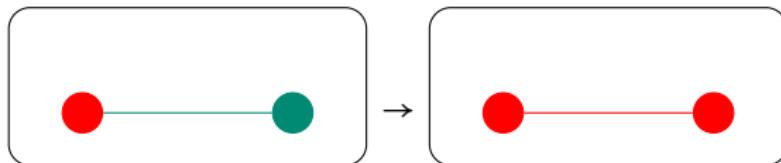
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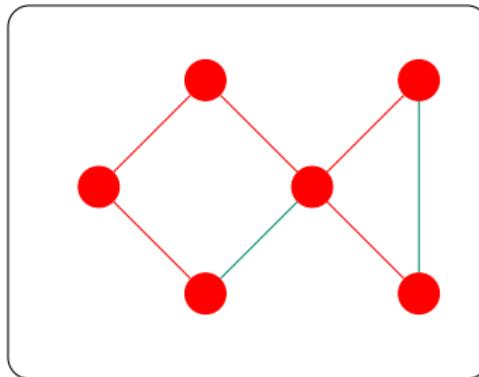
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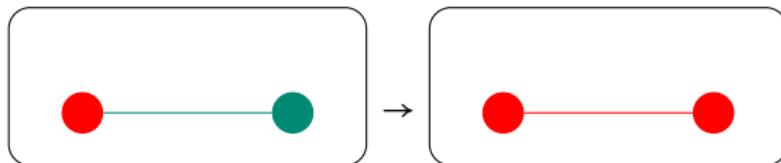
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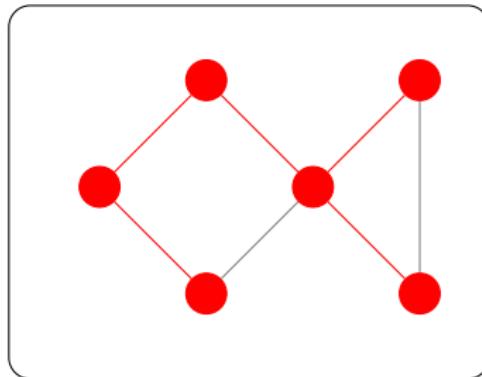
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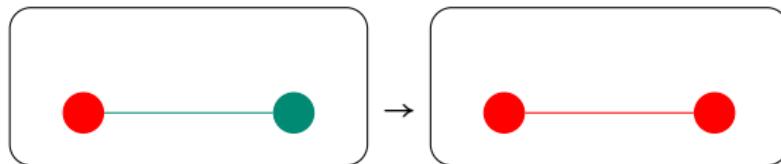
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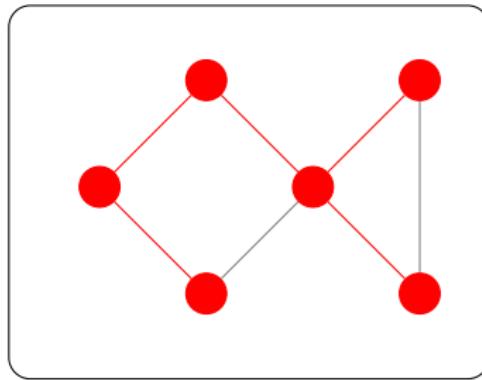
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Spanning-tree construction:



Does the transformation process terminate for any initial graph?

# Termination of Graph Transformation Systems

- ▶ No graph  $G_0$  can be transformed forever

$$G_0 \Rightarrow G_1 \Rightarrow \dots$$

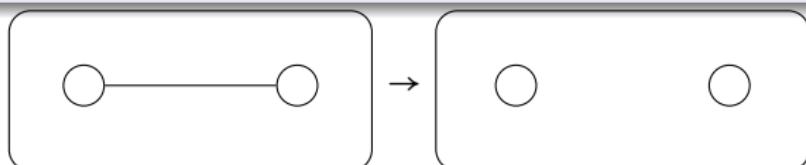
- ▶ Aligns with the notion of program termination:  
“every execution (on any input) halts.”
- ▶ Undecidable in general [Plu95]
  - ▶ Automated techniques for specific subclasses

# Termination by interpretations

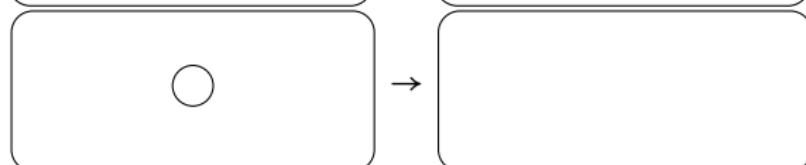
Interpret graphs as natural numbers.

Show each transformation step decreases the value.

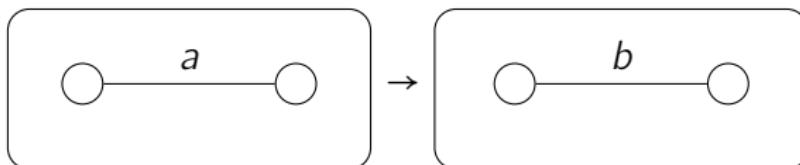
Number of edges:



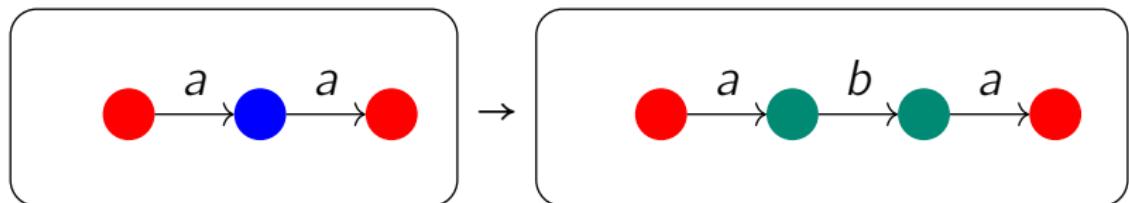
Number of nodes:



Number of edges labeled by  $a$ :



## Limitation



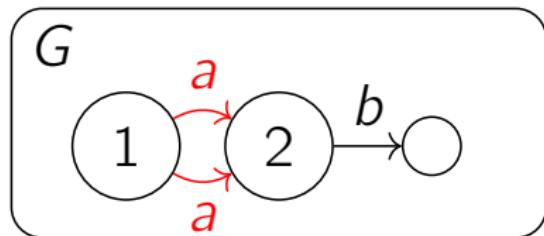
Left-hand side graph: middle has no other incident edges

Right-hand side graph: middles are fresh nodes

Can its termination be proved by interpretations?

- ▶ Weighted Type Graph Method
- ▶ Need a more powerful definition of graph transformations.

# Graphs: Finite, Directed, Edge-Labeled Multigraphs

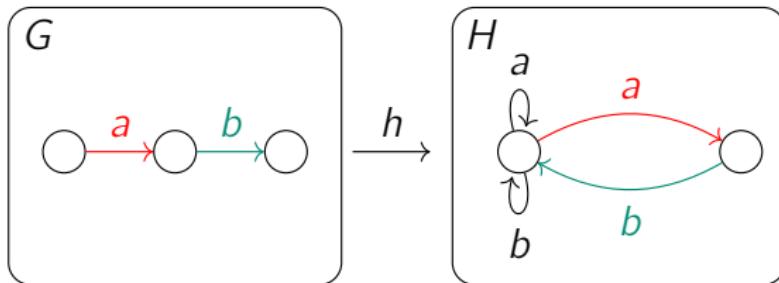


Edges with the same source, target and label are permitted.

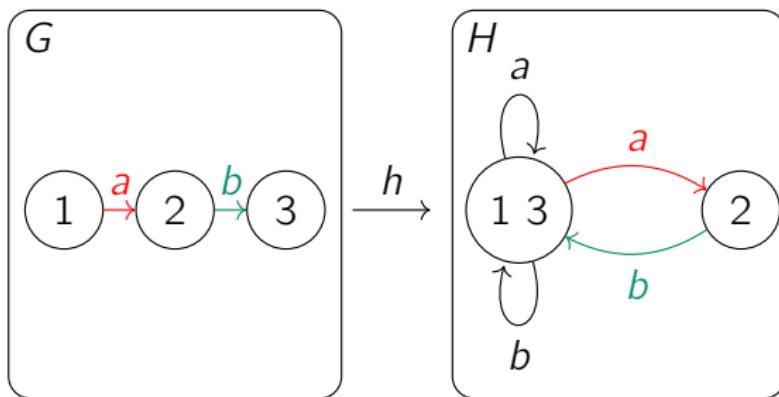
$G$ : graph name

Numbers inside nodes: identifiers

# Graph Morphisms: Structure-Preserving Functions



Colors show edge correspondence.



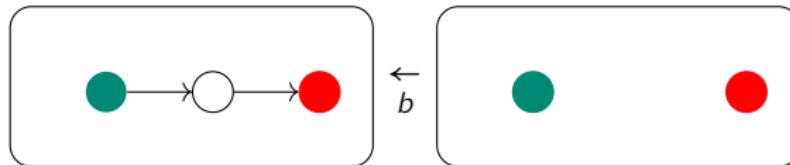
Numbers show node correspondence.

$h$  : morphism name

# Commutative Diagram

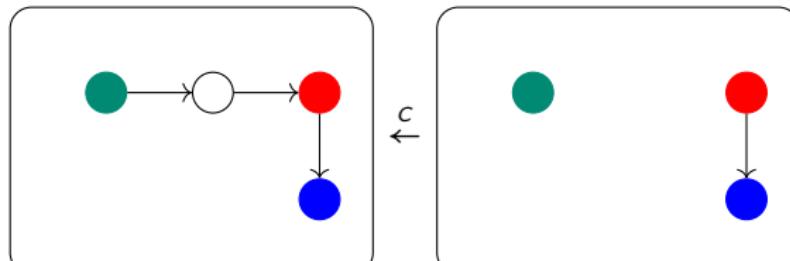
$$\begin{array}{ccc} L & \xleftarrow{b} & K \\ \downarrow a & & \downarrow d \\ G & \xleftarrow{c} & C \end{array}$$

commutes if  $a \circ b = c \circ d$ .



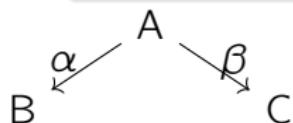
$\downarrow a$

$d \downarrow$



## Pushouts: Gluing Graphs Along a common part

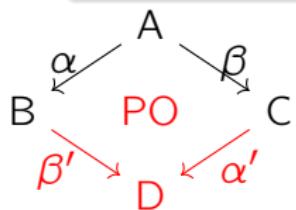
The **pushout** of  $(\alpha, \beta)$  is



## Pushouts: Gluing Graphs Along a common part

The **pushout** of  $(\alpha, \beta)$  is  $(\beta', \alpha')$  with

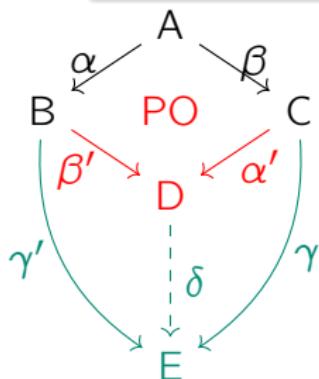
- $\square ABCD$  commutes,



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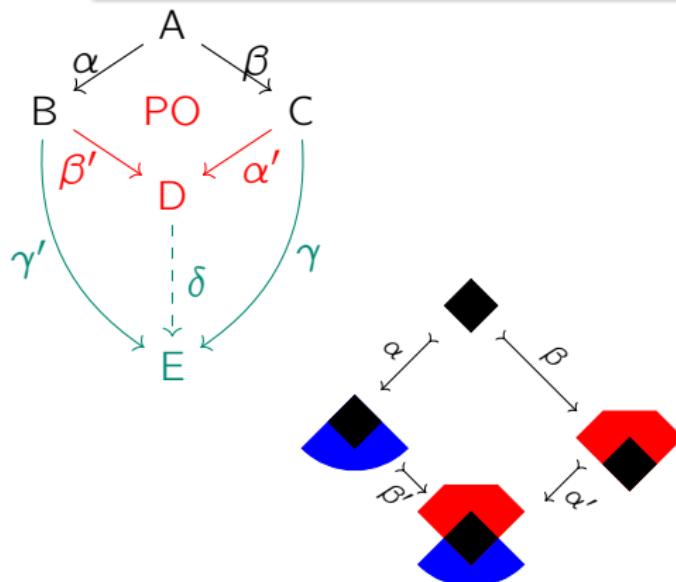
- ▶  $\square ABDC$  commutes,
- ▶ universality: for all  $(\gamma, \gamma')$ , if  $\square ABEC$  commutes, then there is a unique  $\delta$  such that  $\triangle BDE$  and  $\triangle CDE$  both commute.



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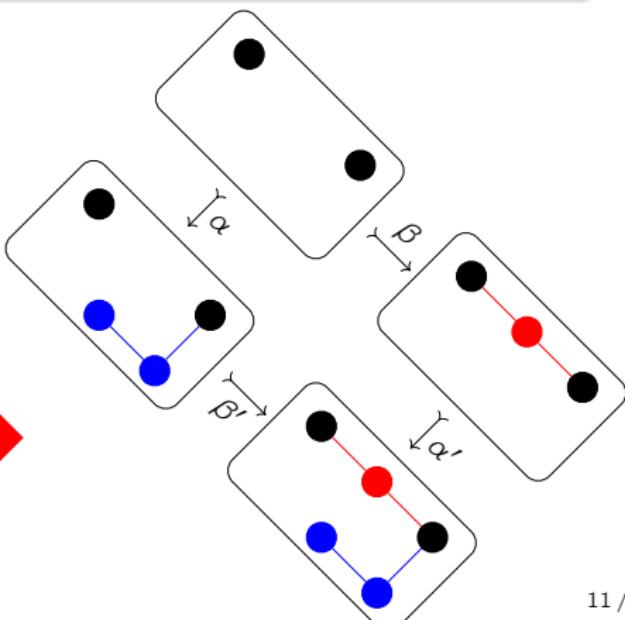
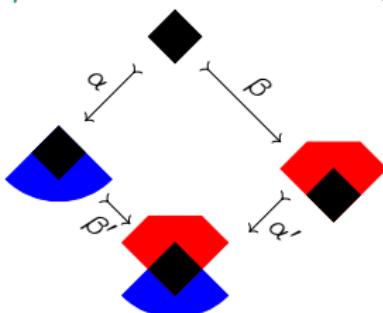
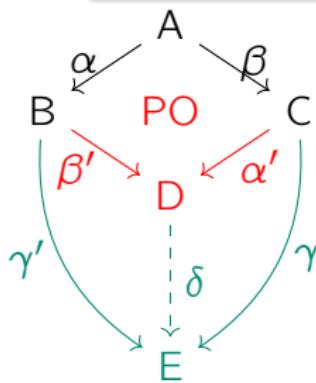
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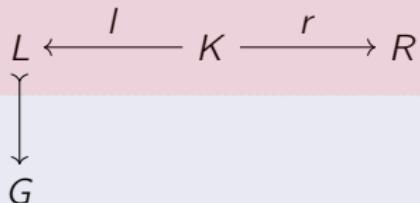
# Graph Rewriting with Double-Pushout (DPO)

$$L \xleftarrow{I} K \xrightarrow{r} R$$

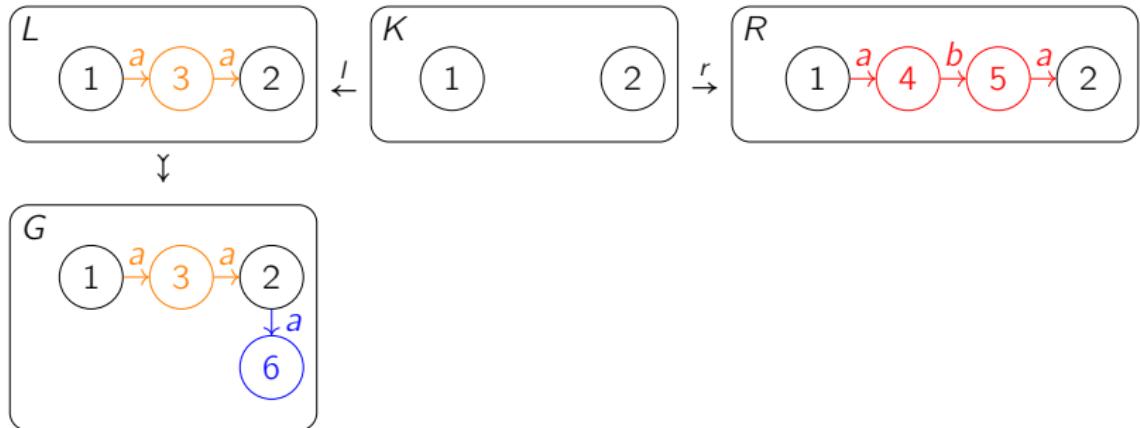
Rewriting rule with **interface  $K$**



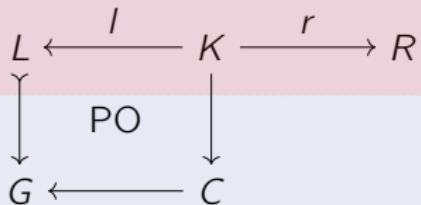
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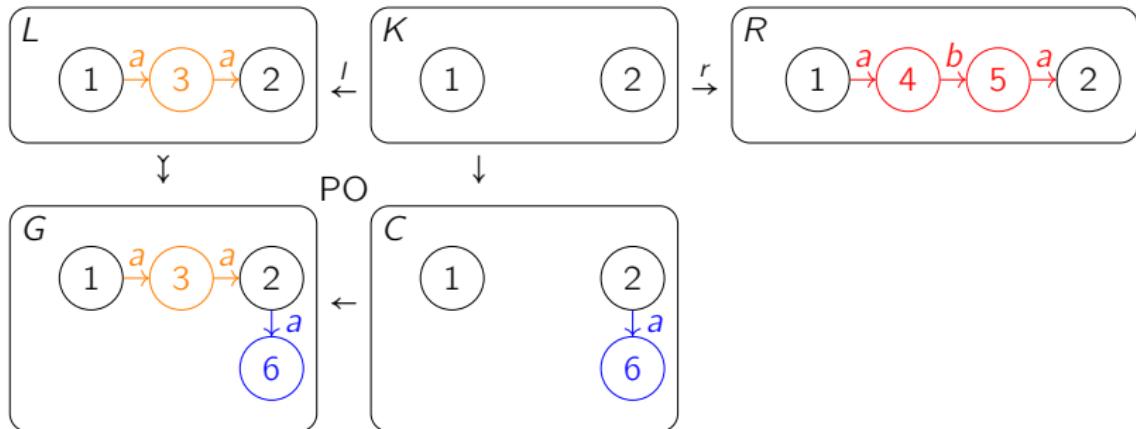
Rewriting rule with **interface**  $K$



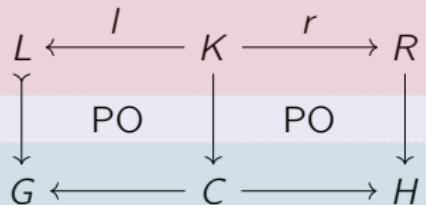
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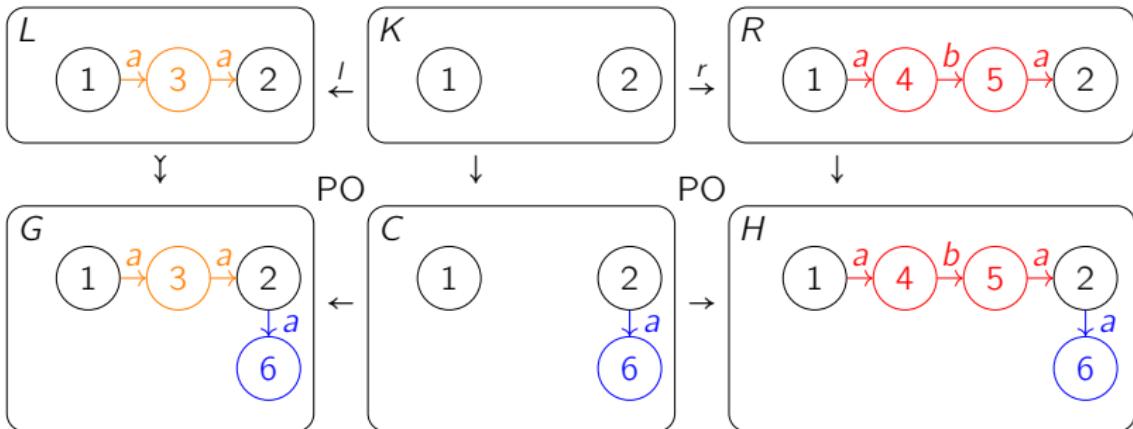


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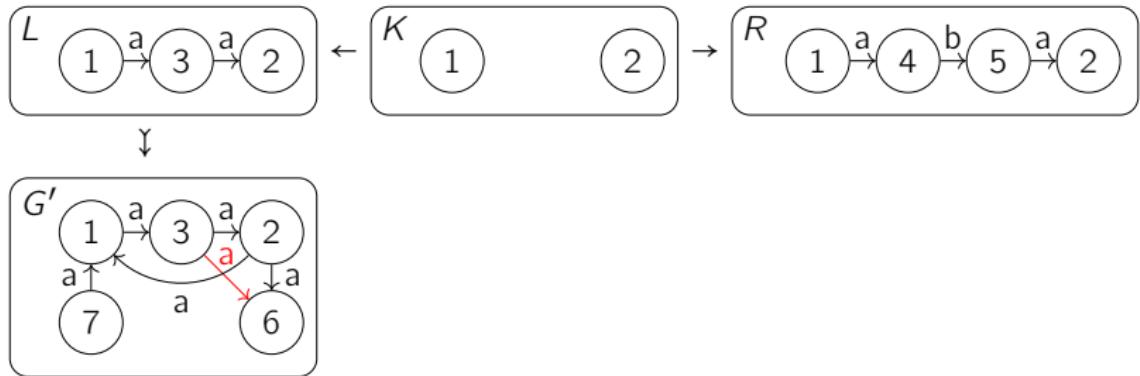


Rewriting rule with interface  $K$

rewriting step  $G \Rightarrow H$

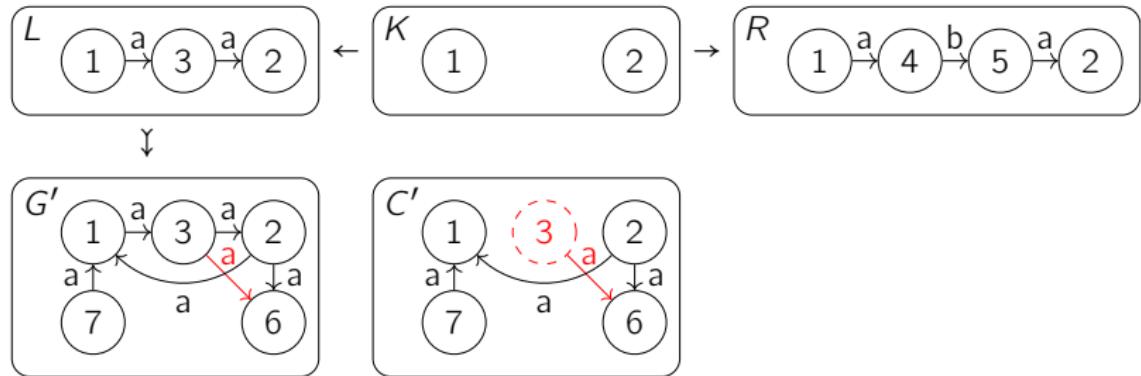


# An Invalid Rewriting Step



No implicit edge deletion by construction

# An Invalid Rewriting Step



No implicit edge deletion by construction

Toward greater usability

Toward greater power

LyonParallel—A Tool for Termination of Graph Rewriting

# Weighted Type Graph Method [Bru14; Bru+15; EO24b]

Termination by interpretation

Parameter: an object  $T$  in the category, called **type graph**

Terminology: every graph is “typed” as morphisms to  $T$

Interpretation:

$$G \rightsquigarrow \mathcal{F}(G, T)$$

$$\rightsquigarrow \text{weight}(\mathcal{F}(G, T))$$

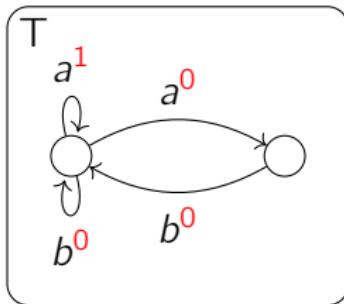
$$\rightsquigarrow \text{aggregator}(\text{weight}(\mathcal{F}(G, T))) \in \mathbb{N}$$

What is the morphism weight?

What is the graph weight?

# Weighted Type Graph

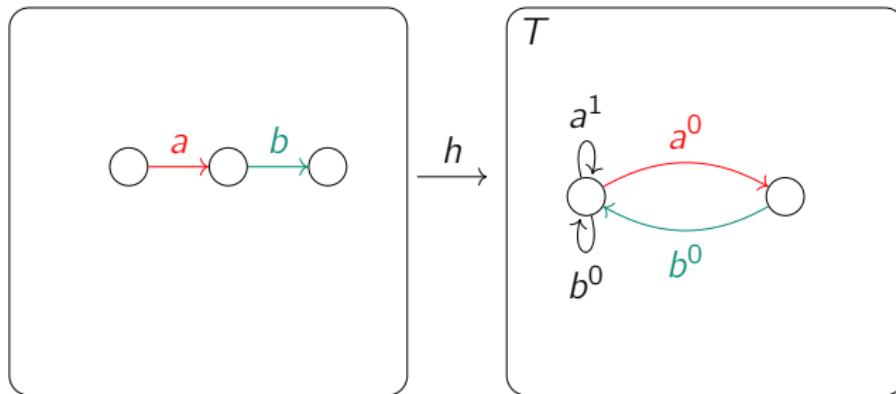
A weighted type graph is a graph with weights on edges.



# Morphism Weight

The weight of a morphism  $h : G \rightarrow T$  is

$$\sum_{e \in \text{Edge}(G)} \text{weight}(h(e))$$

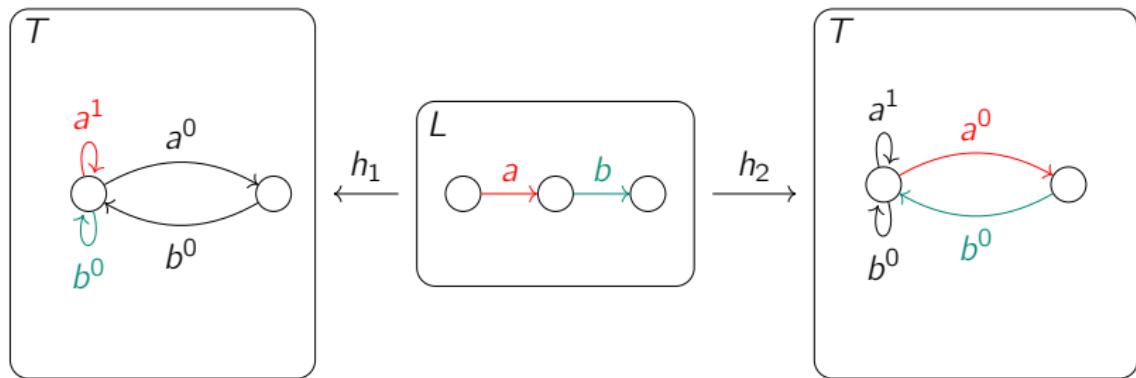


$$\text{weight}_T(h) = 0 + 0 = 0$$

# Graph Weight

The weight of a graph  $L$  is

$$\min\{h : L \rightarrow T \mid \text{weight}_T(h)\}$$

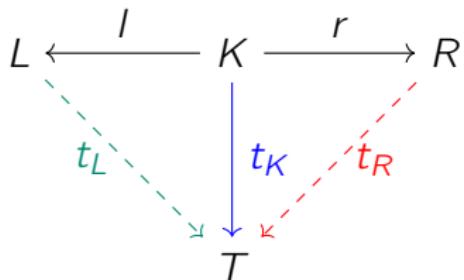


$$\text{weight}_T(h_1) = 1 + 0 = 1$$

$$\text{weight}_T(L) = \min\{1, 0\} = 0$$

$$\text{weight}_{T'}(h_2) = 0 + 0 = 0$$

## Termination Criterion [Bru+15]



Every rewriting step strictly decreases the weight if

- for all  $t_K$ , if there is  $t_L$  such that  $\Delta KLT$  commutes, then

$$\begin{aligned} & \min\{\text{weight}_T(t_L) \mid t_L. \Delta KLT \text{ commutes}\} \\ & > \min\{\text{weight}_T(t_R) \mid t_R. \Delta KRT \text{ commutes}\} \end{aligned}$$

How to find a suitable weighted type graph?

# Searching for Weighted Type Graphs over $\mathbb{N}$

Restricted search space:

- ▶ no parallel edges of the same label

User-specified parameters:

- ▶  $k$  nodes
- ▶ maximum edge weight  $n \in \mathbb{N}$

The problem amounts to checking the satisfiability of an existential Presburger arithmetic theory with:

- ▶  $k^2m$  binary variables where  $m$  is the number of labels
- ▶  $k^2m$  integer variables

Challenge:

- ▶  $2^{k^2m} \cdot n^{k^2m}$  possible assignments of weights
- ▶ maximum edge weight hard to guess

# Problem of the Size of the Search Space

With natural numbers as weights:

# nodes (k)	# labels (m)	# weights	# possibilities
2	2	2	$\approx 10^4$
3	3	3	$\approx 10^{21}$
3	3	10	$\approx 10^{45}$
3	3	100	$\approx 10^{87}$
4	4	4	$\approx 10^{57}$
4	4	10	$\approx 10^{95}$
4	4	100	$\approx 10^{181}$

Problems can be solved by Z3 in exponential-time with respect to the number of variables  $2k^2m$ .

## Idea

Using positive real numbers as weights

Additional constraint: there is  $\delta > 0$  such that every rewriting step decreases the weight by at least  $\delta$ .

# Searching for Weighted Type Graphs over $\mathbb{X} \mathbb{R}$

User-specified parameters:

- ▶  $k$  nodes
- ▶ ~~edge weights in  $\{0, 1, \dots, n\}$~~

Assumption:

- ▶ no parallel edges of the same label

The problem amounts to checking the satisfiability of an ~~existential Presburger arithmetic theory~~ existential theory of the reals with binary variables:

- ▶  $k^2 m$  binary variables where  $m$  is the number of labels
- ▶  $k^2 m$  ~~integer~~ real variables

Challenge:

- ▶ ~~there are  $2^{k^2 m} \cdot n^{k^2 m}$  possible assignments of weights.~~ There are  $2^{k^2 m}$  linear programs which have polynomial-time average-case complexity.

# Complexity Comparison

With weights in  $\mathbb{N}$ :

# nodes (k)	# labels (m)	# weights	# possibilities
2	2	2	$\approx 10^4$
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3	3	100	$\approx 10^{87}$
4	4	4	$\approx 10^{57}$
4	4	10	$\approx 10^{95}$
4	4	100	$\approx 10^{181}$

With weights in  $\mathbb{R}$ :

# nodes (k)	# labels (m)	# variables	# linear programs in $\mathbb{R}$
2	2	8	$\approx 10^2$
3	3	27	$\approx 10^8$
4	4	64	$\approx 10^{19}$

Linear programs can be solved in polynomial time with respect to the number of variables on average.

# Experimental Results

	A	a	T	t	N	n
[EO24a, Example 6.3]					2.74	1.16
[EO24a, Example D.3]	2.25	1.18			2.24	1.18
[Plu95, Example 3.8]	2.95	1.90	2.94	1.87	3.49	1.87
[Plu18, Example 4]	4.26	3.19	4.24	3.13	5.82	timeout
[Plu18, Example 5]	5.54	5.55	5.53	5.50	9.11	5.62
[Bru+15, Example 4]	2.44	2.46	2.47	2.54	4.58	2.46
[Bru+15, Example 5]					7.80	timeout
[Bru+15, Example 6]					9.75	timeout
[Bru14, Example 1]	2.26	1.18			2.24	1.18
[Bru14, Example 4]	2.25	1.22	2.24	1.18	2.25	1.19
[Bru14, Example 5]	4.23	3.23	4.25	3.28	5.82	timeout

“A”, “T”, “N” : different configurations with weights over the natural numbers. “a”, “t”, “n” : corresponding configurations over the real numbers.

# Implementation

LyonParallel

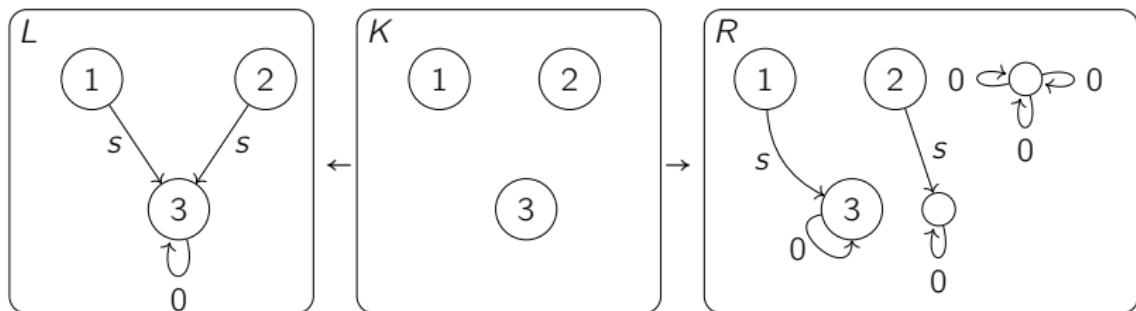
Tool in Ocaml

Relative termination

Search parallel with 6 configurations

Z3 for constraint solving

# A Limitation of the Weighted Type Graph Method



All existing automated methods fail.

Intuition: the number of morphisms from  $\bullet \xrightarrow{s} \bullet \xleftarrow{s} \bullet$  strictly decreases.

Toward greater usability

Toward greater power

LyonParallel—A Tool for Termination of Graph Rewriting

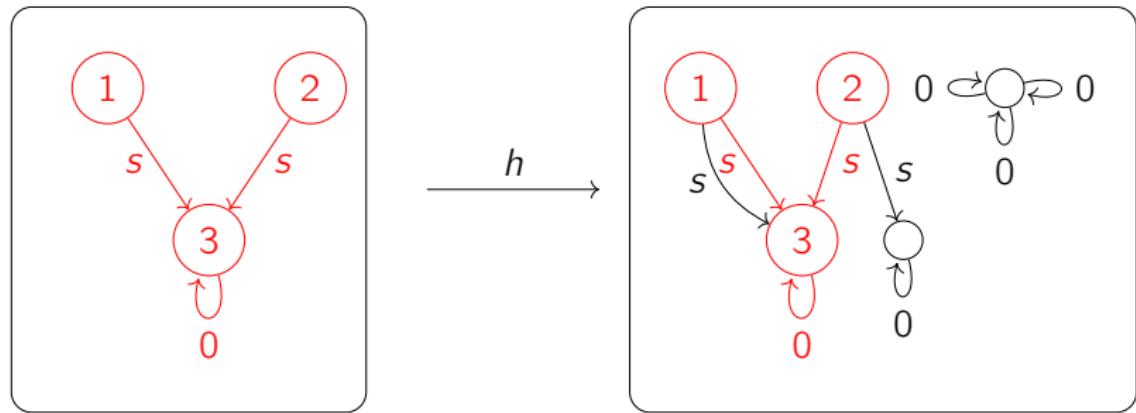
# Morphism Counting

Termination by interpretation

Parameter: a graph  $X$

Interpretation of a graph  $G$  : number of morphisms from  $X$  to  $G$

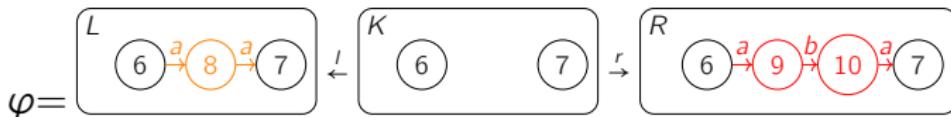
Inclusions: morphisms  $h$  with  $h(x) = x$  for all  $x$ .



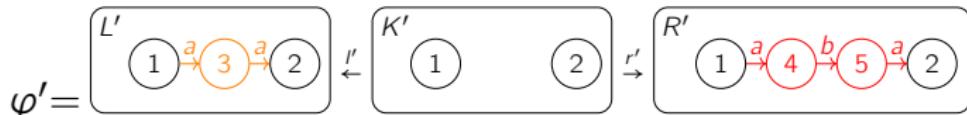
Subgraph

# Graph Rewriting with Injective Rules

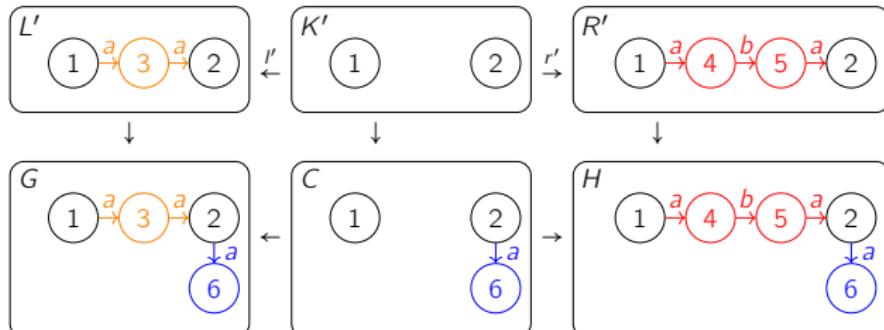
A rewriting rule consists of two inclusions.



An equivalent rewriting rule expresses the same transformation.

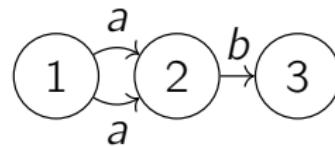


A rewriting step with  $\varphi$  is defined by a DPO diagram with inclusions and  $\varphi'$ .

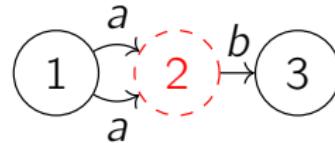


# Pre-Graphs

Graph:



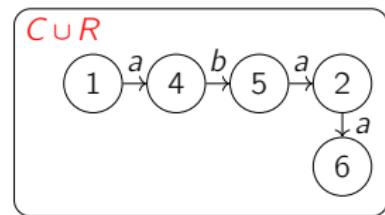
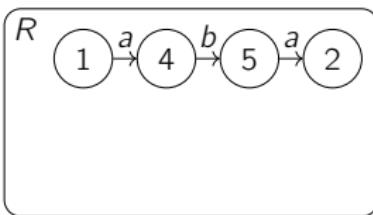
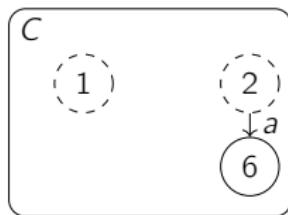
Pre-graphs obtained by removing node 2:



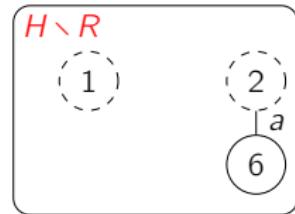
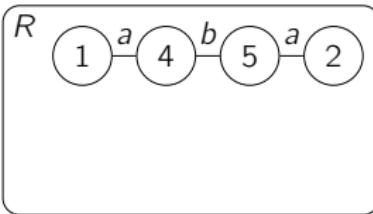
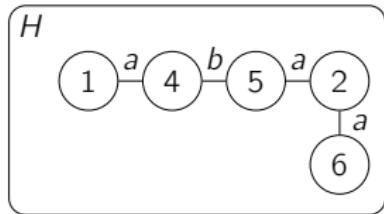
All edges are dangling.

# Pre-Graph Operations

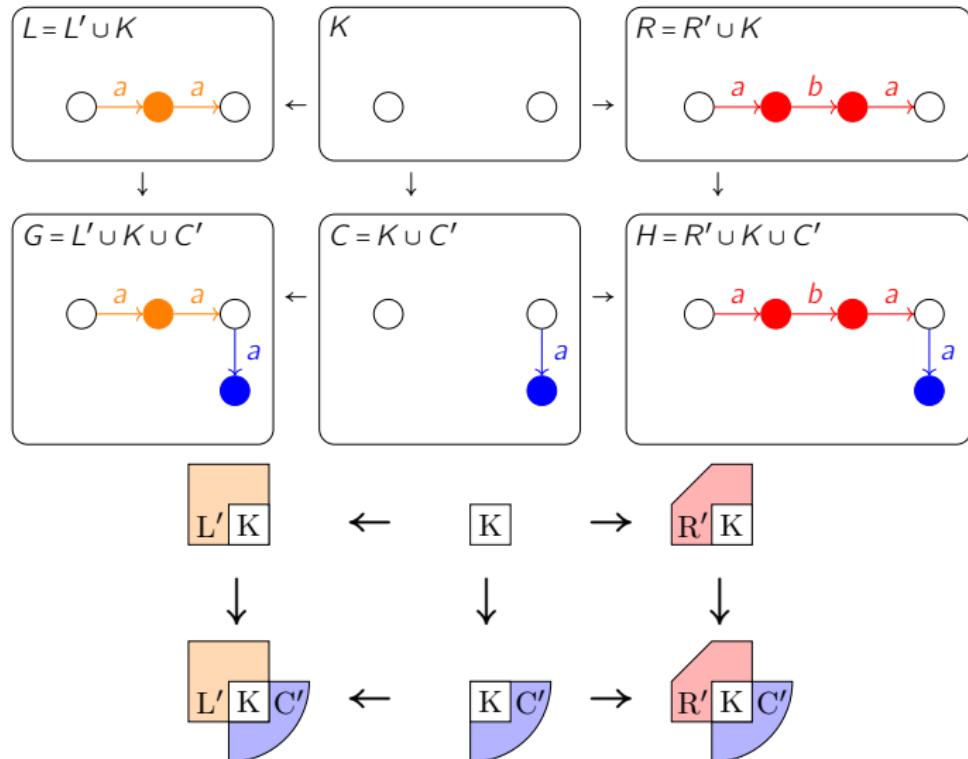
Union of two pre-graphs  $C \subseteq G$  and  $R \subseteq G$ , denoted  $C \cup R$ .



Relative complement of  $R$  in  $H$  where  $R \subseteq H$ , denoted  $H \setminus R$ .



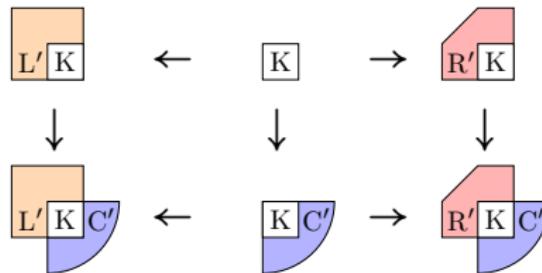
# Decomposition of Graphs in Rewriting Steps



This coloring provides a classification of morphisms in rewriting steps by image node colors.

# Morphisms by Image Node Colors

An  $X$ -occurrence is an injective morphism from  $X$ .

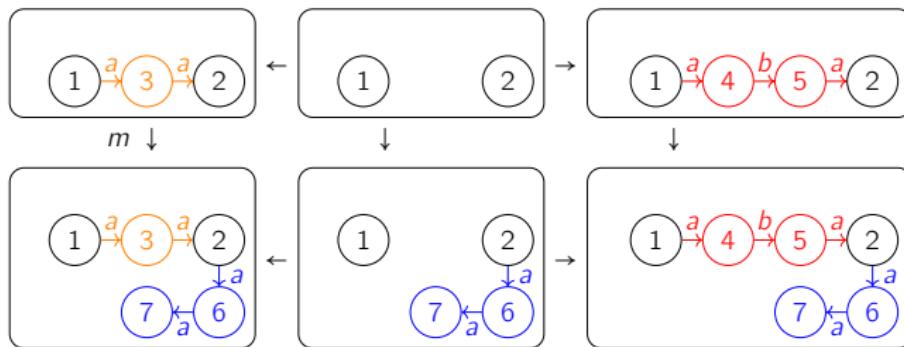


$X$ -morphisms are classified by the colors of their image nodes:

- ▶ orange: only white and orange nodes;
- ▶ red: only white and red nodes;
- ▶ blue: only white and blue nodes;
- ▶ blue-and-orange: blue and orange nodes;
- ▶ blue-and-red: blue and red nodes.

# Morphisms by Image Node Colors

Let  $X$  be the graph  $\bullet \xrightarrow{a} \bullet \xrightarrow{a} \bullet$ .



Blue  $X$ -morphisms:

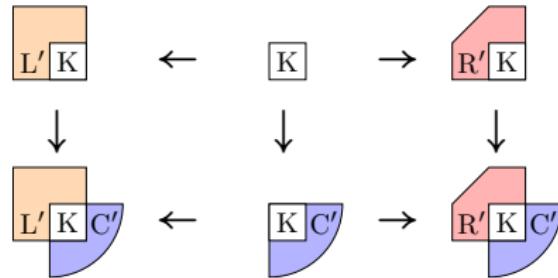
Orange  $X$ -morphisms:

Blue-and-Orange  $X$ -morphisms:

Red  $X$ -morphisms: none.

Blue-and-red  $X$ -morphisms:

# A Sufficient Condition for Termination

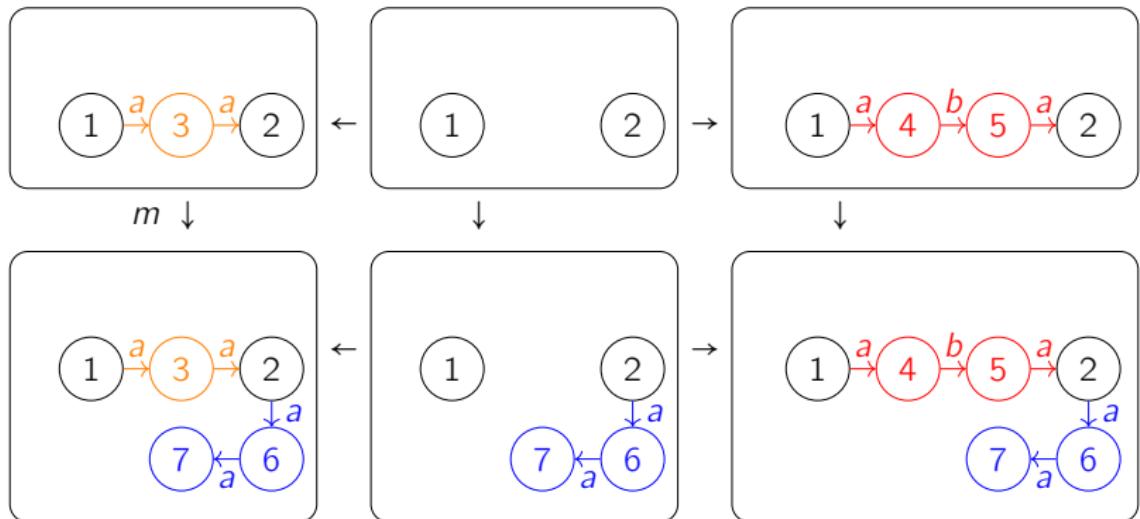


A rule terminates if, for every rewriting step, there are

- ▶ strictly more orange X-morphisms than red X-morphisms,
- ▶ more blue-and-orange X-morphisms than blue-and-red X-morphisms.

**Challenge:**  $C'$  is unknown before rewriting.

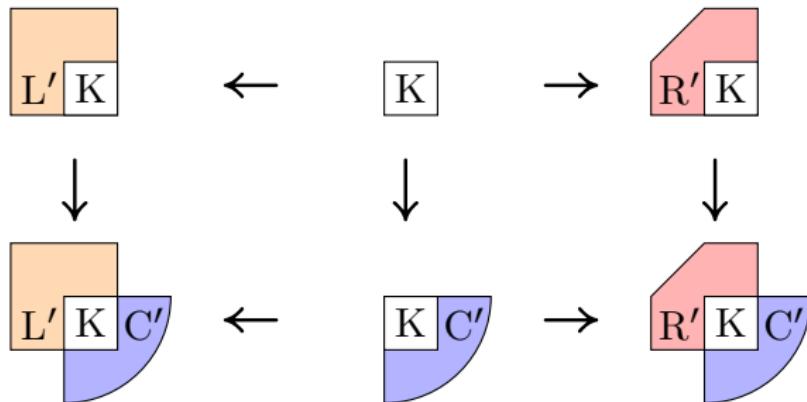
# Analysis of Implicit Occurrences



Blue-and-red X-morphisms:

Blue-and-Orange X-morphisms:

# A Sufficient Condition for the Second Condition

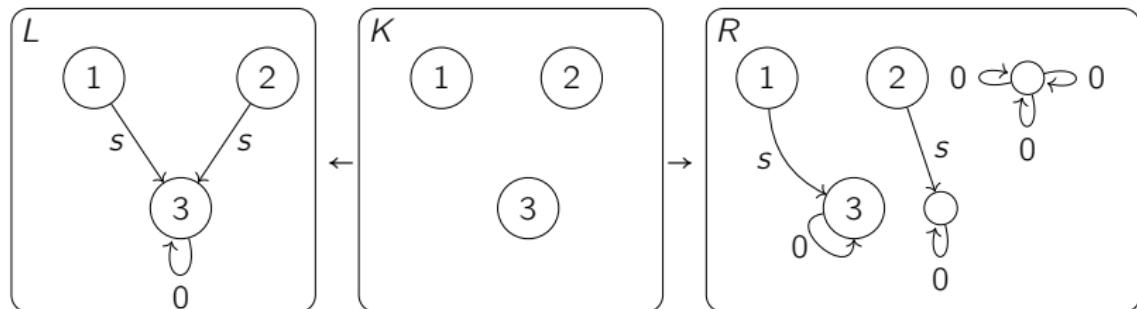


There are more blue-and-orange X-morphisms than blue-and-red X-morphisms, if all subgraphs of  $R'K$  that can form an implicit X-occurrence in some rewriting step can be mapped to distinct subgraphs in  $L'K$  while preserving elements in  $K$ .

# Imcomparable with Existing Methods

Fail in some cases where other methods succeed.

Succeed in the following case where other methods fail:



Termination proved by counting morphisms from  $\bullet \xrightarrow{s} \bullet \xleftarrow{s} \bullet$ .

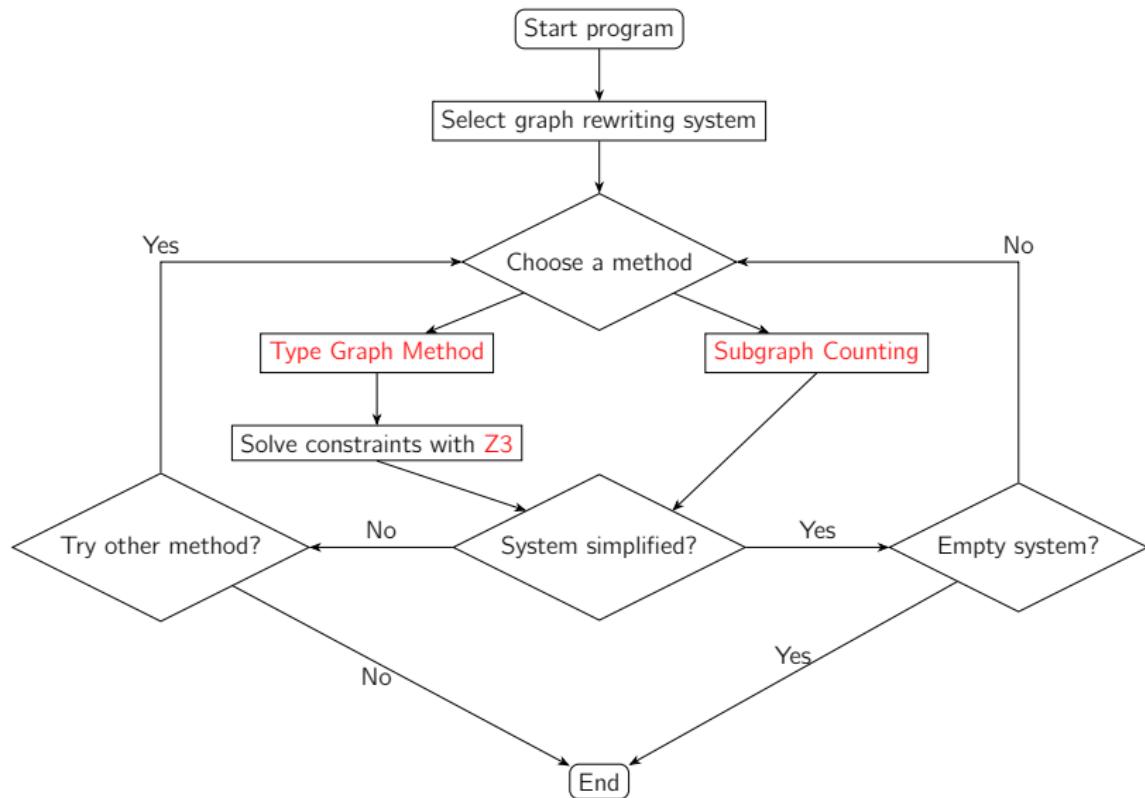
# LyonParallel

Automated tool in Ocaml

Iterative elimination of graph rewriting rules

Available : <https://github.com/Qi-tchi/LyonParallel>

# Process Flowchart of LyonParallel



# Conclusion and Future Work

## Contributions

- ▶ Extended the Weighted Type Graph Method to improve usability.
- ▶ Proposed a termination criterion applicable to new cases.
- ▶ Implemented an automated tool for termination analysis.

## Future work

- ▶ Formally verify the methods.
- ▶ Generalize Morphism Counting Method to Multiple Forbidden Contexts.
- ▶ Extend the approach to other rewriting frameworks.

## References I

- [Bru+15] H. J. Sander Bruggink et al. “Proving Termination of Graph Transformation Systems using Weighted Type Graphs over Semirings”. In: *CoRR abs/1505.01695* (2015). arXiv: 1505.01695.
- [Bru14] H. J. Sander Bruggink. “Towards Process Mining with Graph Transformation Systems”. In: *Graph Transformation*. Ed. by Holger Giese and Barbara König. Cham: Springer International Publishing, 2014, pp. 253–268. ISBN: 978-3-319-09108-2.
- [EO24a] J. Endrullis and R. Overbeek. *Generalized Weighted Type Graphs for Termination of Graph Transformation Systems*. 2024. arXiv: 2307.07601v2 [cs.LO].

## References II

- [EO24b] Jorg Endrullis and Roy Overbeek. “Generalized Weighted Type Graphs for Termination of Graph Transformation Systems”. In: *Graph Transformation - 17th International Conference, ICGT 2024, Held as Part of STAF 2024, Enschede, The Netherlands, July 10-11, 2024, Proceedings*. Ed. by Russ Harmer and Jens Kosiol. Vol. 14774. Lecture Notes in Computer Science. Springer, 2024, pp. 39–58. DOI: [10.1007/978-3-031-64285-2\\_3](https://doi.org/10.1007/978-3-031-64285-2_3).

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