

# An Introduction to Graph Transformation

Dagstuhl Workshop *Formal Models of Graph Transformation in  
Natural Language Processing*

F. Drewes

16 March 2015



# Introduction



Graph transformation...

- started around 1970 in the form of graph grammars,
- studies **rewrite systems** that act on graphs,
- ranges from **Turing complete models** of computation to **context-free graph grammars**,
- does not provide very successful **automata models** for graphs (in the sense of FSA) though there do exist some attempts,
- has established strong connections between context-free graph languages and **monadic second-order logic**.

Guiding idea behind most of it

Use rules that **replace local substructures**.

Apply them iteratively.

Here, I attempt to given an **overview** of some of the most important concepts and facts.

- Certainly **heavily biased**
- Tries to focus on what I expect to be **potentially interesting for CL/NLP**
- **Subjective choice**, will certainly include & omit the wrong things

Since we are here to learn from each other, please interrupt, ask, comment, correct, add, jump in, etc.

# Structure of the Presentation

---

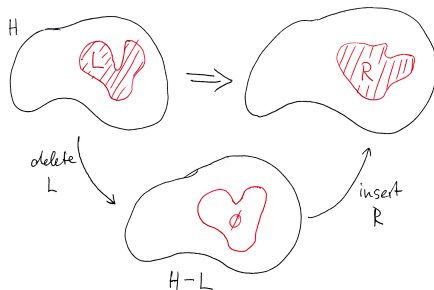
- ① Introduction
- ② General Graph Transformation Systems
- ③ Context-Free Graph Grammars
- ④ Parsing HR Languages
- ⑤ Monadic Second-Order Logic
- ⑥ Term Graphs
- ⑦ Concluding Remarks

# General Graph Transformation Systems

## General idea of rule application

Applying a rule  $L \Rightarrow R$  to a host graph  $H$

- 1 **locates** (a copy of) the left-hand side (lhs)  $L$  in  $H$ ,
- 2 **deletes**  $L$  from  $H$ , and
- 3 **inserts** the right-hand side (rhs)  $R$ .



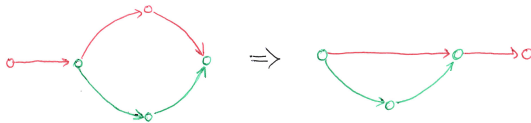
Obvious question: What does **locate**/**delete**/**insert** mean?

The **locate/delete/insert question** can be answered in several ways  
⇒ many possible approaches to graph transformation

- Basically all of them are **Turing complete**.
- Some add **control structures** (like programmed graph grammars).
- Here: focus on the “**algebraic approach**”.
- Comes in two flavors: **double-pushout** and **single-pushout** approach.
- There is also a **pullback** approach, but I won't talk about that one.

**Note:** Pushouts and pullbacks are notions from category theory that we do not need to care about.

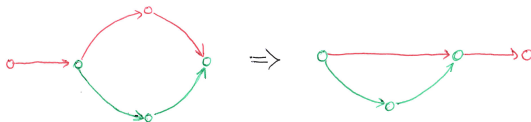
# Getting More Concrete: a Rule



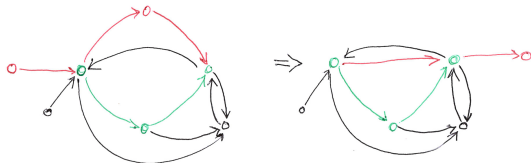
- Left-hand side (lhs) and right-hand side (rhs) intersect in the green items that form the **gluing graph**.
- The **red** part of the lhs (rhs) is to be deleted (inserted, resp.)
- The purpose of the gluing graph is to establish the connection between old and new parts.

**Note:** In general, nodes and edges can be labeled.

# Getting More Concrete: Applying the Rule (1)

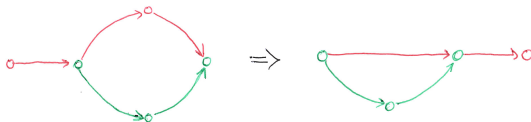


yields

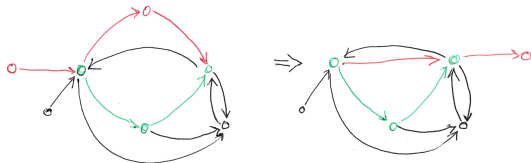




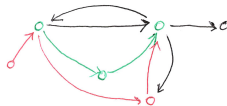
# Getting More Concrete: Applying the Rule (1)



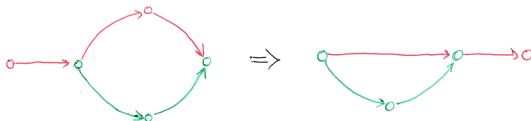
yields



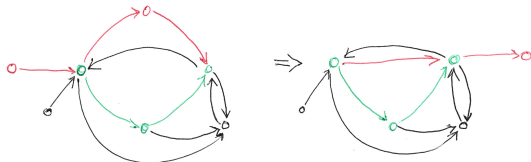
||



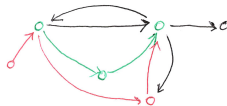
# Getting More Concrete: Applying the Rule (1)



yields

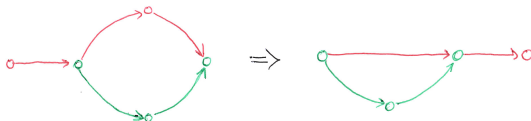


||

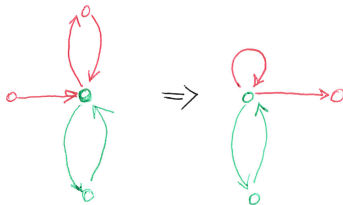


**Dangling condition:** All edges that are incident with deleted nodes must be deleted. (Deletion of the red part creates no dangling edges.)

## Getting More Concrete: Applying the Rule (2)



yields



**Identification condition:** Identify no deleted (red) items with other items.

**Alternative:** Generally require **injective occurrences** (forbid identification).

## Remark: Formalization as Double vs. Single Pushout

---

Application of  $L \Rightarrow R$  to obtain a **derivation step**  $G \Rightarrow H$ :

Rule:  $L \supseteq K \subseteq R$  This diagram exists and is unique if the dangling and identification conditions are satisfied. (Formally, the squares are **pushouts**.)

Step:  $G \supseteq D \subseteq H$

In the **single pushout approach** a rule is a **partial mapping**  $L \rightarrow R$  and only one square is constructed:

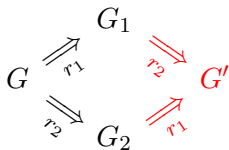
Rule:  $L \longrightarrow R$  This imposes no dangling or identification condition. Instead, **deletion gets priority over preservation**.

Step:  $G \longrightarrow H$

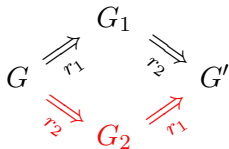
# Some Words about Parallelism

Rule applications can be made in parallel if they are **independent**.

Formulated for the double pushout case:



**Parallel independence:** The red part exists iff the two applications overlap in gluing items only.



**Sequential independence:** The red part exists iff all items that are both in the rhs of  $r_1$  and the lhs of  $r_2$  are gluing items of both.

- These two are equivalent.
- The **parallel rule**  $r = r_1 \uplus r_2$  is applicable iff the two individual applications are parallel independent, and then  $G \xRightarrow[r]{r} G'$ .

# Context-Free Graph Grammars

**Idea:** A rule should replace an atomic item with a nonterminal label.

**Derivation:** Start from an **axiom** (e.g., a single nonterminal item). Apply rules until no nonterminal is left.

Have your choice

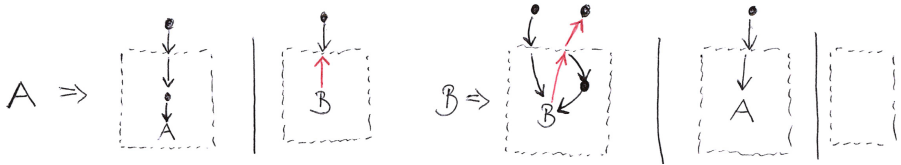
An **atomic item** can be a **node** or an **edge**.

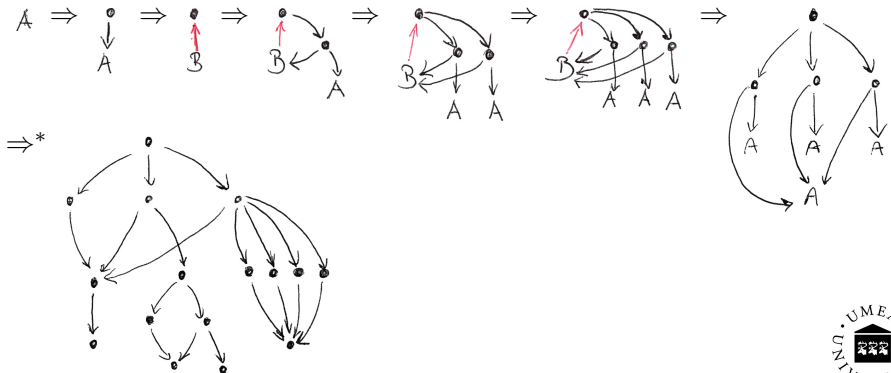
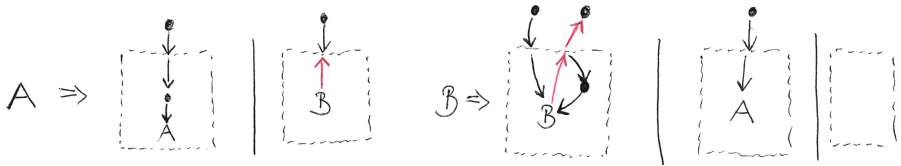
⇒ two different types of grammars based on

- **node replacement** and
- **edge replacement**, resp.

- Rules replace nodes labeled with nonterminals  
⇒ the left-hand side of a rule is a nonterminal label.
- Problem: we need to specify how the right-hand side shall be **connected** to the host graph.
- Replacement steps:
  - ① remove the lhs node with its incident edges,
  - ② add the rhs disjointly, and
  - ③ use the **connection instructions** to connect it to former neighbors of the replaced node.



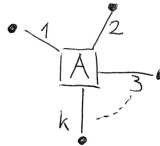




- Context-freeness requires **confluence**.
- Confluence may be violated if there are adjacent nonterminals.
- The **boundary condition** guarantees confluence but is stronger.
- Non-confluence gives PSPACE-complete languages.
- Confluence ensures containment of the languages in NP.

# Hyperedge Replacement (HR)

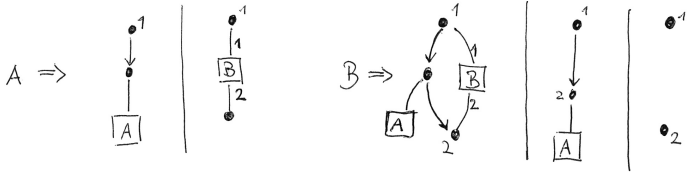
- Rules replace directed **hyperedges** labeled with nonterminals  
 $\Rightarrow$  the left-hand side of a rule is a nonterminal label.
- A hyperedge of rank  $k$   
connects a sequence of  $k$  nodes:



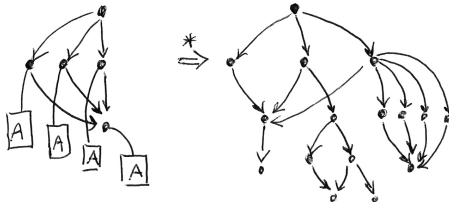
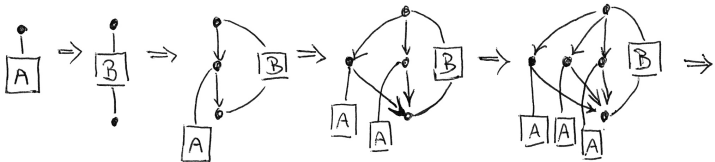
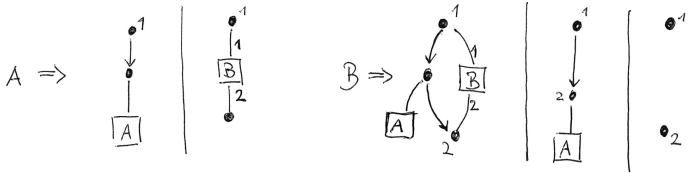
- In the right-hand side a sequence of  $k$  nodes called **sources** is distinguished.
- Replacement steps:
  - 1 remove a hyperedge  $e$  whose label is that of the lhs,
  - 2 add the rhs disjointly, and
  - 3 fuse the  $i$ th incident node of  $e$  with the  $i$ th source.

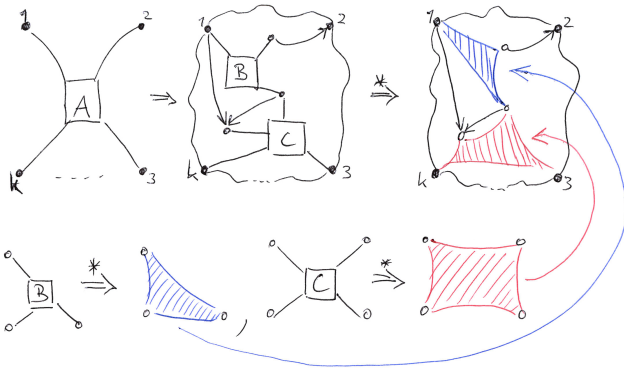
**Note:** We use hyperedges instead of edges in order to be able to “control” more than two nodes.

# HR by Example



# HR by Example



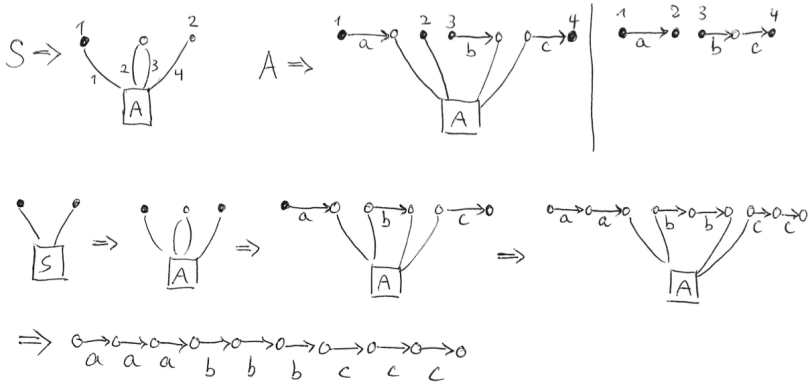


$(G \Rightarrow^n H \text{ iff } H = G[G_1/e_1, \dots, G_n/e_l] \text{ with } G(e_i) \Rightarrow^{n_i} G_i, n = \sum_i n_i)$

- Paths connecting “inside” and “outside” must pass attached nodes.
- Treewidth of language is bounded.
- Special case of node replacement (more or less).
- Chomsky normal-form puts languages into NP.

# String Generation by HR

Look at this:



- Same power as DTWT, MCFG, etc.
- Work on Early-style parsing algorithms for string-generating HR grammars was done by Fischer et al.



# HR and VR Graph Operations

Old idea by Mezei, Wright (1967)

Context-free generation = regular tree grammar + evaluation of trees in some algebra (i.e., view a symbol of rank  $k$  as a  $k$ -ary operation).

HR	VR
Objects: graphs with partial injective <b>source label</b> mapping $src: V \rightarrow LAB$	Objects: graphs with partial <b>port label</b> mapping $port: V \rightarrow LAB$
Operations (many variants possible)	
binary <b>composition</b> $//$ (take disjoint union & fuse sources with same label)	binary <b>disjoint union</b> $\oplus$ (put two graphs next to each other)
	<b>edge creation</b> $add_{a \rightarrow b}$ (add all edges from $a$ -ports to $b$ -ports)
unary <b>relabeling</b> $rel_\rho$ (relabel all sources according to partial injective $\rho: LAB \rightarrow LAB$ )	unary <b>relabeling</b> $rel_\rho$ (relabel all ports according to $\rho: LAB \rightarrow LAB$ )

# Parsing HR Languages

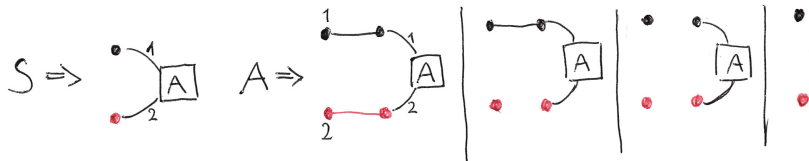
# NP-Completeness of linear VR and HR Languages

Two similar independent “historical” proofs. Flexible because of simplicity.

Language 1 (Aalbersberg, Ehrenfeucht, Rozenberg 1986):



Grammar:



NP-complete by reduction of 3-PARTITION

# NP-Completeness of VR and HR Languages

Language 2 (Lange, Welzl 1987):

Writing  $\bullet \xrightarrow{x} \bullet$  as  $x$ :

... # ... 1 ...

... 1 ... # ... 1 ...

↑  
same position

... 1 ... # ... 1 ...

... 1 ... # ... 1 ...

... 1 ... # ...

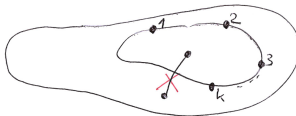
(the '...' are 0/1-strings)

NP-complete by reduction of HAMILTONIAN PATH.

Component  $u \# u$  is interpreted as a (mirrored) incidence list of a node  $v$ . ('1' in position  $i$  means  $i$ th edge is incident with  $v$ .)

# Polynomial Parsing of HR Languages

- CFG-parsing by dynamic programming (CKY) is polynomial because a string has  $O(n^2)$  substrings. But a graph has  $O(2^n)$  subgraphs.
- Sometimes it helps that we only need to consider



⇒ Connected + bounded degree yields P (Rozenberg, Welzl 1986).

- More general: Lautemann (1990) requires logarithmic *k-separability*.
- Chiang et al. (2013) show the bound  $O((3^d n)^{w+1})$ , where  $w$  is the treewidth of the rules (requires connectedness!)

**Note 1:** Chiang et al. (2013): replace  $d$  by  $k$ -separability?

**Note 2:** Forgotten concept by Lautemann: componentwise derivations.

**Note 3:** Polynomial algorithms are *non-uniform* (fixed grammar).

# Monadic Second-Order Logic

Viewing a graph  $G$  as a **logical structure**:

- Nodes (and edges?) are elements of the domain  $dom(G)$ .
- If only nodes are in the universe, graphs are **simple**.
- Predicates for source labels etc ( $src_a(x) = true$  if  $x$  is  $a$ -source)
- Predicates for incidence or adjacency ( $edg_f(x, y) = true$  if  $(x, y)$  is an edge with label  $f$ , or  $s(e, x) = true$  if  $x$  is the source of  $e$  and  $t(e, y) = true$  if  $y$  is the target of  $e$ ).

**Formulas** are built as usual, including quantification  $\forall x, \exists x, \forall X, \exists X$  over singletons  $x \in dom(G)$  and sets  $X \subseteq dom(G)$ .

**Note:** “monadic” means that there is **no quantification over relations**.

**Counting MSO** is a useful generalization containing **cardinality predicates**  $card_p^q(X) \equiv |X| = p \pmod{q}$ .



# Connections between MSO and Context-Freeness

- We have to use the “right” relational structures (e.g., HR needs quantification over edges whereas VR uses simple graphs).
- A (counting) MSO sentence  $\phi$  defines the graph language  $\{G \mid G \models \phi\}$ .
- Context-freeness is **not equivalent** to definability (counterexample:  $a^n b^n$  viewed as string graphs). However, the following hold:
  - $\{G \in L(\mathcal{G}) \mid G \models \phi\}$  is effectively context-free.
  - Consequently, it is decidable whether **all/infinitely many/finitely many/no graphs** of a context-free graph language satisfy  $\phi$ .
- Generalization: The **image** of a context-free graph language under a **CMSO transduction** is effectively context-free.

Most MSO-based constructions/algorithms are inefficient, but they provide a good starting point.



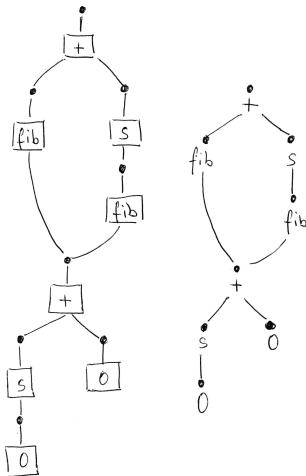


# Term Graphs

# Graphs Representing Trees

(Hyper)graphs can represent trees with **shared subtrees**

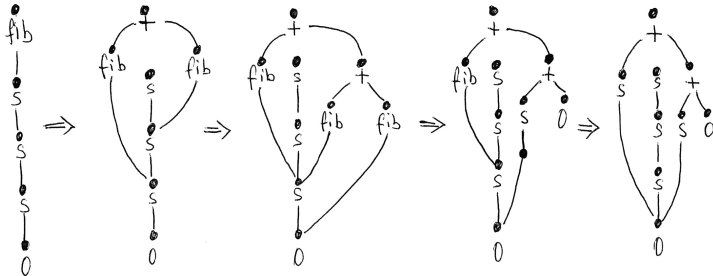
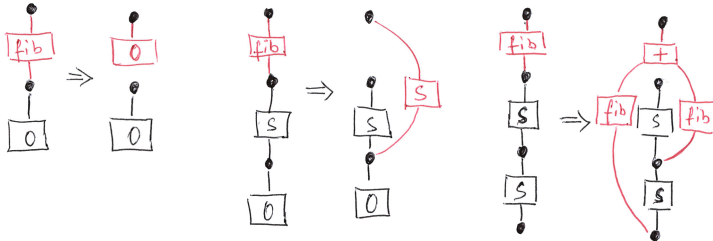
⇒ we can **implement term rewriting by graph transformation**.



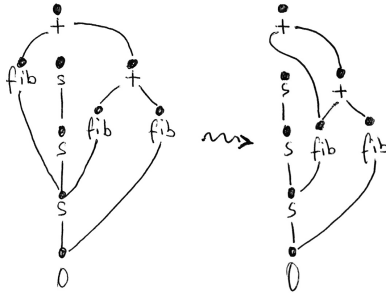
- Example:  
symbols  $+$ ,  $fib$ ,  $s$ ,  $0$  (arities 2, 1, 1, 0)  
term  $fib(s(0) + 0) + s(fib(s(0), 0))$
- **Unfolding** removes sharing by copying shared subtrees.
- Conversely, **collapsing** equal subtrees creates a compact representation.

# Example: Term Rewriting by Graph Transformation

$$\text{fib}(0) \rightarrow 0, \quad \text{fib}(s(0)) \rightarrow s(0), \quad \text{fib}(s(s(x))) \rightarrow \text{fib}(x) + \text{fib}(s(x))$$



Collapsing nodes that represent identical subtrees increases efficiency (but removes degrees of freedom):



Another phenomenon observed in this term graph is [garbage](#).

## Concluding Remarks

# Many Things have been Left Out

---

Among the many things left out are:

- rules with **application conditions**
- **structuring principles** such as transformation units
- **graph programs**
- graphs with **attributes**
- **generalizations** of graph transformation
- ...

# Systems Implementing Graph Transformation

---

- **AGG**: transform graphs with attributes, based on single-pushout approach, TU Berlin (G. Taentzer). Development stopped?
- **GrGen.NET**: fast implementation using single-pushout approach, Univ. Karlsruhe (R. Geiß et al.). Latest release from 2014.
- **GP**: implements graph programs, University of York (D. Plump et al.). Ongoing development (I think).
- **GMTE**: implements several approaches to graph transformation, LAAS-CNRS (Houda Khelif et al.). Ongoing development.
- **GROOVE**: system for model transformation based on graph transformation, intended for verification, University of Twente (A. Rensink et al.).
- **Bolinas**: graph processing package implementing (synchronous) HR grammars, USC/ISI (D. Bauer et al.). Ongoing.