



Monadic second-order logic for graphs.
Algorithmic and language theoretical applications

Part 2

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Reference : Graph structure and monadic second-order logic,
book to be published by Cambridge University Press, readable on :
<http://www.labri.fr/perso/courcell/ActSci.html>

Summary

1. Context-free sets defined by equation systems
2. Two graph algebras. Tree-width and clique-width
3. Recognizability : an algebraic notion
4. Monadic second-order sentences define recognizable sets.

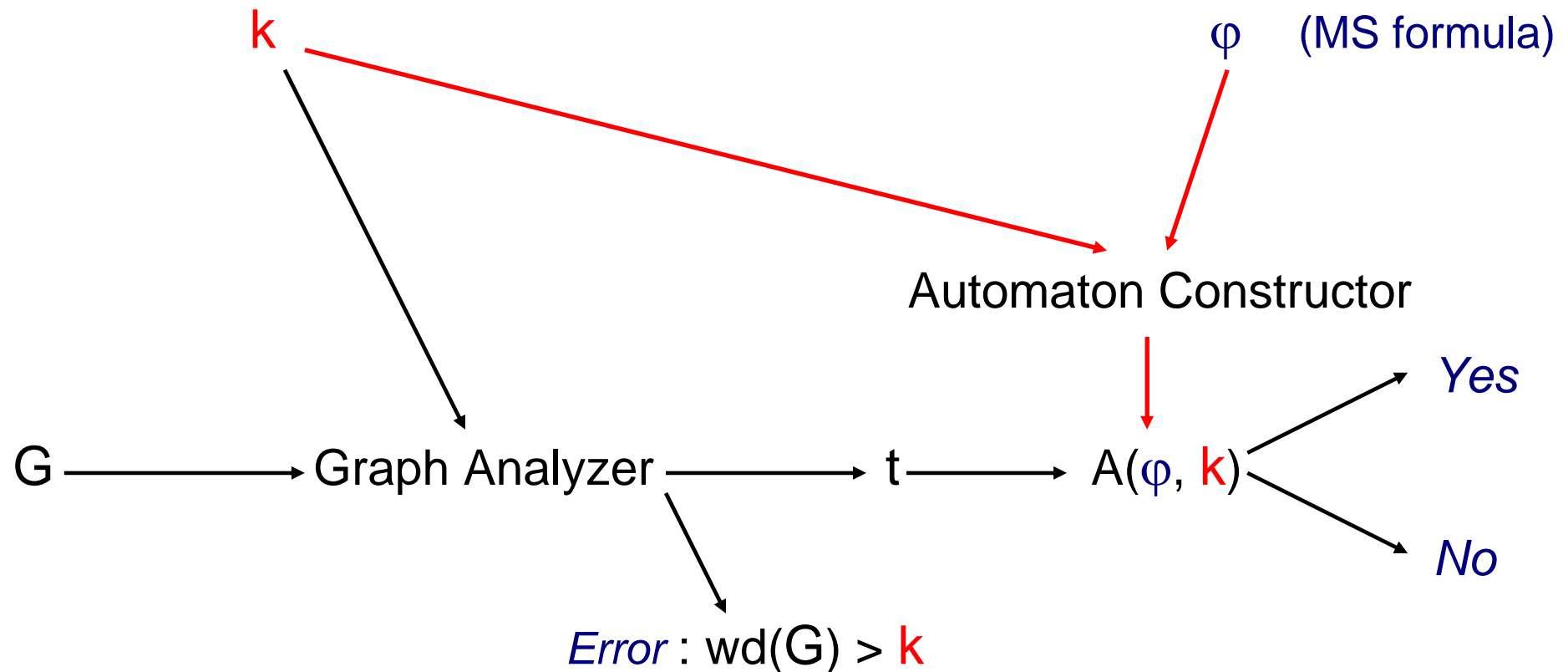
Part 2

5. Fixed-parameter tractable algorithms; constructions of automata.

Part 3

6. Monadic second-order transductions.
7. Robustness results : preservation of classes under direct and inverse monadic second-order transductions. Short proofs in graph theory. (black = graph theory)
8. Logic and graph structure theory : Graph classes on which monadic second-order logic is decidable
9. Some open questions

5. FPT algorithms : Constructions of automata



Steps \longrightarrow done “once for all”, independent of G $A(\varphi, k)$: finite automaton on terms (wd = tree-width or clique-width or equivalent)

Difficulties

1. **Parsing** : construction of terms (based on tree-decompositions or other graph decompositions).

The *linear-time exact* parsing algorithm by Bodlaender (for tree-width) and the *cubic approximate* parsing algorithm by Hlineny & Oum (for clique-width via *rank-width*) are not implementable.

Bodlaender reports about usable algorithms for (non-random) graphs with 50 vertices and tree-width ≤ 35

Specific algorithms : (1) Flow-graphs of structured programs have **tree-width** at most 6 and tree-decompositions are easy from the parse trees of programs (Thorup).

(2) For certain graph classes of bounded **clique-width** defined by forbidden induced subgraphs, optimal clique-width terms can be constructed in polynomial time (by using *modular decomposition*).

2. Sizes of automata

The automata $A(\varphi, k)$ may be too large for being **practically compiled**.

The construction by induction on the structure of φ may need intermediate automata of huge size, even if the *unique minimal deterministic* automaton equivalent to $A(\varphi, k)$ has a manageable number of states.

Examples : Soguet *et al.* using MONA have constructed automata for the following cases ; no success for clique-width 4 :

	<i>Clique-width 2</i>	<i>Clique-width 3</i>
MaxDegree ≤ 3	91 states	Space-Out
Connected	11 states	Space-Out
IsConnComp(X)	48 states	Space-Out
Has ≤ 4 -VertCov	111 states	1037 states
HasClique ≥ 4	21 states	153 states
2-colorable	11 states	57 states

Other examples of automata too large to be constructed, i.e., “compiled”:

for $k = 2$: 4-colorability, 3-acyclic-colorability, NoCycle (i.e., is a forest)

for $k = 5$: 3-colorability, clique

for $k = 4$: connectedness.

This is not avoidable :

The number of states of $A(\varphi, k)$ is bounded by an h -iterated exponential where h is the number of quantifier alternations of φ .

There is no alternative construction giving an upper bound with a bounded nesting of exponentiations (Meyer & Stockmeyer, Weyer, Frick & Grohe).

What to do ?

(1) Focus on MS formulas *without quantifier alternation*, written with “powerful” atomic formulas expressing basic graph properties :

$\text{Path}(X, Y)$: X has exactly 2 vertices linked by a path in $G[Y]$,

$\text{NoEdge}(X)$: $G[X]$ has no edge,

$\text{Conn}(X)$: $G[X]$ is connected,

$\text{NoCycle}(X)$: $G[X]$ is a forest.

(2) Using *fly-automata* : transitions are *not compiled* but computed as needed

Examples of graph properties

(1) p-colorability

$$\exists X_1, \dots, X_p \text{ (Partition}(X_1, \dots, X_p) \wedge \text{NoEdge}(X_1) \wedge \dots \wedge \text{NoEdge}(X_p) \text{)}$$

(2) p-*acyclic* colorability

$$\begin{aligned} \exists X_1, \dots, X_p \text{ (Partition}(X_1, \dots, X_p) \wedge \text{NoEdge}(X_1) \wedge \dots \wedge \text{NoEdge}(X_p) \wedge \dots \\ \dots \wedge \text{NoCycle}(X_i \cup X_j) \wedge \dots \text{)} \quad \text{(all } i < j\text{).} \end{aligned}$$

We use set terms : $X_i \cup X_j$, to avoid some quantifications.

(3) minor inclusion : H simple, loop-free. $\text{Vertices}(H) = \{v_1, \dots, v_p\}$

$$\begin{aligned} \exists X_1, \dots, X_p \text{ (Disjoint}(X_1, \dots, X_p) \wedge \text{Conn}(X_1) \wedge \dots \wedge \text{Conn}(X_p) \wedge \dots \\ \dots \wedge \text{Link}(X_i, X_j) \wedge \dots \text{)} \end{aligned}$$

with $\text{Link}(X_i, X_j)$ for each edge $v_i - v_j$ of H ; (there exists an edge between X_i and X_j .)

Remarks on Conn(X)

(connectedness of $G[X]$)

and the automata for terms that define graphs of clique-width $\leq k$.

There are two *non-deterministic* automata for Conn(X) and \neg Conn(X) that have both $2^{O(k \cdot k)}$ states.

There is a *deterministic* automata for Conn(X) (and also \neg Conn(X)) that has $2^{O(2^k)}$ states. Its states are the sets of subsets of $[k]=\{1, \dots, k\}$

The *minimal deterministic* automaton for Conn(X) has more than $2^{2^{k/2}}$ states.

Construction of $A(\varphi, k)$ for “clique-width” terms

k = the number of vertex labels = the bound on clique-width

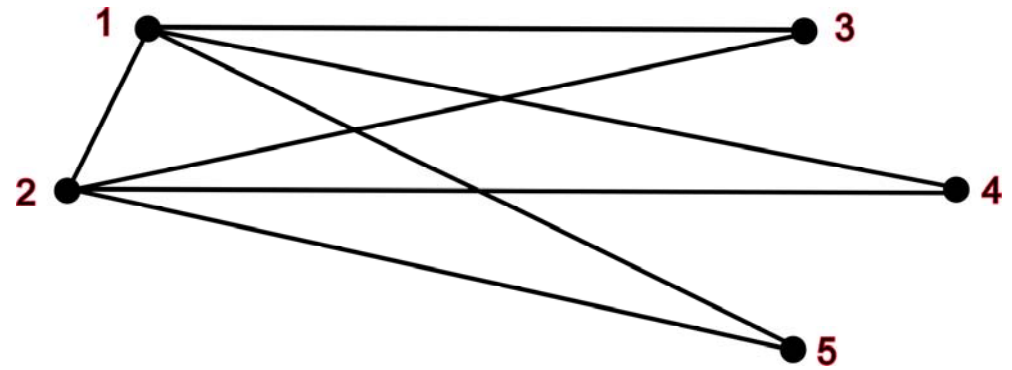
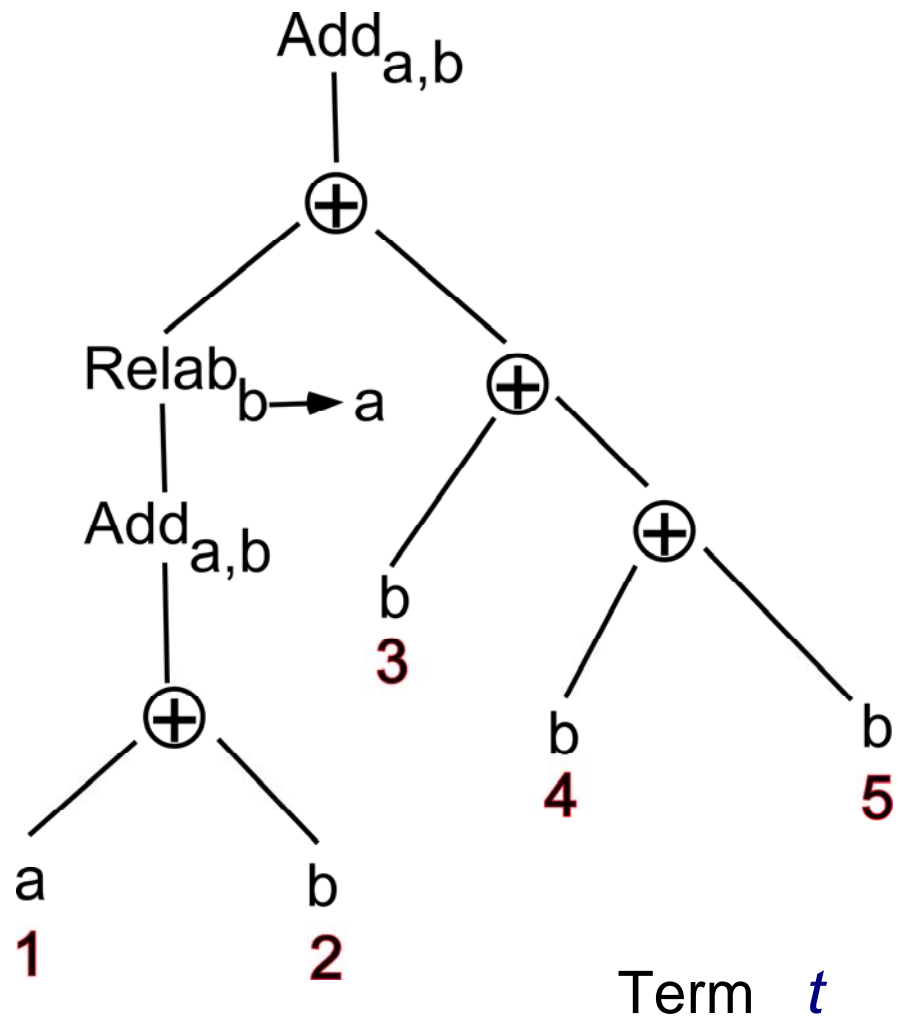
F = the corresponding set of operations and constants :

a , \emptyset , \oplus , *Add* a,b , *Relab* $a \longrightarrow b$

$G(t)$ = the graph defined by a term t in $\mathbf{T}(F)$.

Its vertices are (in bijection with) the occurrences of the constants in t that are not \emptyset

Example



Terms are equipped with Booleans that encode assignments of vertex sets V_1, \dots, V_n to the free set variables X_1, \dots, X_n of MS formulas (*formulas are written without first-order variables*):

1) we replace in F each constant \mathbf{a} by the constants

$(\mathbf{a}, (w_1, \dots, w_n))$ where $w_i \in \{0, 1\}$: we get $F^{(n)}$

(only constants are modified);

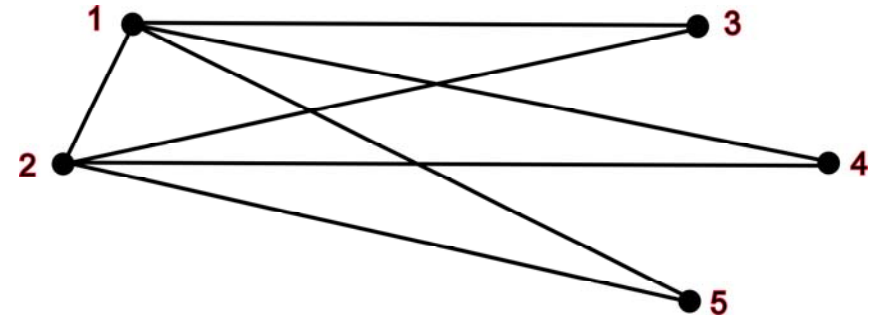
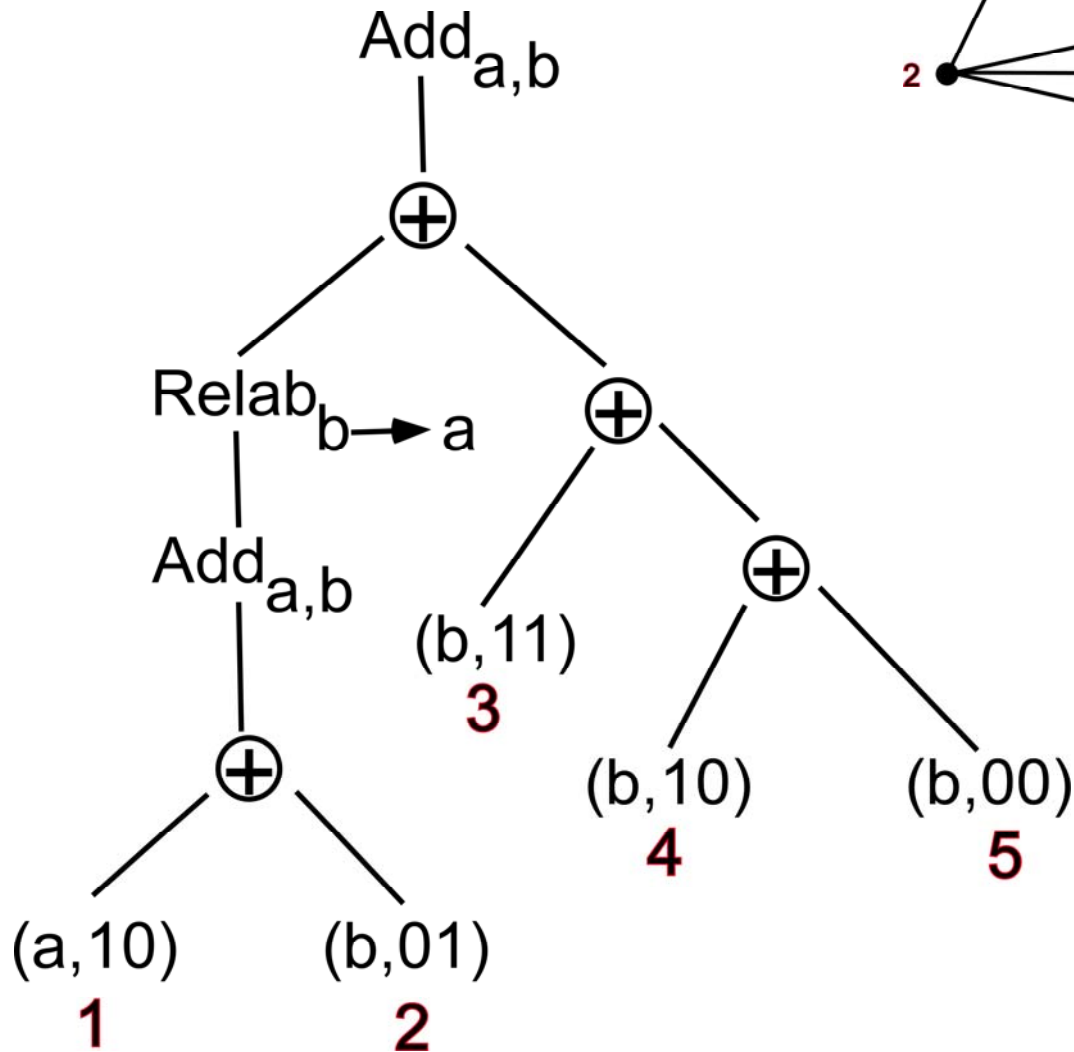
2) a term \mathbf{s} in $\mathbf{T}(F^{(n)})$ encodes a term t in $\mathbf{T}(F)$ and an assignment of sets V_1, \dots, V_n to the set variables X_1, \dots, X_n :

if u is an occurrence of $(\mathbf{a}, (w_1, \dots, w_n))$, then

$w_i = 1$ if and only if $u \in V_i$.

3) \mathbf{s} is denoted by $t^*(V_1, \dots, V_n)$

Example (continued)



$$V_1 = \{1,3,4\}, V_2 = \{2,3\}$$

Term $t^*(V_1, V_2)$

By an induction on φ , we construct for each $\varphi(X_1, \dots, X_n)$ a finite (bottom-up) deterministic automaton $A(\varphi(X_1, \dots, X_n), \mathbf{k})$ that recognizes:

$$L(\varphi(X_1, \dots, X_n)) := \{ t^* (V_1, \dots, V_n) \in \mathbf{T}(F^{(n)}) \mid (G(t), (V_1, \dots, V_n)) \models \varphi \}$$

Theorem: For each sentence φ , the automaton $A(\varphi, \mathbf{k})$ accepts in time $f(\varphi, \mathbf{k}) \cdot |t|$ the terms t in $\mathbf{T}(F)$ such that $G(t) \models \varphi$

It gives a *fixed-parameter linear* model-checking algorithm for input t , and a *fixed-parameter cubic* one if the graph has to be parsed.

(The parameter is clique-width, or, for undirected graphs, the equivalent graph complexity measure *rank-width* defined by Oum & Seymour).

The inductive construction of $A(\varphi, k)$

Atomic formulas : discussed below.

For \wedge : product of two automata (deterministic **or not**)

For \vee : union of two automata (or product of two **complete** automata; product preserves determinism)

For **negation** : exchange accepting / non-accepting states
for a complete **deterministic** automaton

Quantifications: Formulas are written without \forall

$$L(\exists X_{n+1} \cdot \varphi(X_1, \dots, X_{n+1})) = \text{pr}(L (\varphi(X_1, \dots, X_{n+1})))$$

$$A(\exists X_{n+1} \cdot \varphi(X_1, \dots, X_{n+1})) = \text{pr}(A (\varphi(X_1, \dots, X_{n+1})))$$

where **pr** is the “*projection*” that eliminates the last Boolean.

→ a *non-deterministic* automaton.

oOo

The number of states is an **h-iterated exponential**,

where **h** = maximum nesting of negations.

Some tools for constructing automata

Substitutions and inverse images (“cylindrifications”).

1) If we know $A(\varphi(X_1, X_2))$, we can get easily $A(\varphi(X_4, X_3))$:

$$L(\varphi(X_4, X_3)) = h^{-1}(L(\varphi(X_1, X_2))) \quad \text{where}$$

h maps $(\mathbf{a}, (w_1, w_2, w_3, w_4))$ to $(\mathbf{a}, (w_4, w_3))$

We take

$$A(\varphi(X_4, X_3)) = h^{-1}(A(\varphi(X_1, X_2)))$$

This construction preserves determinism and the number of states.

2) From $A(\varphi(X_1, X_2))$, we can get $A(\varphi(X_3, X_1 \cup (X_2 \setminus X_4)))$ by h^{-1} with h mapping $(\mathbf{a}, (w_1, w_2, w_3, w_4))$ to $(\mathbf{a}, (w_3, w_1 \vee (w_2 \wedge \neg w_4)))$

Set term

Relativization to subsets by inverse images.

If φ is a closed formula expressing a graph property P , its relativization $\varphi [X_1]$ to X_1 expresses that the subgraph induced on X_1 satisfies P . To construct it, we replace recursively

$$\exists y. \theta \quad \text{by} \quad \exists y. y \in X_1 \wedge \theta, \text{ etc...}$$

However, there is an easy transformation of automata :

Let h map $(\mathbf{a}, 0)$ to \emptyset and $(\mathbf{a}, 1)$ to \mathbf{a} .

$$L(\varphi [X_1]) = h^{-1} (L(\varphi))$$

Hence:

$$A(\varphi [X_1]) := h^{-1} (A(\varphi))$$

The inductive construction (continued) :

Complete *deterministic* automata for atomic formulas and basic graph properties : automaton over $F^{(n)}$ recognizing the set of terms

$$t^* (V_1, \dots, V_n) \text{ in } L(\varphi(X_1, \dots, X_n))$$

Intuition : in all cases, the *state* at node u represents a *finite information* $q(u)$ about the graph $G(t/u)$ and the restriction of (V_1, \dots, V_n) to the vertices below u (vertices = leaves)

1) if $u = f(v, w)$, we want that $q(u)$ is defined from $q(v)$ and $q(w)$ by a fixed function : \rightarrow the *transition function* ;

2) whether $(G(t), V_1, \dots, V_n)$ satisfies $\varphi(X_1, \dots, X_n)$ must be checkable from $q(\text{root})$: \rightarrow the *accepting states*.

Atomic and basic formulas :

$X_1 \subseteq X_2$, $X_1 = \emptyset$, $\text{Single}(X_1)$,

$\text{Card}_{p,q}(X_1)$: cardinality of X_1 is $= p \pmod{q}$,

$\text{Card}_{<q}(X_1)$: cardinality of X_1 is $< q$.

→ Easy constructions with small numbers of states :
respectively 2, 2, 3, q , $q+1$.

Example : for $X_1 \subseteq X_2$, the term has no constant (**a**, 10).

Atomic formula : $\text{edg}(X_1, X_2)$ for directed edges

$\text{edg}(X_1, X_2)$ means : $X_1 = \{x\} \wedge X_2 = \{y\} \wedge x \longrightarrow y$

Vertex labels \in a set C of k labels.

k^2+k+3 *states* : 0, Ok, **a(1)**, **a(2)**, **ab**, Error, for **a, b** in C , **a** \neq **b**

Meaning of states (at node u in t ; its subterm t/u defines $G(t/u) \subseteq G(t)$).

0 : $X_1 = \emptyset$, $X_2 = \emptyset$

Ok *Accepting state* : $X_1 = \{v\}$, $X_2 = \{w\}$, $\text{edg}(v, w)$ in $G(t/u)$

a(1) : $X_1 = \{v\}$, $X_2 = \emptyset$, v has label **a** in $G(t/u)$

a(2) : $X_1 = \emptyset$, $X_2 = \{w\}$, w has label **a** in $G(t/u)$

ab : $X_1 = \{v\}$, $X_2 = \{w\}$, v has label **a**, w has label **b** (hence $v \neq w$)
and $\neg \text{edg}(v, w)$ in $G(t/u)$

Error : all other cases

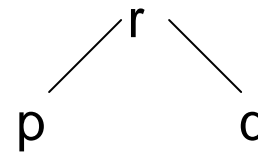
Transition rules

For the constants based on **a** :

(a,00) \rightarrow 0 ; **(a,10)** \rightarrow a(1) ; **(a,01)** \rightarrow a(2) ; **(a,11)** \rightarrow Error

For the binary operation \oplus :

(p,q,r are states)



If p = 0 then r := q

If q = 0 then r := p

If p = **a(1)**, q = **b(2)** and **a** \neq **b** then r := **ab**

If p = **b(2)**, q = **a(1)** and **a** \neq **b** then r := **ab**

Otherwise r := Error

For unary operations $\overrightarrow{Add}_{a,b}$

r
|
p

If $p = ab$ then $r := Ok$ else $r := p$

For unary operations $Relab_a \rightarrow b$

If $p = a(i)$ where $i = 1$ or 2 then $r := b(i)$

If $p = ac$ where $c \neq a$ and $c \neq b$ then $r := bc$

If $p = ca$ where $c \neq a$ and $c \neq b$ then $r := cb$

If $p = Error$ or 0 or Ok or $c(i)$ or cd or dc where $c \neq a$

then $r := p$

Sizes of some deterministic automata :

k = bound on clique-width

Property	Partition (X_1, \dots, X_p)	edg(X, Y)	NoEdge	Connected, NoCycle for degree $\leq p$	Path(X, Y)	Connected, Nocycle
Number of states N(k)	2	k^2+k+3	2^k	$2^{O(p.k.k)}$	$2^{O(k.k)}$	$2^{2^{O(k)}}$

Difficulties with the *sizes* of the automata $A(\varphi, k)$

Examples of automata too large to be constructed, i.e., “compiled”:

for $k = 2$: 4-colorability, 3-acyclic-colorability, NoCycle (i.e., is a forest)

for $k = 4$: connectedness,

for $k = 5$: 3-colorability, clique.

From now on : work in progress



Fly-automata :

States and transitions are not listed in huge tables :
they are *specified* (in uniform ways for all k) by “small” programs.

Example of state for connectedness :

$$q = \{ \{a\}, \{a,b\}, \{b,c,d\}, \{b,d,f\} \},$$

a,b,c,d,f are vertex labels; q is the set of *types* of
the connected components of the current graph.

Some transitions :

$$\text{Add}_{a,c} : \quad q \longrightarrow \{ \{a,b,c,d\}, \{b,d,f\} \},$$

$$\text{Relab}_{a \rightarrow b} : \quad q \longrightarrow \{ \{b\}, \{b,c,d\}, \{b,d,f\} \}$$

Transitions for \oplus : union of sets of types.

This method works for formulas with no quantifier alternation, but that use “powerful atomic formulas”.

Examples : p -acyclic colorability

$$\exists X_1, \dots, X_p \left(\text{Partition}(X_1, \dots, X_p) \wedge \text{NoEdge}(X_1) \wedge \dots \wedge \text{NoEdge}(X_p) \wedge \dots \right. \\ \left. \dots \wedge \text{NoCycle}(X_i \cup X_j) \wedge \dots \right)$$

Minor inclusion : H simple, loop-free. $\text{Vertices}(H) = \{v_1, \dots, v_p\}$

$$\exists X_1, \dots, X_p \left(\text{Disjoint}(X_1, \dots, X_p) \wedge \text{Conn}(X_1) \wedge \dots \wedge \text{Conn}(X_p) \wedge \dots \right. \\ \left. \dots \wedge \text{Link}(X_i, X_j) \wedge \dots \right)$$

Existence of “holes” : odd induced cycles (to check *perfectness* ; one checks “anti-holes” on the edge-complement of the given graph).

Some experiments with **fly-automata** (by Irène Durand, LaBRI)

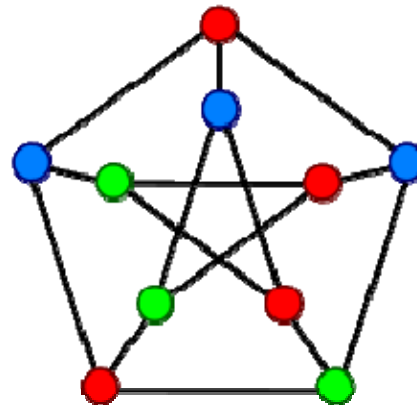
3-colorability of the 6 x 300 grid (of clique-width 8) in less than 2 hours,

4-acyclic-colorability of the Petersen graph (clique-width 7) in 17 minutes.

(3-colorable but not acyclically;

red and **green** vertices

induce a cycle).



Closure properties of fly-automata (can be non-deterministic):

Union (for \vee)

Product (for \wedge)

Image (for \exists)

Inverse image (for substitutions and relativization)

New tool : Annotations

At some positions in the given term, we attached some (finite) contextual information.

Example :

At position u in a term t , we attach the set

$\text{ADD}_t(u)$ = the set of pairs (a,b) such that some operation

$\text{Add}_{c,d}$ above u (hence, in its “context”) adds edges between the (eventual) vertices below u labelled by a and b .

These sets can be computed in *linear time* by means of a top-down traversal of t .

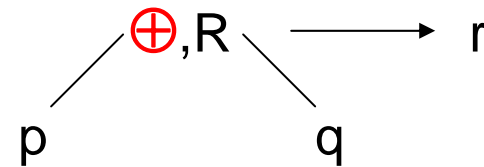
Certain automata on **annotated terms** may have less states.

Example: $edg(X_1, X_2)$: $2k+3$ states instead of $k^2 + k + 3$ (cf. page 21):

0, Ok, **a**(1), **a**(2), Error, for **a** in C.

Transitions for \oplus annotated by R :

(p, q, r are states)



if $p = 0$ then $r := q$; if $q = 0$ then $r := p$;

if $p = \mathbf{a}(1)$, $q = \mathbf{b}(2)$ and $(\mathbf{a}, \mathbf{b}) \in R \wedge$ then $r := \text{Ok}$;

and if $(\mathbf{a}, \mathbf{b}) \notin R \wedge$ then $r := \text{Error}$;

if $p = \mathbf{b}(2)$, $q = \mathbf{a}(1)$: *idem* ;

otherwise $r := \text{Error}$.

Other examples :

For *Clique*(X) meaning that X induces a clique :

$2^k + 2$ states instead of $2^{O(k.k)}$.

For *Connectedness* : same states but they “shrink” quicker :

cf. the rules for *Add*_{a,c} on page 26.

Model-checking of MS_2 formulas

(1) By Kreutzer, Makowsky *et al.*, FPT model-checking for MS_2 formulas (using edge quantifications) *needs* restriction tree-width as parameter unless $P=NP$, ETH, Exptime=NExptime *etc...*

(2) The case of MS_2 formulas reduces to that of MS ones:

- G of tree-width $k \geq 2 \rightarrow \text{Inc}(G)$ has tree-width k ,
hence, clique-width $\leq 2^{O(k)}$ (exponential blow-up !)
- every MS_2 property of G is an MS property of $\text{Inc}(G)$

(3) For a “direct” construction, we need :

(3.1) Terms to represent graphs, over appropriate operations.

(3.2) A representation of vertices *and edges* by occurrences of operations and constants in these terms.

(3.2.1) : For “clique-width” terms : we have *no* good representation of edges because each occurrence of $Add_{a,b}$ may add simultaneously an unbounded number of edges.

(3.2.2) : For “special terms”, i.e., “clique-width” terms where each occurrence of $Add_{a,b}$ adds a unique edge, we have such a bijection. This is OK for graphs of bounded *special tree-width* (but not for bounded tree-width). (cf. my lecture to FST-TCS 2010).

Special tree-width is the minimal width of a *special tree-decomposition*

(T,f) where :

(a) T is a rooted tree,

(b) the set of nodes whose boxes contain any vertex is a *directed path*

Motivations : (1) Comparison with

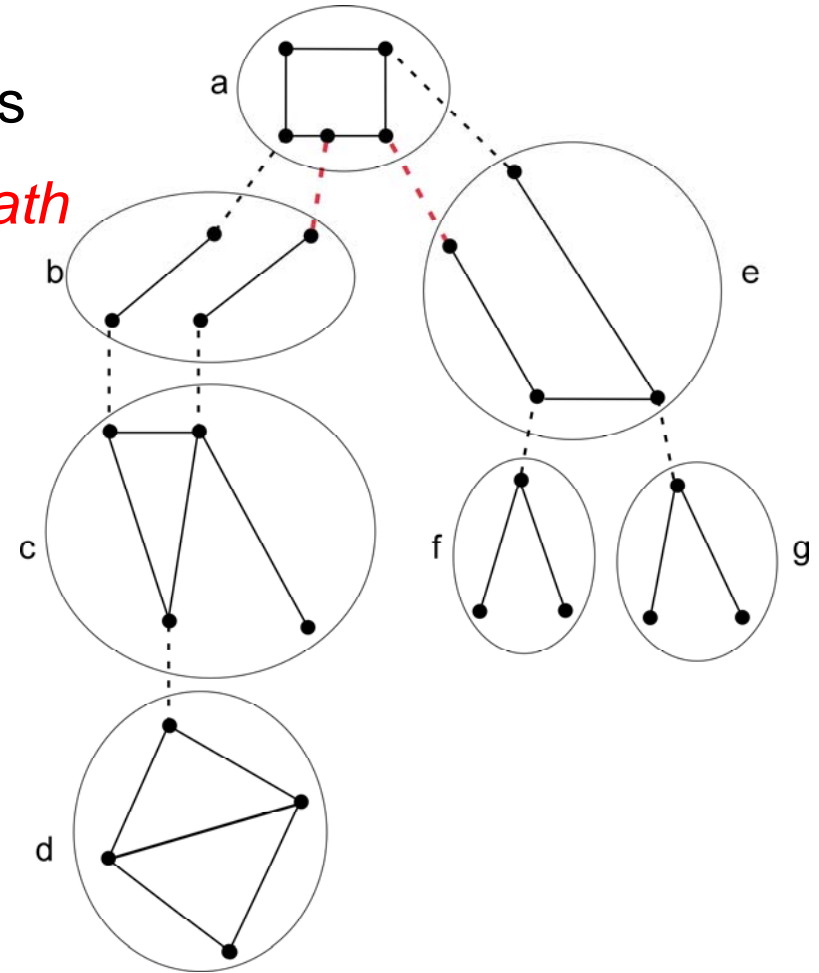
clique-width (no exp. blow-up)

$$\text{cwd}(G) \leq \text{sptwd}(G)+2$$

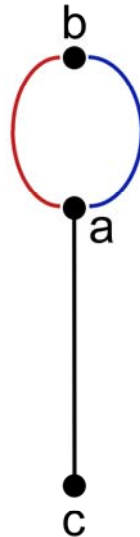
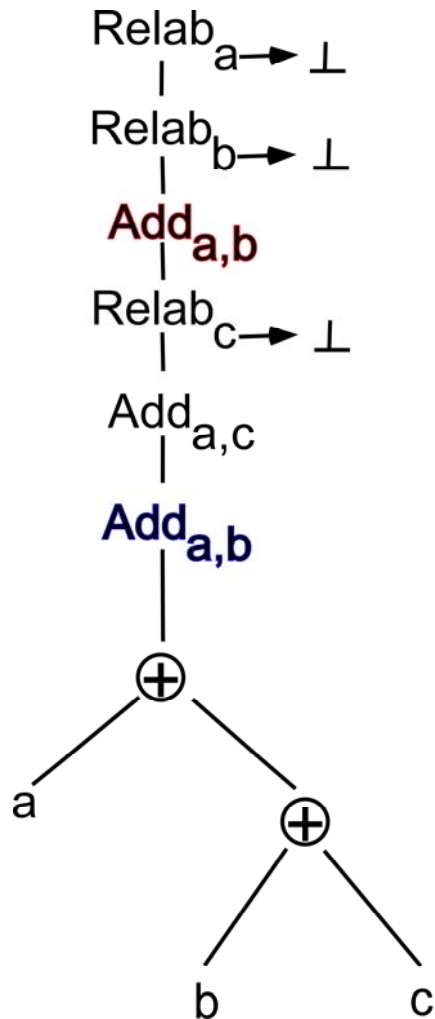
(2) The automata for checking

adjacency are exponentially smaller

than for bounded tree-width



Special terms :



The leaves represent the vertices.

The nodes labelled **Add_{a,b}** and **Add_{a,c}** represent the edges ; each occurrence of **Add_{a,b}** represents one of the two parallel edges

(3.2.3) : Case of terms characterizing **tree-width**

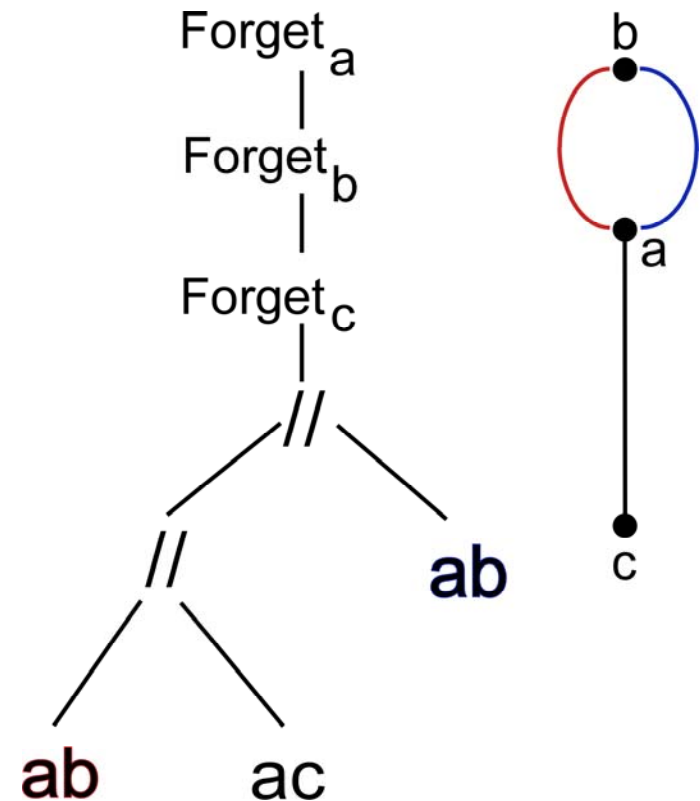
How to handle them “directly”, as for special terms ? The difficulty is to have a bijection between *nodes* in the term and the *vertices and edges* of the graph.

Vertices are in bijection with the occurrences of **Forget** operations.

The edges are at the leaves of the tree, **below** the nodes representing their ends.

The automaton for $edg(X,Y)$

has $2^{\Theta(k.k)}$ states ($O(k^2)$ for $sptwd$). Too bad for a basic property !



An improvement using annotations

Undirected graphs of tree-width $\leq k-1$ are denoted by terms over the operations of the HR algebra : $//$, $Forget_a$ and the constants a , ab for $a,b \in [k]=\{1,\dots,k\}$. *Without renamings of labels.*

The vertices are in bijection with the occurrences of the $Forget$ operations.

The annotation : at each occurrence u of $Forget_a$ representing a vertex x is attached the set of labels b such that the first occurrence of $Forget_b$ above u represents a vertex adjacent to x .

The automaton for $edg(X,Y)$ has $2^{2k} + 2$ states (instead of $2^{\Theta(k.k)}$).

Remarks :

incidence : $\text{in}(X,Y)$ uses $k^2 + 3$ states (for undirected graphs)
(only $k+3$ states for directed graphs).

adjacency : $\text{edg}(X,Y)$, can be written $\exists Z (\text{in}(Z,X) \wedge \text{in}(Z,Y))$
(for undirected graphs) which gives a deterministic
automaton with $2^{O(k.k)}$ states.

With this annotation, incidence and adjacency are handled
separately on “redundant” representations of graphs by
terms.

Conclusion

Using automata for model-checking of MS sentences on graphs of bounded tree-width or clique-width is **not hopeless** if we use **fly-automata**, built from (possibly non-deterministic) “small” automata for **basic graph properties** (and their negations), and for sentences **without quantifier alternation** (in order to keep flexibility, by allowing variations on the input sentences).

More tests on significant examples are necessary, and also comparison (theory and practice) with **other approaches** : games, monadic Datalog, specific problems, “Boolean width”.

Can one adapt fly-automata to **counting and optimization problems**?