### **Bachelor Thesis**

# Visualizing Dynamic Programming on Tree Decompositions

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### **Abstract**

The thesis is about a practical and lightweight implementation for visualizing dynamic programming on tree decompositions. I created the python-packagetdvisu for the purpose of visualizing, teaching and analyzing the solving process of MSOL-problems using tree decomposition.

Intended audience:

- Developer of dynamic programming on tree decompositions for debugging.
- Researcher of such algorithms for comparisons and visualizations.
- Teachers or students wanting some automatic visualization of their examples and the dynamic-solving-process.

As two reference implementations of dynamic programming on tree decompositions we chose the projects GPUSAT and dpdb.

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### 1. Introduction

Graphs are increasingly interesting in scientific work. The idea for this project comes from my supervisor Dr. Johannes Fichte, who works on and with many projects such as the ones listed above on solving monadic second order logic (MSOL [1]) problems using highly parallelized architectures like graphics processing units or state of the art databases. One early implementation is published in [2] where for different real world examples the results looked promising These projects are very competitive ?????REF????? for solving even large instances of those problems.

intro. mit motivation und related work, state of the art, advancements.

Visualization Pipeline

Stand Umsetzung, Tools: Slack, Trello, GitHub, Presentations

## 2. Background

This chapter provides the reader with a brief background for this work.

We begin with a description on SAT and #SAT as examples for a very general problem that can be described with monadic second order logic (MSOL). Furthermore the general case of MSOL will be described, as well as the *DIMACS*-file-format used in the projects. The following section describes Tree Decompositions (TDs) which are the basis for our visualization. Finally we shortly discuss Courcelle's Theorem [1] as a related method of solving these problems.

#### 2.1. Boolean satisfiability problem

https://en.wikipedia.org/wiki/Boolean\_satisfiability\_problem

SAT was the first known NP-complete problem, shown by Stephen Cook at the University of Toronto in 1971 [3]

```
literal \equiv boolean variable v or its negation clause \equiv finite set of literals, interpreted as the disjunction unit \equiv clause with |c|=1 CNF formula \equiv set of clauses, interpreted as their conjunction var \equiv set of variables contained in the clause or clause set C assignment \equiv \alpha : var(C) \rightarrow \{0,1\} satisfiedclause \equiv if \exists v \in var(c), v \in c and \alpha(v)=1 or \neg v \in c and \alpha(v)=0. Otherwise falsified satisfiedform \equiv each clause in the formula is satisfied by assignment
```

Connection to graphs with [4]

SAT Handbook: Even finding a single solution can be a challenge for such problems; counting the number of solutions is much harder. Not surprisingly, the largest formulas we can solve for the model counting problem with state - of - the - art model counters are orders of magnitude smaller than the formulas we can solve with the best SAT solvers. Generally speaking, current exact counting methods can tackle problems with a couple of hundred variables, while approximate counting methods push this to around 1, 000 variables.

### 2.2. Monadic Second Order Logic

See also figure 2.

Explain graphs? Node, Edge

MSO graph properties are "fixed-parameter-tractable" with respect to clique-width and tree-width. https://www.youtube.com/watch?v=hZI-wANHO1w 5th workshop on Graph Classes, Optimization, and Width Parameters (GROW 2011) 2011-10-28. MSO

counting (k-colorings ) and optimizing (distance between two vertices...) functions. Interested in MSO logic over graphs.

Two types of MSO formulas or logical graph representations.

- MSO formulas
- $MSO_2$  formulas with edge quantification  $\equiv MSO$  formulas over incidence graphs
- G=(vertices, edges as binary relation)
- INC(G) = (vertices and edges, Inc) for G undirected: Inc(e,v) ;-; v is a vertex of edge e
- FPT for clique width
- FPT for tree-width

This can also be done for directed graphs!

Typical MSO<sub>2</sub> graph properties:

has a perfect matching has a Hamiltonian circuit spanning tree of degree  $\leq 3$ 

The expressions have the form: "There exists a **set of edges** that is..." can not be transferred into "set of vertices"

https://youtu.be/Wyn3djrYg7c?t=1385 Bruno Courcelle: Recognizable sets of graphs: algebraic and logical aspects https://library.cirm-math.fr/Record.htm?idlist= 2&record=19276851124910940339 Recording during the thematic meeting: "Frontiers of reconnaissability" the April 29, 2014 at the Centre International de Rencontres Mathématiques (Marseille, France)

FPT for model checking: An algorithm is FPT if it takes time  $f(k) \cdot n^c$  for some fixed function f and constant c. The size of the input is n. The value k is a parameter of the input. This algorithm is then usable for small values of k. usually tree-width and clique width.

#### 2.3. DIMACS Format

Developed in 1993 at Rutgers University. DIMACS (the Center for Discrete Mathematics and Theoretical Computer Science)

Wolfram Language fully supports the DIMACS format for storing a single undirected graph. https://reference.wolfram.com/language/ref/format/DIMACS.html

DIMACS CNF: This format is used to define a Boolean expression, written in conjunctive normal form. https://people.sc.fsu.edu/~jburkardt/data/cnf/cnf.html Other formats for WMC, different graphs...

Supported also in Maple https://www.maplesoft.com/support/help/maple/view.aspx?path=Formats/CNF

Examples in appendix

#### 2.4. Tree Decomposition

[4]chapter 2.2 Tree decompositions were originally introduced by Robertson and Seymour [5] in 1984. A tree decomposition (TD) of a graph G is a pair  $(T, \chi)$ . T is a tree and  $\chi$  is a mapping which assigns each node  $n \in V(T)$  a set  $\chi(n) \subseteq V(G)$  called a bag. Then  $(T, \chi)$ . T is a TD if the following conditions hold:

- 1. for each vertex  $v(n) \in V(G)$  there is a node  $n \in V(T)$  such that  $v \in \chi(n)$
- 2. for each edge  $(x,y) \in E(G)$  there is a node  $n \in V(T)$  such that  $x,y \in \chi(n)$
- 3. if  $x, y, z \in V(T)$  and y lies on the path from x to z then  $\chi(x) \cap \chi(z) \subseteq \chi(y)$ .

The width width(T) of a tree decomposition T is  $max_{n \in V(T)}(|\chi(n)|) - 1$ . The tree width of a graph is the *minimal width* over all tree decompositions of the graph.

!!!Example (can take one from the visualizations) also in [6] page 169

#### 2.5. Courcelle's Theorem

Every graph property definable in monadic second-order logic (MSO) is decidable in linear time on graphs of bounded tree-width. Courcelle, Bruno  $(1990)^1$ 

For all  $k \in \mathbb{N}$  and MSO-sentences F is the decision problem for a given graph G, whether  $G \models F$  is true, in time  $2^{p(tw(G))} \cdot |G|$  with a polynom p decidable.

• drawback: still expensive  $(2^{p(twG)}, 2^{2^{(\#Q)}}, large constants)$ 

The workflow then looks like we see in figure 1.

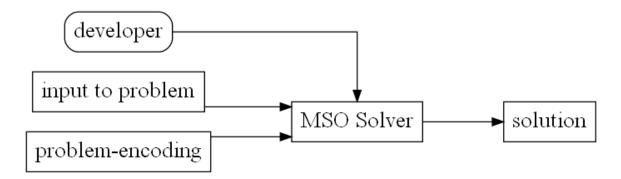


Figure 1: Implementation of the theorem

<sup>&</sup>lt;sup>1</sup>Courcelle, Bruno "The monadic second-order logic of graphs. I. Recognizable sets of finite graphs", Information and Computation, 85 (1990) no. 1: 12-75

## 3. Concept

What I do and why I did it Steps in Trello, Issues, Commits Research: language (python - explain) graph-construction (graphviz vs networkX), examples (diploma at first).

## 4. My Visualization Project

Pip, requirements files, virtual environments and how to pick quality Python libraries: https://realpython.com/products/managing-python-dependencies/?utm\_source=drip&utm\_medium=email&utm\_campaign=productfooter&utm\_content=mpd

The first stages were in https://github.com/VaeterchenFrost/gpusat-VISU and the first releases of the source code outsourced tohttps://github.com/VaeterchenFrost/tdvisu

The objective of this project was/is to support the visualization mainly to document and improve the development efforts of dynamic programming on tree decompositions.

The tree decompositions in every tested application were provided by the utility https://github.com/mabseher/htd (small but efficient C++ library for computing (customized) tree and hypertree decompositions). Files / Classes / Methods Current perspective Checking with www.deepcode.ai

#### 4.1. Integration in GPUSAT

Windows opencl driver problem: ERROR: clBuildProgram(-9999)

Programm https://github.com/VaeterchenFrost/GPUSAT

Differences: https://github.com/daajoe/GPUSAT/compare/master...VaeterchenFrost: master Commits 142 Files changed 94 Nagoya talk: Graphs for performance are Ordered by used time per algorithm - gpusat quite good

Working with cmake remotly. ssh @(sg1.)dbai.tuwien.ac.at CPU branch wasn't working. Only AMD/Nvidia graphics with respective flags.

First steps: Connect ssh mkdir Ba cd Ba git clone https://github.com/mabseher/htd.git cd htd/ cmake . make -B -j1 make test (100pct tests passed, 0 tests failed out of 38 Total Test time (real) =  $0.81~{\rm sec}$ )

git clone https://github.com/VaeterchenFrost/GPUSAT.git Adding include\_directories (/home/roemar/Ba/htd/ include) to CMakeLists.txt

find\_library(HTD\_LIB htd /home/roemar/Ba/htd/lib) find\_library(HTD\_IO\_LIB htd\_io /home/roemar/Ba/htd/lib) cmake - L /Ba/GPUSAT/build - Configuring done - Generating done - Build files have been written to : /home/roemar/Ba/GPUSAT/build-Cache values

Common commands cd Ba/GPUSAT date && make && scp ./gpusat mroebke@128.131.196.128: /Ba/C The CUDA Remote had no cmake so I built the projects on the

Umsetzung Special fork connecting the Visualization directly to the Beispiel

## 4.2. Integration in dpdb

Programm Umsetzung Beispiel

# 5. Application and Images

## 6. Summary and Outline

What is achieved? What worked good, what bad?

## References

- [1] B. Courcelle and J. Engelfriet, Graph Structure and Monadic Second-Order Logic A Language-Theoretic Approach. Cambridge: Cambridge University Press, 1 ed., 2012.
- [2] A. Langer, F. Reidl, P. Rossmanith, and S. Sikdar, "Evaluation of an mso-solver," *Proc. of ALENEX 2012*, 01 2012.
- [3] S. A. Cook, "The complexity of theorem-proving procedures," in *Proceedings of the Third Annual ACM Symposium on Theory of Computing*, STOC '71, (New York, NY, USA), p. 151–158, Association for Computing Machinery, 1971.
- [4] M. Zisser, Solving the #SAT problem on the GPU with dynamic programming and OpenCL. 2018.
- [5] N. Robertson and P. Seymour, "Graph minors. iii. planar tree-width," *Journal of Combinatorial Theory, Series B*, vol. 36, no. 1, pp. 49 64, 1984.
- [6] J. K. Fichte, "Parameterized complexity and its applications in practice."

## A. Images

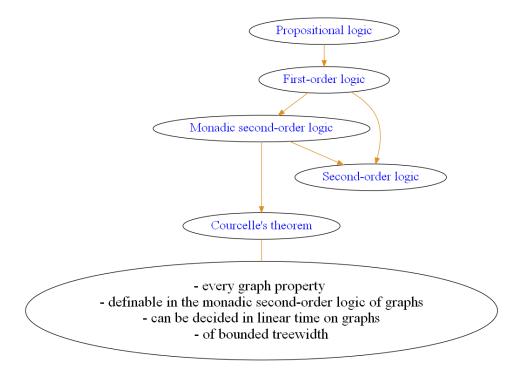


Figure 2: From propositional logic to monadic second order logic and Courcelle's Theorem