



# MUS Extraction with Interactive Choice of Candidates

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## Introduction

With a remarkable amount of recent work (e.g. [3, 1, 2]) and a broad range of applications (e.g. [4, 5]), the field of minimal unsatisfiable subset (MUS) extraction has become an emerging research field in the SAT community.

We introduce **interactive MUS extraction**, a completely new approach to guiding the destructive MUS extraction algorithm by Nadel [6]. The user receives full control over the individual reduction steps, moving into smaller unsatisfiable subsets  $F'$  until all subsets  $F'' \subset F'$  are satisfiable. We explicitly visualize the search space, and provide an interface for interactively focusing on or eliminating subspaces by reverting to intermediate results, and exploring new parts of the search space by choosing alternative deletion candidates.

## Reduction Graph

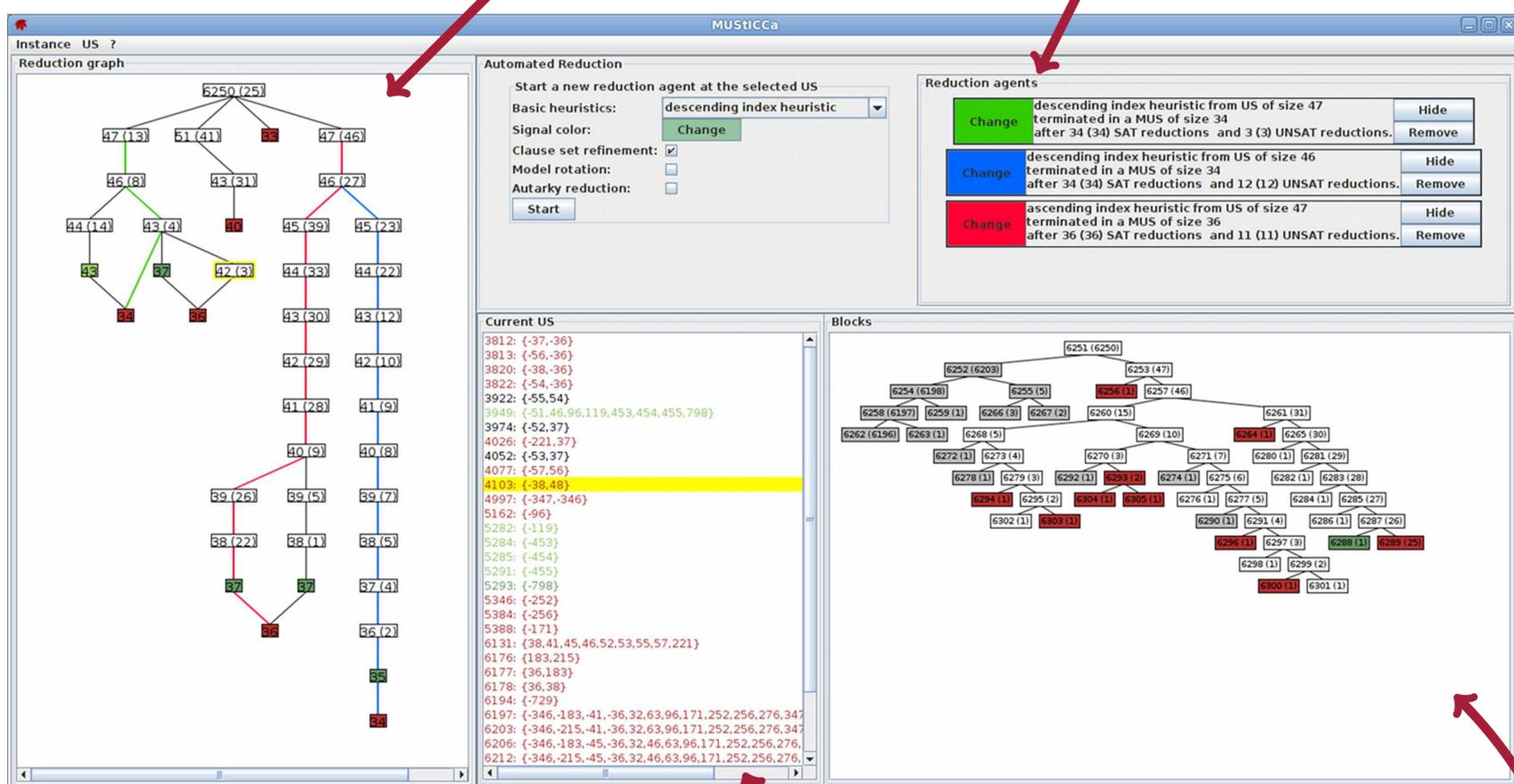
The interface is based on the open-source Kahina framework [9] for graphical debugging. In the visualization of the reduction graph, the number on each node gives the size of the corresponding US, followed in brackets by the number of clauses of unknown criticality. MUSes are marked in **red**, **dark green** marks non-MUSes where all reduction options have been explored, and **light green** colour marks USes where all clauses are known to be either critical or unnecessary, but some unexplored reduction options remain.

Whenever a node in the reduction graph view is selected, MUSTICCa uses unit-propagation to derive which clauses in it are implied to be critical, and the US corresponding to the node is displayed in the US view.

## Reduction Agents

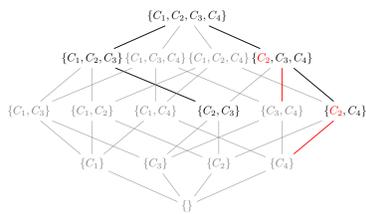
MUSTICCa includes an automated reduction mechanism in the form of **reduction agents**, comparable to autonomous additional users that are given sets of simple instructions. This is useful for testing new reduction heuristics.

In the dialog for creating and starting new reduction agents the user can select one of the predefined heuristics from a drop-down menu. Clause set refinement [6], model rotation [11] and autarky pruning [10] can be activated or deactivated independently. The new reduction agent starts at the US that is currently selected in the reduction graph, and runs until it has determined a MUS. The downward path of an agent through the powerset lattice is visualized in the form of an **agent trace** highlighted in its randomly chosen signal colour.



## Internal Representation

Consider the powerset lattice of  $\{C_1, C_2, C_3, C_4\}$ . Assume a reduction graph that spans the edges coloured in **black**, where the **grey** edges and subsets are still unexplored. In the subset  $\{C_2, C_3, C_4\}$ , the clause  $C_2$  is critical, which we symbolize by colouring critical clauses and the corresponding transition edges in **red**. We can propagate the criticality of  $C_2$  downwards to the subset  $\{C_2, C_4\}$ , but we lose the information, that  $C_2$  is critical in other subsets as well, e.g. in the already explored US  $\{C_2, C_3\}$ .



To overcome this we use boolean **constraints over selector variables** in a so-called **meta-instance**. The criticality information of  $C_2$  depends on all previously deleted clauses, leading to the meta-constraint  $\bar{s}_1 \rightarrow s_2$  in our example. This expression can directly be written as a single clause  $(s_1 \vee s_2)$ , representing the fact that either  $C_1$  or  $C_2$  have to be present in each MUS. Solving the meta-instance with  $\bar{s}_1 \wedge \bar{s}_4$  as assumptions - denoting both incoming edges of the node  $\{C_2, C_3\}$  in the powerset lattice - will require  $s_2$  to be **true** or in other words  $C_2$  to be critical in  $\{C_2, C_3\}$ .

## US View

The clauses in the US view are colour-coded: critical clauses are displayed in **red**, explicitly reduced clauses in a **dark green**, other unnecessary clauses in a **lighter green**, and clauses of unknown status in **black**. The colour codes make it easy to spot interesting deletion candidates for reduction steps, which are started by double-clicking on clauses in the US view.

For advanced interactions, a set of clauses in the US view can be selected and refined via a hierarchy of context menus, to either initiate a series of deletion attempts or a single attempt to delete all selected clauses at once.

## Block View

The **meta-instance** is compressed using an inferred **block structure** over the input clauses. Assume that the clauses  $(s_1, \dots, s_i, s_k)$  and  $(s_1, \dots, s_i, s_l)$  were added. To save space, we insert a fresh variable  $b_i$  representing a **block** of variables, and obtain the following clauses:  $(s_1, \dots, s_i, b_i)$ ,  $(b_i, s_k)$  and  $(b_i, s_l)$ . The block structure visualizes the overlaps between encountered USes, often revealing interesting structural features of the input instance.

## References

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