

# Trimming while Checking Clausal Proofs

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Portland, Oregon  
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# Outline

- Motivation and Contributions
- Resolution versus Clausal Proofs
- Checking Clausal Proofs Efficiently
- Experimental Evaluation
- Conclusion

# Motivation

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SAT solvers are used in many tools and applications.

- Counter-examples (satisfiable) using symbolic simulation;
- Equivalence-checking (unsatisfiable) using miter;
- Small explanations (unsatisfiable core) for diagnosis;
- Small (trimmed) proofs to validate with a verified checker.

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- Solvers that emit additional information use lots of memory.

***We developed a tool that can efficiently validate the results of SAT solvers and produce trimmed formulas and trimmed proofs***

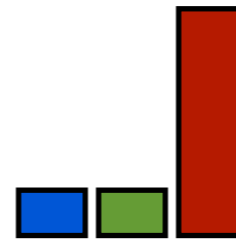
# Contributions and Related Work

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Easy to Emit

Compact

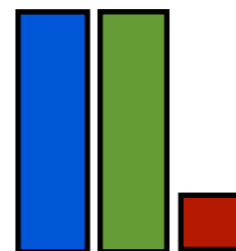
Checked Efficiently



Resolution Proofs

Zhang and Malik, 2003

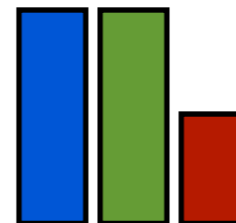
Van Gelder, 2008; Biere, 2008



Clausal Proofs

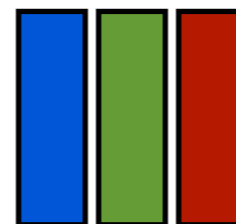
Goldberg and Novikov, 2003

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Clausal proofs + clause deletion

Heule, Hunt, Jr., and Wetzler [STVR 201X]



A fast clausal proof checker,  
called DRUP-trim

Heule, Hunt, Jr., and Wetzler [FMCAD 2013]

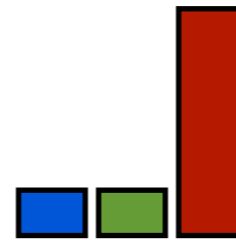


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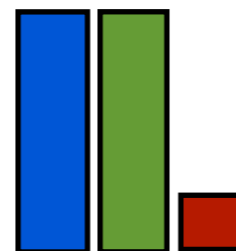
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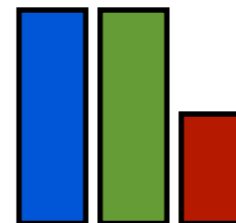
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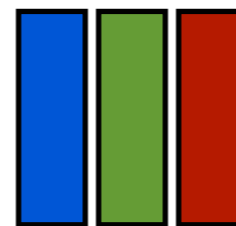
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*All approaches can be used for applications such as minimal unsatisfiable core extraction, computing interpolants, reduce proofs*

# Satisfiability and Resolution

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Given a Boolean formula  $F$ , is there an assignment to variables in  $F$  such that the formula evaluates to TRUE?

$\bar{b}c$   $ac$   $\bar{a}b$   $\bar{a}\bar{b}$   $a\bar{b}$

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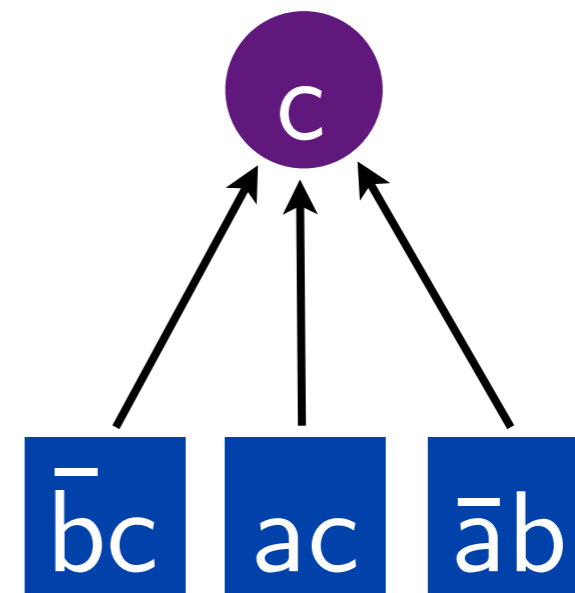
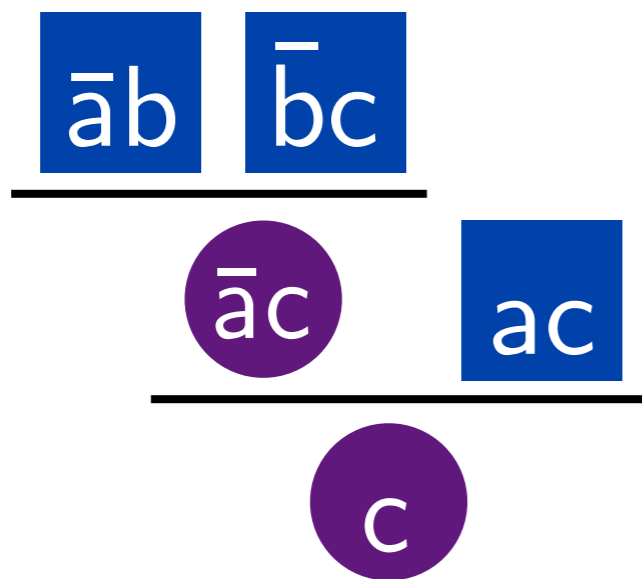
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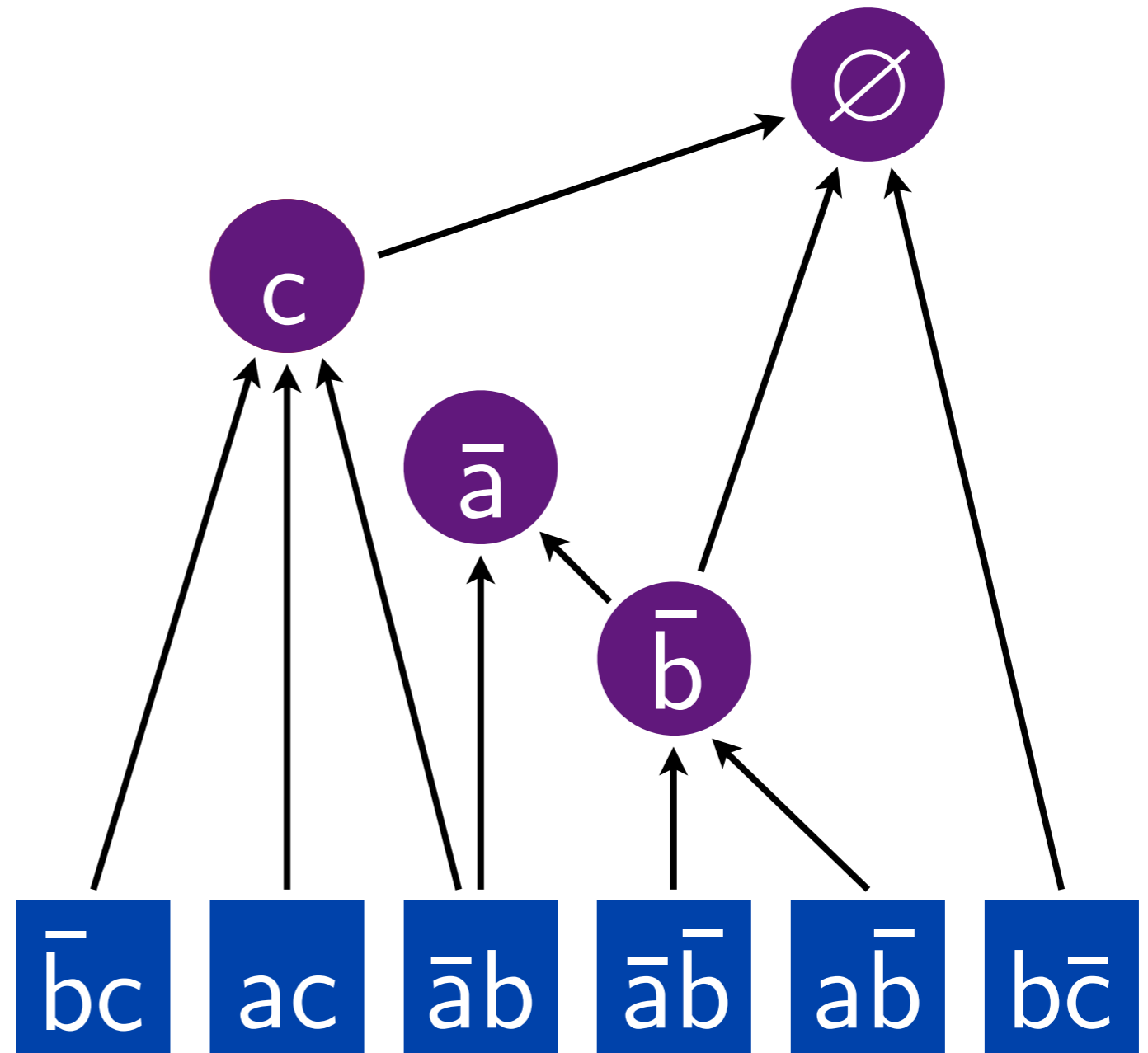
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Unsatisfiability proofs use lemmas (resolvents):



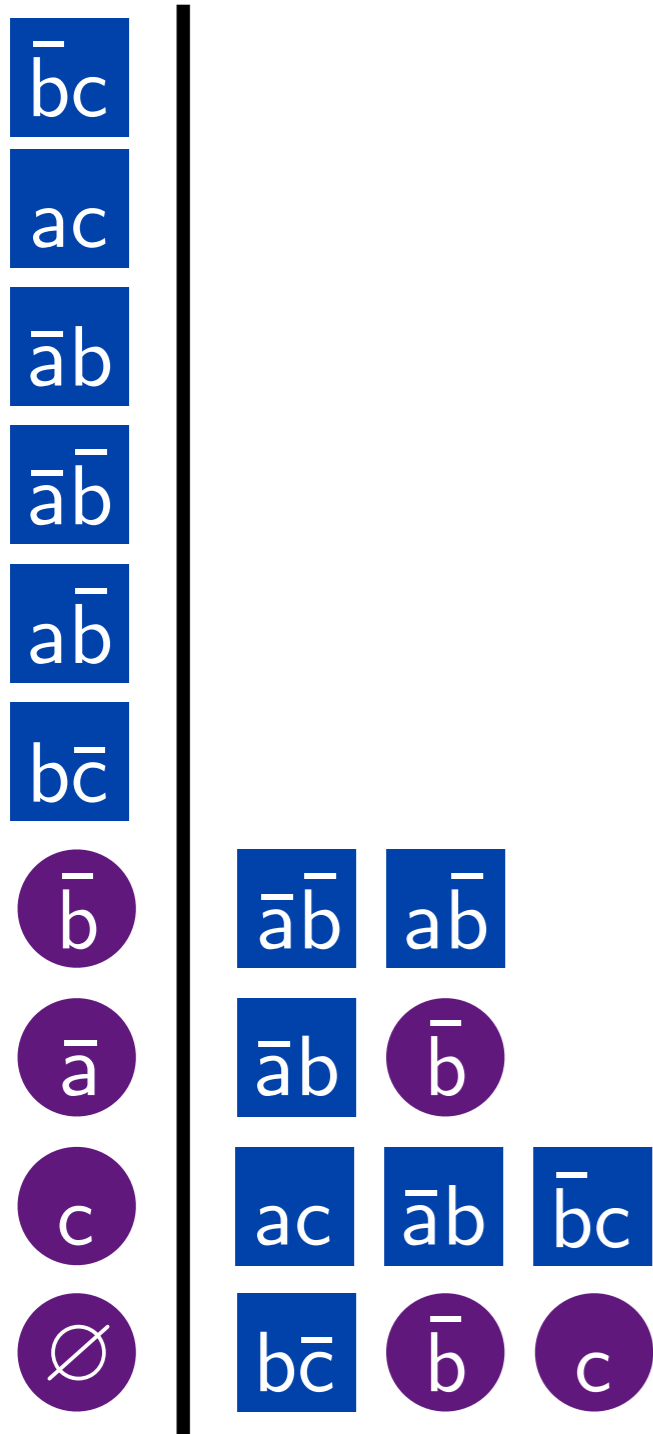
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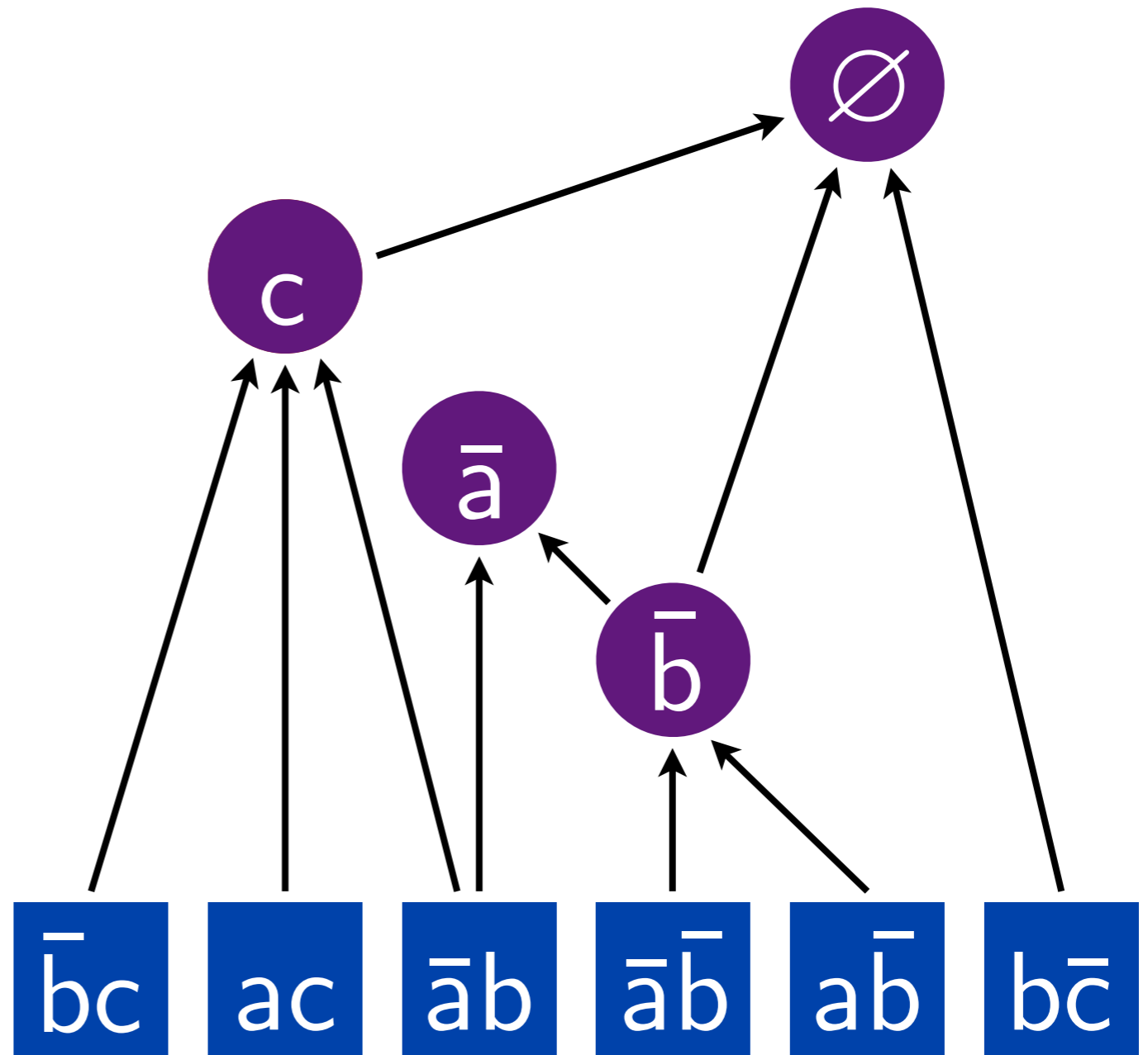


resolution graph

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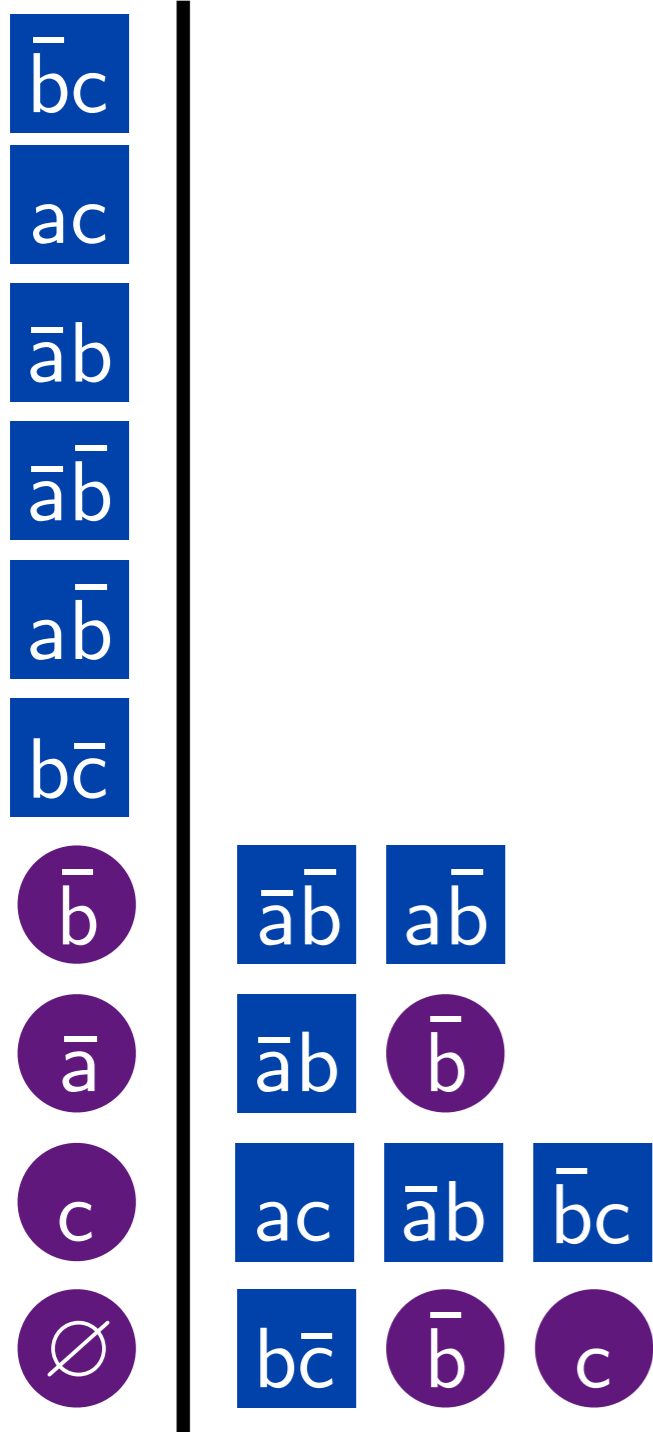
resolution proof



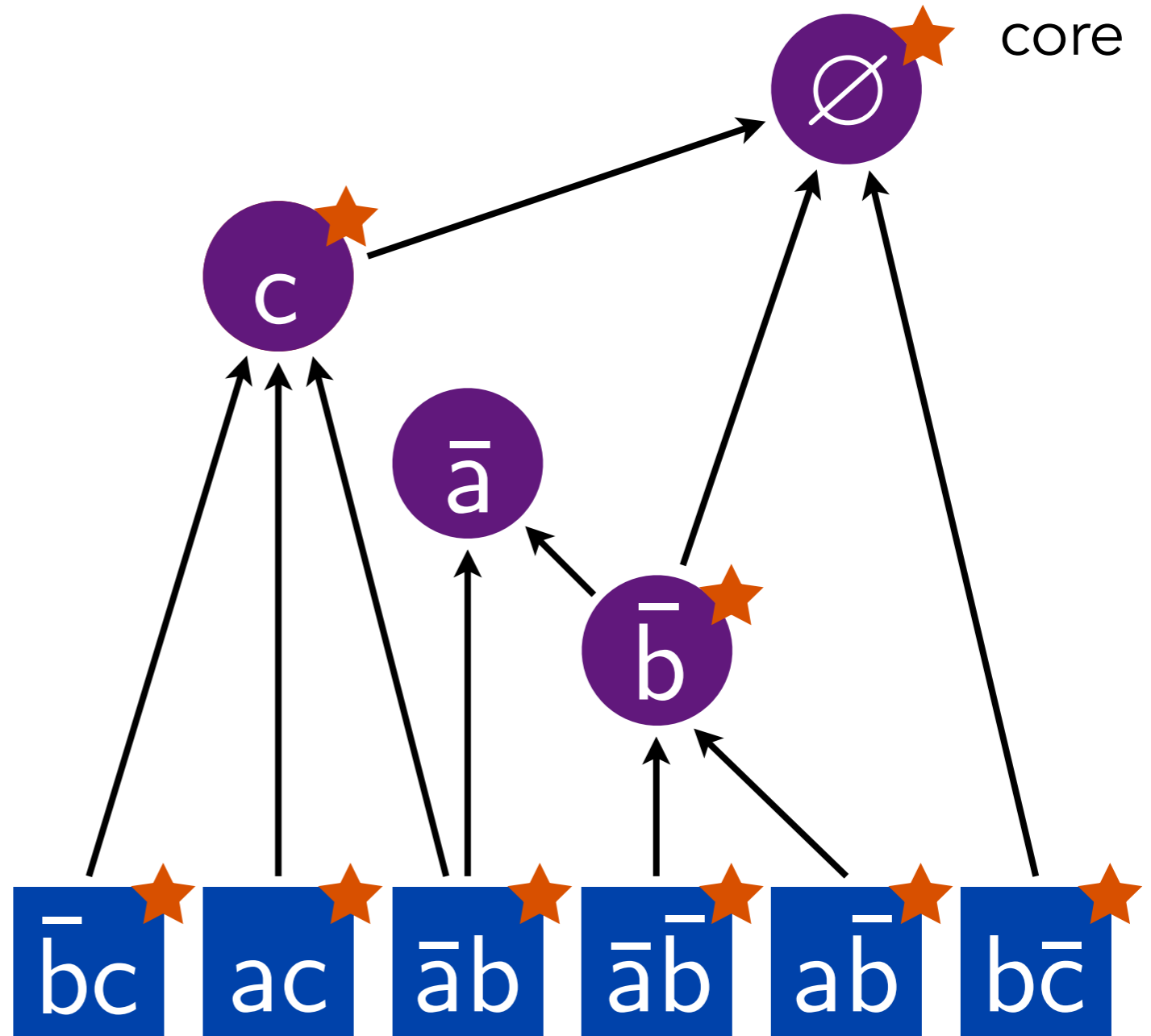
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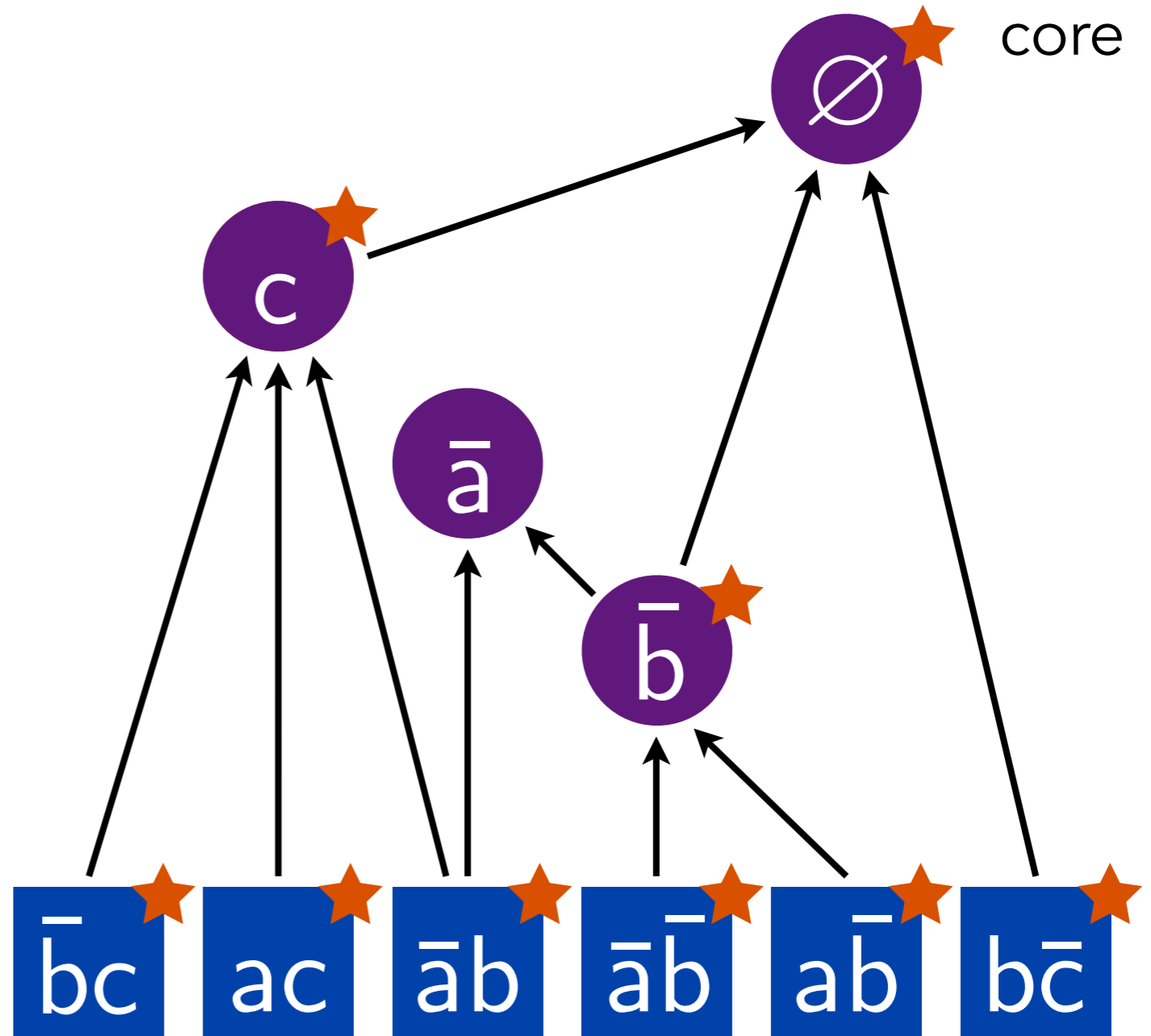
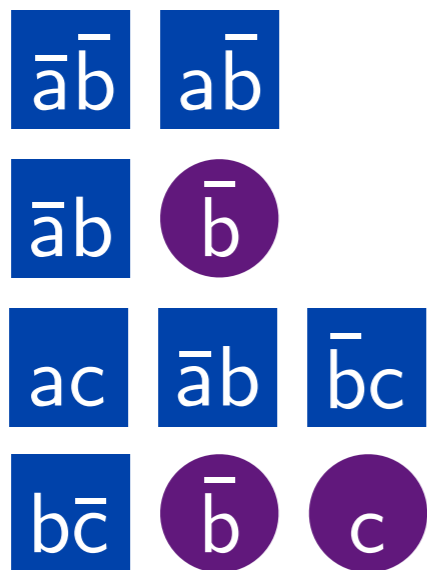
resolution proof



resolution graph

# Resolution Graph / Proof and Core

- $\bar{b}c$
- $ac$
- $\bar{a}b$
- $\bar{a}\bar{b}$
- $a\bar{b}$
- $b\bar{c}$
- $\bar{b}$
- $\bar{a}$
- $c$
- $\emptyset$



**resolution proofs are HUGE**

# Checking Lemmas by Unit Propagation

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A clause is **unit** with respect to an assignment if all literals in the clause are falsified except for one literal, which is unassigned.

Unit propagation:

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assignment:  $\bar{c}$   $\bar{b}$   $a$

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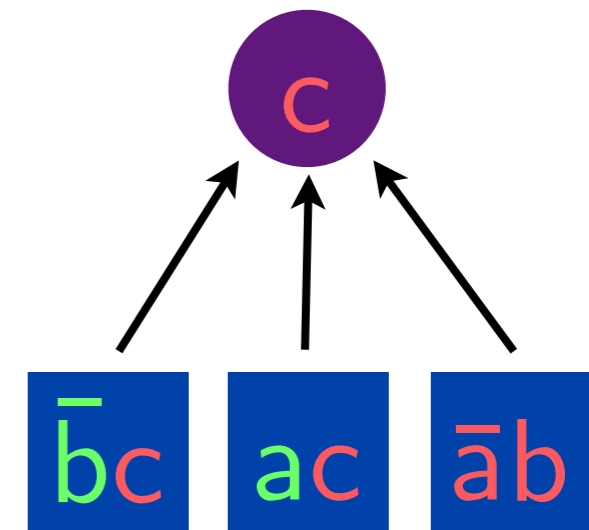
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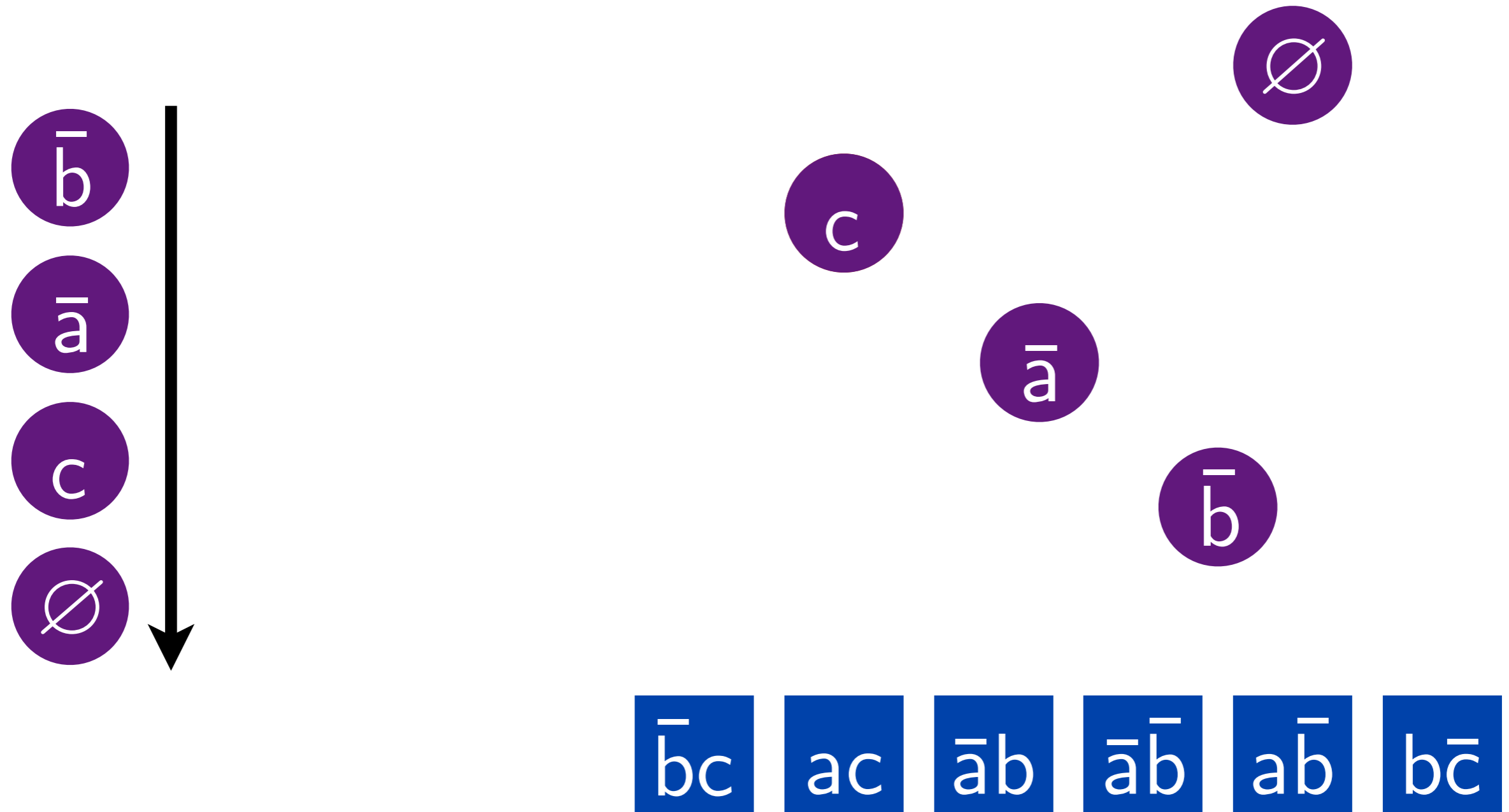
Reverse Unit Propagation (RUP) of a lemma:

- Assign all literals in the lemma to false and apply unit propagation
- If another clause / lemma becomes falsified, then the lemma is valid

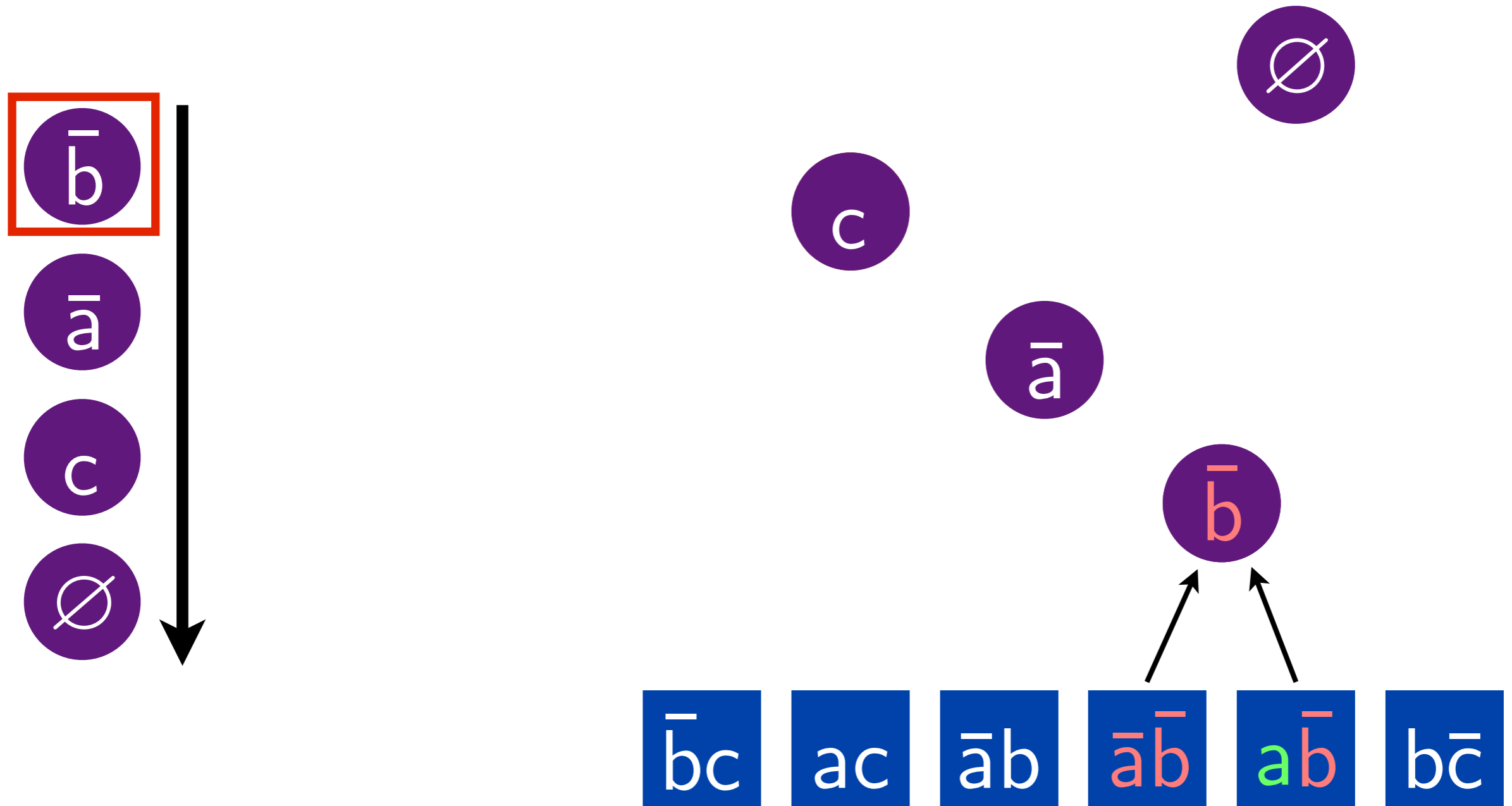




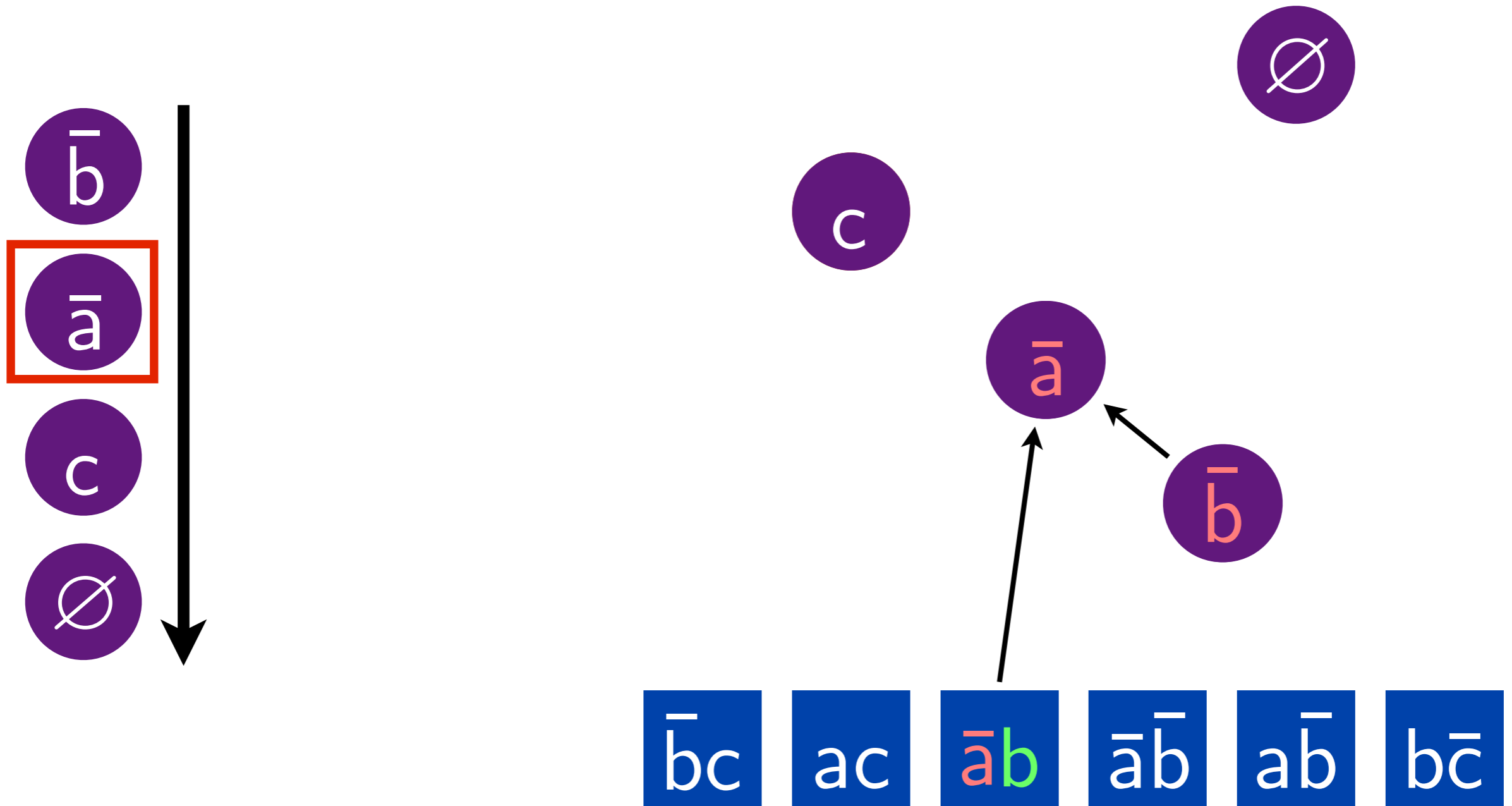
# Clausal Proof: Check using Unit Propagation



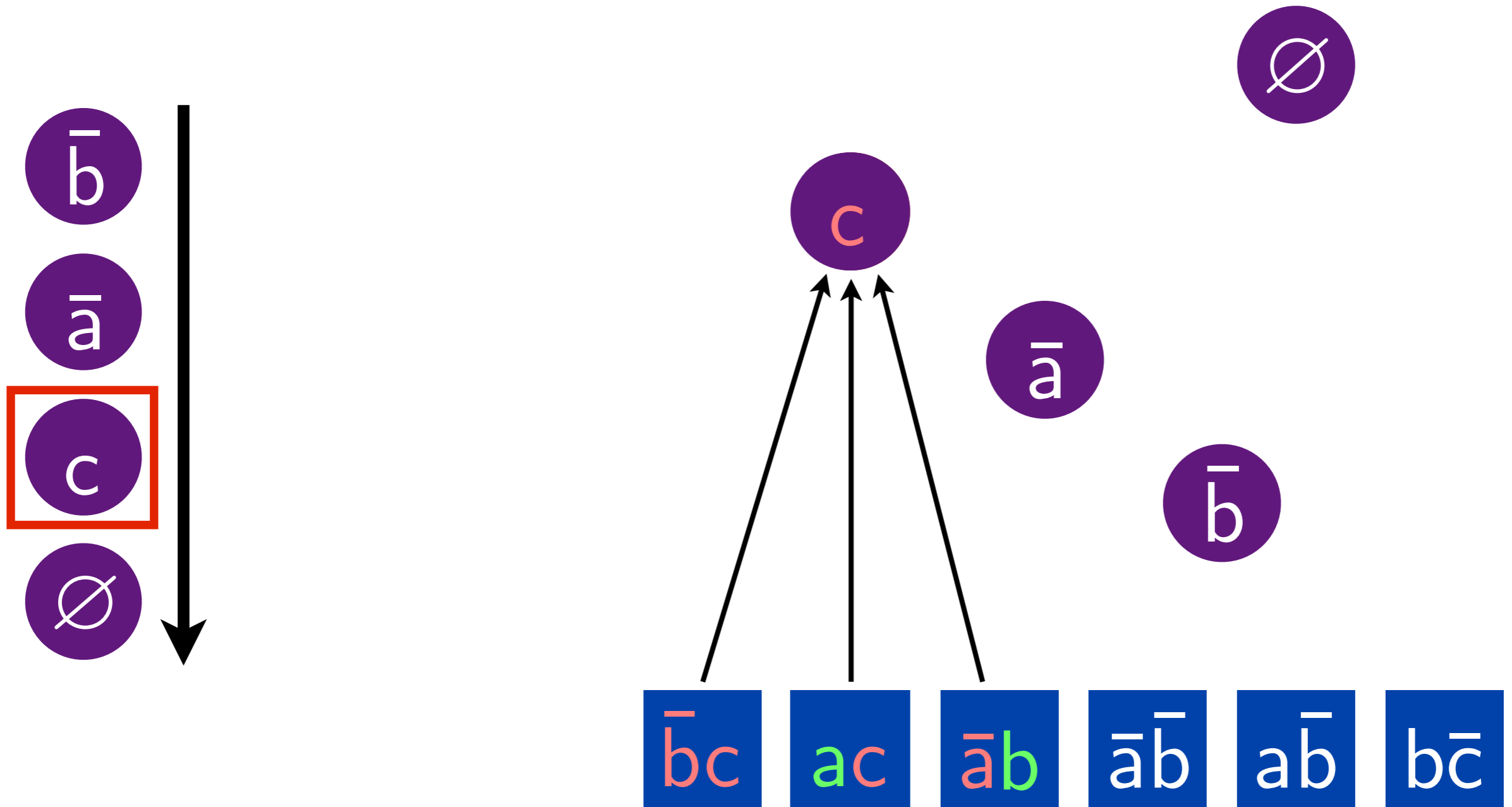
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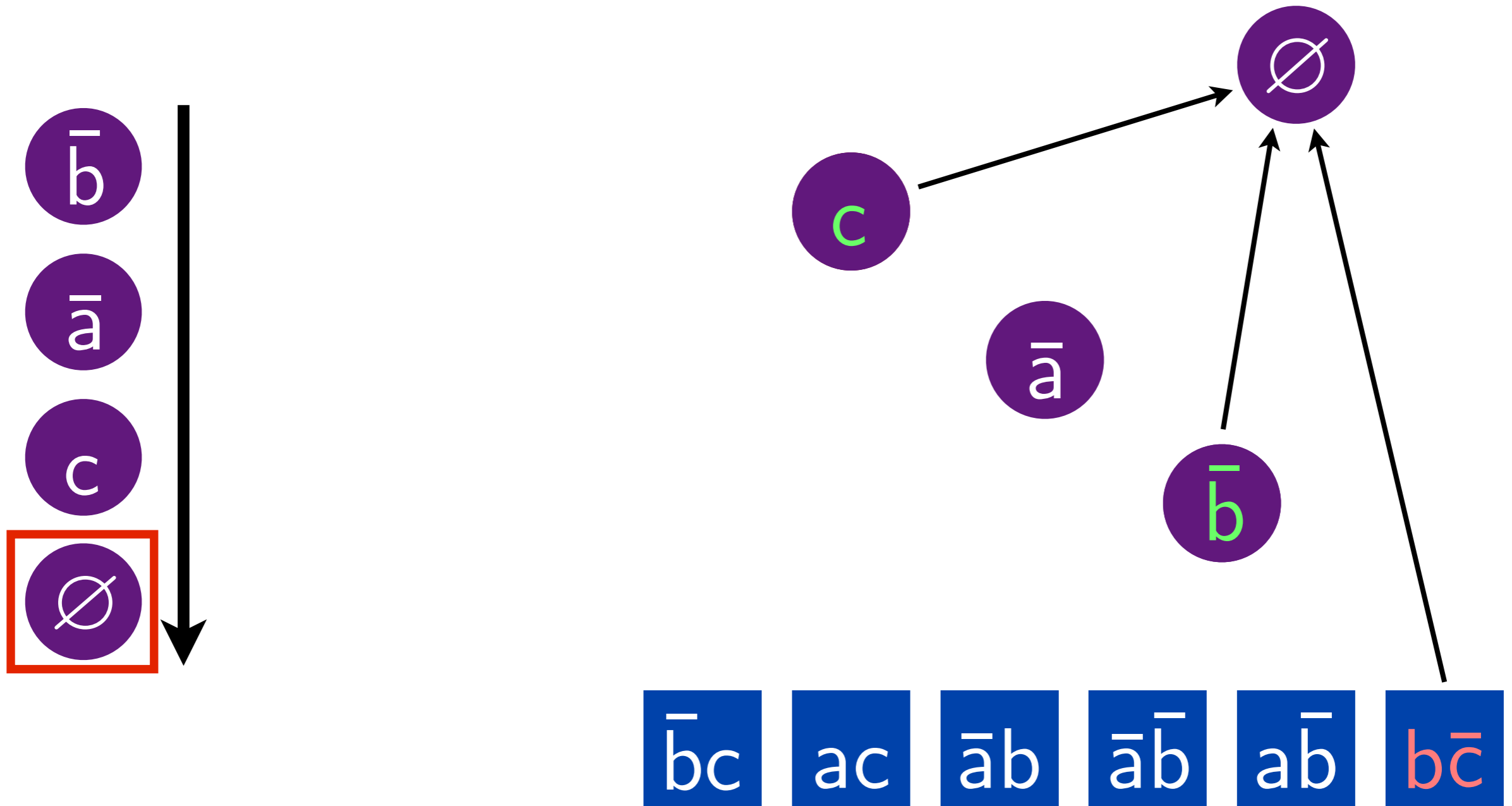
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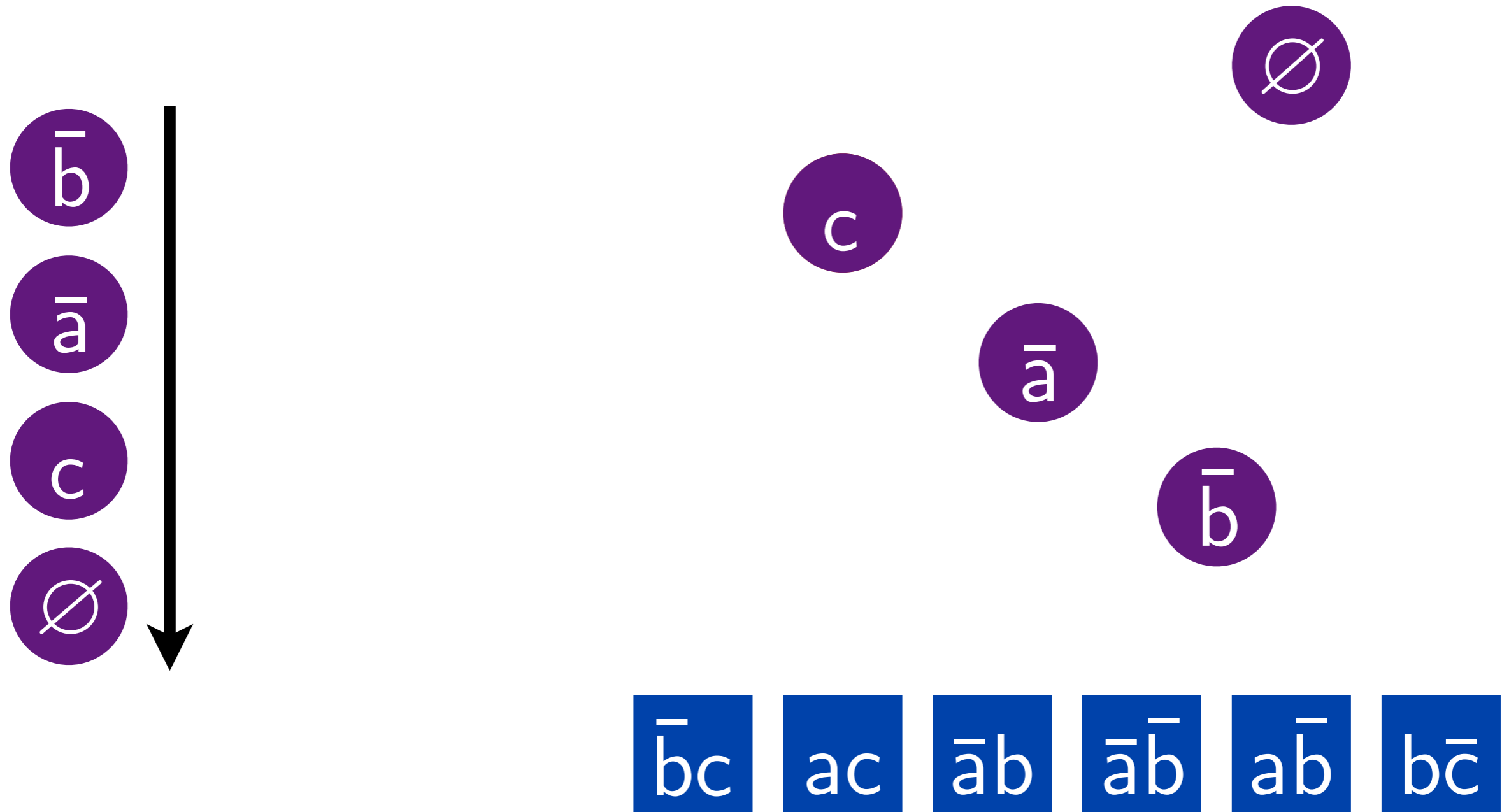
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***clausal proofs are expensive to validate***

# Improvement I: Backwards Checking

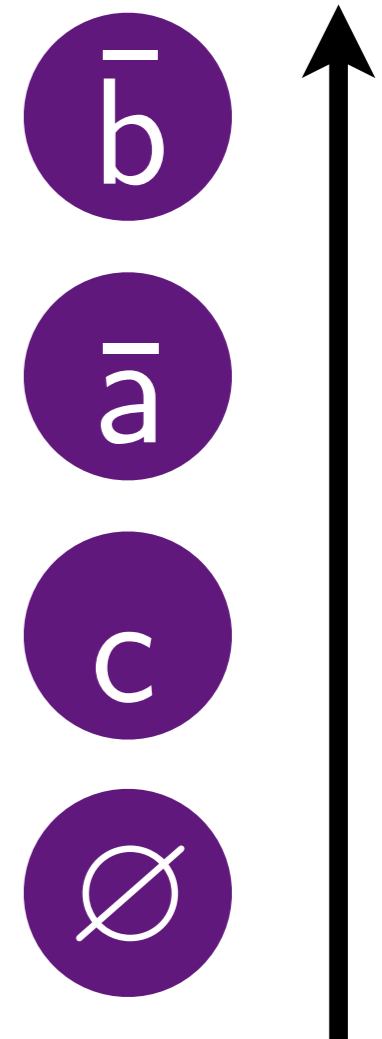
Goldberg and Novikov proposed checking the refutation backwards [DATE 2003]:

- start by validating the empty clause;
- mark all lemmas using conflict analysis;
- only validate marked lemmas.

Advantage: validate fewer lemmas.

Disadvantage: more complex.

We provide a fast open source implementation of this procedure.



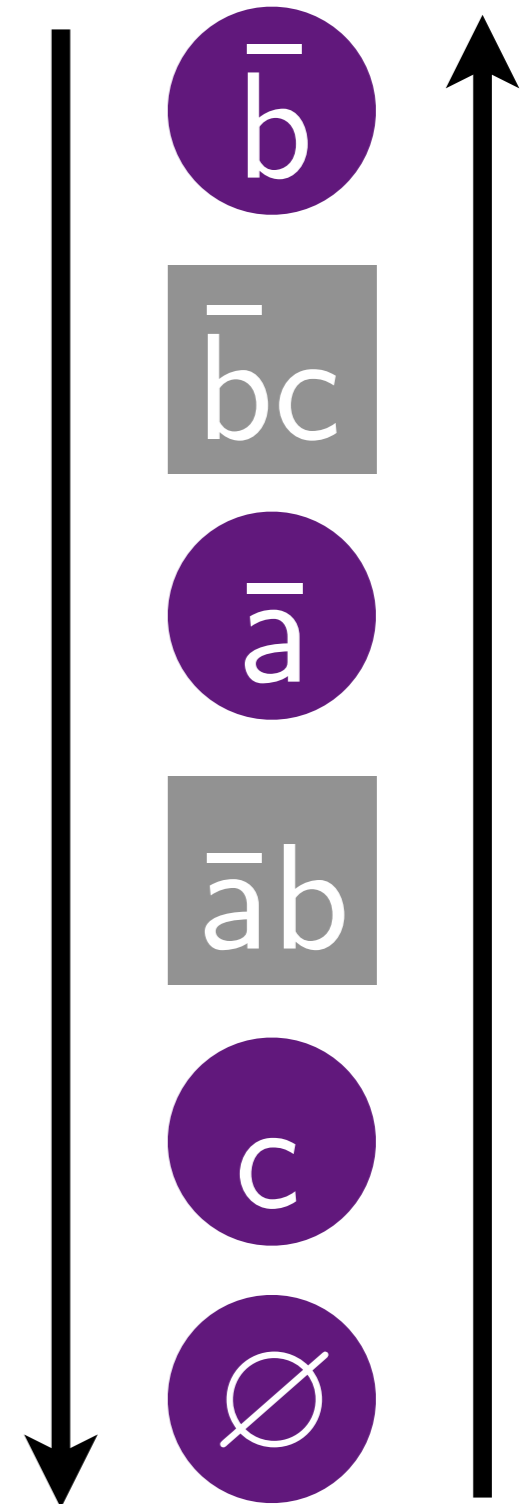
# Improvement II: Clause Deletion

We proposed to extend clausal proofs with deletion information [STVR 201X]:

- clause deletion is crucial for efficient solving;
- emit learning and deletion information;
- proof size might double;
- checking speed can be reduced significantly.

Clause deletion can be combined with backwards checking [FMCAD 2013]:

- ignore deleted clauses earlier in the proof;
- optimize clause deletion for trimmed proofs.





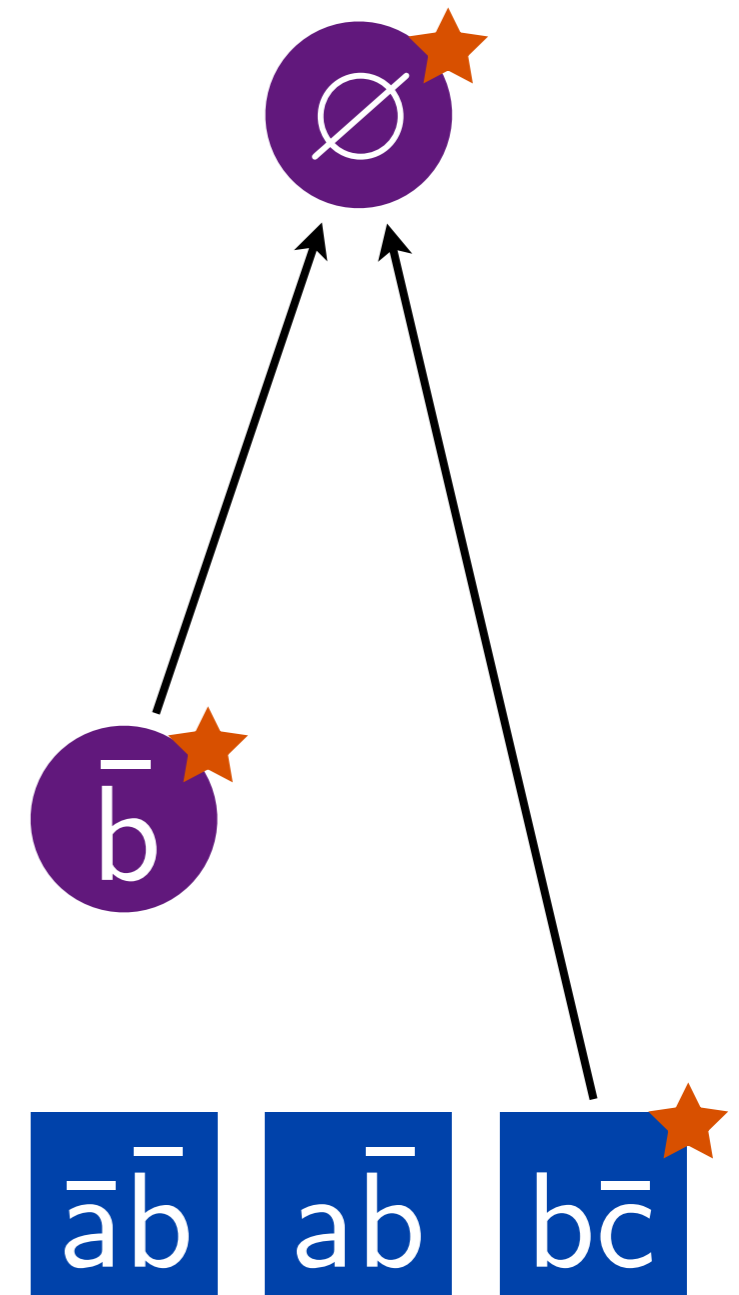
# Improvement III: Core-first Unit Propagation

We propose a new unit propagation variant:

- 1) propagate using clauses already in the core;
- 2) examine non-core clauses only at fixpoint;
- 3) if a non-core unit clause is found, goto 1);
- 4) otherwise terminate.

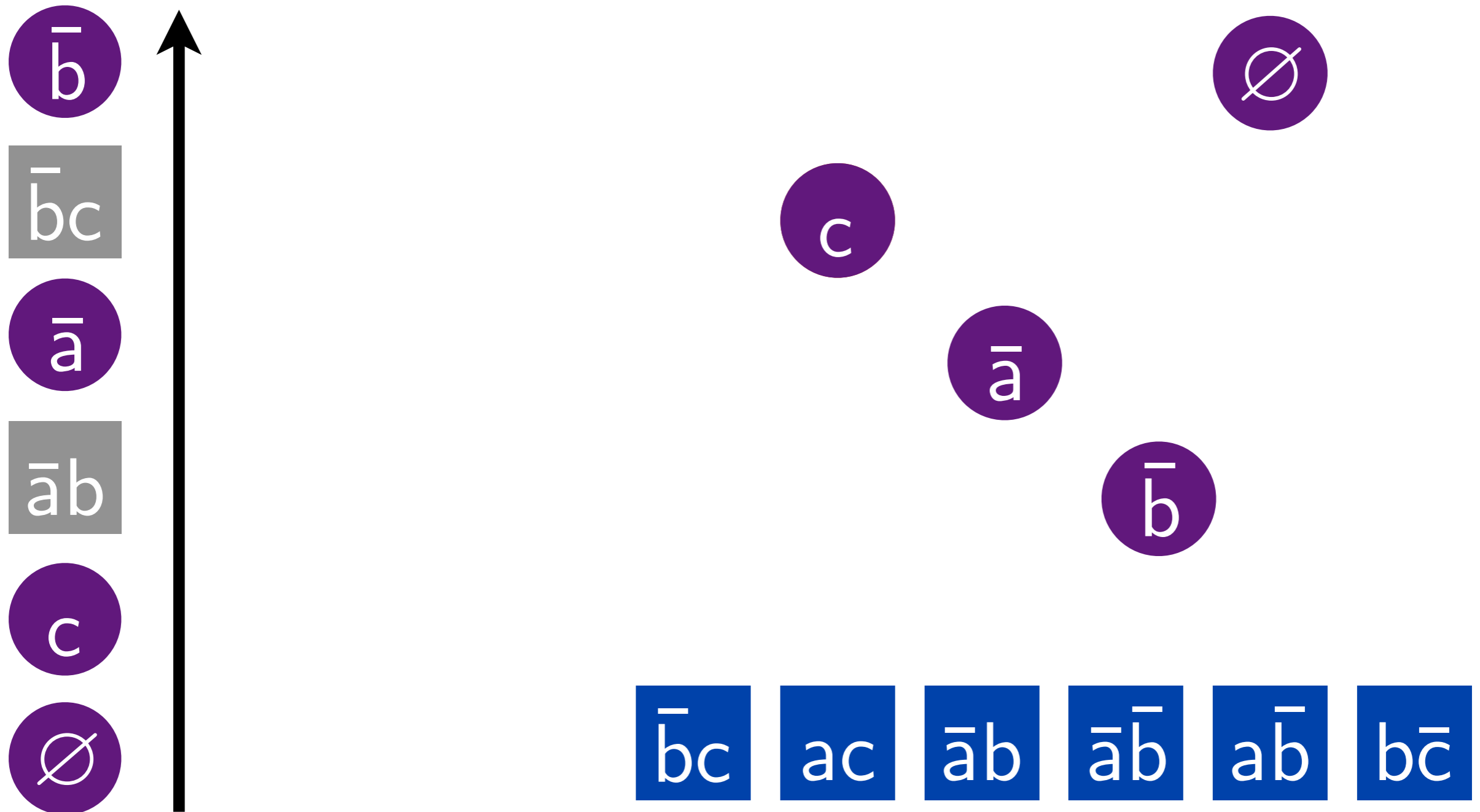
Our variant, called *Core-first Unit Propagation*, can reduce checking costs considerably.

Fast propagation in a checker is different than fast propagation in a SAT solver.

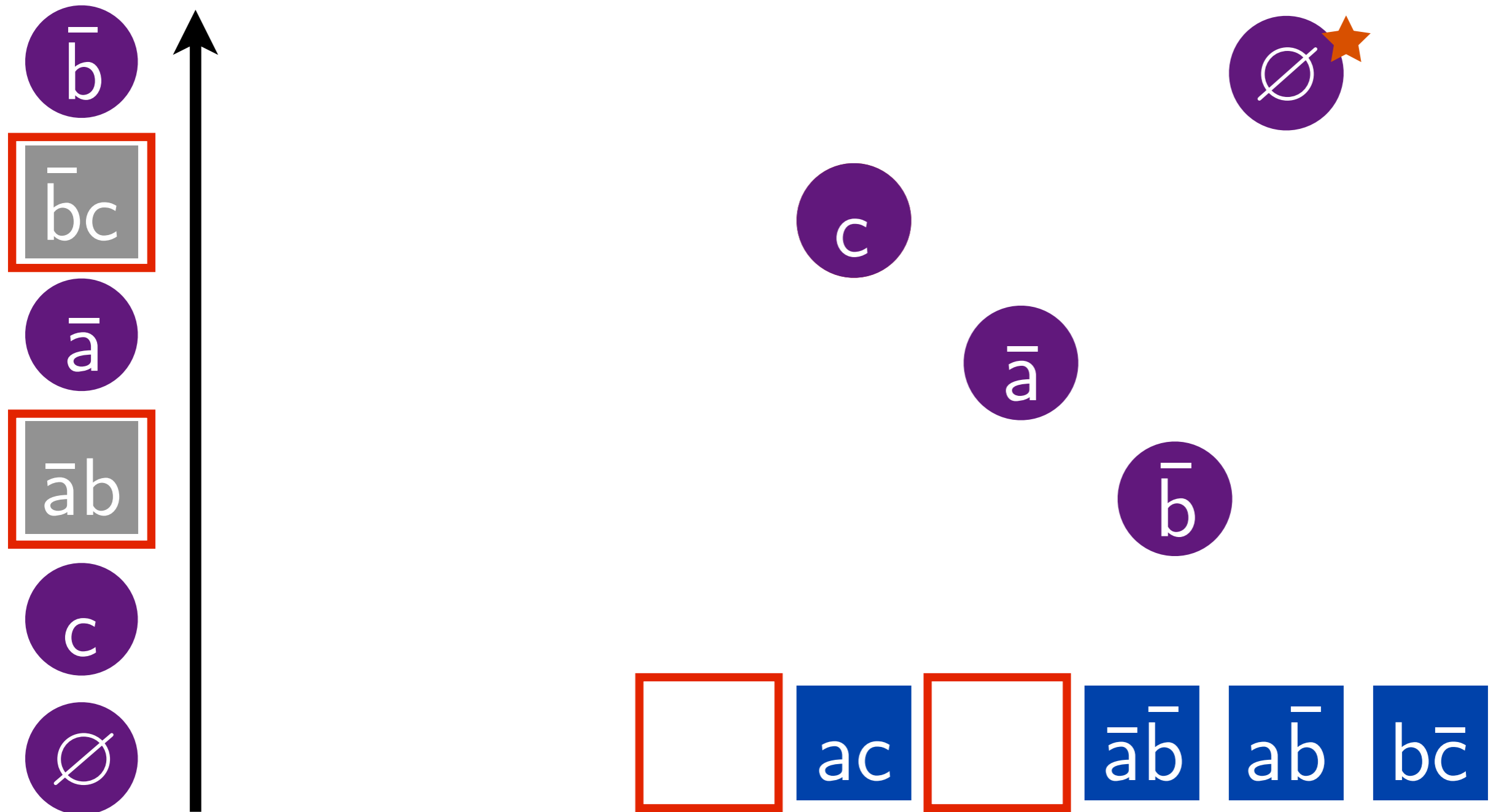


**Also, the resulting core and proof are smaller**

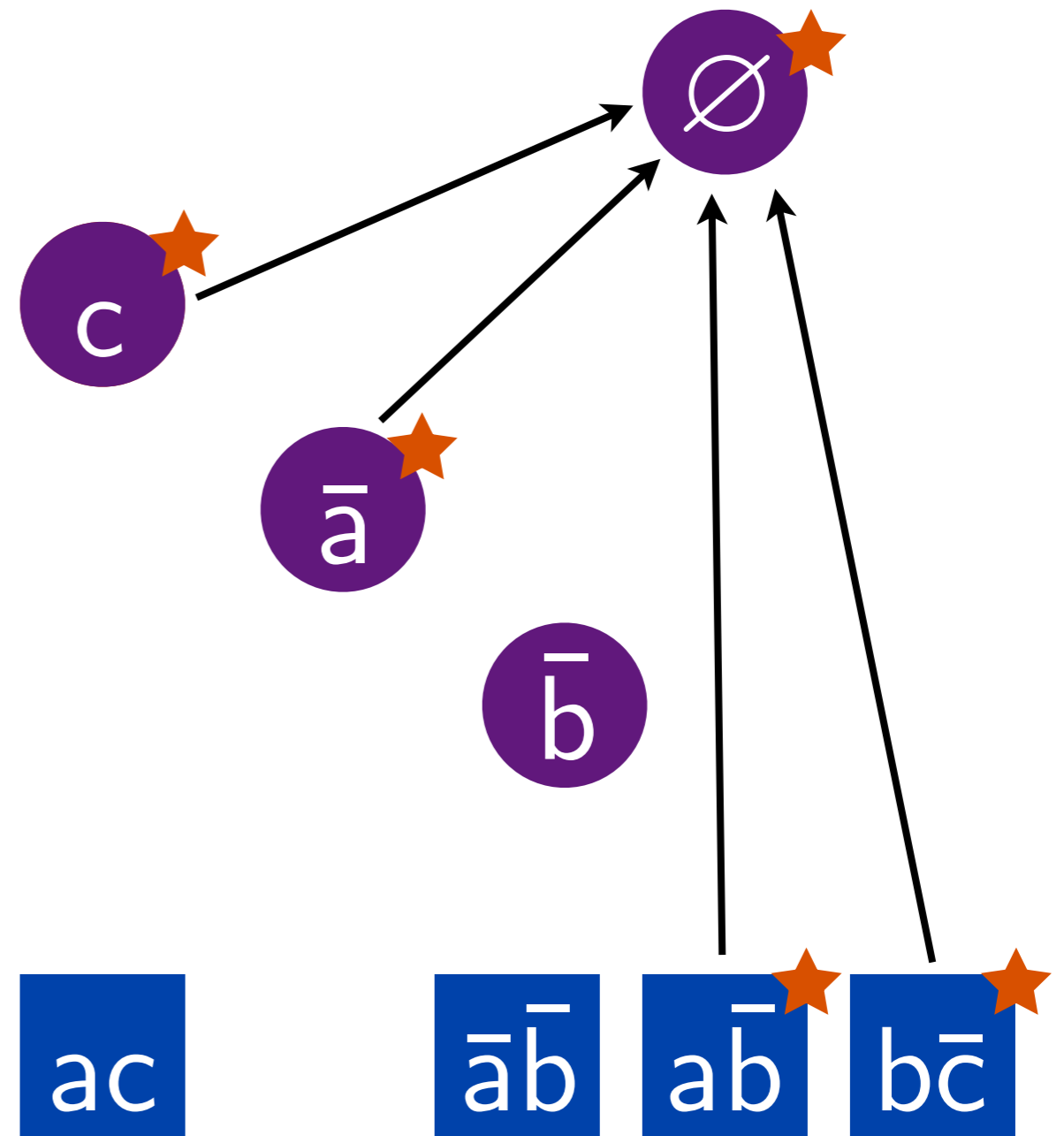
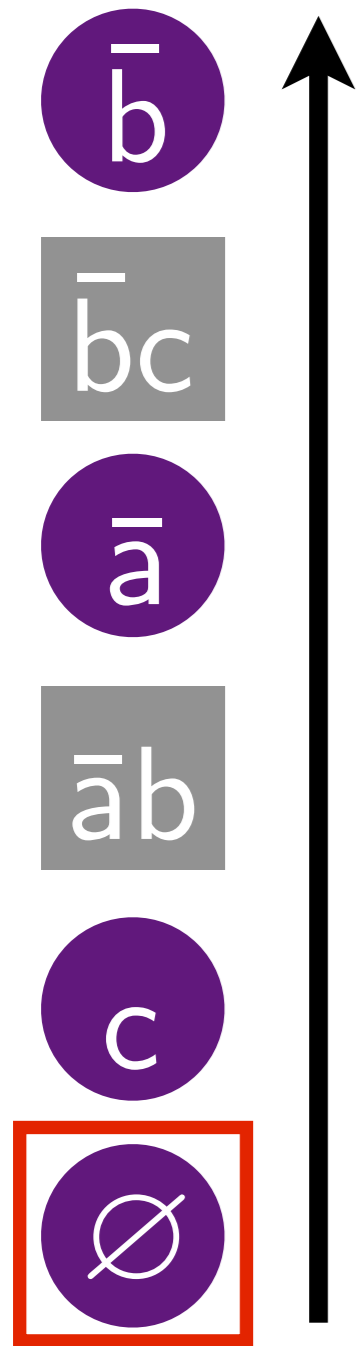
# Checking: Backwards + Core-first + Deletion



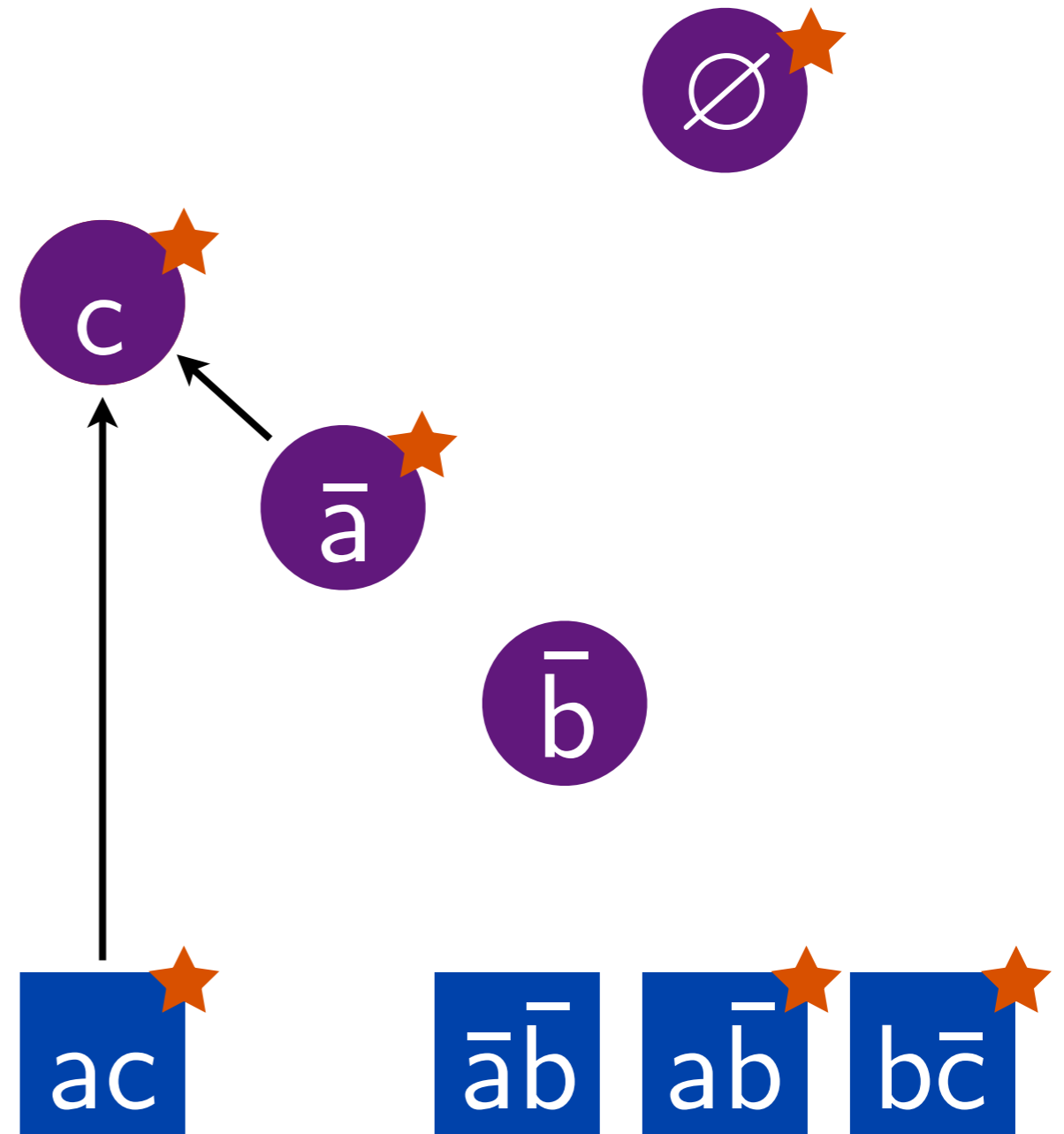
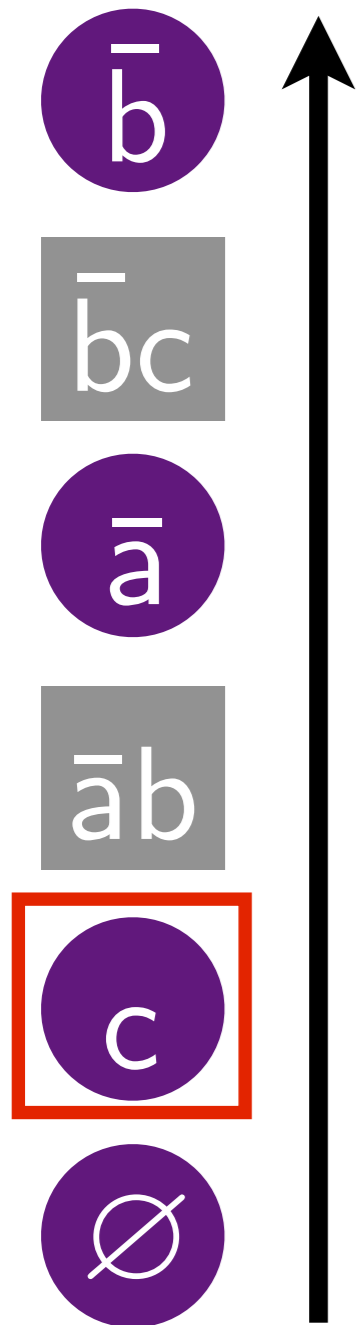
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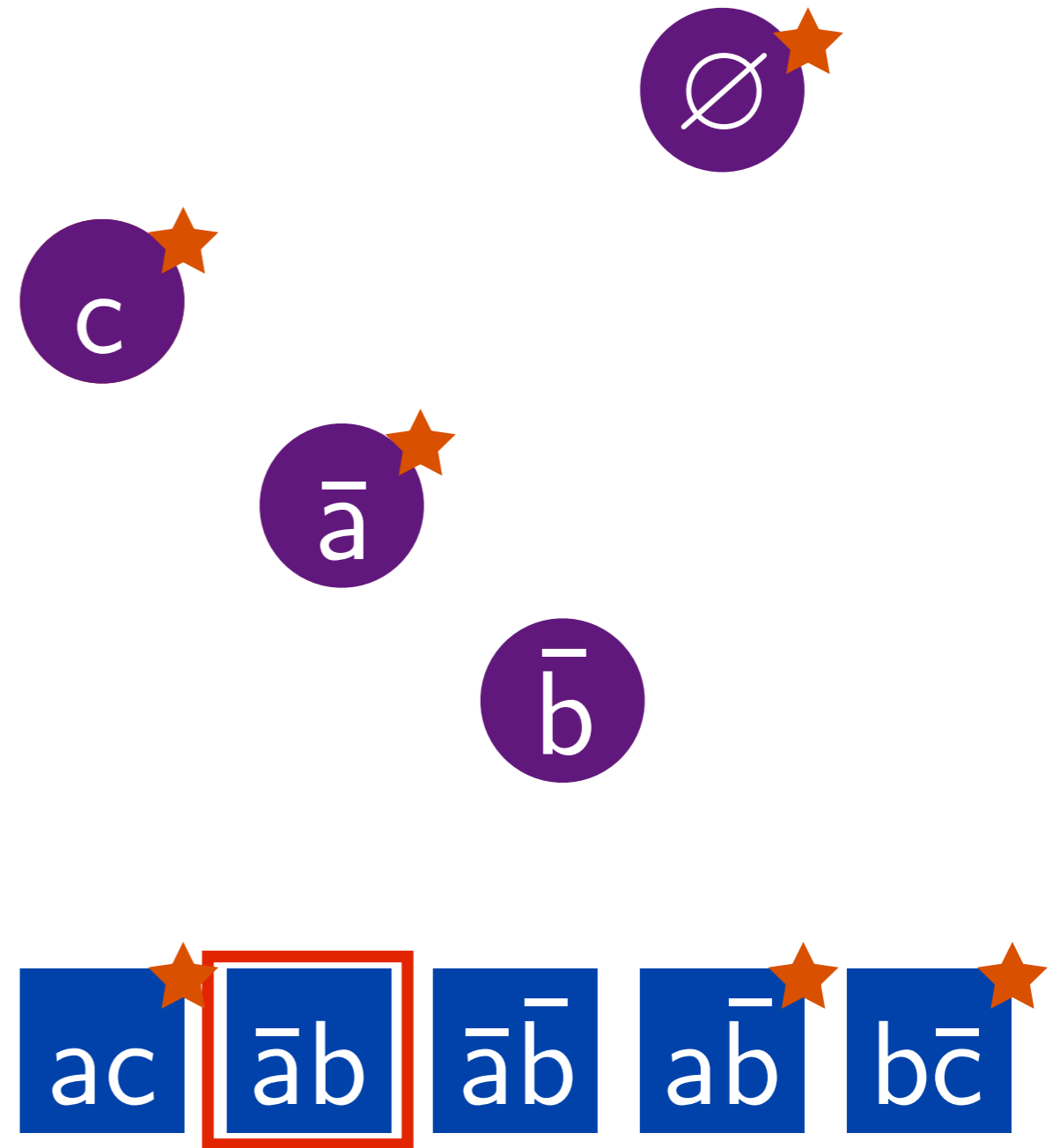
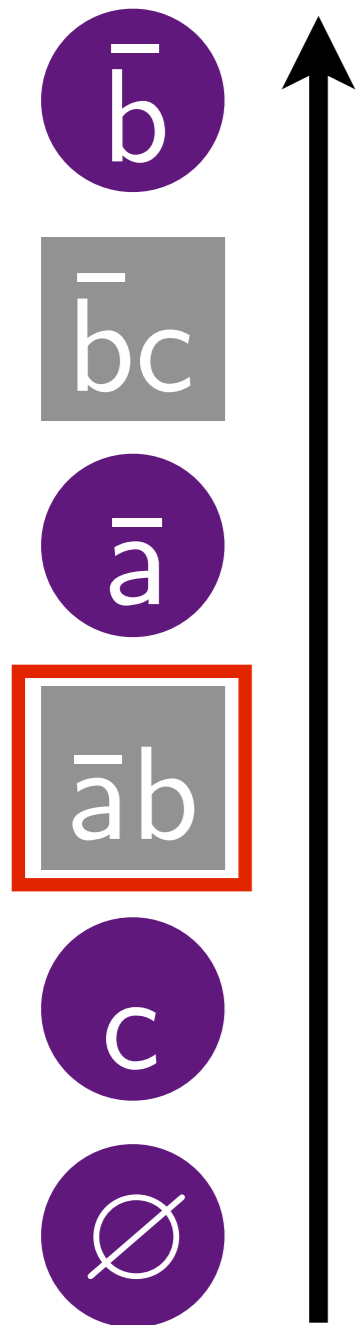
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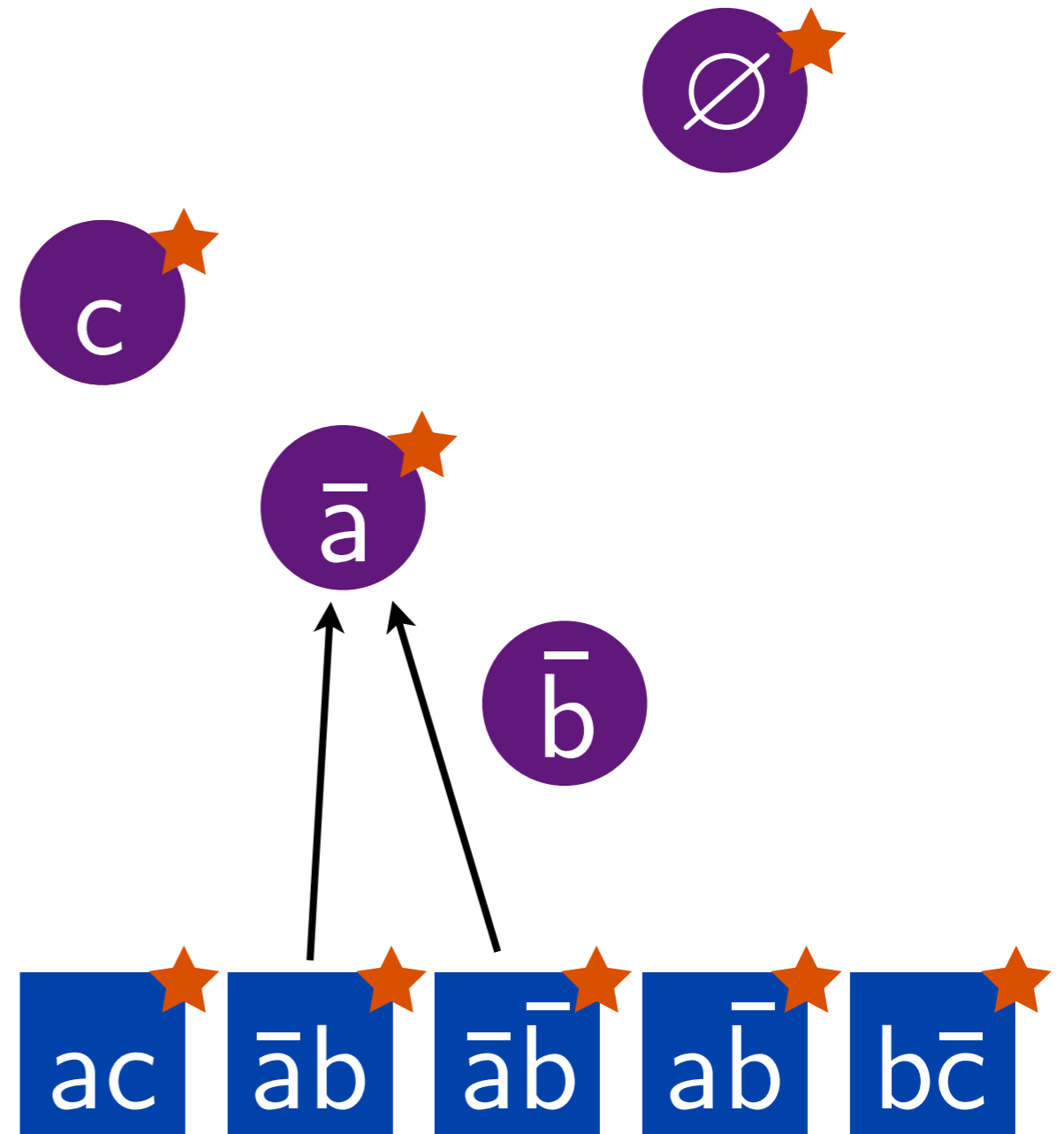
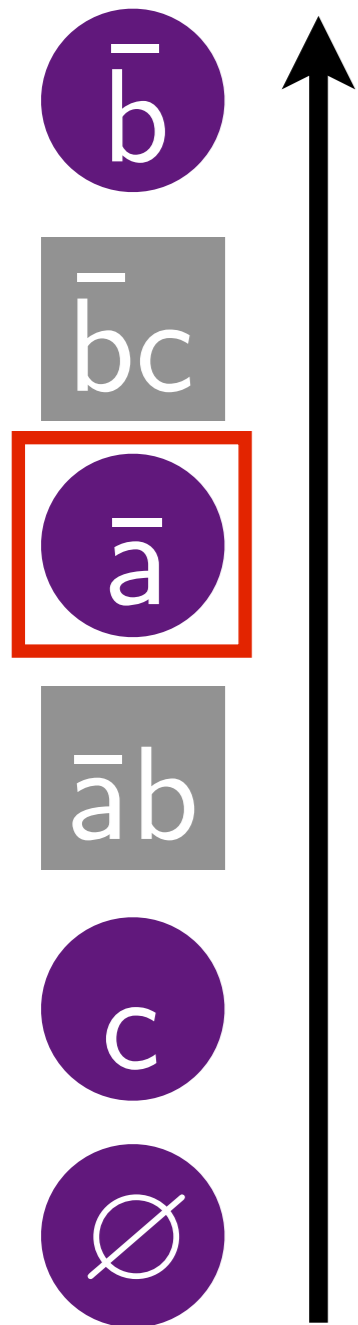
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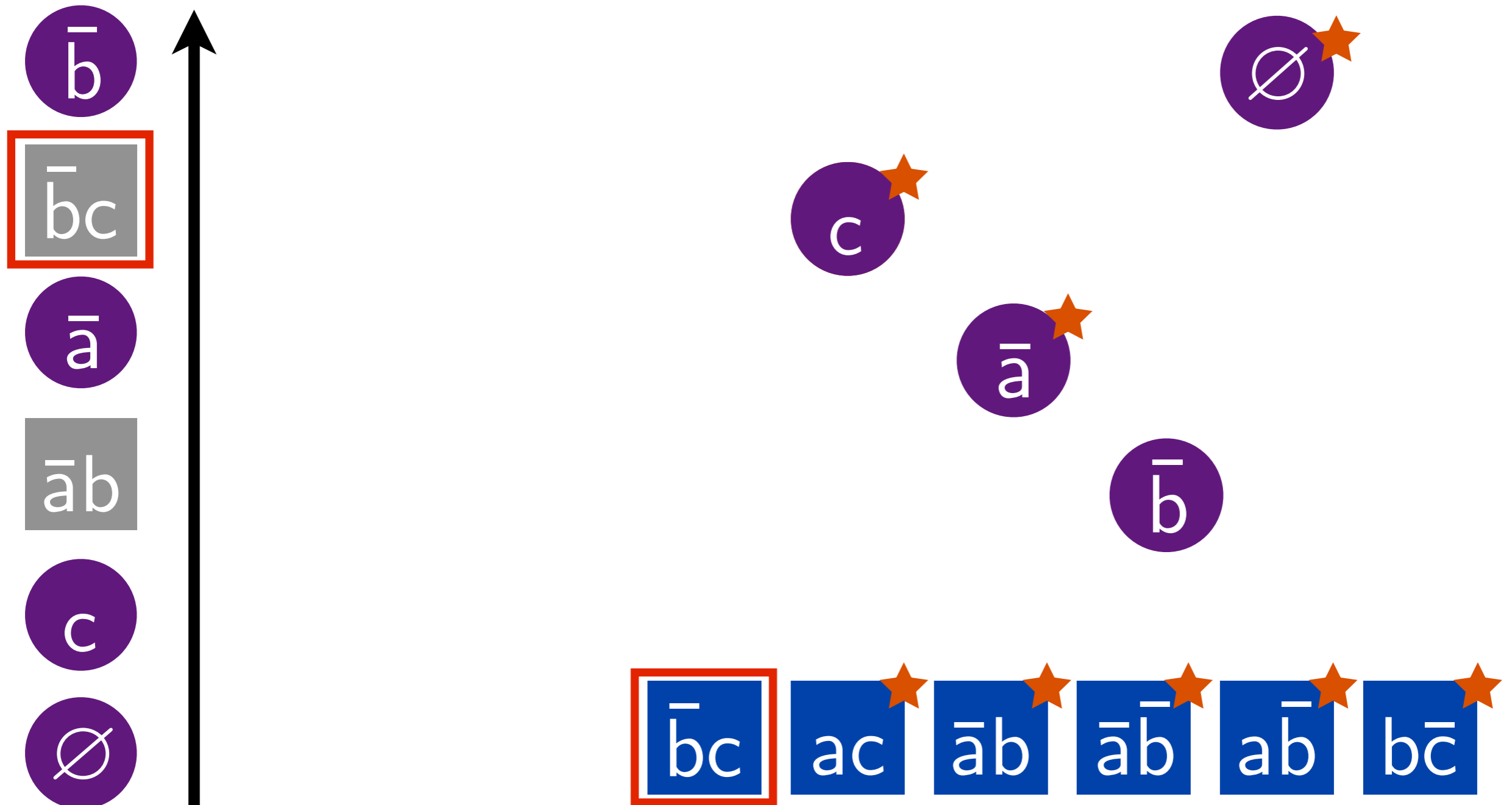
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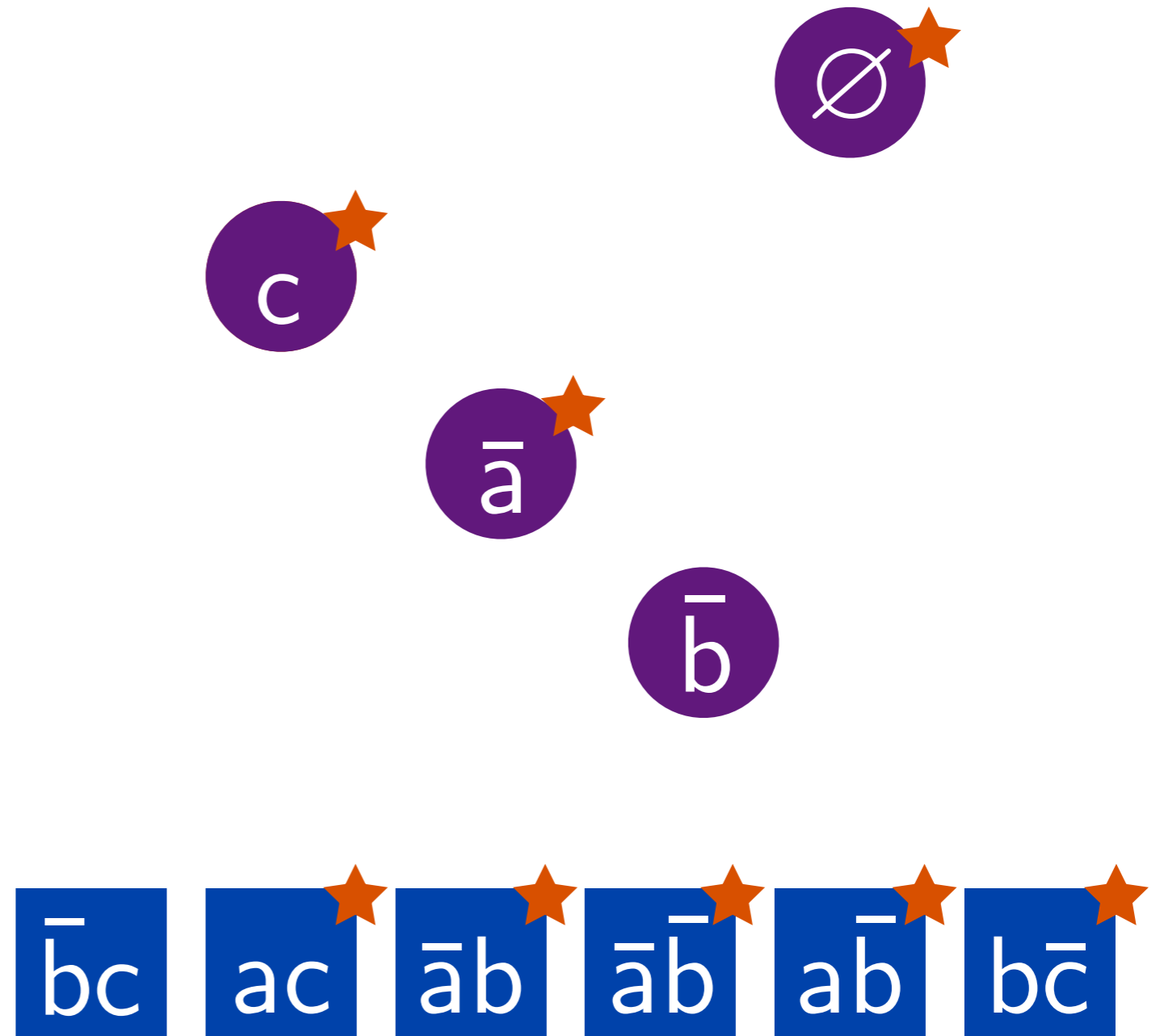
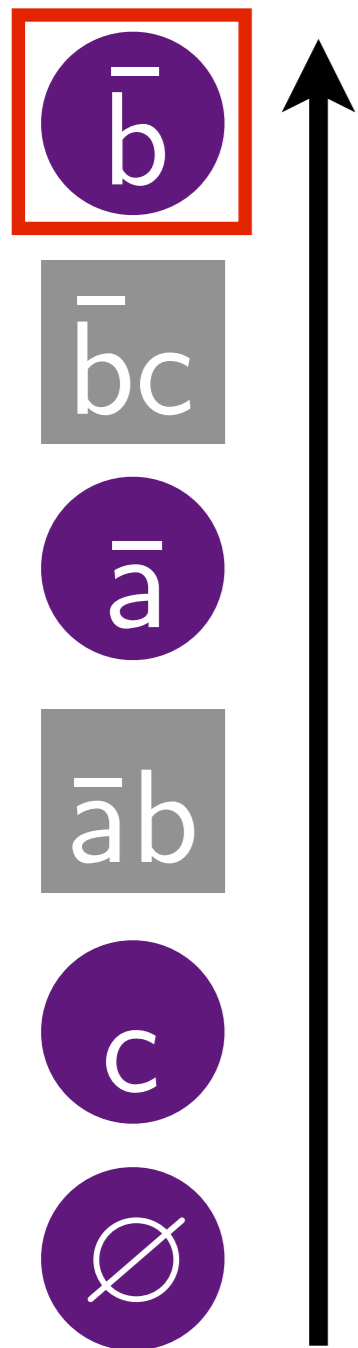


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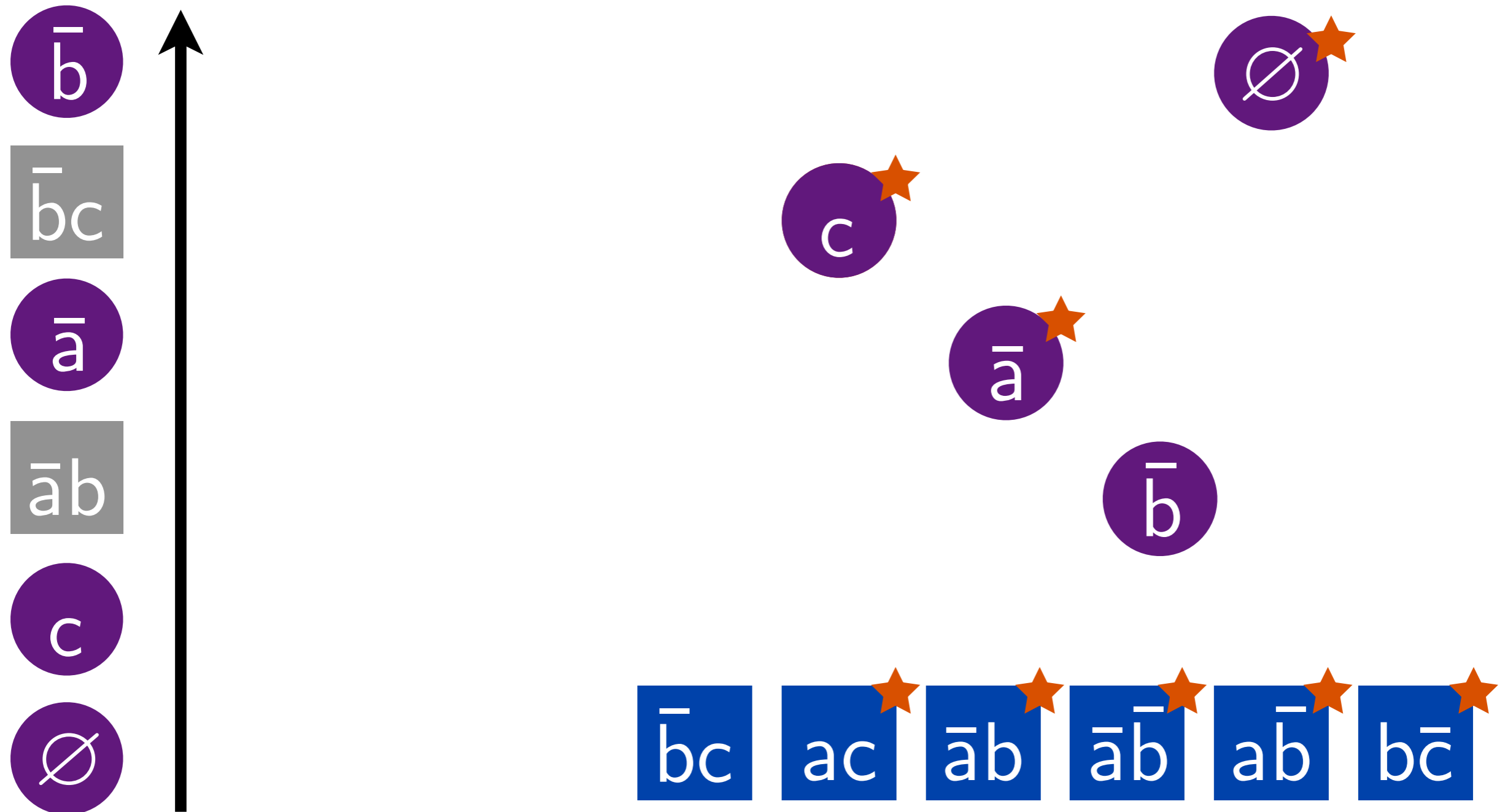




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**Core-first unit propagation results in smaller cores and proofs**

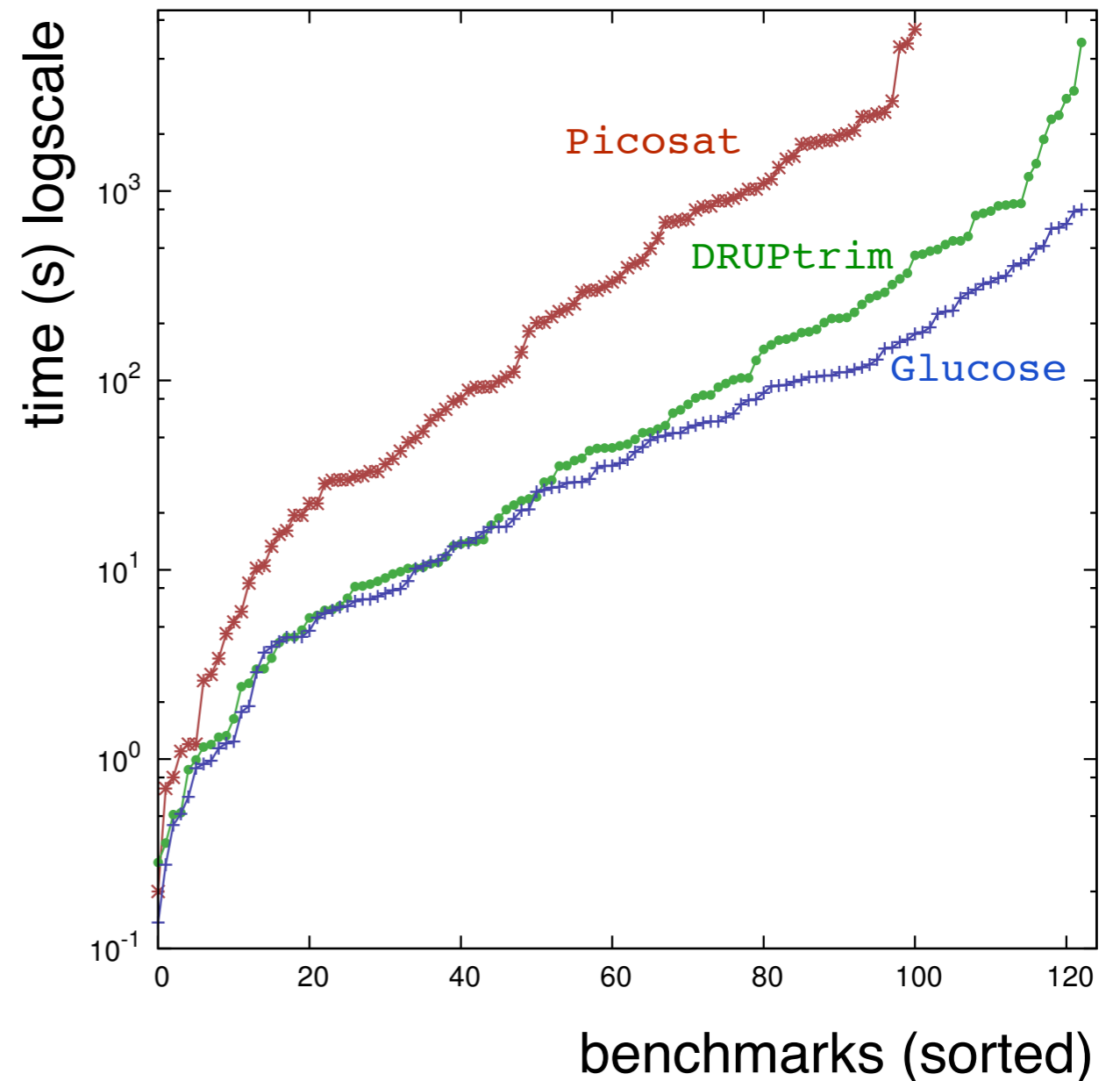
# Experimental Evaluation

We implemented DRUP logging into **Glucose** using only 40 LoC.

**Glucose** (DRUP) solves about twice as many benchmarks as compared to **Picosat** (resolution).

Resolution proof logging increased memory usage up to a factor 100.

**DRUPtrim** validated clausal proofs in a time similar to the solving time.



# DRUP<sub>trim</sub> in SAT Competition 2013

**Unsatisfiable tracks required certificates.** Allowed formats:

- TraceCheck (resolution);
- DRUP, Delete Reverse Unit Propagation.

Timeout : 5,000 seconds for solving and 20,000 seconds for checking

Submissions with proof logging:

- 11 application solvers (9 DRUP, 2 RUP);
- 9 hard-combinatorial solvers (7 DRUP, 2 RUP);
- Most submissions were certified unsatisfiable versions of top-tier solvers.

Statistics:

- 98% of DRUP proofs of top-tier solvers were checked within the time limit;
- Checking most RUP proofs (i.e., no clause deletion) results in a timeout.

# Conclusion

Our DRUP<sub>trim</sub> tool:

- makes it feasible to check the results of state-of-the-art solvers efficiently (demonstrated at SAT Competition 2013);
- validates learning, preprocessing, and inprocessing techniques;
- and produces trimmed proofs and trimmed formulas.

**Our next goal** is to increase confidence in **all** SAT solvers by efficiently checking proofs with a mechanically-verified proof checker.

**Discussion:** should UNSAT proof logging be mandatory for tools participating in competitive events (e.g., SAT Competition, HWMCC)?

# Recent Work

## *Bridging the Gap Between Easy Generation and Efficient Verification of Unsatisfiability Proofs*

Marijn J.H. Heule, Warren A. Hunt, Jr., and Nathan Wetzler

Accepted: Software Testing, Verification, and Reliability (STVR 201X)

## *Verifying Refutations with Extended Resolution*

Marijn J.H. Heule, Warren A. Hunt, Jr., and Nathan Wetzler

Published: Conference on Automated Deduction (CADE 2013)

## *Mechanical Verification of SAT Refutations with Extended Resolution*

Nathan Wetzler, Marijn J.H. Heule, and Warren A. Hunt, Jr.

Published: Interactive Theorem Proving (ITP 2013)

## *Trimming while Checking Clausal Proofs*

Marijn J.H. Heule, Warren A. Hunt, Jr., and Nathan Wetzler

Accepted: Formal Methods in Computer-Aided Design (FMCAD 2013)

**Thank you for your attention!**

**Questions?**

# Resolution Graphs: Arcs vs Vertices vs Literals

Resolution graphs are huge

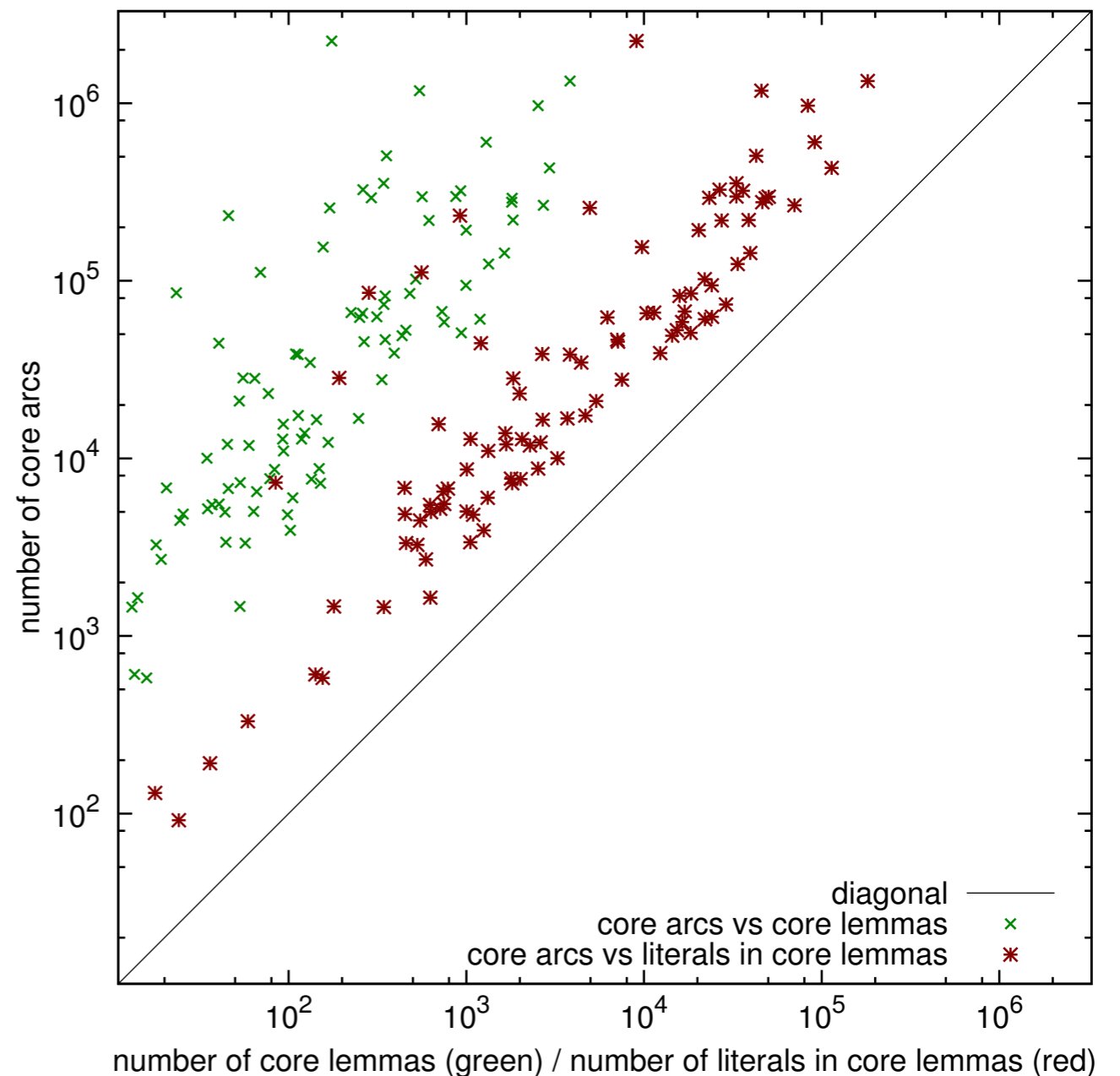
- plot obtained using `picosat`

Lemmas require  $\sim 400$   
resolution steps (arcs in graph)

- due to clause minimization

Lemmas have  $\sim 40$  literals

Resolution proofs are at least  
10x larger than clausal proofs,  
up to 100x memory footprint !



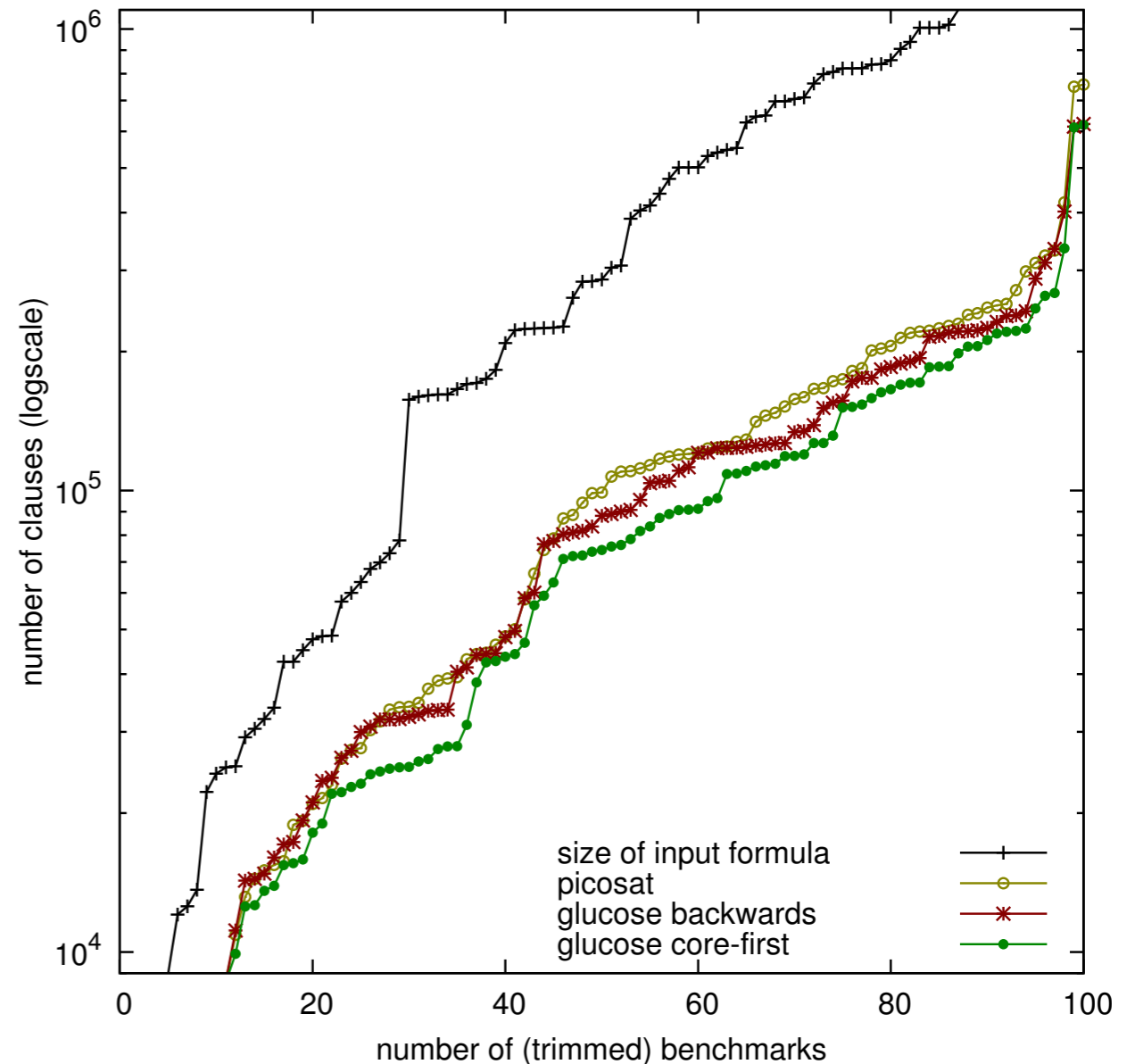
# Results: Trimming

The number of core clauses using

- Picosat (resolution + no preprocessing)
- Glucose (backwards + preprocessing)
- Glucose (core-first + preprocessing)

Checking clausal proofs results in smaller trimmed formulas

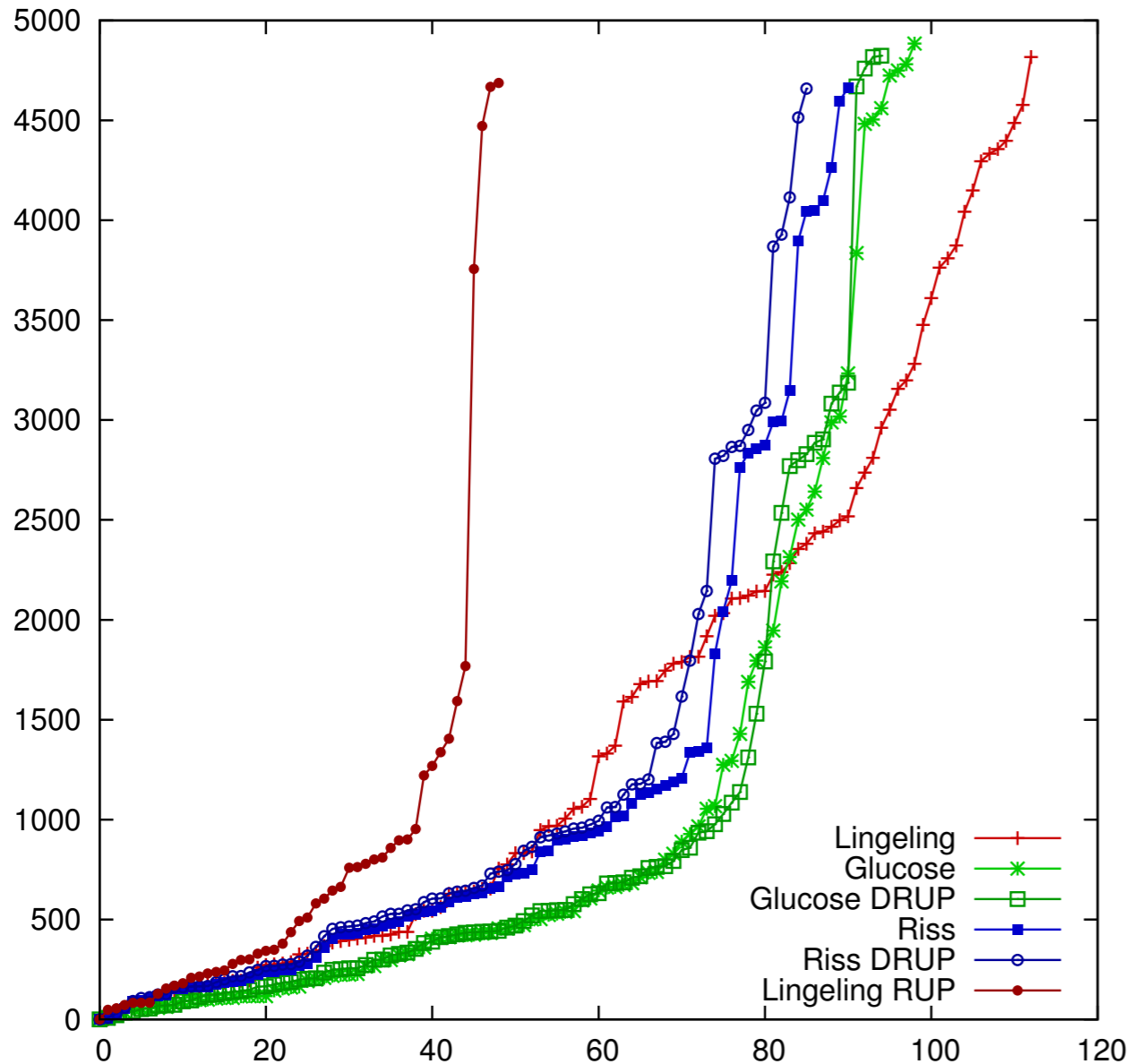
The core-first unit propagation technique further trims the formula



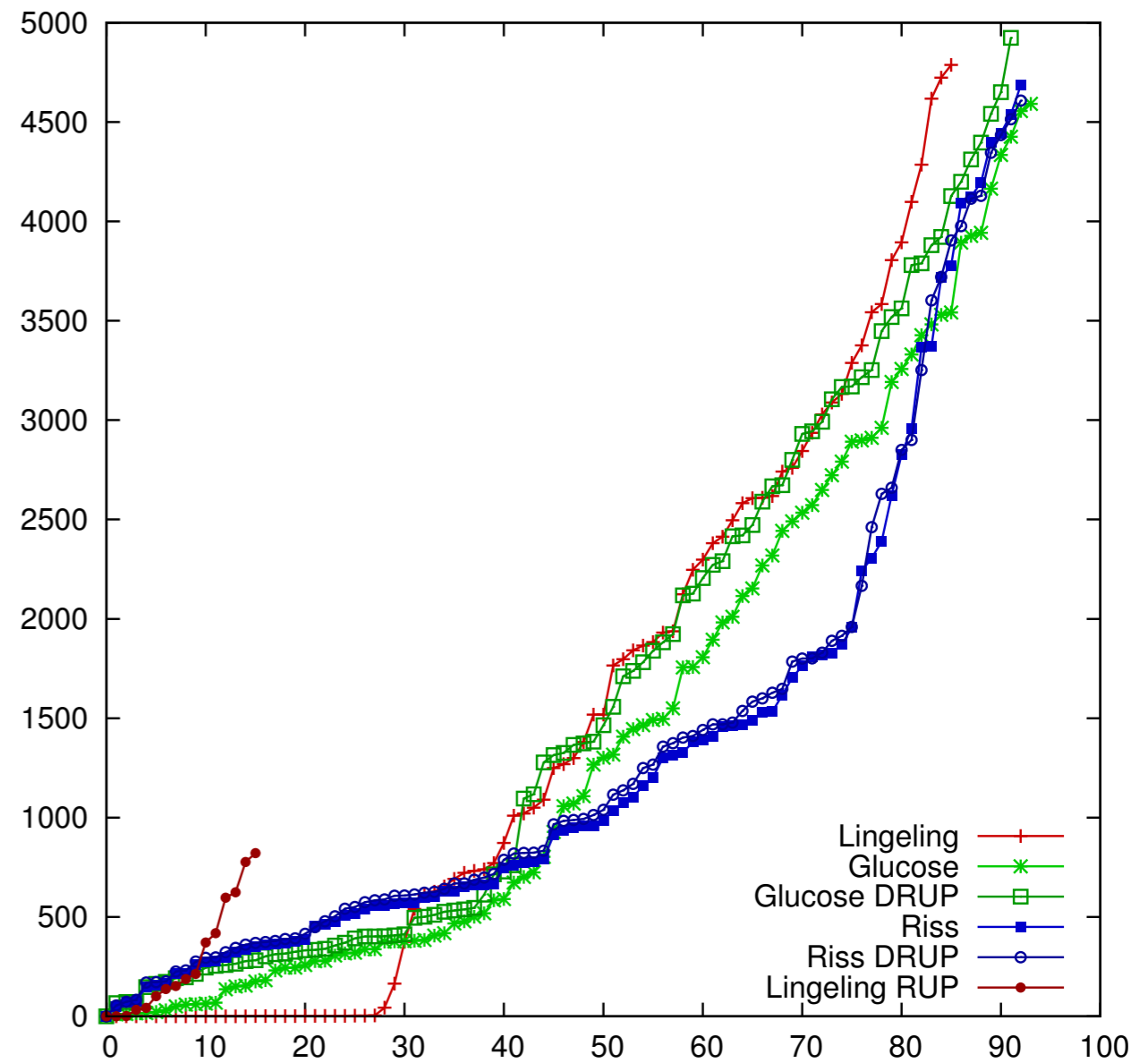


# Proofs Plots for SAT Competition 2013

## Application benchmarks



## Hard-combinatorial benchmarks



*NB: a solved benchmark was only counted if the output was verified*

# UNSAT Results of SAT Competition 2013

DRUP proofs can be checked in a time similar to the solving time

Lack of deletion information made checking much more costly

Enabling DRUP support has a small effect on the solving time

Big performance differences were due to bugs

- some "features" were turned off by enabling DRUP support
- two buggy solvers were not disqualified, due to "correct results"

Our DRUP-trim tool made it feasible to validate all DRUP results