

# Implementing a Relevance Tracker Module

Joachim Jansen<sup>1</sup>, Bart Bogaerts<sup>2,1</sup>, Jo Devriendt<sup>1</sup>  
Gerda Janssens<sup>1</sup>, Marc Denecker<sup>1</sup>

1 KU Leuven, Belgium, [firstname.lastname@kuleuven.be](mailto:firstname.lastname@kuleuven.be)

2 Aalto University, Finland, [bart.bogaerts@aalto.fi](mailto:bart.bogaerts@aalto.fi)

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The logo for KU Leuven, featuring the text "KU LEUVEN" in white, bold, uppercase letters on a dark blue rectangular background with a light blue border.

**KU LEUVEN**

The logo for Aalto University School of Science, featuring a large black letter "A" with a red exclamation mark to its right, and the text "Aalto University School of Science" below it.

**A!**  
Aalto University  
School of Science

# Overview

- ▶ Background: SAT(ID)
- ▶ Background: Relevance for SAT(ID)
- ▶ Implementing Relevance

## PC(ID), SAT(ID)

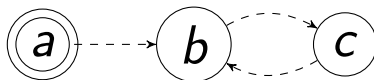
- ▶ SAT(ID) = satisfiability check of PC(ID)
- ▶ **P**ropositional **C**alculus + **I**nductive **D**efinitions
- ▶ PC(ID) encoding  $\mathcal{T} = \{p_{\mathcal{T}}, \Delta\}$  (normal form)
- ▶  $p_{\mathcal{T}}$  is defined in  $\Delta$ ; must hold for  $\mathcal{T}$  to be satisfied.
- ▶ Relation with ASP:  $p_{\mathcal{T}}$  is a single constraint, all atoms not defined in  $\Delta$  are *open* (choice rules),  $\Delta$  contains no recursion over negation (real definition)

## PC(ID), SAT(ID)

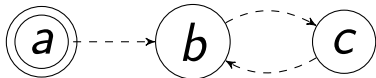
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### Example

- ▶ Choose edges and colors of nodes s.t.
  - ▶ node  $b$  is reachable from  $a$
  - ▶ every node reachable from  $a$  is colored green



## Example (continued)



$$\Delta = \left\{ \begin{array}{l} p_T \leftarrow reach_b \wedge constr_1 \wedge constr_2 \wedge constr_3. \\ constr_1 \leftarrow \neg reach_a \vee green_a. \\ constr_2 \leftarrow \neg reach_b \vee green_b. \\ constr_3 \leftarrow \neg reach_c \vee green_c. \\ reach_a \quad . \\ reach_b \leftarrow case_1 \vee case_2. \\ case_1 \leftarrow reach_a \wedge edge_{a,b}. \\ case_2 \leftarrow reach_c \wedge edge_{c,b}. \\ reach_c \leftarrow reach_b \wedge edge_{b,c}. \end{array} \right.$$

►  $reach_x$  = node  $x$  is reachable from  $a$

►  $constr_x$  = color constraints on node  $x$

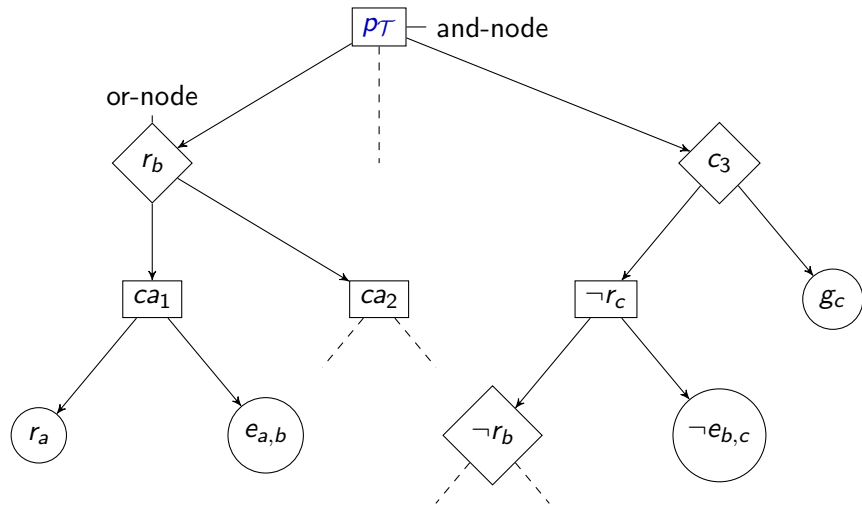
►  $green_x$  = node  $x$  is green

►  $edge_{x,y}$  = edge from  $x$  to  $y$  selected

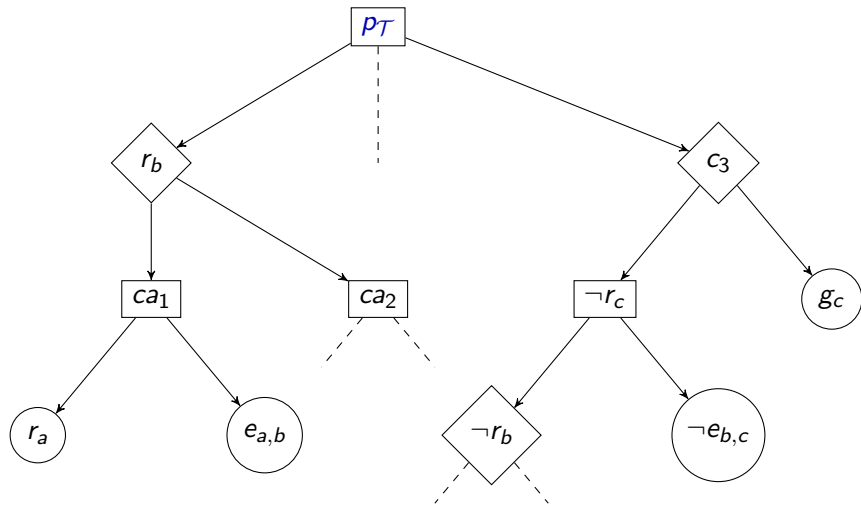
## SAT(ID) solver

Typically, a SAT(ID) solver searches for an *assignment* (*true/false*) to *all atoms* such that  $\mathcal{T}$  is satisfied

## Visualising the hierarchy

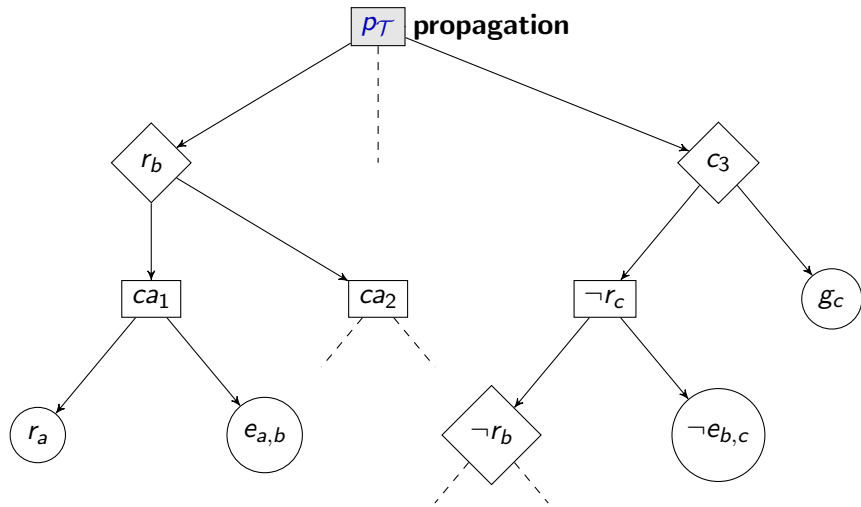


## Visualising the Search process

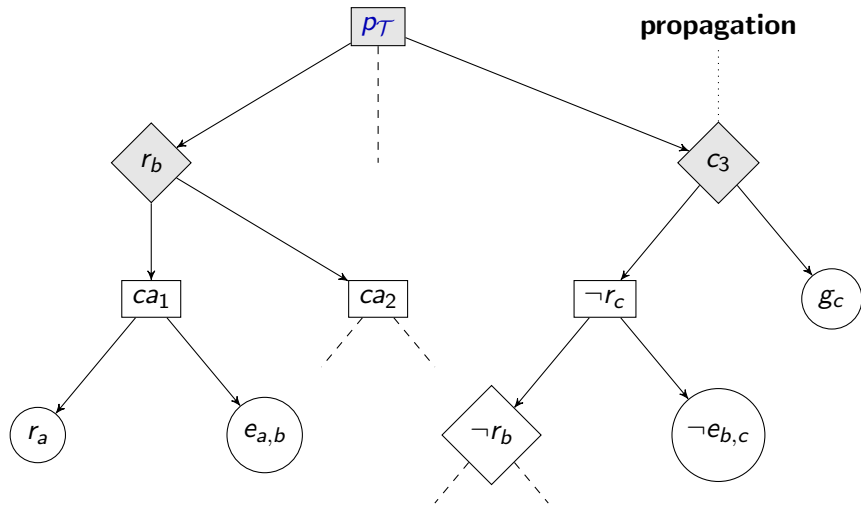




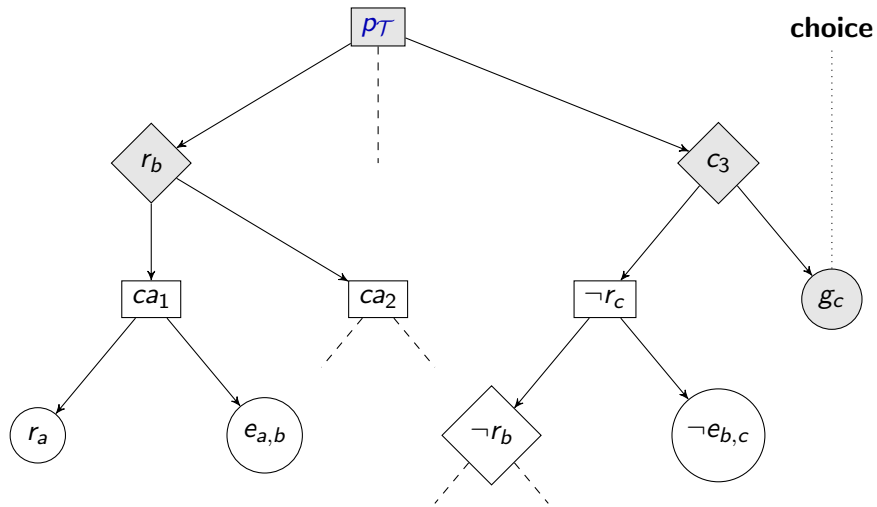
## Visualising the Search process



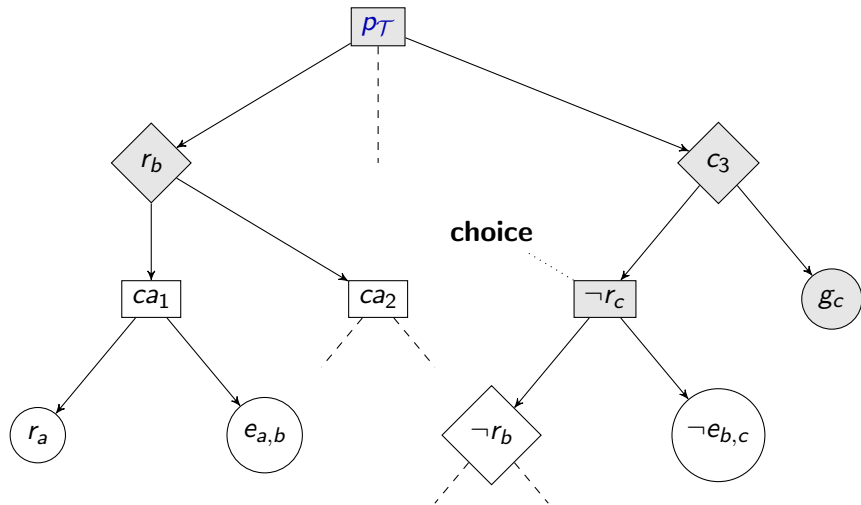
# Visualising the Search process



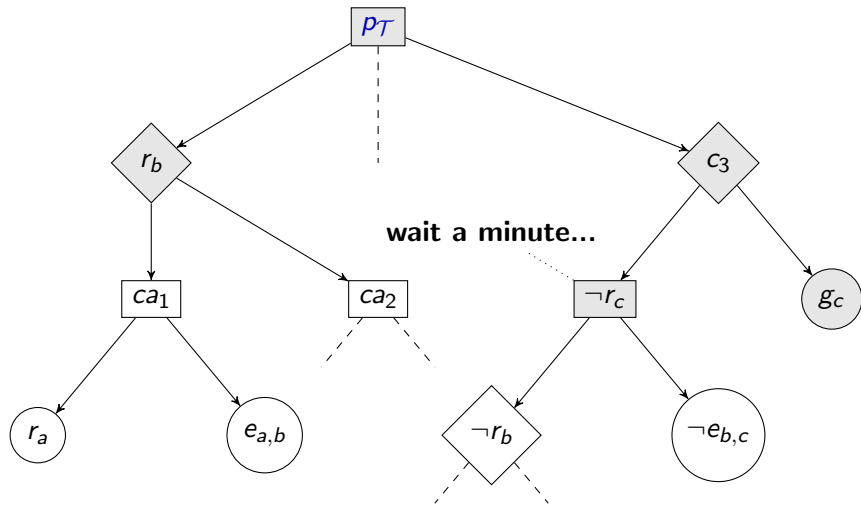
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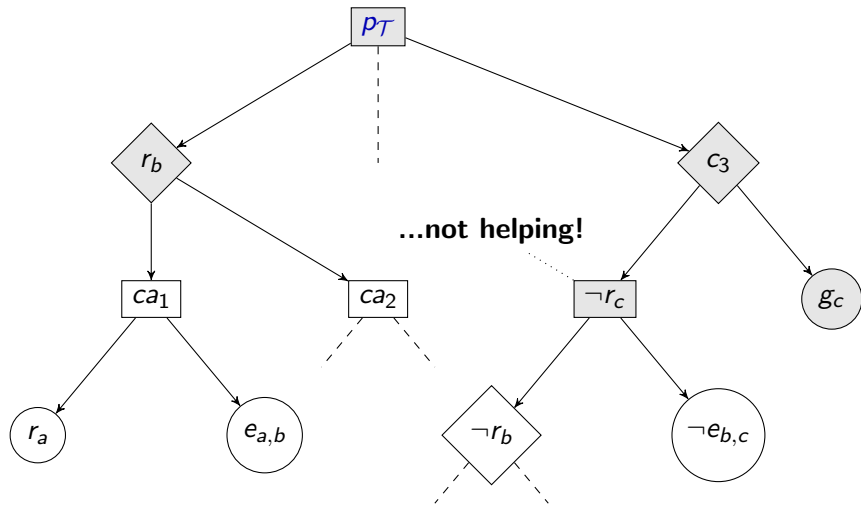
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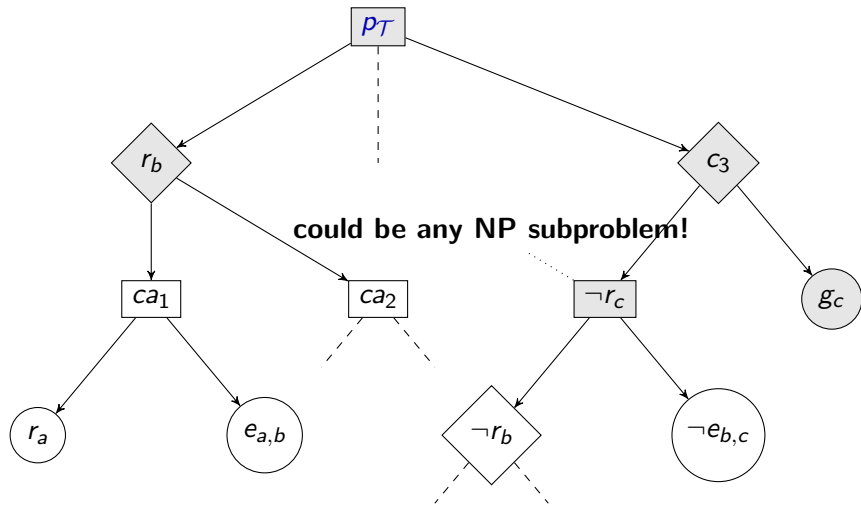
# Visualising the Search process



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# Justifications

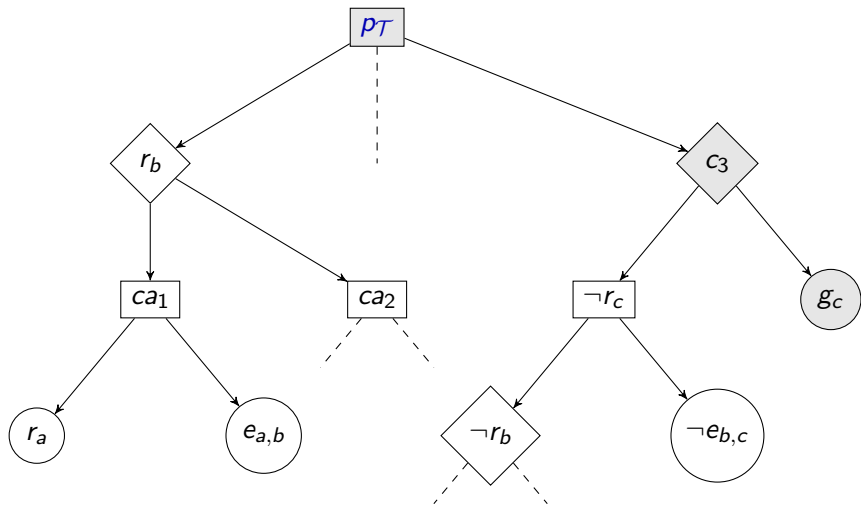
- ▶ Defined by Denecker and De Schreye (1993) and Denecker, Brewka and Strass (2015)
- ▶ Intuitively, a literal is *justified* given a partial assignment if there exists a (recursive) explanation why it must hold in terms of true open literals.



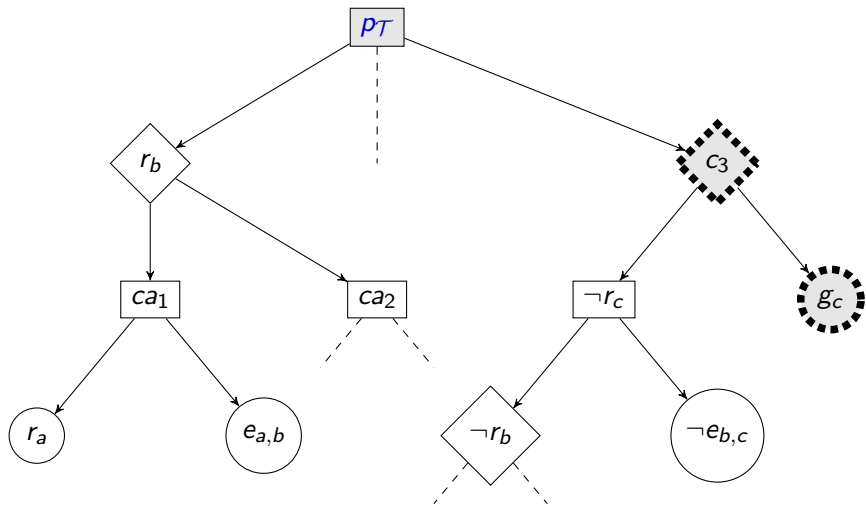
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- ▶ Intuitively, a literal is *justified* given a partial assignment if there exists a (recursive) explanation why it must hold in terms of true open literals.
- ▶ If a literal is justified in a partial assignment, then there exists a model of  $\Delta$  in which that literal holds.
- ▶ Thus... it suffices to prove that  $p_{\mathcal{T}}$  is *justified* in some partial interpretation to conclude that  $\mathcal{T}$  is satisfiable.

Searching assignment  $\rightarrow$  searching *justification*



Searching assignment  $\rightarrow$  searching *justification*





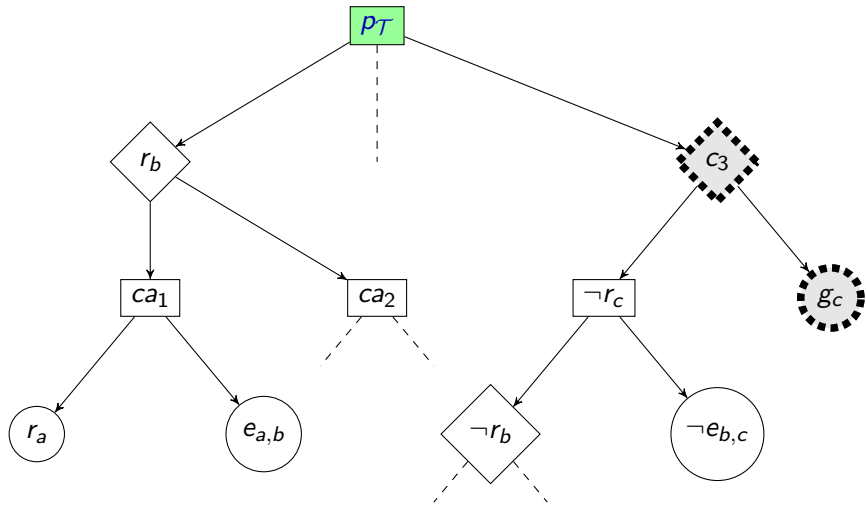
# Relevance

## Definition

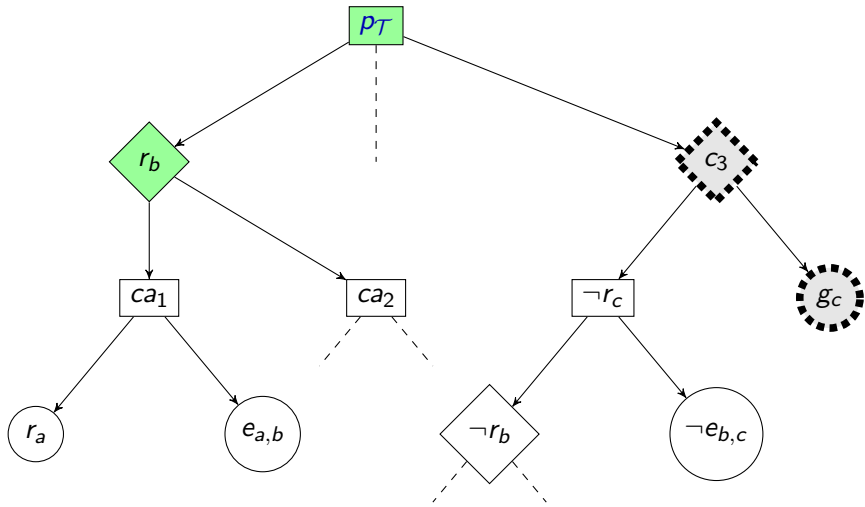
Given a PC(ID) theory  $\mathcal{T} = \{p_{\mathcal{T}}, \Delta\}$  and a partial interpretation  $\mathcal{I}$ , we inductively define the set of relevant literals, denoted  $\mathcal{R}_{\mathcal{T}, \mathcal{I}}$ , as follows

- ▶  $p_{\mathcal{T}}$  is relevant if  $p_{\mathcal{T}}$  is not justified,
- ▶  $l$  is relevant if  $l$  is not justified and there exists some  $l'$  such that  $(l', l) \in dd_{\Delta}$  and  $l'$  is relevant.

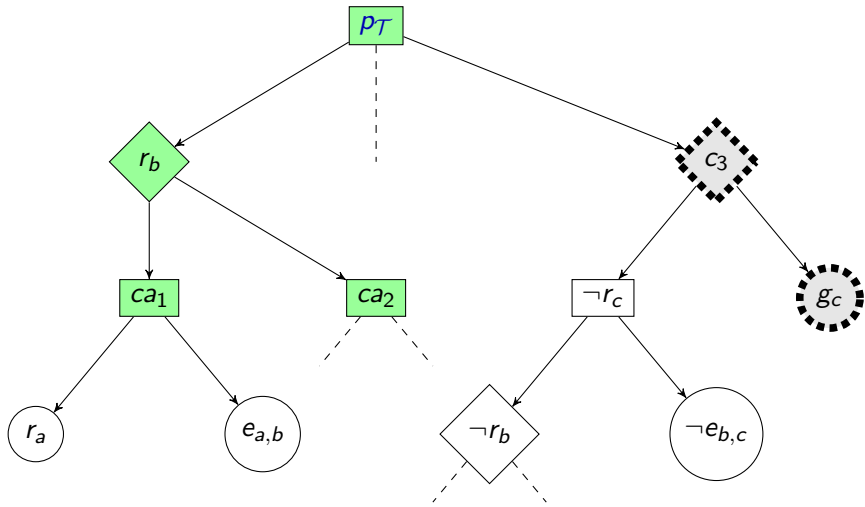
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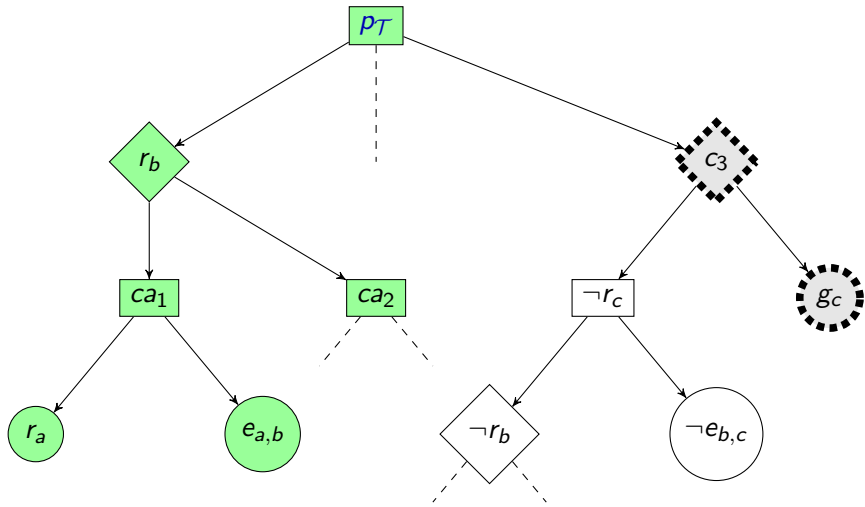


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# Adjusting the Solver

- ▶ Decide only on **Relevant** literals.
- ▶ Stop search when  $p_{\mathcal{T}}$  is *justified*
  - ▶ Guarantee that a two-valued solution can be generated efficiently
  - ▶ More tolerant to faulty choices of the solver
  - ▶ Expectation: less choices made by solver

# Implementation

- ▶ How to keep track of justified literals?
- ▶ How to keep track of relevant literals?

## Keeping track of justified literals

- ▶ For each defined atom  $p$ , introduce a new atom  $j_p$ .
- ▶ Intended interpretation:  $j_p$  is true (in a partial interpretation) iff  $p$  is justified;  $j_p$  is false iff  $\neg p$  is justified;  $j_p$  is unknown otherwise.
- ▶ Duplicate definition  $\Delta$  to a new definition  $\Delta'$ , obtained by a replacing each defined atom  $p$  by  $j_p$  (note: open literals remain).
- ▶ Modify solver: forbidden to make choices on  $j_p$ .
- ▶ **Claim:** after the standard propagation is executed,  $j_p$  satisfies the “intended interpretation” above.

# Keeping track of justified literals

## Theorem

*Let  $\Delta$  be a (total) definition and  $\mathcal{I}$  a partial interpretation in which all defined symbols of  $\Delta$  are interpreted as  $\mathbf{u}$ . Let  $l$  be a defined literal in  $\Delta$ . In this case  $l$  is justified in  $\mathcal{I}$  if and only if  $l$  is derivable by unit propagation on the completion of  $\Delta$  and unfounded set propagations.*

## Keeping track of justified literals

- ▶ Without major modifications to the solver, we obtain a method to keep track of justified literals.
- ▶ Only modification: do not make choices on certain atoms.

# Keeping track of relevant literals

Recall:

## Definition

Given a PC(ID) theory  $\mathcal{T} = \{p_{\mathcal{T}}, \Delta\}$  and a partial interpretation  $\mathcal{I}$ , we inductively define the set of relevant literals as follows

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## Keeping track of relevant literals

- ▶ For each relevant literal (except  $p_T$ ), we maintain one *relevant parent in  $dd_\Delta$* : the *reason* why this literal is relevant.
- ▶ Thus, we maintain a subgraph of  $dd_\Delta$ .
- ▶ We incrementally update this subgraph (as the justification status of certain literals changes)
- ▶ Biggest challenge: keeping this graph acyclic. (how to choose the “right” parent)



## Keeping track of relevant literals

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- ▶ We incrementally update this subgraph (as the justification status of certain literals changes)
- ▶ Biggest challenge: keeping this graph acyclic. (how to choose the “right” parent)
- ▶ Turns out... this cycle detection is the same problem as tackled in unfounded set propagators.
- ▶ Only difference: works on a (slightly) different graph.

## Keeping track of relevant literals

- ▶ In the paper, we also detail the used data structures and an event-driven implementation

## Experiment Setup (1)

- ▶ Problems from previous ASP competitions
- ▶ Solver = Minisatid, Heuristic = VSIDS

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- ▶ Problems from previous ASP competitions
- ▶ Solver = Minisatid, Heuristic = VSIDS
- ▶ Measuring
  - ▶ Ratio of irrelevant decisions (%)
  - ▶ Ratio of conflicts originating from irrelevant decisions (%)

## Experimental Results (1)

<b>Problem</b>	<b>% Irr. Decisions</b>	<b>% Irr. Conflicts</b>
HP	27.37%	36.99%
NQueens	22.55%	0.43%
PPM	22.93%	4.98%
Sokoban	48.20%	0.96%
Solitaire	13.32%	3.95%
SM	96.40%	0.01%
Visit All	15.02%	16.45%

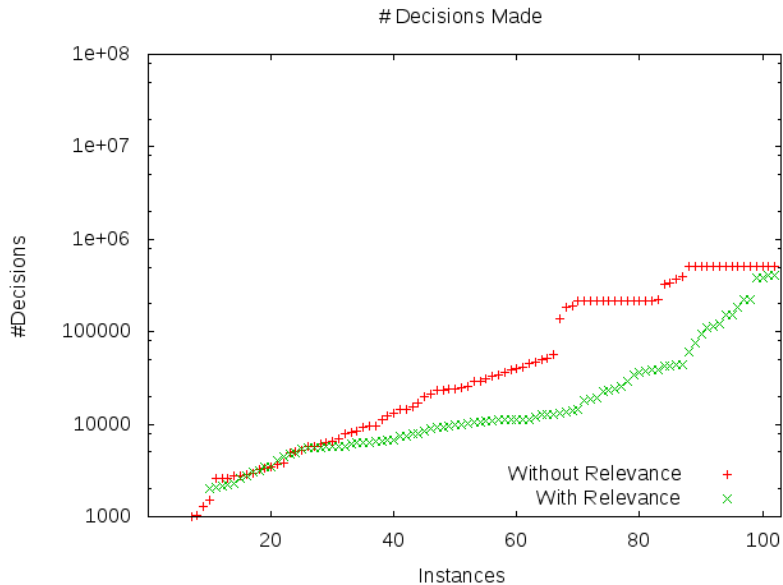
## Experiment Setup (2)

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- ▶ Solver = Minisatid, Heuristic = VSIDS

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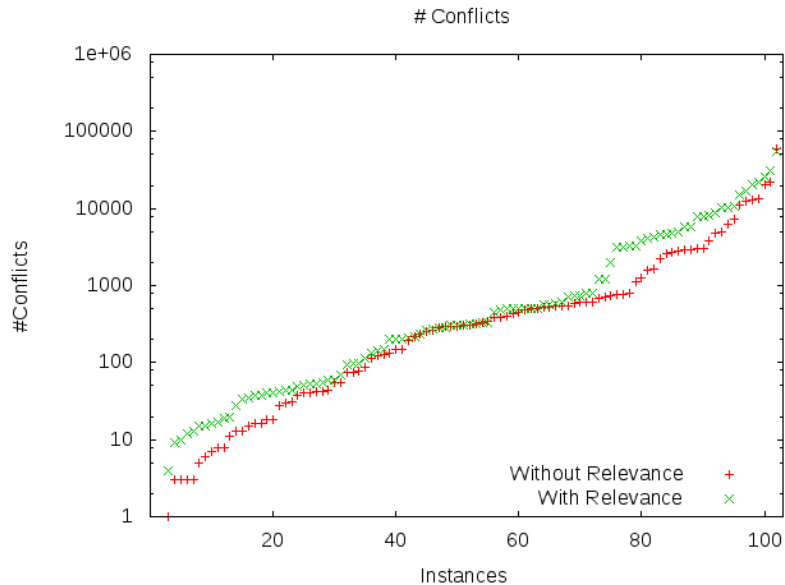
- ▶ Problems from previous ASP competitions
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## Experimental Results (2)





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## Take-away messages

- ▶ Exploit problem hierarchy using *Relevance*

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- ▶ Exploit problem hierarchy using **Relevance**
- ▶ Preliminary promising results: fewer *decisions*
- ▶ A relevance tracker can be *implemented* reusing existing methods:
  - ▶ Justification status: unit propagation and unfounded set propagation
  - ▶ Relevance status: unfounded set algorithms

Questions?