



Constraint Learning for Non-confluent Proof Search

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Joint work with

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■ "First calculus towards ATP" [Bibel; Loveland – late 70s]

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- ► Variant of (first-order) tableaux and binary resolution

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- Sound & complete
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- Unlike "ordinary" tableaux or resolution: Non-confluent
 - Some proof steps are wrong and result in "dead ends"
- Iterative deepening & proof enumeration

(First-Order) Connection Tableaux

- **Given** a set of (first-order) input clauses
- Just 3 kinds of rules (+ first-order unifier)

(First-Order) Connection Tableaux

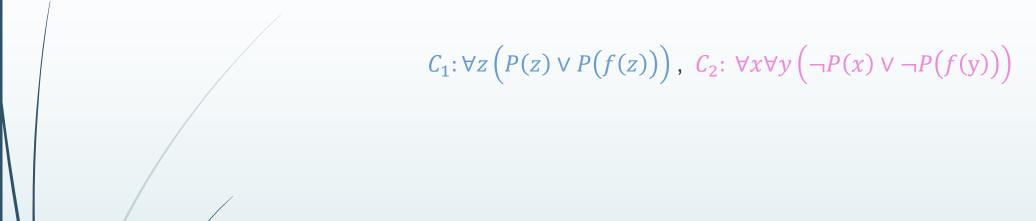
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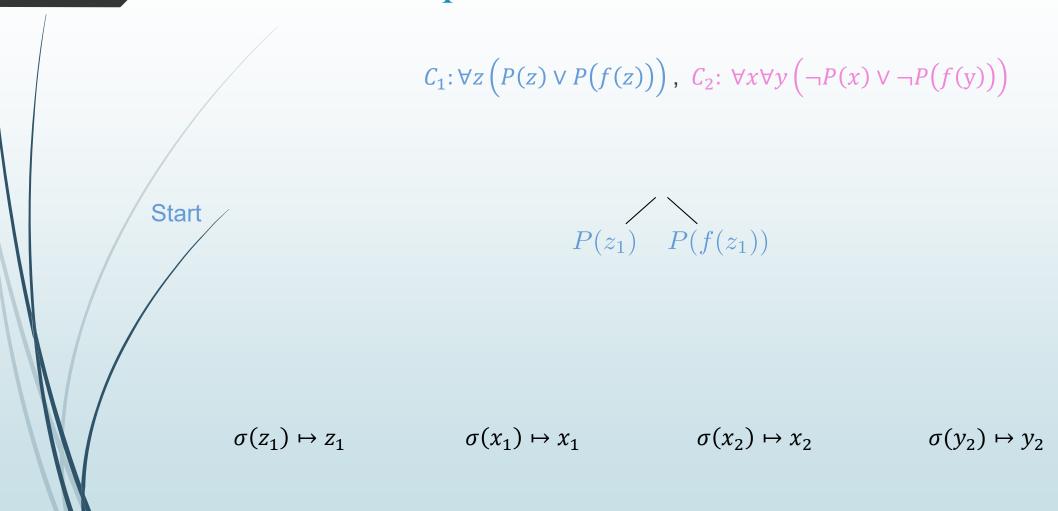
Reduction	Extension
	Reduction

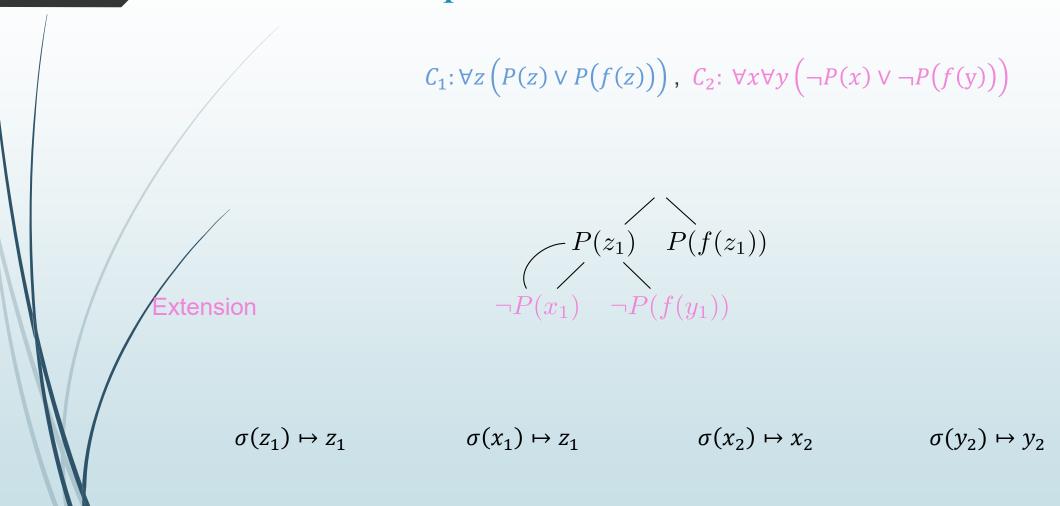
(First-Order) Connection Tableaux

- **Given** a set of (first-order) input clauses
- Just 3 kinds of rules (+ first-order unifier)

Start	Reduction	Extension
L_1 L_2 \ldots L_n	L L_1	L L_1 L_2 L_n







 $C_1: \forall z \left(P(z) \lor P(f(z))\right), C_2: \forall x \forall y \left(\neg P(x) \lor \neg P(f(y))\right)$

Reduction

$$P(z_1) P(f(z_1))$$

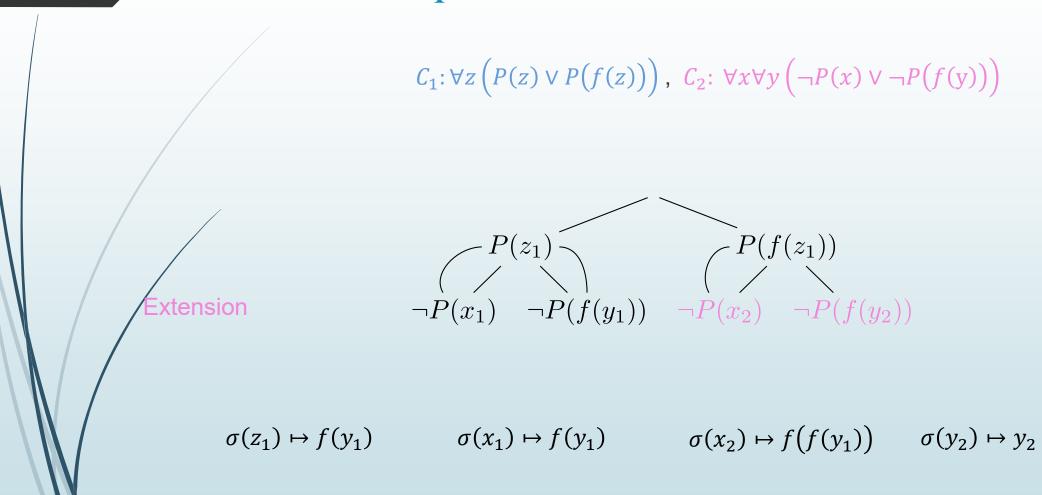
$$\neg P(x_1) \neg P(f(y_1))$$

$$\sigma(z_1) \mapsto f(y_1)$$

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Reduction

$$\begin{array}{c|cccc}
P(z_1) & & P(f(z_1)) \\
\hline
 P(x_1) & \neg P(f(y_1)) & \neg P(x_2) & \neg P(f(y_2))
\end{array}$$

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 $(\neg A \lor \neg B \lor C) \land (\neg C \lor D) \land (\neg A \lor \neg B \lor \neg D) \land (A \lor B)$

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- We resume with $(\neg A \lor \neg B \lor C) \land (\neg C \lor D) \land (\neg A \lor \neg B \lor \neg D) \land (A \lor B) \land (\neg A \lor \neg B)$

■ Theoretical argument for using conflict learning in CC search

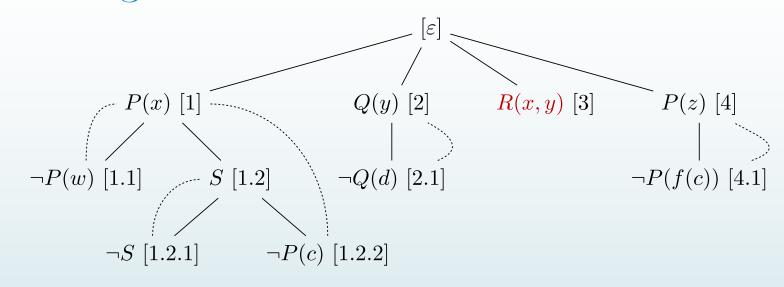
- Theoretical argument for using conflict learning in CC search
- Overhead of using SAT core

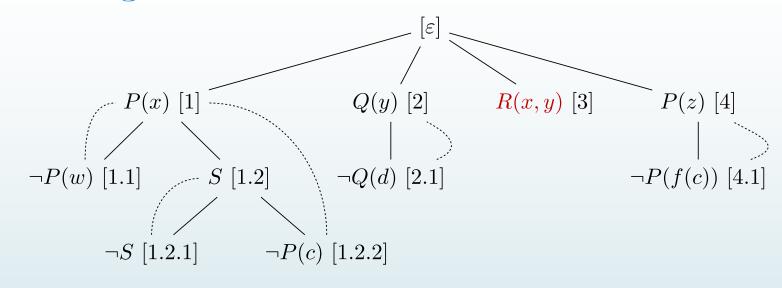
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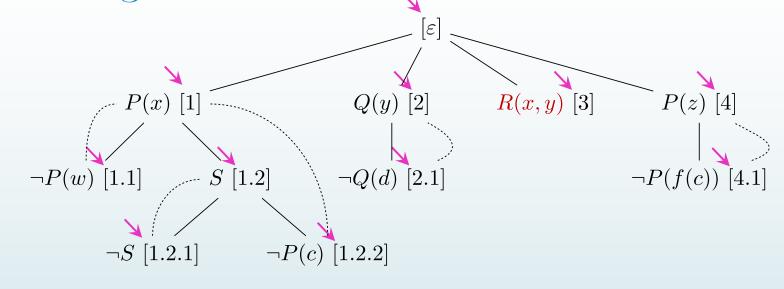
→ Specialized Learning Engine

Custom Learning Engine for CC

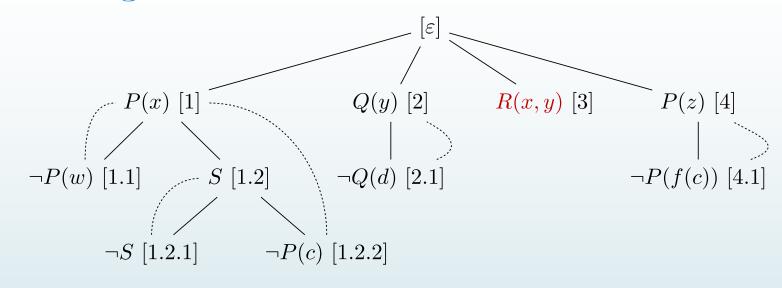




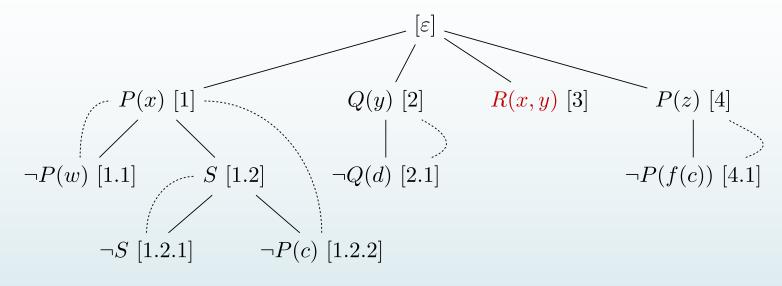
We maintain explicit positions



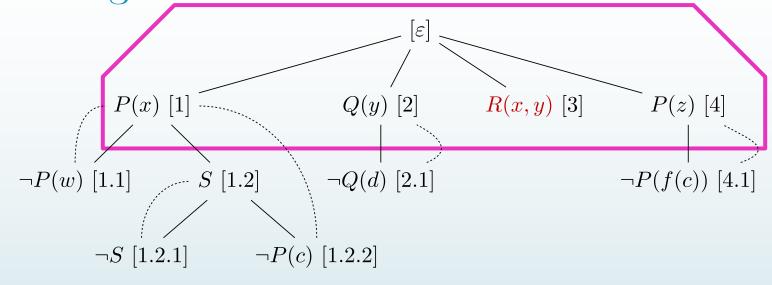
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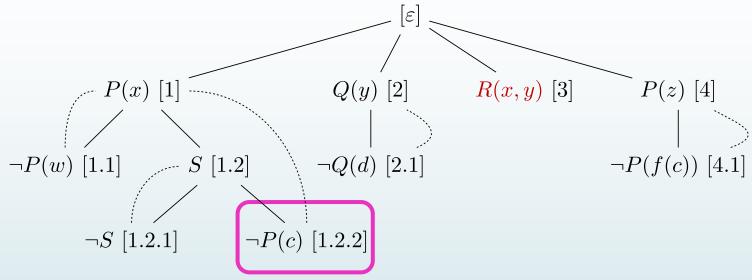
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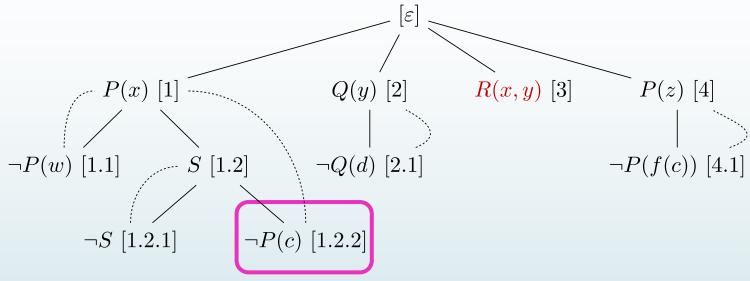
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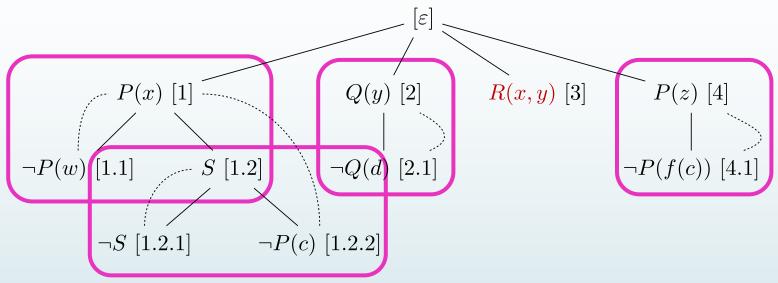
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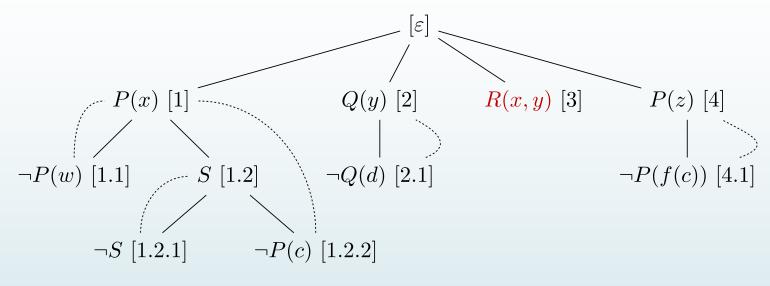
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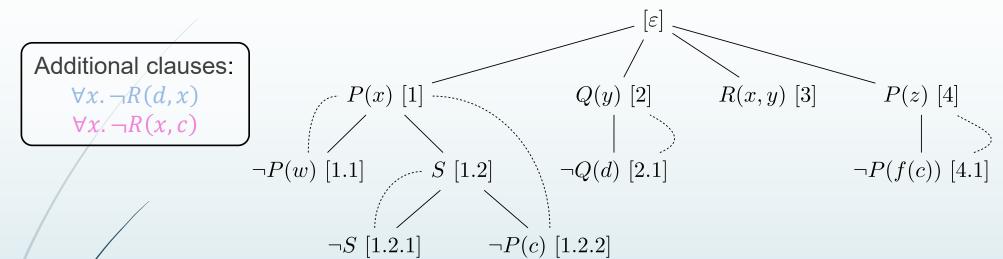
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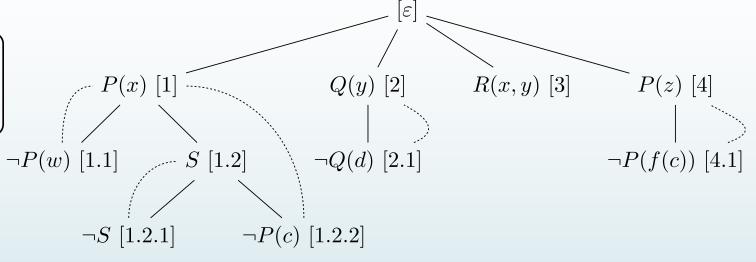


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Additional clauses:

 $\forall x. \neg R(d, x)$ $\forall x. \neg R(x, c)$



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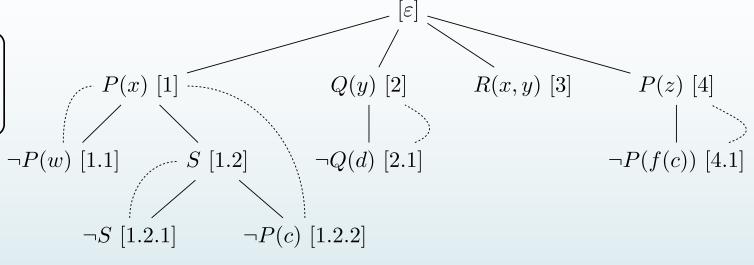
Additional clauses: $\forall x. \neg R(d, x) \\ \forall x. \neg R(x, c)$ P(x) [1] Q(y) [2] R(x, y) [3] P(z) [4] P(x) [1] P(w) [1.1] P(w) [1.1] P(w) [1.1] P(x) [1] P

- As $x \mapsto c$ and $y \mapsto d$ we need to connect to R(c, d) but we cannot
- Stuck by union of justification

$$\{E_{\neg P(x) \lor S/1}^{1}, E_{\neg S \lor \neg P(c)/1}^{1,2}, R_{1.2.2}^{1}\} \cup \{E_{\neg Q(y)/1}^{2}\}$$

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We learn the clause:

$$\neg S_{P(\mathbf{x}) \lor Q(\mathbf{y}) \lor R(\mathbf{x}, \mathbf{y}) \lor P(\mathbf{z})} \lor \neg E_{\neg P(\mathbf{x}) \lor S/1}^{1} \lor \neg E_{\neg S \lor \neg P(c)/1}^{1.2} \lor \neg R_{1.2.2}^{1} \lor \neg E_{\neg Q(\mathbf{y})/1}^{2}$$

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 - We indeed learn non-trivial stuff

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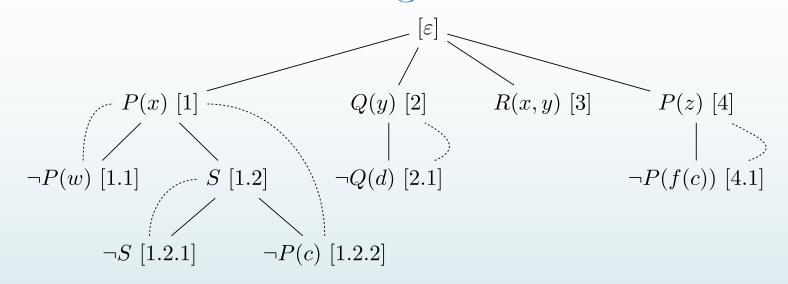
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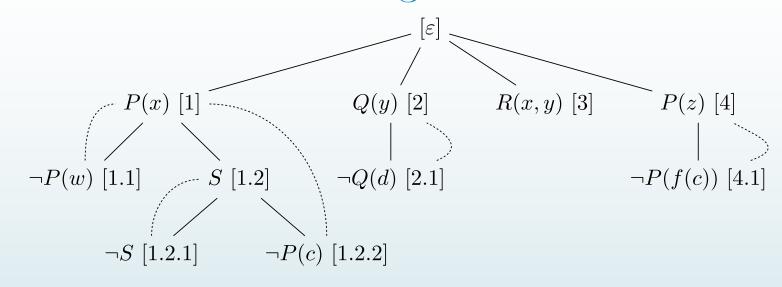
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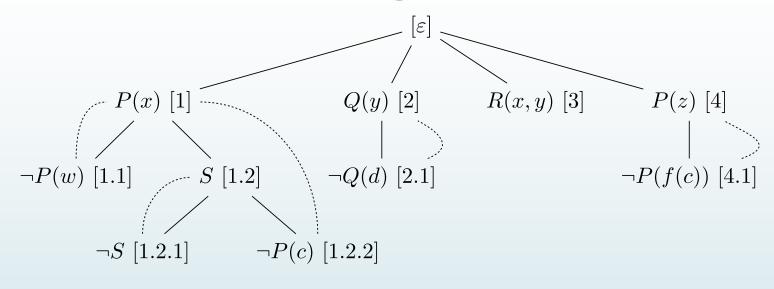
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- **■** Conflicts inherently **depending** on **precise paths** ⊗

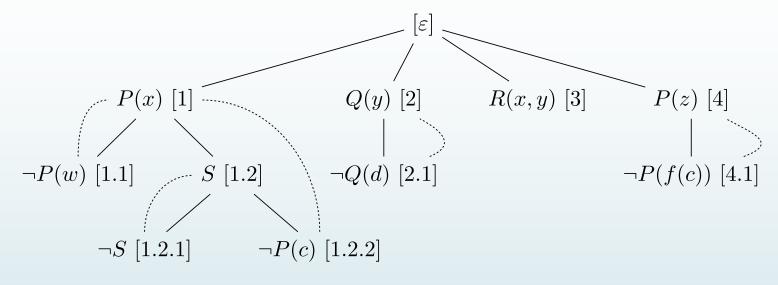




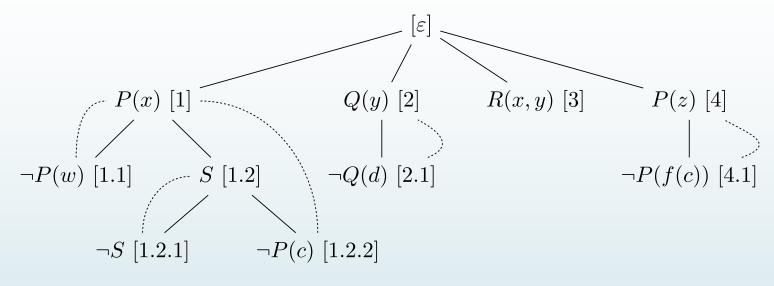
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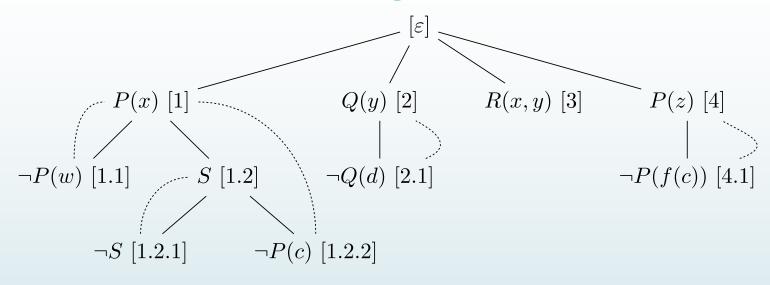
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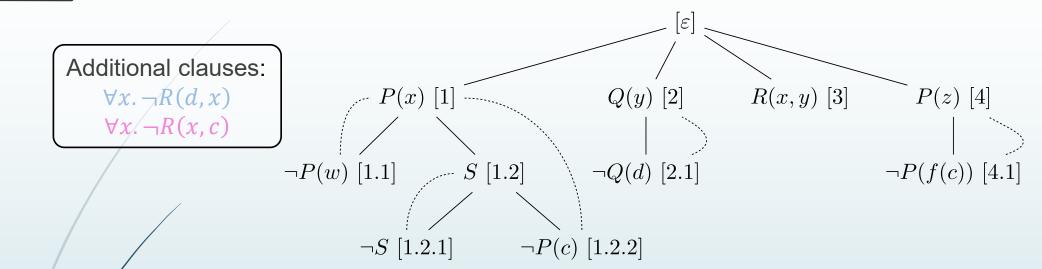
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 - 1. **Literal** at **position** e.g., $\langle P(x)@1 \rangle$ or $\langle \neg P(c)@1.2.2 \rangle$

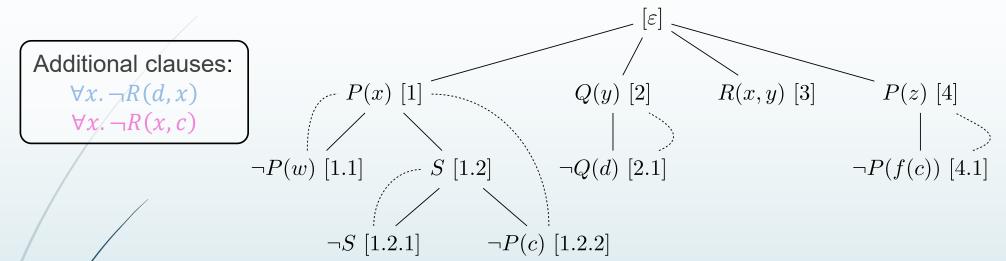


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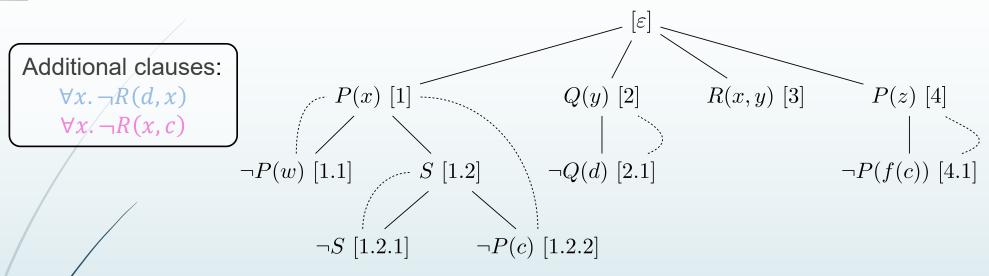


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- Major difference: The origin of bindings [extension/reduction] is not tracked





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Additional clauses: $\forall x. \neg R(d, x)$ $\forall x. \neg R(x, c)$ $P(x) [1] \qquad Q(y) [2] \qquad R(x, y) [3] \qquad P(z) [4]$ $\neg P(w) [1.1] \qquad S [1.2] \qquad \neg Q(d) [2.1] \qquad \neg P(f(c)) [4.1]$ $\neg S [1.2.1] \qquad \neg P(c) [1.2.2]$

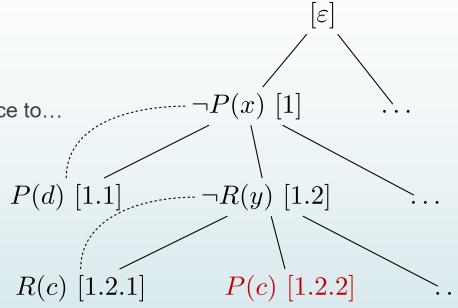
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We learn the clause:

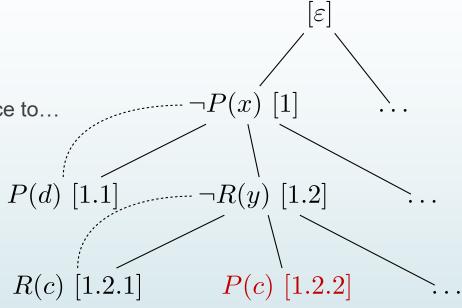
$$\neg \langle R(x,y)@3 \rangle \lor \neg (x \mapsto c) \lor \neg (y \mapsto d)$$

- More complicated
 - Express: there is nothing we can reduce to...



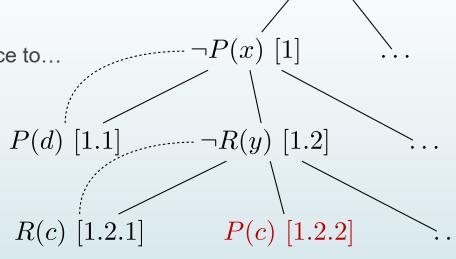
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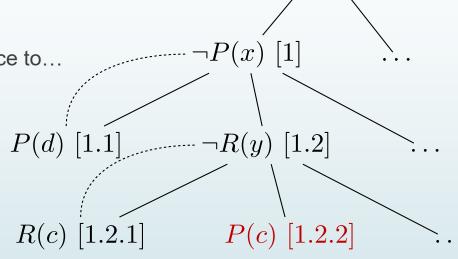


 $[\varepsilon]$

- lacktriangle Either P(c) can be extended **or** it reduces with anything above
 - $\blacksquare \neg \langle P(c)@1.2.2 \rangle \lor \neg Ext_1 \lor ... \lor \neg Ext_n \lor \neg \langle \neg P(x)@1 \rangle \lor \neg (x \mapsto c) \lor \neg \langle \neg R(y)@1.2 \rangle$
 - $\neg \langle \neg R(y)@1.2 \rangle$ is unnecessarily specific

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 - $\neg \langle \neg R(y)@1.2 \rangle$ is unnecessarily specific
- ightharpoonup We use auxiliary "could connect" literals $p_i \sim p_j$
 - $\blacksquare \neg \langle P(c)@1.2.2 \rangle \lor \neg Ext_1 \lor ... \lor \neg Ext_n \lor \neg \langle \neg P(x)@1 \rangle \lor \neg (x \mapsto c) \lor \mathbf{1.2.2} \sim \mathbf{1.2}$

Results - I

- Prototype hopCoP
- Compared against *meanCoP*

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Results - I

- Prototype hopCoP
- Compared against meanCoP
- Solved instances

	M2k	Miz40	MPTP - bushy	MPTP - chainy	ТРТР
hopCoP	1 050	13 040	589	203	4 026
meanCoP	795	7 592	480	157	3 578
meanCoP %	878	9 748	562	337	3 283

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Sounds way better than before!

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Results - II

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■ Extension steps for *PUZ005-1.p* (lower = better)

	Lvl. 1	Lvl. 2	Lvl. 3	Lvl. 4	Lvl. 5	Lvl. 6	Lvl. 7
hopCoP	1	4	89	495	2 309	10 066	48 517
meanCoP	1	4	24	108	535	9 963	6 445 008

CASC Participation

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► hopCoP participated in CASC30 [2025]

CASC Participation

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 - Random restart + random literal selection
 - Solved 88 out of 500 inputs

First-order Theorems	<u>Vampire</u>	Vampire	CSI Enig	<u>iProver</u>	<u>E</u>	<u>Drodi</u>	CSE E	cvc5	Zipperpin	Prover9	ConnectP	<u>hopCoP</u>	LisaTT	SPASS-SO	LastButN
	4.9	5.0	1.0.6	3.9.3	3.3.0	4.1.0	1.7	1.3.0	2.1.9999	1109a	0.6.1	0.1	0.9.1	0.1	0
Solved/500	466/500	455/500	402/500	367/500	364/500	325/500	295/500	290/500	267/500	119/500	102/500	88/500	3/500	11/500	0/500
Solutions/500	466/500	455/500	402/500	367/500	364/500	325/500	293/500	290/500	267/500	119/500	102/500	88/500	3/500	0/500	0/500

■ Not bad for a newcomer based on CC!

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 - Encode there is no parent to reduce

 - 1. Even harder to track violation



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