### Partial Regularization of First-Order Resolution **Proofs**

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### The Quest for Simple Proofs

"The 24th problem in my Paris lecture was to be: Criteria of simplicity, or proof of the greatest simplicity of certain proofs. Develop a theory of the method of proof in mathematics in general. Under a given set of conditions there can be but one simplest proof. Quite generally, if there are two proofs for a theorem, you must keep going until you have derived each from the other, or until it becomes quite evident what variant conditions (and aids) have been used in the two proofs. "

—David Hilbert [Thi03]



#### The 'Real World'

nature.com : Sitemap



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# Two-hundred-terabyte maths proof is largest ever

A computer cracks the Boolean Pythagorean triples problem — but is it really maths?

**Evelyn Lamb** 

26 May 2016

(See [HKM16])



## First-Order Proof Compression Motivation

 The best, most efficient provers, do not generate the best, least redundant proofs.

 Many compression algorithms for propositional proofs; few for first-order proofs.

 Finding a minimal proof is NP-hard, so use heuristics to find smaller proofs (see [FMP11])





#### Our Goal

Lifting propositional proof compression algorithms to first-order logic.

This work: LowerUnits [FMP11] and

 ${\tt RecyclePivotWithIntersection} \ [FMP11,BIFH^+08]$ 



# (Propositional) Proofs

#### Definition (Proof)

A directed acyclic graph  $\langle V, E, \Gamma \rangle$ , where

- V is a set of nodes
- E is a set of edges labeled by literals
- Γ (the proof clause) is inductively constructible using axiom and resolution nodes

#### Definition (Axiom)

A proof with a single node (so  $E = \emptyset$ )





# (Propositional) Resolution

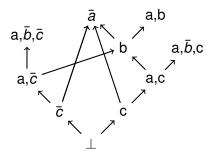
#### Definition (Resolution)

Given two proofs  $\psi_L$  and  $\psi_R$  with conclusions  $\Gamma_L$  and  $\Gamma_R$  with some literal I such that  $\overline{I} \in \Gamma_L$  and  $I \in \Gamma_R$ , the resolution proof  $\psi$  of  $\psi_L$  and  $\psi_R$  on I, denoted  $\psi = \psi_L \psi_R$  is such that:

- $\psi$ 's nodes are the union of the nodes of  $\psi_L$  and  $\psi_R$ , and a new root node
- there is an edge from  $\rho(\psi)$  to  $\rho(\psi_L)$  labeled with  $\bar{I}$
- there is an edge from  $\rho(\psi)$  to  $\rho(\psi_R)$  labeled with I
- $\psi$ 's conclusion is  $(\Gamma_L \setminus \{\bar{I}\}) \cup (\Gamma_R \setminus \{I\})$



## A Propositional Proof





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#### Deletion

#### Deletion of an edge

- The resolvent is replaced by the other premise
- Some subsequent resolutions may have to be deleted too

#### Deletion of a subproof $\psi$

- Deletion of every edge coming to  $\rho(\psi)$
- The operation is commutative and associative





#### First-Order Proofs

### Definition (First-Order Proof)

A directed acyclic graph  $\langle V, E, \Gamma \rangle$ , where

- V is a set of nodes
- E is a set of edges labeled by literals and substitutions
- Γ (the proof clause) is inductively constructible using axiom, (first-order) resolution, and contraction nodes

Axioms are unchanged





#### Substitutions and Unifiers

#### Definition (Substitution)

A mapping  $\{X_1 \setminus t_1, X_2 \setminus t_2, \ldots\}$  from variables  $X_1, X_2, \ldots$  to terms  $t_1, t_2, \ldots$ 

#### Definition (Unifier)

A substitution that makes two terms equal when applied to them.





# First-Order (Unifying) Resolution

### Definition (First-Order Resolution)

Given two proofs  $\psi_L$  and  $\psi_R$  with conclusions  $\Gamma_L$  and  $\Gamma_R$  with some literal I such that  $I_L \in \Gamma_L$  and  $I_R \in \Gamma_R$ , and  $\sigma_L$  and  $\sigma_R$  are substitutions usch that  $I_L \sigma_L = \overline{I_R} \sigma_R$ , and the variables in  $(\Gamma_L \setminus I_L) \sigma_L$  and  $(\Gamma_R \setminus I_R) \sigma_R$  are disjoint, then the resolution proof  $\psi$  of  $\psi_L$  and  $\psi_R$  on I, denoted  $\psi = \psi_L \psi_R$  is such that:

- $\psi$ 's nodes are the union of the nodes of  $\psi_L$  and  $\psi_R$ , and a new root node
- there is an edge from  $\rho(\psi)$  to  $\rho(\psi_L)$  labeled with  $I_L$  and  $\sigma_L$
- there is an edge from  $\rho(\psi)$  to  $\rho(\psi_R)$  labeled with  $I_R$  and  $\sigma_R$
- $\psi$ 's conclusion is  $(\Gamma_L \setminus I_L)\sigma_L \cup (\Gamma_R \setminus I_R)\sigma_R$



# Unifying Resolution Example

$$\eta_1 \colon p(a) \vdash \quad \eta_2 \colon q(Y,X) \vdash p(Y)$$

$$\psi \colon q(a,X) \vdash$$

$$\sigma = \{ \textit{Y} \rightarrow \textit{a} \}$$
 Refutation when  $\psi = \bot$ 





#### Contraction

#### **Definition (Contraction)**

If  $\psi'$  is a proof and  $\sigma$  is a unifier of  $\{I_1,\ldots,I_n\}\subset\Gamma'$ , then a contraction  $\psi$  is a proof where

- $\psi$ 's nodes are the union of the nodes of  $\psi'$  and a new node v
- There is an edge from  $\rho(\psi')$  to  $\nu$  labeled with  $\{l_1, \ldots, l_n\}$  and  $\sigma$
- The conclusion is  $(\Gamma' \setminus \{I_1, \dots, I_n\})\sigma \cup \{I\}$ , where  $I = I_k\sigma$  for  $k \in \{1, \dots, n\}$





## Contraction Example

$$\sigma = \{X \to a, Y \to f(b), Z \to f(b)\}$$



## **Contraction Example**

$$\eta_1$$
:  $p(X, Y), p(X, Z), p(U, V) \vdash q(Z)$ 

$$\uparrow \qquad \qquad \qquad \downarrow \\ \psi \colon p(X, Z) \vdash q(Z)$$

$$\sigma = \{ Y \to Z, U \to Z, V \to Z \}$$





### **Contraction Example**

$$\eta_1$$
:  $p(X, Y), p(a, Z), p(a, f(b)) \vdash q(Z)$ 

$$\uparrow \qquad \qquad \downarrow \qquad \qquad \qquad \psi$$
:  $p(X, Y), p(a, f(b)) \vdash q(f(b))$ 

 $\sigma = \{Z \to f(b)\}$ 





### **Lowering Units**

#### **Definition (Unit)**

A unit clause is a subproof with a conclusion clause (final clause) having exactly 1 literal

### Theorem ([FMP11])

A unit clause can always be lowered

Compression is achieved by delaying resolution with unit clause subproofs.





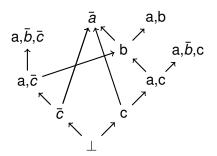
#### LowerUnits

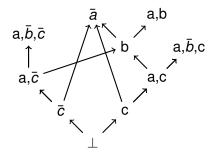
#### Two Traversals of the proof

- † Collect units with more than one resolvent
- \ Delete units and reintroduce them at the bottom of the proof



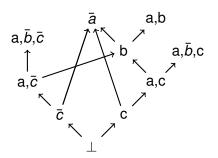


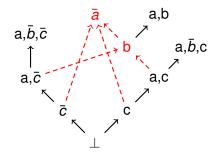






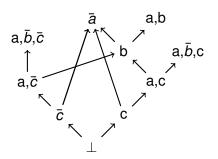


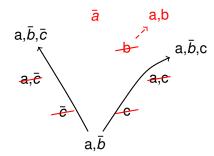






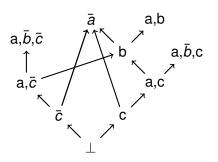






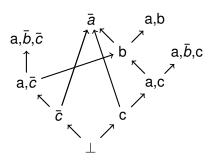






$$a, \bar{b}, \bar{c}$$
  $a, \bar{b}, c$   $a, \bar{b}$ 

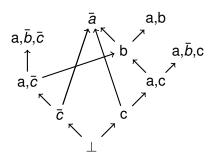




$$a, \bar{b}, \bar{c}$$
  $a, \bar{b}, c$   $a, \bar{b}$   $a, \bar{b}$   $a, \bar{b}$   $a, \bar{b}$   $a, \bar{b}$ 

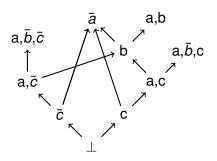






$$a, \bar{b}, \bar{c}$$
  $a, \bar{b}, c$   $a, \bar{b}$   $a, b$   $a, \bar{b}$   $a, \bar{b}$   $a, \bar{b}$   $a, \bar{c}$ 





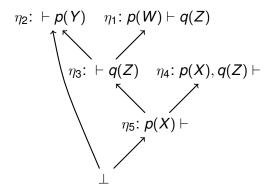
$$a, \bar{b}, \bar{c}$$
  $a, \bar{b}, c$ 

$$a, \bar{b}$$
  $a, b$ 

$$a \quad \bar{a}$$

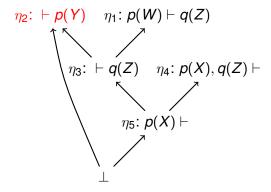
$$a \quad \bar{a}$$





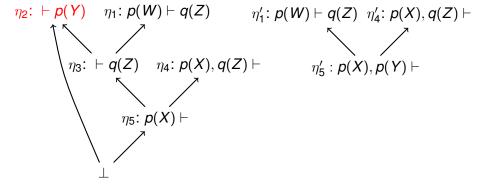


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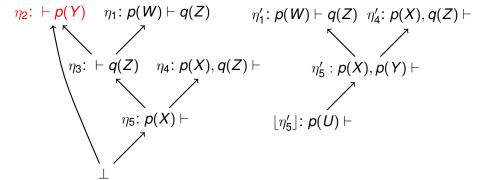


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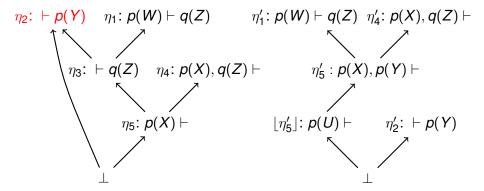






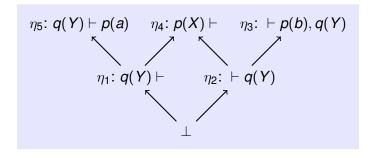




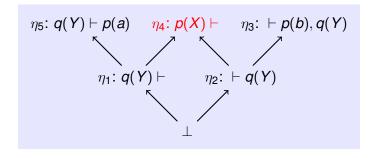




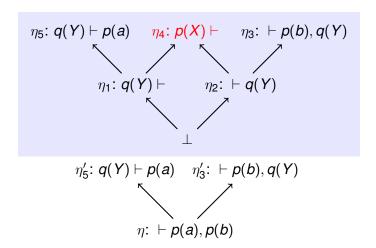






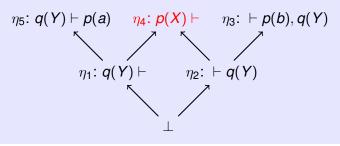












$$\eta_5'$$
:  $q(Y) \vdash p(a) \quad \eta_3'$ :  $\vdash p(b), q(Y)$ 

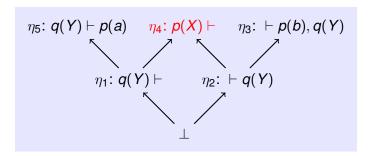
$$\eta \colon \vdash p(a), p(b)$$

$$\uparrow$$

$$\downarrow \eta \uparrow$$







### Definition (Pre-Deletion Property)

 $\eta$  unit,  $I \in \eta$ , such that I is resolved with literals  $I_1, \ldots, I_n$  in a proof  $\psi$ .  $\eta$  satisfies the *pre-deletion unifiability* property in  $\psi$  if  $I_1, \ldots, I_n$  and  $\bar{I}$  are unifiable.





$$\eta_1: r(Y), p(X, q(Y, b)), p(X, Y) \vdash$$
 $\eta_2: \vdash p(U, V)$ 
 $\eta_4: \vdash r(W)$ 
 $\eta_3: r(V), p(U, q(V, b)) \vdash$ 

$$\downarrow$$
 $\downarrow$ 



$$\eta_1: r(Y), p(X, q(Y, b)), p(X, Y) \vdash$$
 $\eta_2: \vdash p(U, V)$ 
 $\eta_4: \vdash r(W)$ 
 $\eta_3: r(V), p(U, q(V, b)) \vdash$ 

$$\downarrow$$
 $\downarrow$ 



$$\eta_4'$$
:  $\vdash r(W) \qquad \eta_1'$ :  $r(Y), p(X, q(Y, b)), p(X, Y) \vdash \eta_5'$ :  $p(X, q(W, b)), p(X, W) \vdash$ 





$$\eta_1$$
:  $r(Y)$ ,  $p(X, q(Y, b))$ ,  $p(X, Y) \vdash \eta_2$ :  $\vdash p(U, V)$ 
 $\eta_4$ :  $\vdash r(W) \qquad \eta_3$ :  $r(V)$ ,  $p(U, q(V, b)) \vdash \eta_5$ :  $p(U, q(W, b)) \vdash \chi$ 

$$\eta_{4}'$$
:  $\vdash r(W)$ 
 $\eta_{5}'$ :  $r(Y), p(X, q(Y, b)), p(X, Y) \vdash$ 
 $\eta_{5}'$ :  $p(X, q(W, b)), p(X, W) \vdash$ 
 $\eta_{5}'$ 





$$\eta_1: r(Y), p(X, q(Y, b)), p(X, Y) \vdash$$
 $\eta_2: \vdash p(U, V)$ 
 $\eta_4: \vdash r(W)$ 
 $\eta_3: r(V), p(U, q(V, b)) \vdash$ 

$$\downarrow$$

#### Definition (Post-Deletion Property)

 $\eta$  unit,  $I \in \eta$ , such that I is resolved with literals  $I_1, \ldots, I_n$  in a proof  $\psi$ .  $\eta$  satisfies the *post-deletion unifiability* property in  $\psi$  if  $I_1^{\dagger\downarrow}, \ldots, I_n^{\dagger\downarrow}$  and  $\overline{I^{\dagger}}$  are unifiable, where  $I^{\dagger}$  is the literal in  $\psi' = \psi \setminus \{\eta\}$  corresponding to I in  $\psi$ , and  $I^{\dagger\downarrow}$  is the descendant of  $I^{\dagger}$  in the roof of  $\psi'$ .



# First-Order Lower Units Challenges

- Deletion changes literals
- Unit collection depends on whether contraction is possible after propagation down the proof

Deletion of units require knowledge of proof after deletion, and deletion depends on what will be lowered.

- $O(n^2)$  solution to have full knowledge
- Difficult bookkeeping required for implementation





# Greedy First-Order Lower Units - A Quicker Alternative

- Ignore post-deletion satisfaction
- Focus on pre-deletion satisfaction
- Greedy contraction





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Faster run-time (linear; one traversal) Easier to implement





# Greedy First-Order Lower Units - A Quicker Alternative

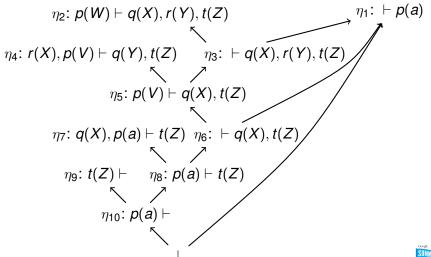
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Easier to implement

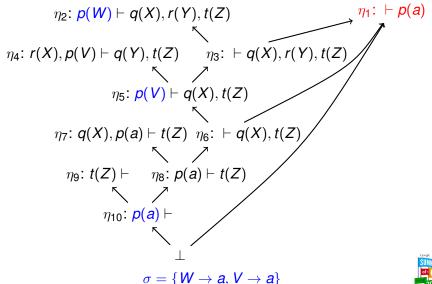
Doesn't always compress (returns original proof sometimes)

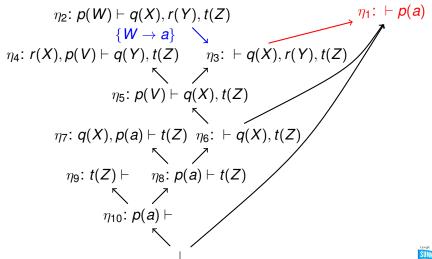


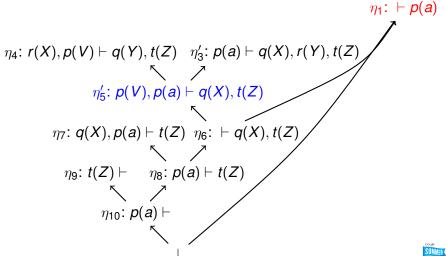




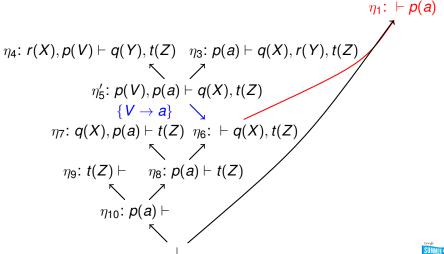




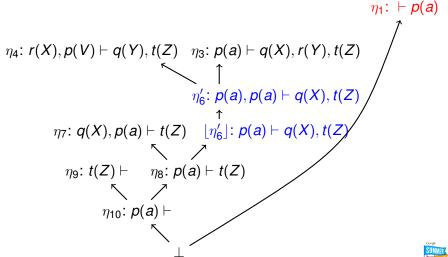


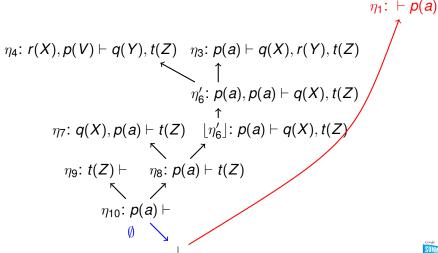










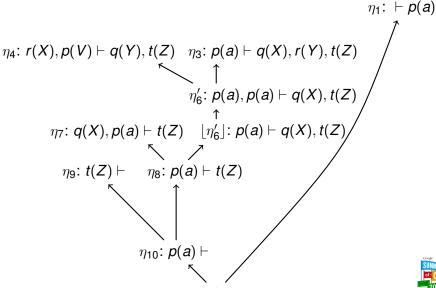




$$\eta_1$$
:  $\vdash p(a)$ 

$$\eta_4$$
:  $r(X)$ ,  $p(V) \vdash q(Y)$ ,  $t(Z)$   $\eta_3$ :  $p(a) \vdash q(X)$ ,  $r(Y)$ ,  $t(Z)$ 
 $\uparrow$ 
 $\eta'_6$ :  $p(a)$ ,  $p(a) \vdash q(X)$ ,  $t(Z)$ 
 $\uparrow$ 
 $\eta_7$ :  $q(X)$ ,  $p(a) \vdash t(Z)$   $\downarrow \eta'_6 \rfloor$ :  $p(a) \vdash q(X)$ ,  $t(Z)$ 
 $\uparrow$ 
 $\eta_9$ :  $t(Z) \vdash \eta_8$ :  $p(a) \vdash t(Z)$ 







# **Recycling Pivots**

Removes *irregularities*: inferences  $\eta$  where the pivot occurs as a pivot of another inference below  $\eta$  on the path to the root

- Store a set of *safe*  $S(\eta)$  literals for each node  $\eta$
- If there are multiple paths, take intersection of safe literals
- Bottom-up: compute safe literals; mark deletions
- Top-down: regularize





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#### Regularization Can Be Bad

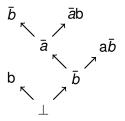
Resolution without irregularities is still complete. But:

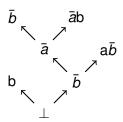
#### Theorem ([Tse70])

There are unsatisfiable formulas whose shortest regular resolution refutations are exponentially longer than their shortest unrestricted resolution refutations.

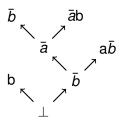


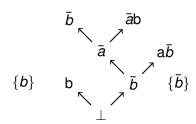




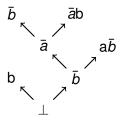


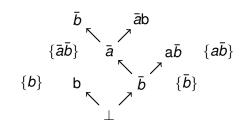




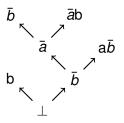


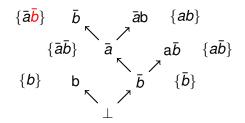




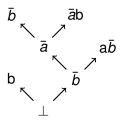


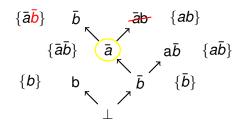




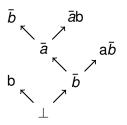


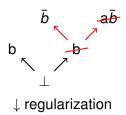






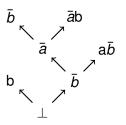


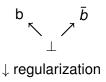














#### Pre-Regularization Checks I

$$\eta_{1} : \vdash p(W,X) \qquad \eta_{2} : p(W,X) \vdash q(c) \\
\{\vdash q(c), p(a,X)\} \qquad \qquad \{p(W,X) \vdash q(c), p(a,X)\} \\
\eta_{3} : \vdash q(c) \qquad \qquad \eta_{4} : q(c) \vdash p(a,X) \\
\{\vdash q(c), p(a,X)\} \qquad \qquad \qquad \{q(c) \vdash p(a,X)\} \\
\eta_{6} : p(Y,b) \vdash \qquad \qquad \qquad \qquad \qquad \{p(Y,b) \vdash \} \qquad \qquad \qquad \qquad \{\vdash p(a,X)\} \\
\sigma = \{W \to a\} \implies \sigma \eta_{1} \in \mathcal{S}(\eta_{1})$$





## Pre-Regularization Checks I

$$\eta_{6}: p(Y,b) \vdash \eta_{1}: \vdash p(W,X)$$

$$\sigma = \{W \to Y, X \to b\}$$





## Pre-Regularization Checks II

$$\eta_{1} : \vdash p(W, c) \qquad \eta_{2} : p(W, X) \vdash q(c) \\
\{\vdash q(c), p(a, X)\} \qquad \qquad \{p(W, X) \vdash q(c), p(a, X)\} \\
\eta_{3} : \vdash q(c) \qquad \qquad \eta_{4} : q(c) \vdash p(a, X) \\
\{\vdash q(c), p(a, X)\} \qquad \qquad \qquad \{q(c) \vdash p(a, X)\} \\
\eta_{6} : p(Y, b) \vdash \qquad \qquad \qquad \downarrow \qquad \{\vdash p(a, X)\} \\
\{p(Y, b) \vdash \} \qquad \qquad \downarrow \qquad \qquad \{\vdash p(a, X)\} \\
\sigma = \{W \to a, X \to c\} \implies \sigma \eta_{1} \in \mathcal{S}(\eta_{1})$$
but...





# Pre-Regularization Checks II

$$\eta_6$$
:  $p(Y,b) \vdash \eta_1$ :  $\vdash p(c,a)$ 

no  $\sigma!$ 



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# Pre-Regularization Unifiability

#### Definition

Let  $\eta$  be a node with pivot  $\ell'$  unifiable with safe literal  $\ell$  which is resolved against literals  $\ell_1, \ldots, \ell_n$  in a proof  $\psi$ .  $\eta$  is said to satisfy the *pre-regularization unifiability property* in  $\psi$  if  $\ell_1, \ldots, \ell_n$ , and  $\bar{\ell}'$  are unifiable.





# Post-Regularization Checks

$$\eta_1 \colon p(U,V) \vdash q(f(a,V),U)$$
  $\eta_2 \colon q(f(a,X),Y), q(T,X) \vdash q(f(a,Z),Y)$ 

$$\eta_4 \colon \vdash q(R,S)$$

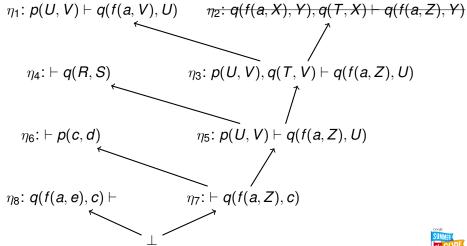
$$\eta_5 \colon p(U,V) \vdash q(f(a,Z),U)$$

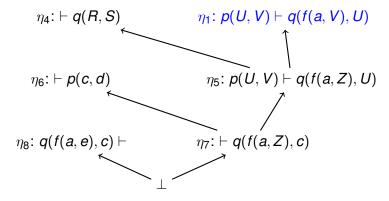
$$\eta_6 \colon \vdash p(c,d)$$

$$\eta_7 \colon \vdash q(f(a,Z),c)$$

$$\mathcal{S}(\eta_3) = \{q(T,V), p(c,d) \vdash q(f(a,e),c)\}$$

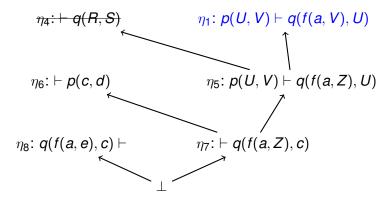
## Post-Regularization Checks



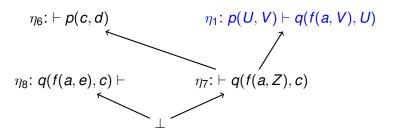






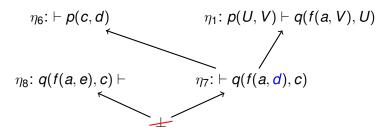
















# Regularization Unifiability

#### Definition

Let  $\eta$  be a node with safe literals  $S(\eta) = \phi$  that is marked for regularization with parents  $\eta_1$  and  $\eta_2$ , where  $\eta_2$  is marked as a deletedNode in a proof  $\psi$ .  $\eta$  is said to satisfy the regularization *unifiability property* in  $\psi$  if there exists a substitution  $\sigma$  such that  $\eta_1 \sigma \subseteq \phi$ .





### First-Order RPI

- Traverse bottom up, collect safe literals (apply unifiers to pivots), check pre-regularization property
- Traverse top-down, check regularization property



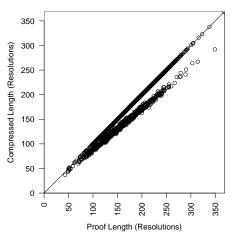


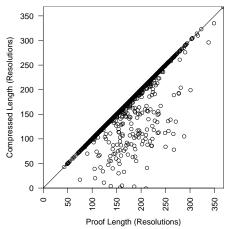
# **Experiment Setup**

- Greedy First-Order Lower Units, Recycle Pivots With Intersection implemented as part of Skeptik (in Scala)
- > 2400 randomly generated resolution proofs
- minutes to generate, seconds to compress



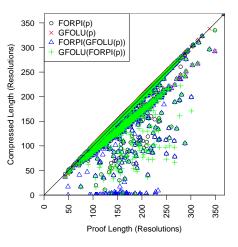
## Results

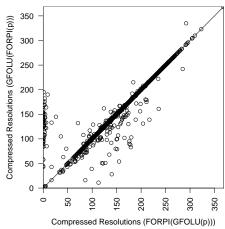






## Results







## Results I

#### Percent of proofs compressed:

• LU(p): 36%

• RPI(p): 9%

• RPI(LU(p)): 43%

• LU(RPI(p)): 42%





## Results II

### Successful cumulative compression ratio:

• LU(p): 0.95

• RPI(p): 0.72

RPI(LU(p)): 0.85

• LU(RPI(p)): 0.89





### Conclusion

- Two simple, quick algorithms lifted from propositional to first-order logic for proof compression
  - LowerUnits compresses more often
  - RPI compresses more
- Future work:
  - Explore other proof compression algorithms?
  - Explore ways of dealing with the post-deletion property quickly

# Thank you for your attention. Any questions?

- Source code: https://github.com/jgorzny/Skeptik
- Data: https://cs.uwaterloo.ca/~jgorzny/data/





## References I

- Omer Bar-Ilan, Oded Fuhrmann, Shlomo Hoory, Ohad Shacham, and Ofer Strichman, *Linear-time reductions of resolution proofs*, Haifa Verification Conference, Springer, 2008, pp. 114–128.
- Pascal Fontaine, Stephan Merz, and Bruno Woltzenlogel Paleo, Compression of propositional resolution proofs via partial regularization, International Conference on Automated Deduction, Springer, 2011, pp. 237–251.
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### To-do



