

# **The Model Evolution Calculus**

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*Based on slides by Peter Baumgartner*

# Background

- An effective method for SAT was pioneered by Davis, Putman, Logemann, and Loveland (DPLL).
- The best modern SAT solvers (MiniSat, zChaff, Berkmin,...) are based on DPLL.
- FDPLL lifts DPLL to first-order but still does not emulate DPLL faithfully.

# What is the ME

The **M**odel **E**volution Calculus (ME)

≈

First-Order DPLL

+ DPLL's simplification rules

+ Universal variables

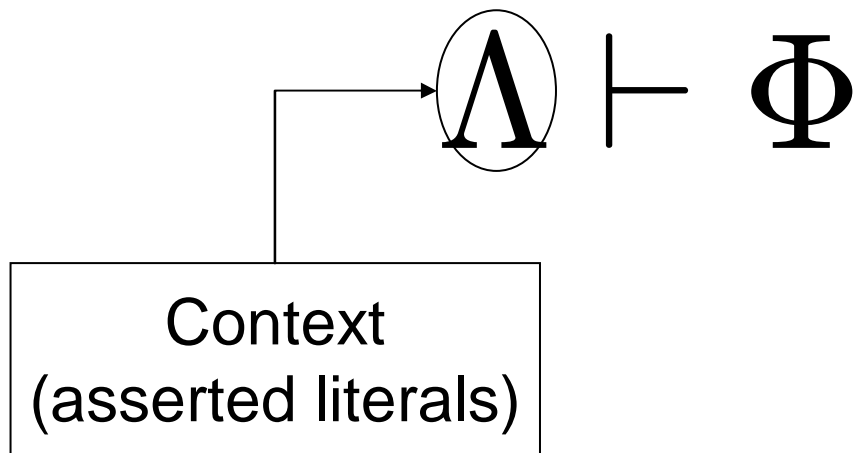
The calculus is a direct lifting of the **whole DPLL** to the first-order level.

# Overview

- The DPLL method as a sequent-style calculus
- The Model Evolution calculus as a lifting of the DPLL calculus
- Properties of the ME calculus
- Implementation

# The DPLL Calculus

$$\Lambda = \{\textit{literals}\} \quad \Phi = \{\textit{clauses}\}$$



# DPLL Calculus (cont.)

- If we want to prove that  $\Phi$  is (un)satisfiable, we start with the sequent  $\emptyset \vdash \Phi$
- By the successive application of inference rules we try to obtain either that

$\Lambda \vdash \emptyset$  ( $\Phi$  is SAT and  $\Lambda$  is a model)

or

$\Lambda \vdash \square$  ( $\Phi$  is UNSAT)

# The DPLL Calculus

$\Lambda = \{\textit{literals}\}$

$\Phi = \{\textit{clauses}\}$

$L$  literal

$\square$  empty clause

$C$  clause

The Split rule:

$$\frac{\Lambda \vdash \Phi, L \vee C}{\Lambda, L \vdash \Phi, L \vee C \quad \Lambda, \bar{L} \vdash \Phi, L \vee C}$$

if

$$\begin{cases} C \neq \square, \\ L \notin \Lambda, \bar{L} \notin \Lambda \end{cases}$$

# The DPLL Calculus

$\Lambda = \{\textit{literals}\}$

$\Phi = \{\textit{clauses}\}$

$L$  literal

$\square$  empty clause

$C$  clause

(subsume)  $\frac{\Lambda \vdash \Phi, L \vee C}{\Lambda \vdash \Phi}$  if  $L \in \Lambda$

(resolve)  $\frac{\Lambda \vdash \Phi, L \vee C}{\Lambda \vdash \Phi, C}$  if  $\bar{L} \in \Lambda$

(close)  $\frac{\Lambda \vdash \Phi, L_1 \vee \dots \vee L_n}{\Lambda \vdash \square}$  if  $\bar{L}_1, \dots, \bar{L}_n \in \Lambda$



# The DPLL Calculus (cont.)

$\Lambda = \{\textit{literals}\}$

$\Phi = \{\textit{clauses}\}$

$L$  literal

$\square$  empty clause

$C$  clause

The Assert rule:

$$\frac{\Lambda \vdash \Phi, L}{\Lambda, L \vdash \Phi, L} \text{ if } \begin{cases} L \notin \Lambda, \\ \bar{L} \notin \Lambda \end{cases}$$

# The DPLL Calculus: Key Insight

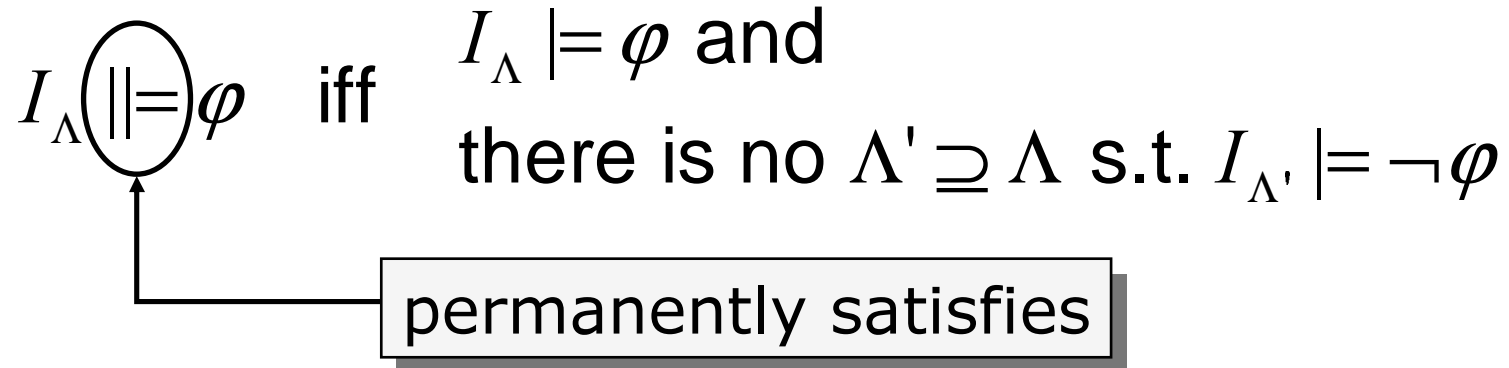
$$\Lambda \vdash \Phi$$

$\Lambda$  can be seen as a finite representation of a Herbrand interpretation:

$$I_\Lambda = \{L \in \Lambda \mid L \text{ is positive}\}$$

If  $I_\Lambda$  does not satisfy  $\Phi$ ,  
“repair” it by adding literals to  $\Lambda$

# Some Notation



Examples:

$$I_{\{p\}} \models \neg p \vee \neg q \quad \text{but not} \quad I_{\{p\}} \models \neg p \vee \neg q$$

$$I_{\{\neg p\}} \models \neg p \vee \neg q \quad \text{and} \quad I_{\{\neg p\}} \models \neg p \vee \neg q$$

# An alternative Split Rule

$$\text{(split)} \quad \frac{\Lambda \vdash L \vee C, \Phi}{\Lambda, L \vdash L \vee C, \Phi \quad \Lambda, \bar{L} \vdash L \vee C, \Phi} \text{ if } (*)$$

$$(*) = \begin{cases} 1) \text{ not } I_{\Lambda} \models L \vee C \\ 2) L \text{ not contradictory with } \Lambda \\ 3) \bar{L} \text{ not contradictory with } \Lambda \end{cases}$$

# The DPLL Calculus Revisited: A Model Evolution View

$$\text{(resolve)} \quad \frac{\Lambda \vdash \Phi, L \vee C}{\Lambda \vdash \Phi, C} \quad \text{if } I_\Lambda \models \bar{L}$$

# Lifting DPLL to First Order Logic

## Main questions:

- How to represent Herbrand models. (we already know that)
- How to check  $\models$
- How to check  $\models$
- How to repair an interpretation

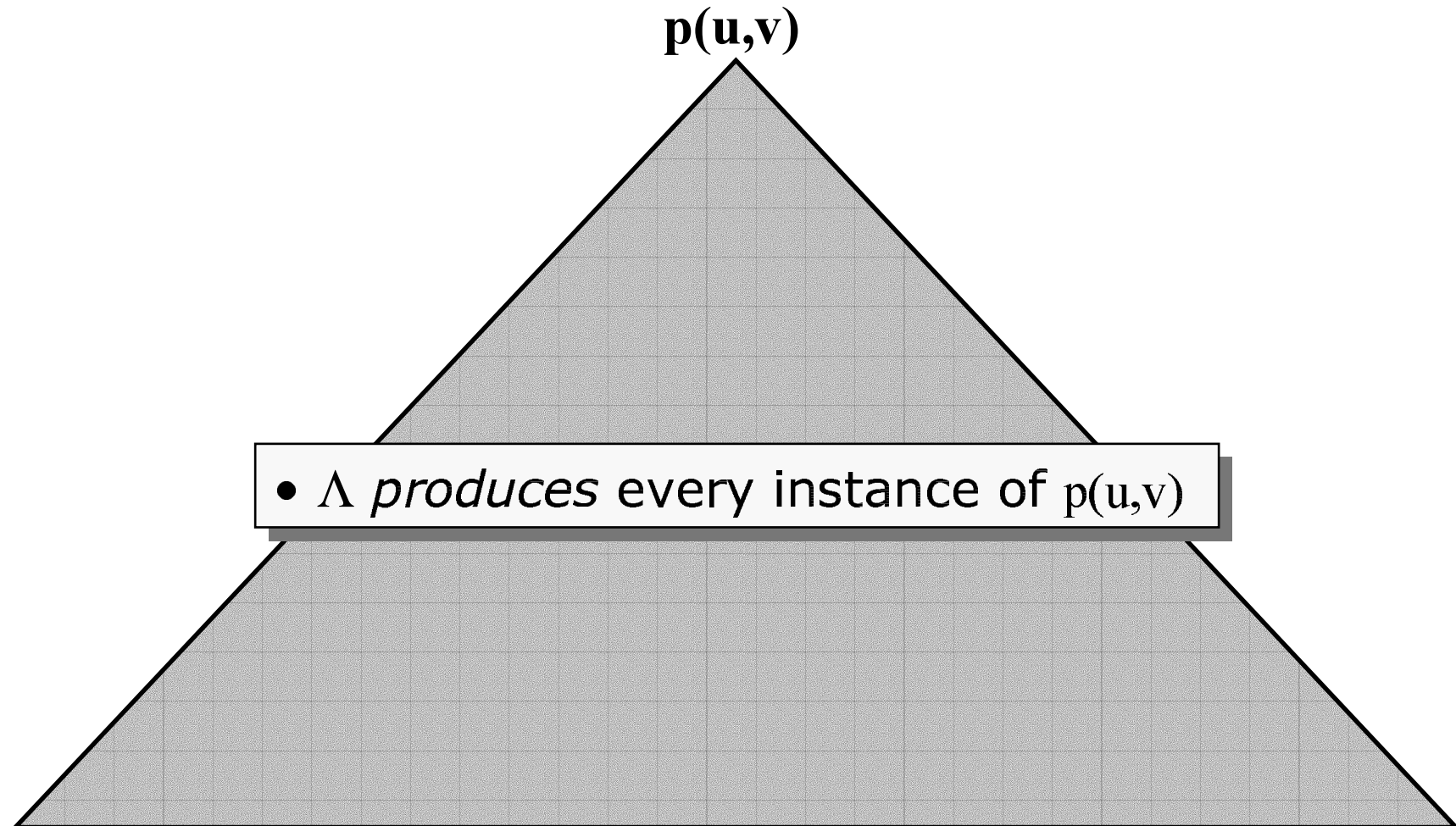
# First-order Contexts

Sets  $\Lambda$  of parametric literals  $L(u,v,..)$  and  
universal literals  $L(x,y,...)$

- parameters  $(u,v, ...)$  and variables  $(x,y,....)$   
both stand for ground terms
- (roughly) a parametric literal  $L$  in  $\Lambda$   
denotes all of its ground instances,  
unless  $\neg L' \in \Lambda$  for some instance  $L'$  of  $L$
- a universal literal denotes all of its  
ground instances, unconditionally

# First-order Contexts: Examples

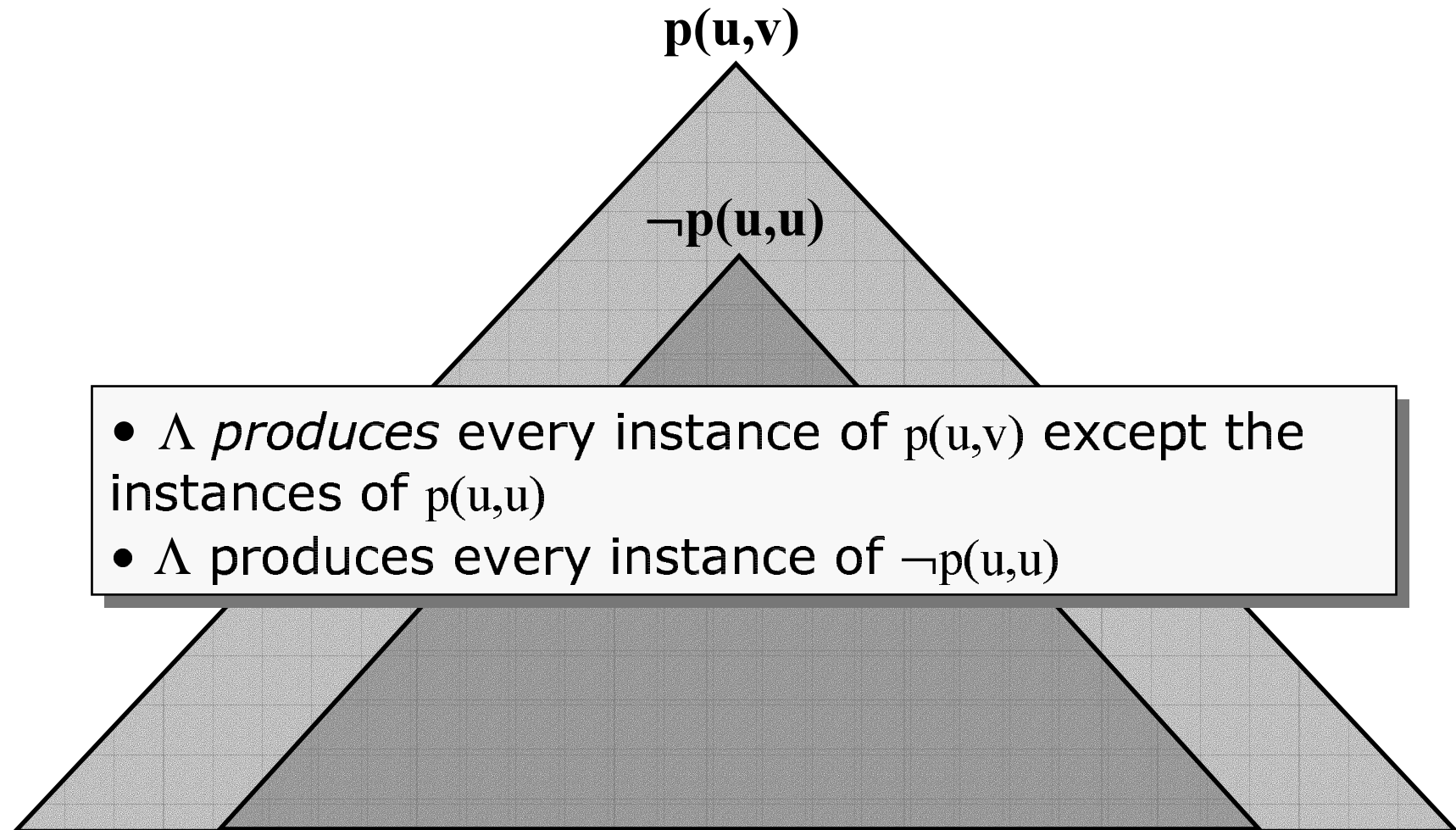
$$\Lambda = \{ p(u,v) \}$$





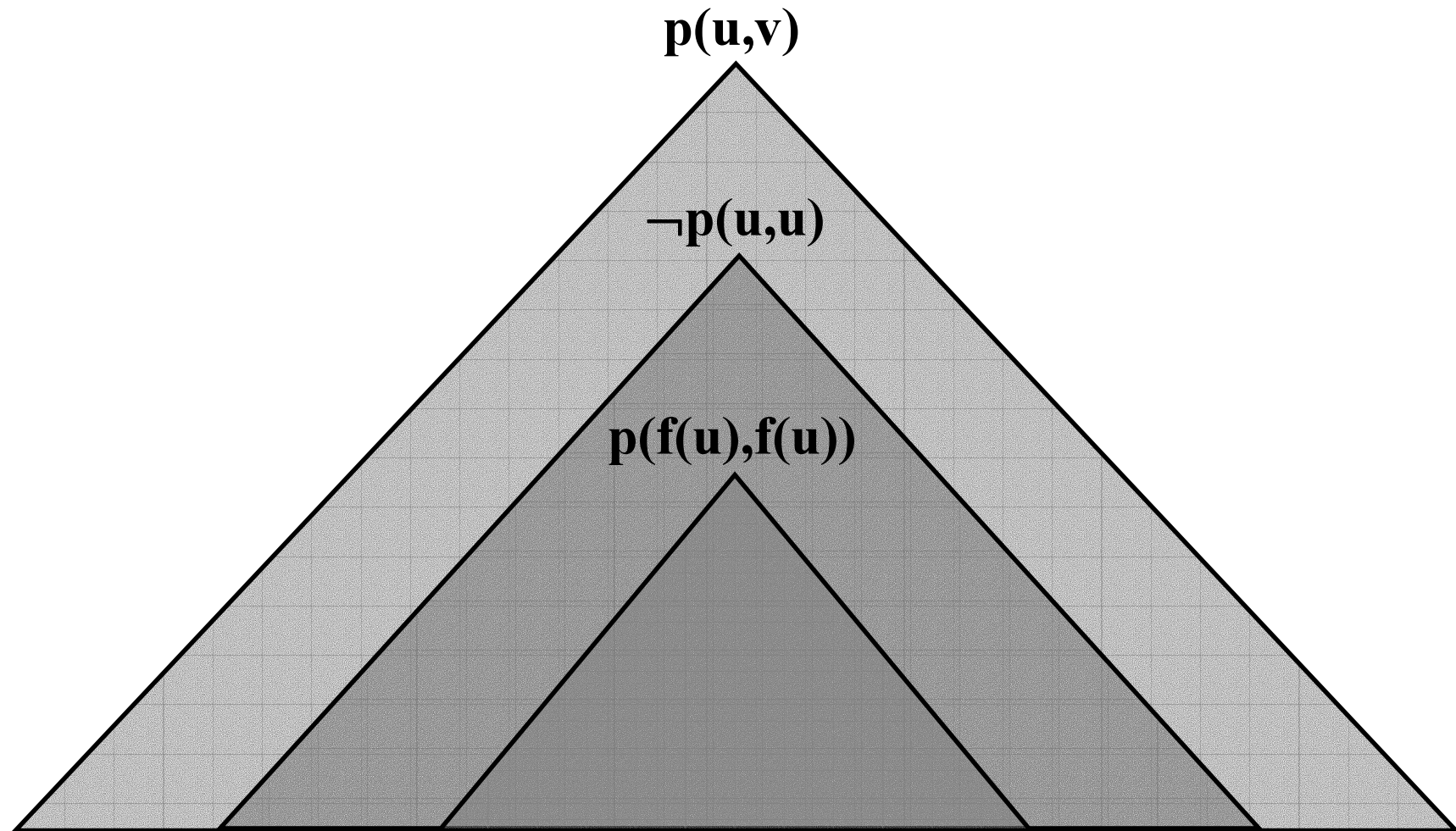
# First-order Contexts: Examples

$$\Lambda = \{p(u,v), \neg p(u,u)\}$$



# First-order Contexts: Examples

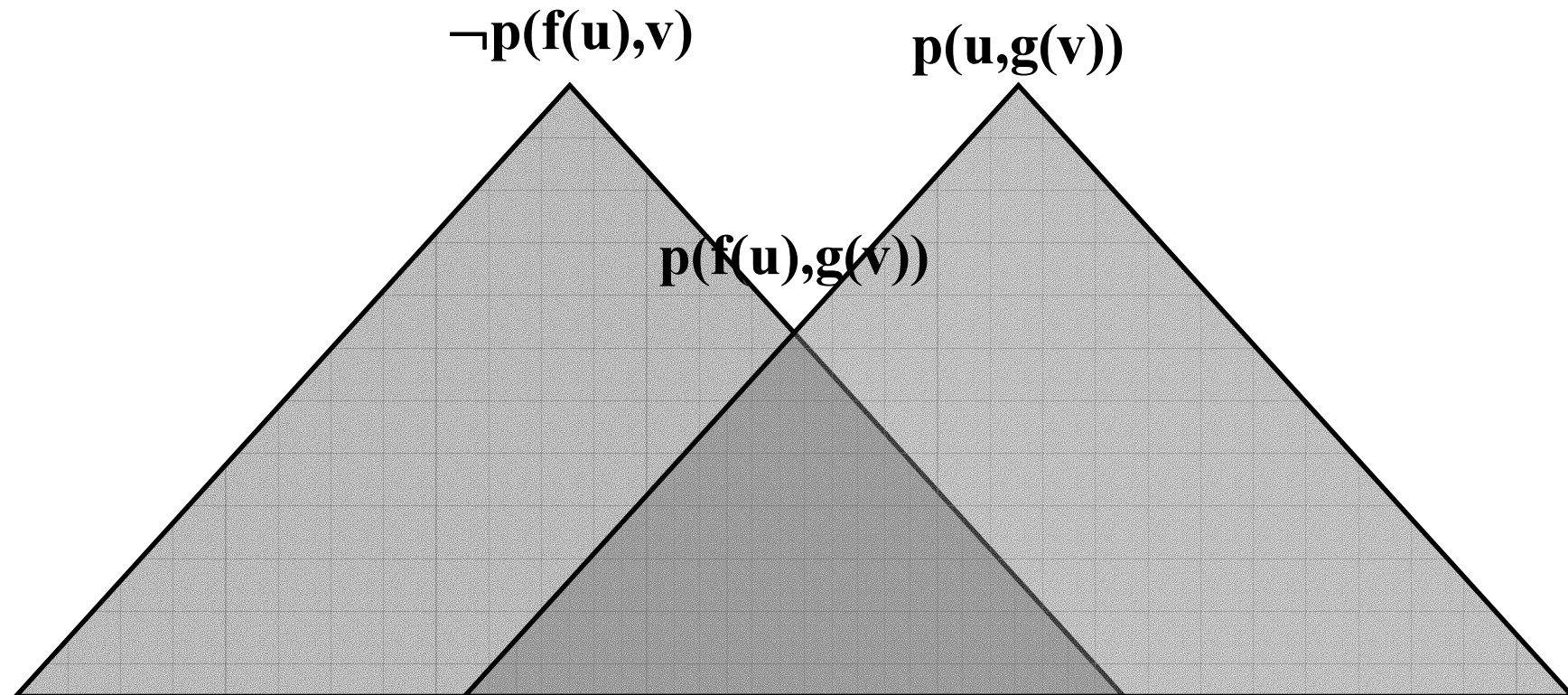
$$\Lambda = \{p(u,v), \neg p(u,u), p(f(u),f(u))\}$$



# First-order Contexts: Examples

$$\Lambda = \{\neg p(f(u),v), p(u,g(v))\}$$

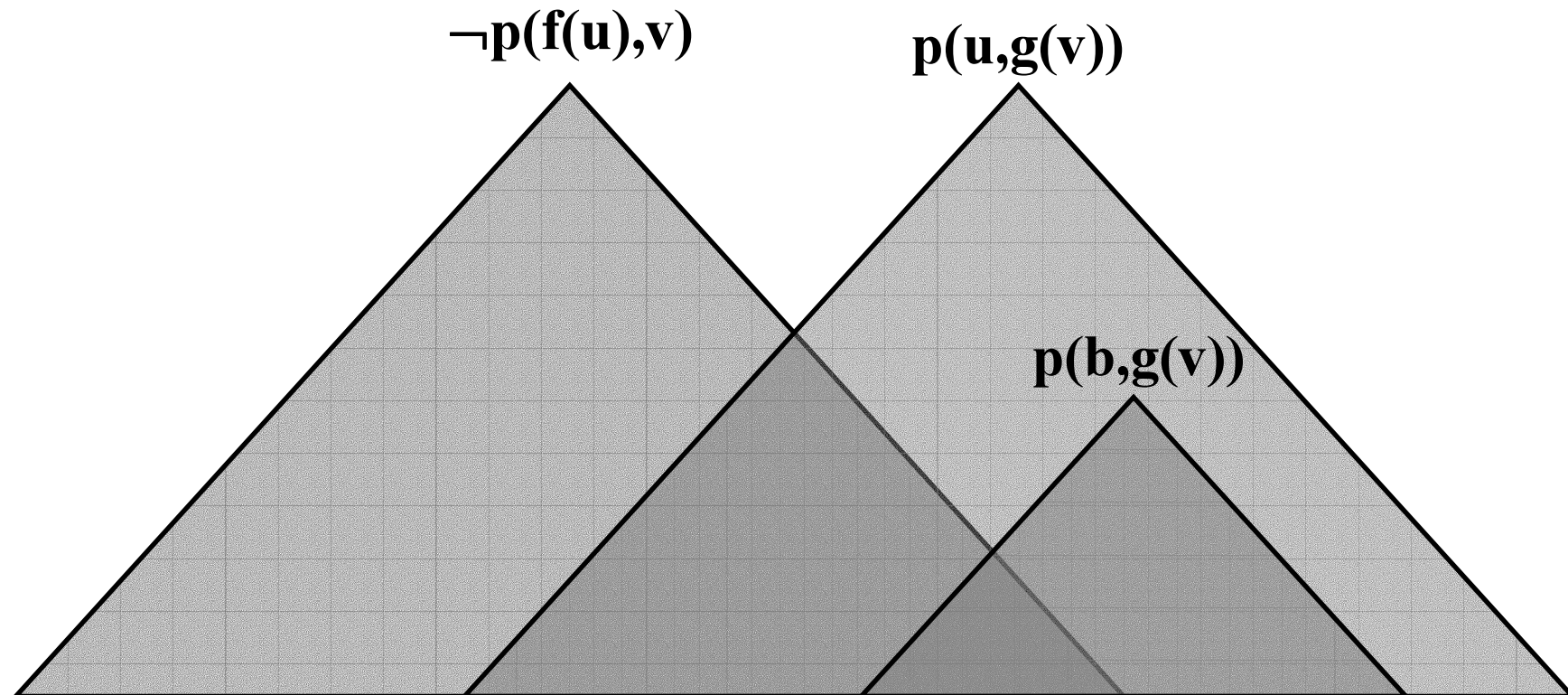
OK



# First-order Contexts: Examples

$$\Lambda = \{ \neg p(f(u), v), p(u, g(v)), p(b, g(v)) \}$$

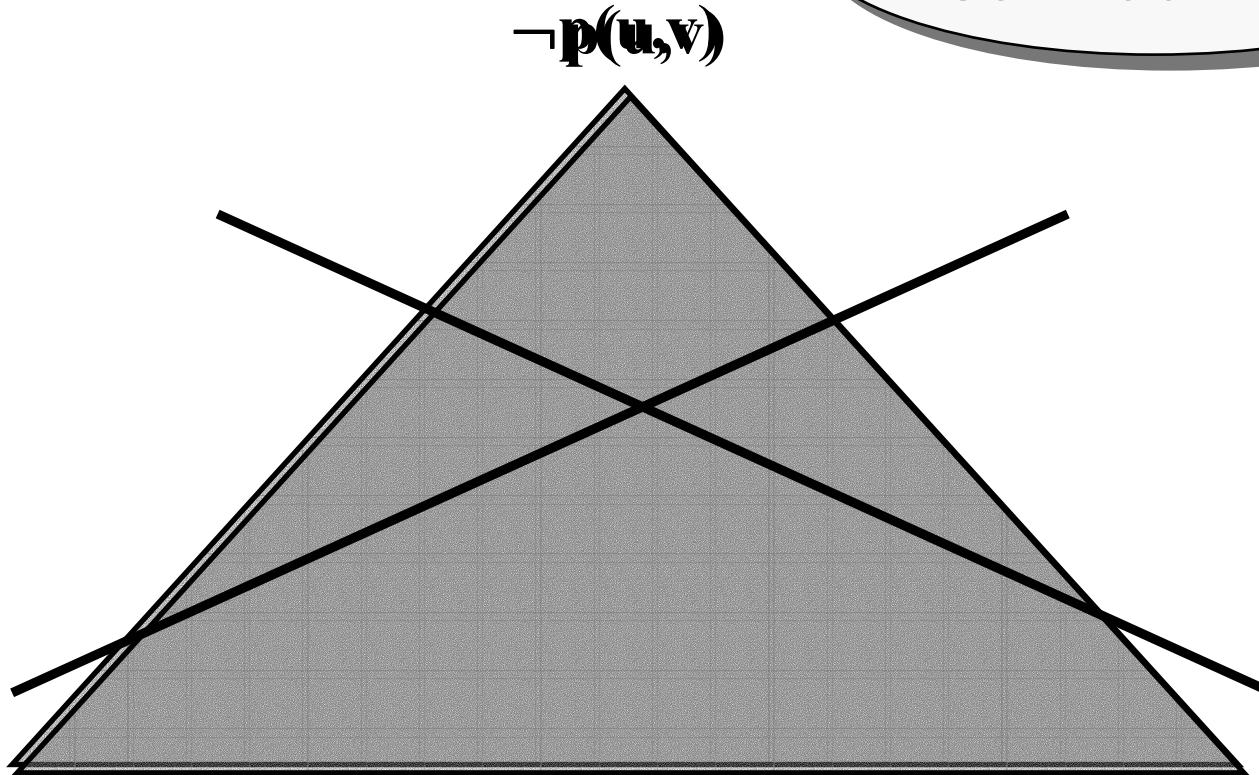
OK



# First-order Contexts: Examples

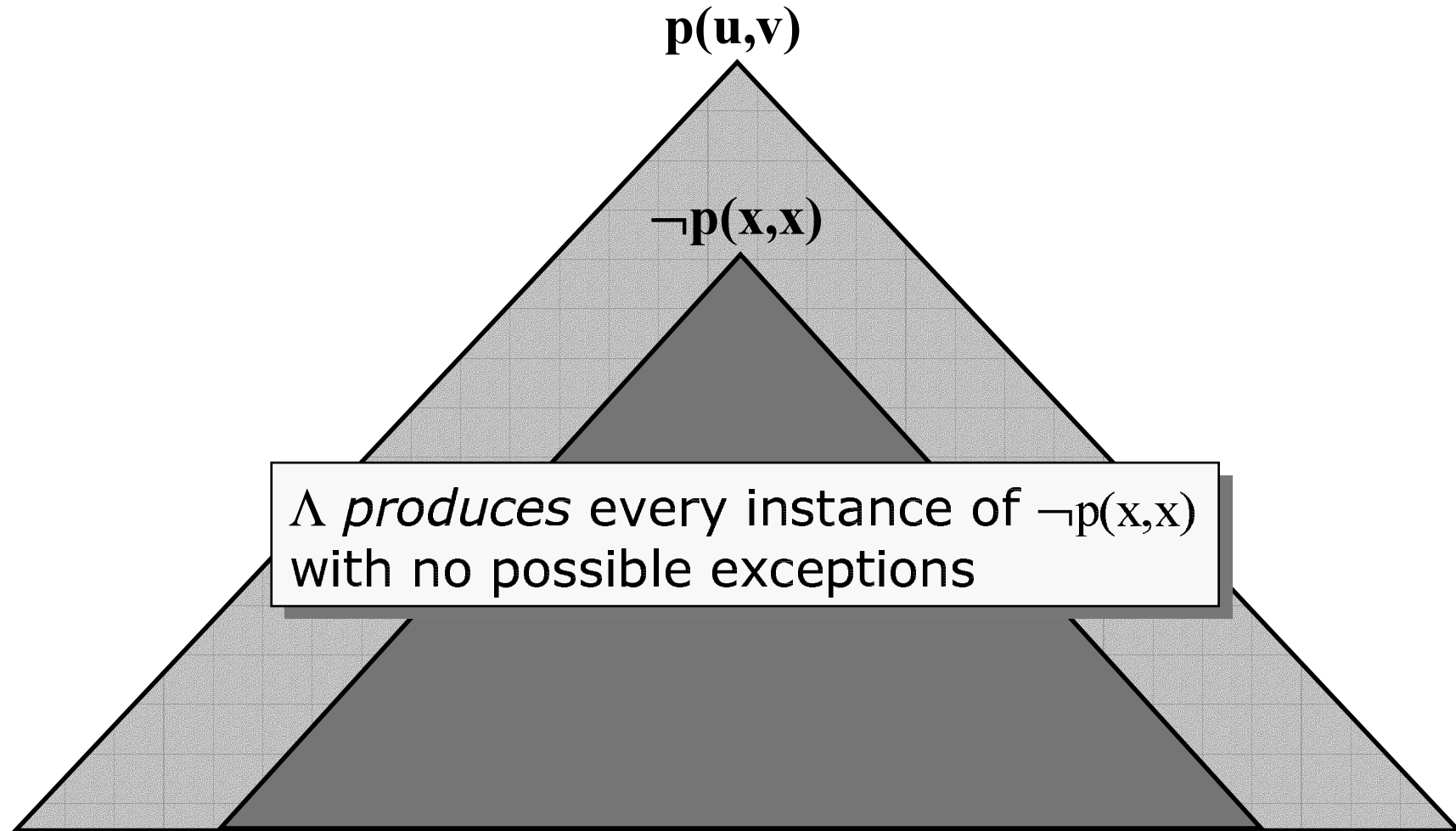
$$\Lambda = \{\neg p(u,v), p(u,v)\}$$

Not OK!  
Contradictory



# First-order Contexts: Examples

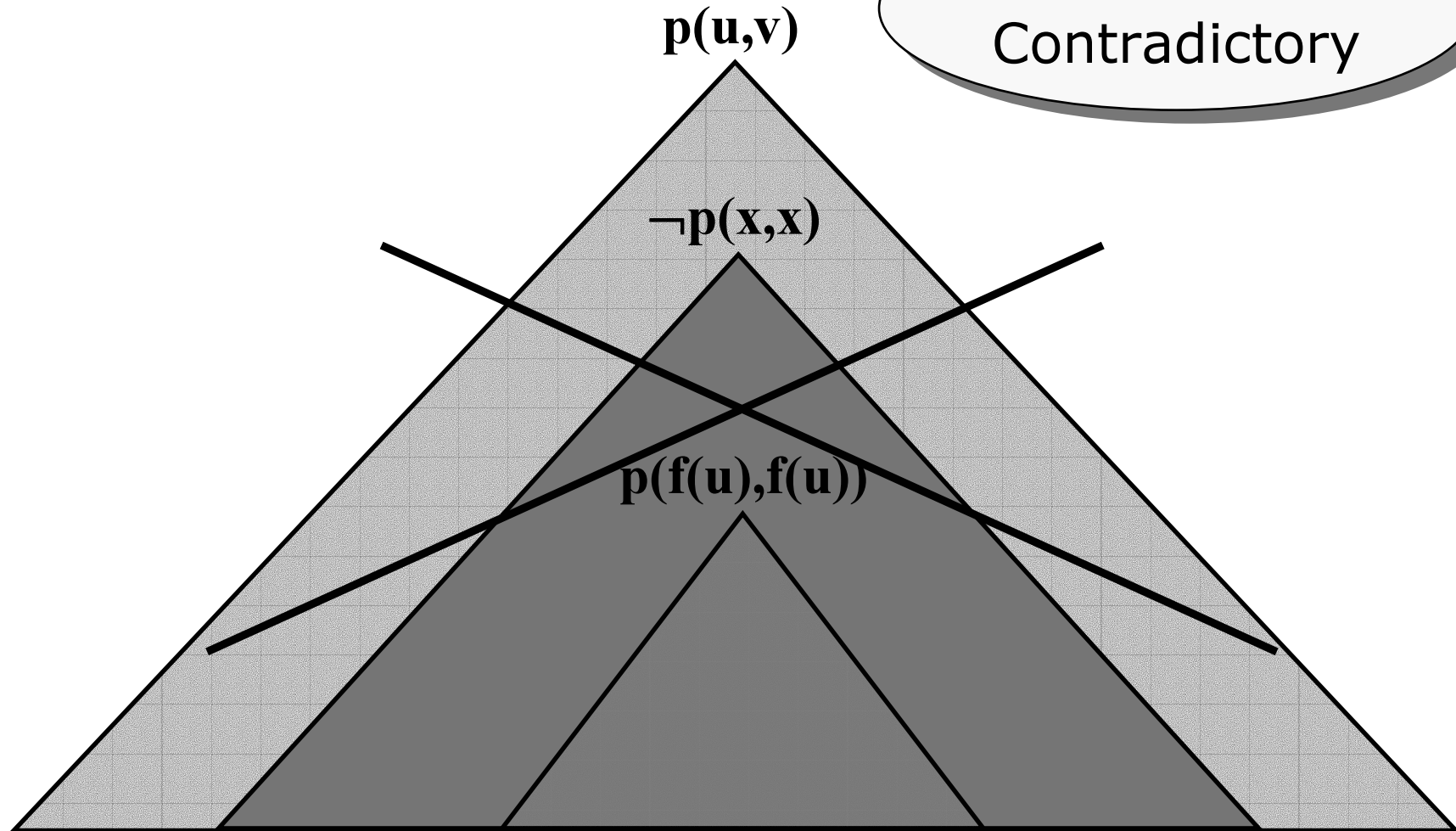
$$\Lambda = \{p(u,v), \neg p(x,x)\}$$



# First-order Contexts: Examples

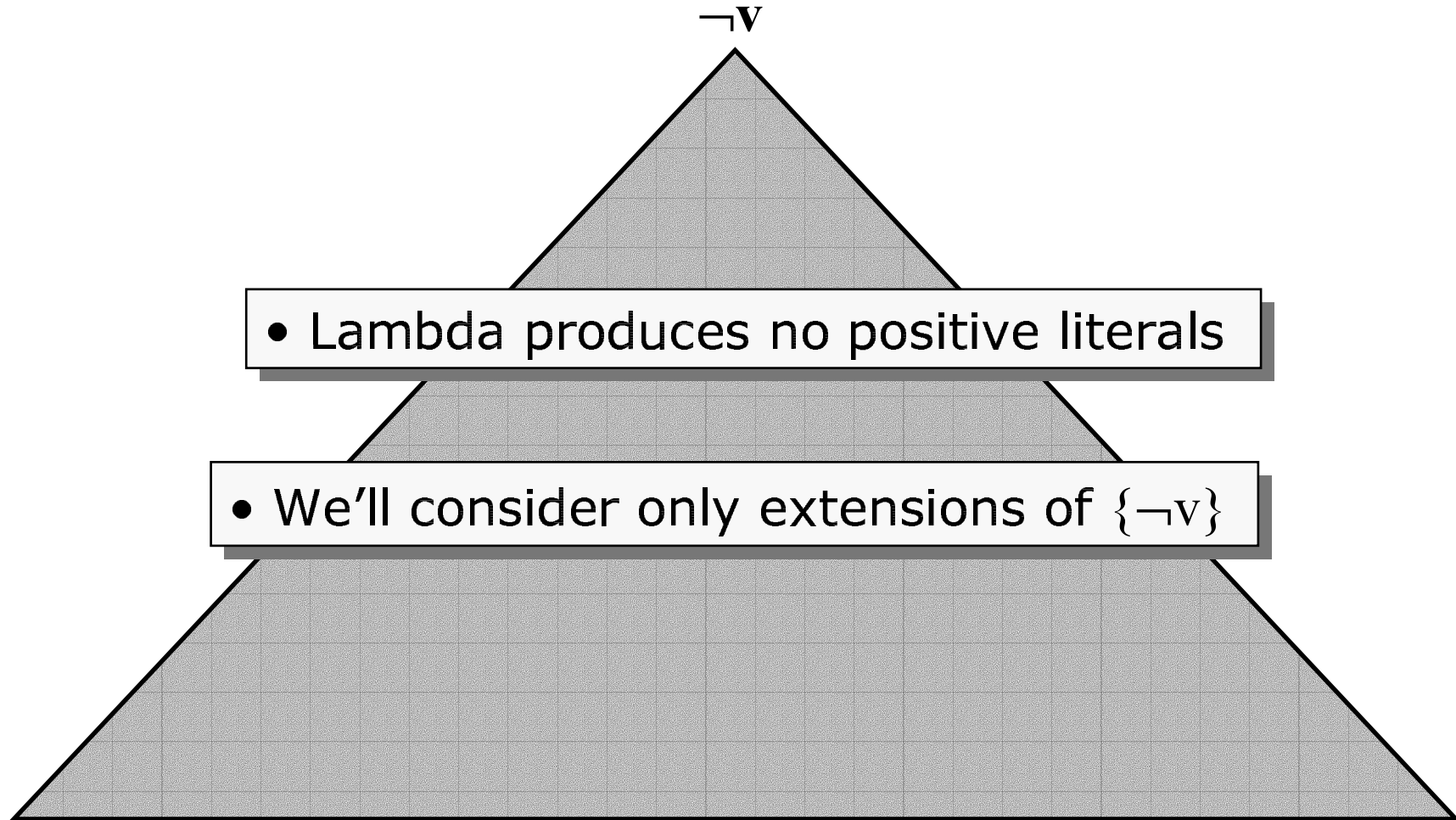
$$\Lambda = \{p(u,v), \neg p(x,x), p(f(u),f(u))\}$$

Not OK!  
Contradictory



# Initial Context

$$\Lambda = \{\neg v\}$$





# Contexts and Interpretations

Let  $\Lambda$  be a non-contradictory context with parametric literals and universal literals

$\Lambda$  denotes a Herbrand interpretation:

$$I_{\Lambda} = \left\{ L \mid \begin{array}{l} L \text{ is ground and positive,} \\ L \text{ is produced by } \Lambda \end{array} \right\}$$

# Checking $\models$

Let  $\Lambda$  be a non-contradictory context

Let  $L_1 \vee \dots \vee L_n$  be a (parameter-free) clause

If not  $I_\Lambda \models L_1 \vee \dots \vee L_n$  then

there are fresh variants  $K_1, \dots, K_n$  of literals in  $\Lambda$

and a substitution  $\sigma$

such that

$\sigma$  is a simultaneous mgu of  $\{K_1, \overline{L_1}\}, \dots, \{K_n, \overline{L_n}\}$

If  $K_i$  produces  $(\overline{K_i}\sigma) \notin \mathcal{B}$  ~~is productive~~

$L_i\sigma$  is part of the **remainder** of  $C$

- $\sigma$  is called a *context unifier* (of the clause against  $\Lambda$ )

# Context Unifiers: an example

Let  $\Lambda = \{\neg v, p(v_1, u_1), \neg p(x_1, g(x_1)), q(v_2, g(v_2))\}$

$$C = r(x) \vee \neg p(x, y)$$

The substitution  $\sigma = \{v \rightarrow r(v_1), x \rightarrow v_1, y \rightarrow u_1\}$   
is a context unifier of  $C$  against  $\Lambda$

The remainder is  $r(v_1) \vee \neg p(v_1, u_1)$

A context unifier is **admissible for Split** if all literals in the remainder are parameter-free or variable-free. Moreover, they must not share variables

# Checking $\models$ (not sure about this!)

Let  $\Lambda$  be a non-contradictory context

Let  $L_1 \vee \dots \vee L_n$  be a (parameter-free) clause

$$I_\Lambda \models \neg(L_1 \vee \dots \vee L_n)$$

iff there are fresh variants  $K_1, \dots, K_n$  of literals in  $\Lambda$

and a substitution  $\sigma$

such that

1.  $\sigma$  is a simultaneous mgu of  $\{K_1, \overline{L_1}\}, \dots, \{K_n, \overline{L_n}\}$
2. for each  $i$ ,  $Pars(K_i)\sigma \subseteq Pars$

**The remainder is empty!**

# The Model Evolution Calculus: Semantical View

$$\text{(assert)} \quad \frac{\Lambda \vdash \Phi, L}{\Lambda, L \vdash \Phi, L} \quad \text{if } (*)$$

(\*) no  $K \in \Lambda$  is s.t.  $K \geq L$  and  $L$  is not contradictory with  $\Lambda$

$$\text{(assert)} \quad \frac{\Lambda \vdash \Phi, C \vee L}{\Lambda, L \vdash \Phi, C \vee L} \quad \text{if } (**)$$

(\*\*) There is a context unifier  $\sigma$  of  $C$  with an empty remainder and  $L\sigma$  is not contradictory with  $\Lambda$  and no  $K \in \Lambda$  is s.t.  $K \geq L\sigma$

# The Model Evolution Calculus: Semantical View

$$\text{(subsume)} \quad \frac{\Lambda, K \vdash \Phi, L \vee C}{\Lambda, K \vdash \Phi} \quad \text{if } K \geq L$$

# The Model Evolution Calculus: Semantical View

$$\text{(resolve)} \quad \frac{\Lambda, \overline{K} \vdash \Phi, L \vee C}{\Lambda, \overline{K} \vdash \Phi, C} \quad \text{if } K \geq L$$

$$\text{(resolve)} \quad \frac{\Lambda \vdash \Phi, L \vee C}{\Lambda \vdash \Phi, C} \quad \text{if } (**)$$

(\*\*) There is a context unifier  $\sigma$  of  $L$  with an empty remainder such that  $C = C\sigma$

# The Model Evolution Calculus: Semantical View

$$(\text{split}) \quad \frac{\Lambda \vdash \Phi, C \vee L}{\Lambda, L\sigma \vdash \Phi, C \vee L \quad \Lambda, (\overline{L\sigma})^{\text{sko}} \vdash \Phi, C \vee L} \text{ if } (*)$$

$$(*) = \left\{ \begin{array}{l} 1) \ \sigma \text{ is a context unifier of } (C \vee L) \text{ against } \Lambda \\ 2) \ \sigma \text{ is admissible} \\ 3) \ \cancel{L\sigma \text{ is not mixed}} \quad \boxed{\text{No Longer}} \\ 4) \ L\sigma \text{ not contr. with } \Lambda \\ 5) \ (\overline{L\sigma})^{\text{sko}} \text{ not contr. with } \Lambda \end{array} \right.$$



# Main Results: Soundness and Completeness

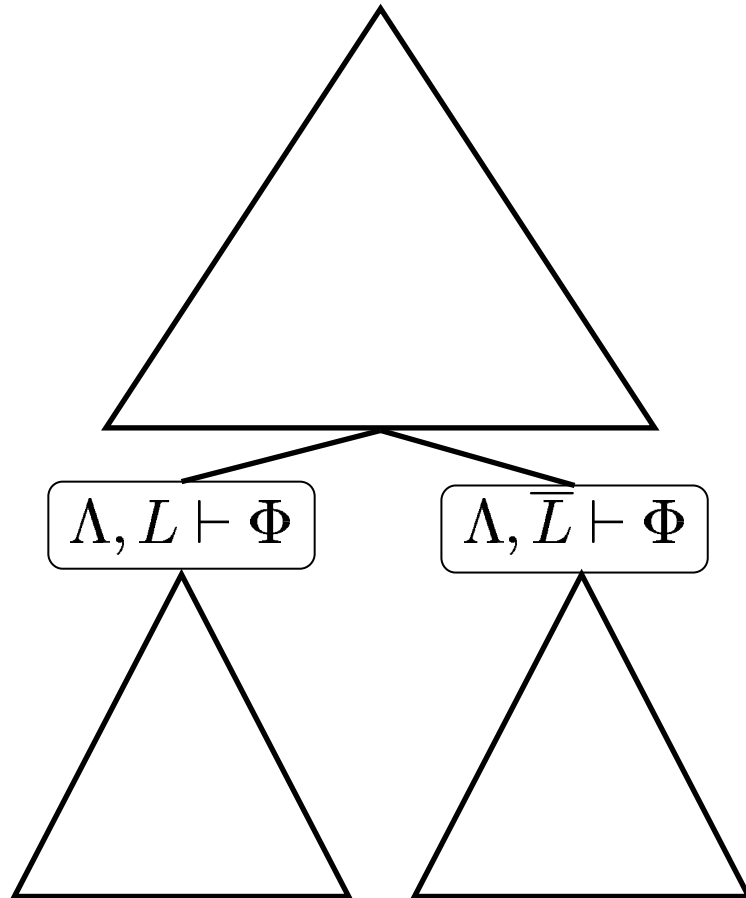
A clause set  $\Phi_0$  is unsatisfiable  
iff  
it has a refutation.

# Making ME Efficient

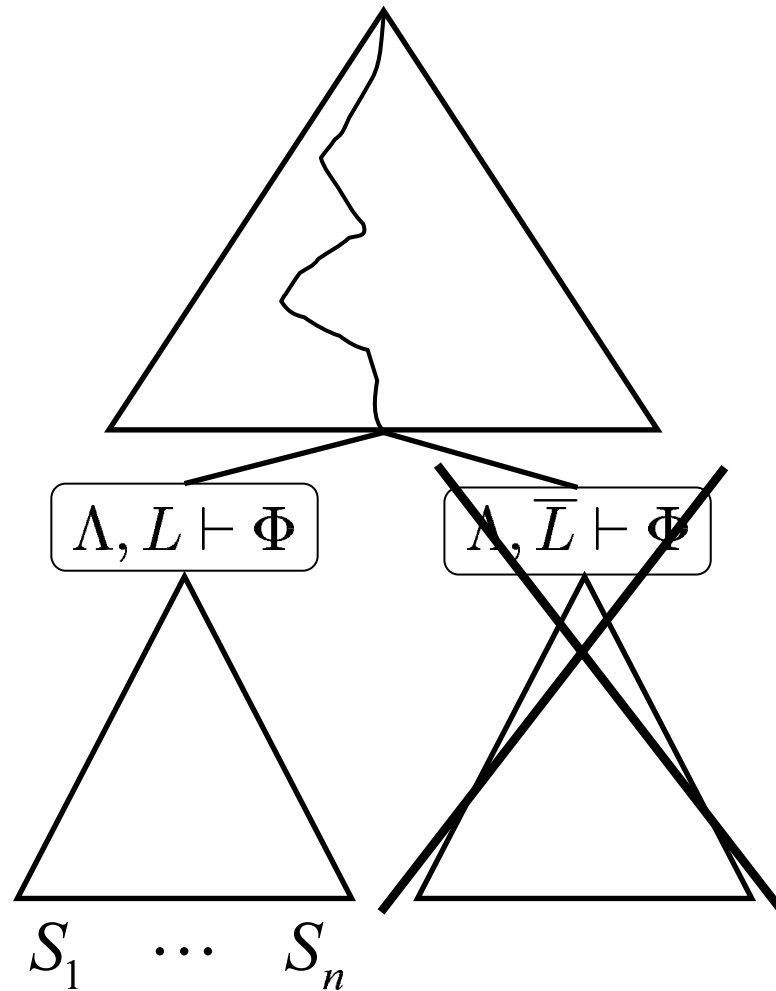
Well-known DPLL improvements:

- **Literal selection** strategies  
Model Elimination:  
can exploit don't care nondeterminism  
for remainder literal to split on
- **Learning** (lemma generation)  
not trivial – future work
- **Intelligent backtracking** (backjumping)

# Backjumping



# Backjumping



$L$  not used to close  
left subtree

# Implementation

- Darwin is an implementation of the ME.
- It is written in Ocaml<sup>j</sup>, a variant of ML.
- The algorithm explores derivation trees using iterative deepening on *term depth*.
  
- Let's see a demo!

## Input file

```
r(a); r(f(a)).          /* r(a) OR r(f(a))          */
s(X); t(X).             /* s(X) OR t(X)             */
p(f(X)); q(f(X)) :- r(a). /* r(a) -> (p(f(X)) OR q(f(X))) */
p(f(X)) :- q(f(X)).     /* q(f(X)) -> p(f(X))     */
q(f(X)) :- p(f(X)).     /* p(f(X)) -> q(f(X))     */
false :- q(f(X)), p(f(X)). /* not (q(f(X)) AND p(f(X))) */
r(a) :- r(f(a)).        /* r(f(a)) -> r(a)        */
```

# A refutation

[1] Split Left:  $+r(a)$   
[2] Split Left:  $+s(=0)$   
[3] Split Left:  $+p(f(=0))$   
[3] Unit Split:  $+q(f(=0))$   
[3] Close:  
[3] Backtracking to: [3]  
[3] Split Right:  $-p(f(=0))$   
[3] Unit Split:  $+q(f(=0))$   
[3] Close:  
[3] Backtracking to: [1]  
[1] Split Right:  $-r(a)$   
[1] Assert:  $-r(f(a))$   
[1] Close:  
END OF DERIVATION

```
r(a); r(f(a)).  
s(x); t(x).  
p(f(x)); q(f(x)) :- r(a).  
p(f(x)) :- q(f(x)).  
q(f(x)) :- p(f(x)).  
false :- q(f(x)), p(f(x)).  
r(a) :- r(f(a)).
```

# Summary

- **Full lifting of DPLL achieved**
- **Properties of DPLL preserved**
  - sound and complete
  - proof convergent
  - simplification rules
  - no Commit rule as in FDPLL