# The Model Evolution Calculus and an Application to Ontological Reasoning

Peter Baumgartner Max-Planck-Institute for Informatics Saarbrücken,Germany

Joint work with Cesare Tinelli, U Iowa

### **Background – Instance Based Methods**

- Model Evolution is related to Instance Based Methods
  - Ordered Semantic Hyper Linking [Plaisted et al]
  - Primal Partial Instantiation [Hooker et al]
  - Disconnection Method [Billon], DCTP [Letz&Stenz]
  - Inst-Gen [Ganzinger&Korovin]
  - First-Order DPLL [B.]
- Principle: Reduce proof search in first-order (clausal) logic to propositional logic in an "intelligent" way
- Different to Resolution, Model Elimination,... (Pro's and Con's)

# **Background - DPLL**

- The best modern SAT solvers (satz, MiniSat, zChaff, Berkmin,...) are based on the Davis-Putnam-Logemann-Loveland procedure [DPLL 1960-1963]
- Can DPLL be lifted to the first-order level? Can we combine
  - successful SAT techniques
     (unit propagation, backjumping, learning,...)
  - successful first-order techniques?
     (unification, subsumption, ...)?
- Model Evolution (ME) and its predecessor First-Order DPLL do so
- ME different to Resolution, Tableaux and Model Elimination but related to "Instance Based Methods"

### **DPLL procedure**

**Input**: Propositional clause set **Output:** Model or "unsatisfiable"

#### **Algorithm components:**

- Propositional semantic tree enumerates interpretations
- Simplification
- Split
- Backtracking



#### Lifting to first-order logic?

 $\{A, B\} \stackrel{?}{\models} \neg A \lor \neg B \lor C \lor D, \dots$ No, split on C:  $\{A, B, C\} \models \neg A \lor \neg B \lor C \lor D, \dots$ 

A First-Order Davis-Putnam Procedure and its Application to Ontological Reasoning

### **Model Evolution as First-Order DPLL**

Lifing of semantic tree data structure and derivation rules to first-order

Input: First-order clause set Output: Model or "unsatisfiable" if termination

#### **Algorithm components:**

- First-order semantic tree enumerates interpretations
- Simplification
- Split
- Backtracking



$$\{\mathsf{P}(\mathsf{a},\mathsf{v}),\neg\mathsf{P}(\mathsf{a},\mathsf{b})\} \stackrel{?}{\models} \mathsf{Q}(\mathsf{x},\mathsf{y}) \lor \mathsf{P}(\mathsf{x},\mathsf{y})$$

#### **Interpretation induced by a branch?**

## **Interpretation Induced by a Branch**

A branch literal specifies the truth value of its ground instances unless there is a more specific branch literal with opposite sign  $\neg_{V}$ 

Branch:

 $\{\neg v, P(a, z), \neg P(a, b)\}$ 

Induced Interpretation true: P(a, a)false: P(a, b), Q(a, b)

How to determine Split literal? Calculus?



$$\begin{cases} \neg v, P(a, v), \neg P(a, b) \} \stackrel{?}{\models} Q(x, y) \lor P(x, y) \\ \text{No, because} \quad \{ \neg v, P(a, v), \neg P(a, b) \} \not\models Q(a, b) \lor P(a, b) \\ \Rightarrow \quad \text{Split with } Q(a, b) \text{ to satisfy } P(a, b) \lor Q(a, b) \end{cases}$$

## **Model Evolution Calculus**

- Branches and clause sets may **shrink** as the derivation proceeds
- Such dynamics is best modeled with a sequent style calculus:



- Derivation Rules
  - To simplify the clause set  $\Phi$ , to simplify the context  $\Lambda$
  - Splitting
  - Close

### **Derivation Rules – Simplified (1)**

Split 
$$\frac{\Lambda \vdash \Phi, C \lor L}{\Lambda, L\sigma \vdash \Phi, C \lor L}$$
if

1. 
$$\sigma$$
 is a simultaneous mgu of  $C \lor L$  against  $\Lambda$ ,  
2. neither  $L\sigma$  nor  $\overline{L}\sigma$  is contained in  $\Lambda$ , and  
3.  $L\sigma$  contains no variables (parameters OK)  
 $\Lambda: P(u, u) Q(v, b)$   
 $C \lor L: \neg P(x, y) \lor \neg Q(a, z) \qquad \sigma = \{x \mapsto u, y \mapsto u, y \mapsto u, y \mapsto u, z \mapsto b\}$   
 $(C \lor L)\sigma: \neg P(x, x) \lor \neg Q(a, b)$   
2. violated 2. satisfied  
 $L\sigma = \neg Q(a, b)$  is admissible for Split

**Derivation Rules – Simplified (2)** 

Close 
$$\frac{\Lambda \vdash \Phi, C}{\Lambda \vdash \bot}$$
  
if

1.  $\Phi \neq \emptyset$  or  $C \neq \bot$ 

2. there is a simultaneous mgu  $\sigma$  of C against  $\Lambda$  such that  $\Lambda$  contains the complement of each literal of C $\sigma$ 



Close is applicable

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### **Derivation Rules – Simplification Rules (1)**

#### **Propositional level:**

Subsume 
$$\frac{\Lambda, L \vdash \Phi, L \lor C}{\Lambda, L \vdash \Phi}$$

#### First-order level pprox unit subsumption:

- All variables in context literal L must be universally quantified
- Replace equality by matching

### **Derivation Rules – Simplification Rules (2)**

#### **Propositional level:**

Resolve 
$$\frac{\Lambda, L \vdash \Phi, L \lor C}{\Lambda, L \vdash \Phi, C}$$

#### First-order level pprox restricted unit resolution

- All variables in context literal L must be universally quantified
- Replace equality by unification
- The unifier must not modify C

**Derivation Rules – Simplification Rules (3)** 

Compact 
$$\begin{array}{ccc} \Lambda, \ K, \ L & \vdash & \Phi \\ \hline \Lambda, \ K & \vdash & \Phi \end{array}$$

if

- 1. all variables in K are universally quantified
- 2. K $\sigma$  = L, for some substitution  $\sigma$

### **Derivations and Completeness**



#### Fairness

Closed tree or open limit tree, with some branch satisfying:

1. Close not applicable to any  $\Lambda_i$ 2. For all  $C \in \Phi_{\infty}$  and subst.  $\gamma$ , ``if for some i,  $\Lambda_i \not\models C\gamma$ then there is  $j \ge i$ such that  $\Lambda_j \models C\gamma$ 

(Use Split to achieve this)

#### Completeness

Suppose a fair derivation that is not a closed tree

Show that  $\Lambda_{\infty} \models \Phi_{\infty}$ 

### **Implementation:** Darwin

- "Serious" Implementation
   Part of Master Thesis, will be continued in Ph.D. project
- (Intended) Applications
  - detecting dependent variables in CSP problems
  - strong equivalence of logic programs
  - Bernays-Schoenfinkel fragment of autoepistemic logic
- Currently extended:
  - Lemma learning
  - Equality inference rules
- Written in OCaml, 14K LOC
- User manual, proof tree output (GraphViz)

#### **Darwin Performance**

Results of ATP system competition at IJCAR 2004

#### **MIX**: Clause logic with Equality

| MIV       | Vampire | E-SETHEO | E                  | EP    | Vampire | DCTP   | THEO  | DCTP  | Darwin  | SOS    | Otter |
|-----------|---------|----------|--------------------|-------|---------|--------|-------|-------|---------|--------|-------|
|           | 7.0     | csp04    | 0.82               | 0.82  | 6.0     | 10.21p | J2004 | 1.31  | CASC-J2 | 1.0    | 3.3   |
| Attempted | 200     | 200      | 200                | 200   | 200     | 200    | 200   | 200   | 200     | 200    | 200   |
| Solved    | 180     | 174      | 162                | 161   | 157     | 103    | 83    | 66    | 45      | 39     | 37    |
| Av. Time  | 51.36   | 36.02    | <mark>26.41</mark> | 27.69 | 80.33   | 33.19  | 73.25 | 17.13 | 29.34   | 124.20 | 74.56 |
| Solutions | 180     | 0        | 0                  | 156   | 157     | 0      | 82    | 0     | C       | 39     | 37    |

#### **EPR**: function free clause logic (without Equality)

| EPR       | DCTP<br>10.21p | E-SETHEO<br>csp04 | Darwin<br>CASC-J2 | DCTP<br>1.31-EPR | DCTP<br>1.3-EPR | Paradox<br>1.1-casc | Vampire<br>7.0 |
|-----------|----------------|-------------------|-------------------|------------------|-----------------|---------------------|----------------|
| Attempted | 80             | 80                | 80                | 80               | 80              | 80                  | 80             |
| Solved    | 79             | 79                | 72                | 72               | 72              | 56                  | 46             |
| Av. Time  | 26.45          | 38.28             | 14.67             | 36.14            | 66.75           | 39.90               | 17.98          |
| Solutions | 0              | 0                 | 37                | 0                | 0               | 28                  | 37             |

## **Application: Ontological Reasoning**

- Automated reasoning on formal ontologies is of growing interest
- Description logics are a widely used logical formalism, e.g. OWL



- Highly optimized reasoners for decidable DLs can cope with realistically sized ontologies (FaCT, Racer)
- Can one also use Darwin/off-the-shelf provers?
- And why?

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# **Why? Going Beyond Description Logics**

DL + Rules:



- Rules cause undecidability
- Cannot use DL reasoner
- Translate to first-order logic and use theorem prover
- How? (Naive approach fails)

### **How? Our Approach**



# Equality

Work in collaboration with Master's student

Equality comes in, e.g., in the translation of

– nominals ("oneOf")



cardinality restrictions



-> Need an (efficient) way to treat equality

# Equality

- **Options**: equality axioms builtin in prover by transformation
- Our transformation:

- Brand's transformation is theoretically more attractive
- But advantages do not apply for "typical" ontologies
- In practice, our transformation works much better

# **Blocking**

• **Problem:** Termination in case of satisfiable input. Caused by certain DL language constructs and cyclic definitions:



• **Solution:** Idea: Re-use old individual to satisfy ∃ -quantifier. Technical: encode search for finite domain model in clause set:



• **Issue:** Search space reduction: don't speculate all possible equalities

### **Experimental Evaluation – OWL Test Cases from W3C**

| System               | <b>Consistent</b><br>56 problems | <b>Inconsistent</b><br>72 problems | <b>Entailment</b><br>57 problems |
|----------------------|----------------------------------|------------------------------------|----------------------------------|
| Darwin +blocking     | 89%                              | 92%                                | 89%                              |
| Darwin - blocking    | 7%                               | 94%                                | 93%                              |
| KRHyper +blocking    | 86%                              | 89%                                | 93%                              |
| KRHyper - blocking   | 75%                              | 94%                                | 93%                              |
| Darwin U KRHyper     | 93%                              | 94%                                | 93%                              |
| Hoolet (Vampire)     | 78%                              | 94%                                | 72%                              |
| Surnia (Otter)       | -                                | 0%                                 | 13%                              |
| Euler ("Prover")     | 0%                               | 98%                                | 100%                             |
| Fact (DL)            | 42%                              | 85%                                | 7%                               |
| Pellet (DL)          | 96%                              | 98%                                | 86%                              |
| OWLP (DL)            | 50%                              | 26%                                | 53%                              |
| Cerebra (DL)         | 90%                              | 59%                                | 61%                              |
| FOWL (OWL)           | 53%                              | 4%                                 | 32%                              |
| ConsVISor (OWL-full) | 77%                              | 65%                                | -                                |

A First-Order Davis-Putnam Procedure and its Application to Ontological Reasoning

### Conclusions

- Objective: "robust" reasoning support beyond description logics:
  - Equality treatment
  - Blocking (decides standard services for cyclic ALC TBoxes)
  - It's not only "strategy hacking" need theoretical results
  - Competitive with DL systems on common domain
- "Rules" not benchmarked (no benchmarks available), but they turned out to be very useful in own application projects:
  - Reputational risk management
  - Document management (E-Learning)
  - Upper ontology for computational linguistic application
- Nonmonotonic negation of KRHyper very useful How to integrate it in Model Evolution?