## Anti-unification and Generalization: A Survey

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### A Survey on Anti-unification

# WHY?

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#### An Unfamiliar Concept

For some (possibly many) members of the audience

Anti-unification is a **new** concept.

- Some may have heard of  $\theta$ -subsumption.
  - Applications within Inductive Logic Programming
- ▶ We expect few are aware of the following:
  - Anti-unification is the dual operation to unification.
  - There exists anti-unification algorithms modulo various equational theories, over Higher-order languages, and within a variety of other settings.
  - Anti-unification has applications within Formal Reasoning, Inductive Synthesis, Theory exploration, Program Analysis, and Program Repair.

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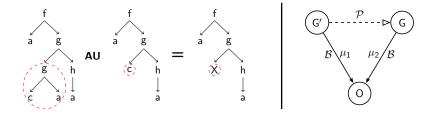
#### The Need For a Comprehensive Source

- Anti-unification remains obscure even though it is a useful and inexpensive technique for generalization and abstraction.
- Consider the recent work:

Babble: Learning Better Abstractions with E-Graphs and Anti-Unification (2023), POPL, Cao et al.

- The authors provide a novel program compression mechanism using equational anti-unification.
- Their system is competitive with statistical learning based approaches, i.e. Dreamcoder [Ellis et al., 2021].
- However the authors only address Plotkin's foundational work. This is likely due to the fractured nature of the literature and how time-intensive act of processing.

#### What is Anti-unification (AU)? (General Perspective)



- Goal: from O<sub>1</sub>, O<sub>2</sub> ∈ O (symbolic expressions) derive G ∈ O possessing certain commonalities shared by O<sub>1</sub> and O<sub>2</sub>.
- Specification: define (a) a class of mappings *M* from *O* → *O*, (b) a base relation *B* consistent with *M*, and (c) a preference relation *P* consistent with *B*.
- ► Result: G is a *B*-generalization of O<sub>1</sub> and O<sub>2</sub> and most *P*-preferred ("better" than G').

#### Complete Sets and Types (A General Perspective)

- A set G ⊂ O is called P-complete set of B-generalizations of O<sub>1</sub>, O<sub>2</sub> ∈ O if:
  - **Soundness:** Every  $G \in \mathcal{G}$  is a  $\mathcal{B}$ -generalization of  $O_1$  and  $O_2$ .
  - Completeness: For each B-generalization G' of O₁ and O₂, there exists G ∈ G such that P(G, G') (G is more preferred).
- Furthermore, G is minimal if:
  - **Minimality:** No distinct elements of  $\mathcal{G}$  are  $\mathcal{P}$ -comparable: if  $G_1, G_2 \in \mathcal{G}$  and  $\mathcal{P}(G_1, G_2)$ , then  $G_1 = G_2$ .
- Minimal Complete sets come in four Types:
  - Unitary (1): G is a singleton,
  - Finitary ( $\omega$ ):  $\mathcal{G}$  is finite and contains at least two elements,
  - ► Infinitary (∞): G is infinite,
  - Nullary (0): G does not exist (minimality and completeness contradict each other).
- Types are extendable to generalization problems.

#### First-order Syntactic Generalization

Generic	Concrete
$\mathcal{O}$	The set of first-order terms
$\mathcal{M}$	First-order substitutions
B	$\doteq$ (syntactic equality)
$\mathcal{P}$	$\succeq$ (more specific, less general): $s \succeq t$ iff $s \doteq t\sigma$
	for some $\sigma \in \mathcal{M}$
$\equiv_{\mathcal{P}}$	Equi-generality: $\succeq$ and $\preceq$
Туре	Unitary
Alg.	[Huet, 1976; Plotkin, 1970: Reynolds, 1970]

- Extendable to first-order clausal generalization and relative θ-subsumption.
- Clausal generalization is a special case of equational generalization (ACUI).

#### Least-Common Subsumer (Description Logics)

Generic	Concrete
$\mathcal{O}$	Concept descriptions
$\mathcal{M}$	Contains only the identity mapping
B	$\sqsupseteq$ - for $\mathcal{C}, \mathcal{D} \in \mathcal{O}, \ \mathcal{C}^{\mathcal{I}} \supseteq \mathcal{D}^{\mathcal{I}}$ for all interpretations $\mathcal{I}$
$\mathcal{P}$	$\sqsubseteq$ - for $\mathcal{C},\mathcal{D}\in\mathcal{O}$ , $\mathcal{C}^\mathcal{I}\subseteq\mathcal{D}^\mathcal{I}$ for all interpretations $\mathcal I$
$\equiv_{\mathcal{P}}$	$\equiv: \sqsubseteq and \sqsupseteq$
Туре	Unitary for all four DLs
Alg.	[Baader et al., 1999] for $\mathcal{EL}$ , $\mathcal{FLE}$ , $\mathcal{ALE}$ ,
	[Küsters and Molitor, 2001] for $\mathcal{ALEN}$

 Generalization (least common subsumer) in Description logics *EL*, *FLE*, *ALE*, and *ALEN*.

### Open Problems and Conclusions

- We present a general framework for discussing and characterising anti-unification and generalization problems.
- Read this survey if you want to know:
  - What it means to generalize in various logic-based languages.
  - What are the techniques to compute such generalizations.
  - What are the applications of these methods and algorithms.
- There are many open problems including:
  - Combining anti-unification algorithms for disjoint (equational) theories.
  - Studying the influence of the preference relation on the type and solution set of generalization problems.
  - Studying computational complexity and optimizations of existing generalization problems.

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