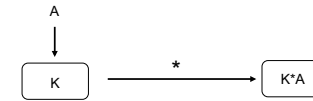


Conceptual and Practical Challenges in Belief Revision

Pavlos Peppas



Overview



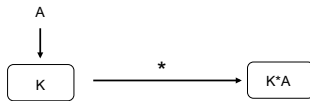
- Conceptual Challenges

- Iterated Revision
- Relevance-Sensitive Revision

- Practical Challenges

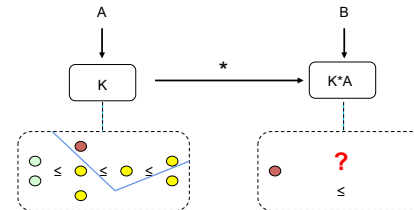
- Computational Complexity
- Representational Cost

AGM Belief Revision



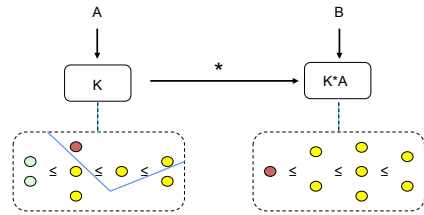
- (K*1) K^*A is a theory
- (K*2) $A \in (K^*A)$
- (K*3) $K^*A \subseteq K+A$
- (K*4) If $\neg A \notin K$ then $K+A \subseteq K^*A$
- (K*5) If A is consistent then K^*A is consistent
- (K*6) If $A=B$ then $K^*A = K^*B$
- (K*7) $K^*(A \wedge B) \subseteq (K^*A)+B$
- (K*8) If $\neg B \notin (K^*A)$ then $(K^*A)+B \subseteq K^*(A \wedge B)$

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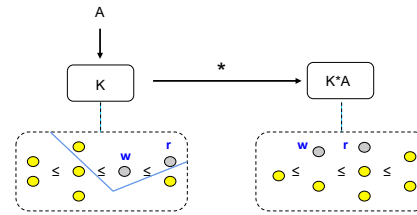
Iterated Belief Revision



- Spohn's OCF
- Darwiche and Pearl Postulates

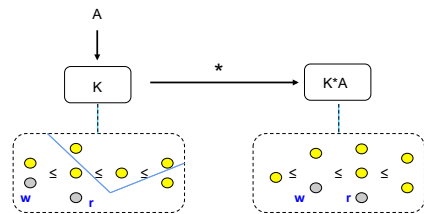
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Iterated Revision – The Darwiche and Pearl Approach



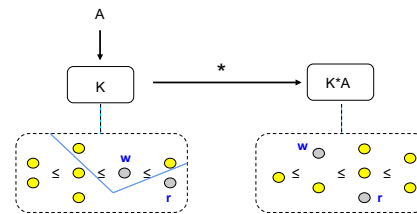
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Iterated Revision – The Darwiche and Pearl Approach



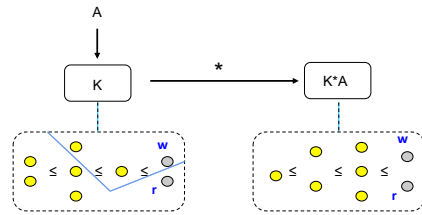
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Iterated Revision – The Darwiche and Pearl Approach



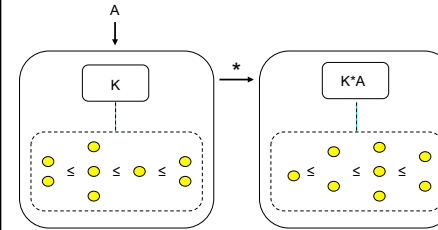
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Iterated Revision – The Darwiche and Pearl Approach



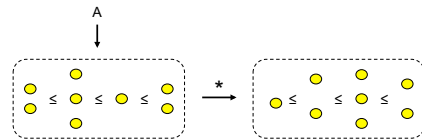
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The DP Approach: What's a Belief State?



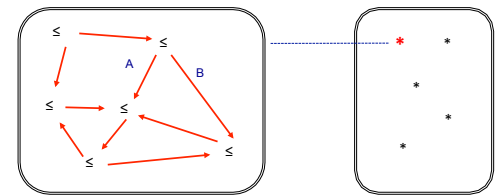
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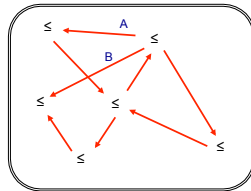
The DP Approach: What's a Belief State?



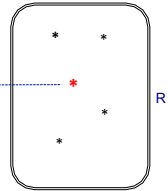
→ satisfies (DP1) – (DP4)

Iterated Revision Functions AGM + (C1) – (C4)

The DP Approach: What's a Belief State?

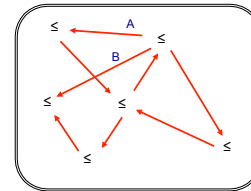


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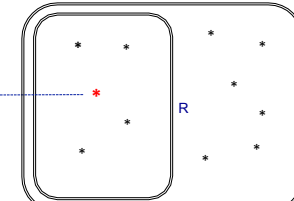


Iterated Revision Functions AGM + (C1) – (C4)

The DP Approach: What's a Belief State?



→ satisfies (DP1) – (DP4)

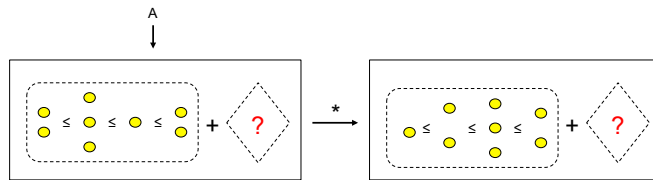


Iterated Revision Functions AGM + (C1) – (C4)

THEOREM:

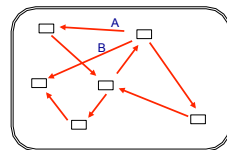
There exists revision functions, that satisfies the DP constraints, which do not belong to R.

The DP Approach: What's a Belief State?

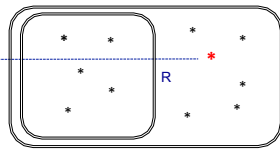


OBSERVATION:

DP belief states are MORE than just preorders over worlds. So what's a "DP-complete" state?



→ satisfies (DP1) – (DP4)

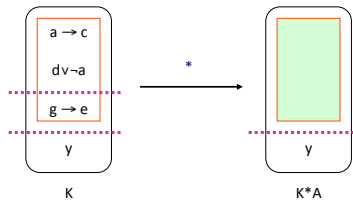


Iterated Revision Functions AGM + (C1) – (C4)

Relevance-Sensitive Revision

Parikh's Approach for Relevance-Sensitive Revision

$$A = (a \wedge y \wedge e) \vee (a \wedge \neg y \wedge e) \equiv a \wedge e$$

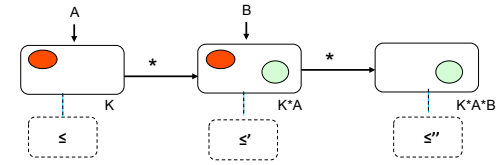


(wP) If $K = \text{Cn}(X, Y)$, $L_x \cap L_y = \emptyset$ and $A \in L_x$, then $(K^*A) \cap L_y = K \cap L_y$.

(SP) If $\text{Diff}(K, r) \subset \text{Diff}(K, z)$ then $r < z$.



The DP approach is Inconsistent with (P)



THEOREM:

Let K be any splittable theory. There exists a K -faithful preorder over worlds \leq and a sentence A such that every posterior preorder \leq' that is faithful to K^*A and satisfies (the semantic constraints for) axiom (wP), violates each one of the constraints (DP1) – (DP4).

THEOREM:

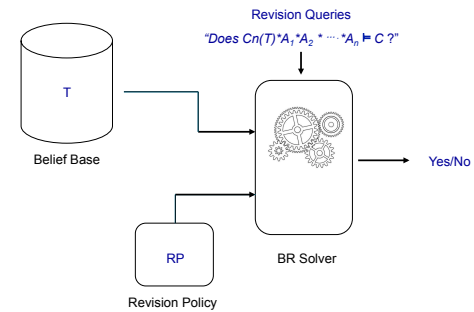
Let K be any splittable theory. For any K -faithful preorder over worlds \leq there exists a sentence A such that every posterior preorder \leq' that is faithful to K^*A and satisfies (the semantic constraints for) axiom (wP), violates (DP2).

THEOREM:

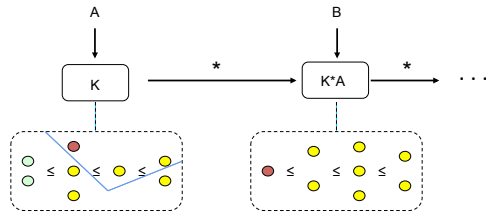
Dalal's operator satisfies (wP) but violates the DP postulates.

Practical Challenges

Building a Scalable Belief Revision Solver



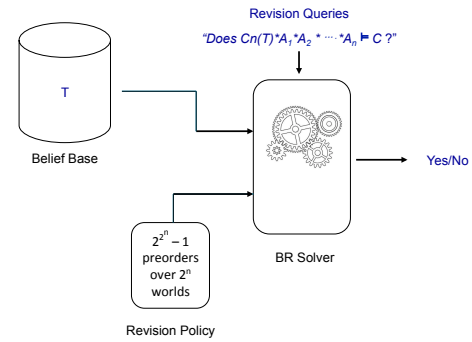
Representational Cost of a Revision Function



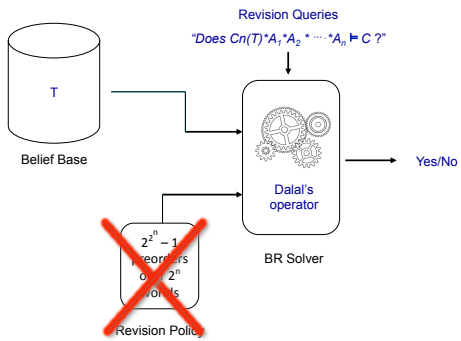
For a propositional language built over n propositional variables there exist 2^n possible worlds, and hence $2^{2^n} - 1$ consistent theories. Thus to specify a (iterated) revision function we need to explicitly provide $2^{2^n} - 1$ preorders over the 2^n possible worlds.

i.e. for a language with just 9 variables, the number of preorders we need to specify is $2^{2048} - 1$, which is more than the atoms in the observable universe!

Building a Scalable Belief Revision Solver

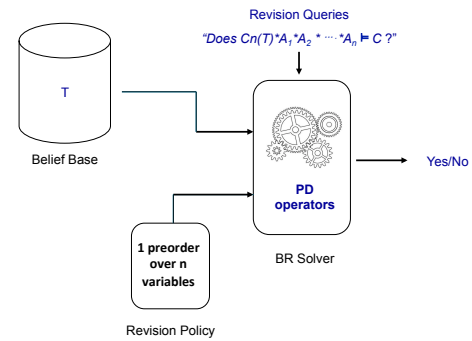


Building a Scalable Belief Revision Solver



Too restrictive!

Building a Scalable Belief Revision Solver

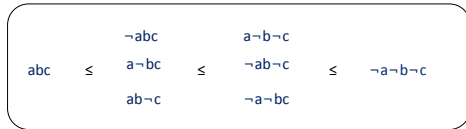


Dalal Preorders

P: the set of all propositional variables (or atoms) of the language.

Diff(w,r) = { x ∈ P: w≠x and r≠x } ∪ { x ∈ P: w≠x and r=x }.

Dalal Preorder: $r \leq r'$ iff for some $w \in [K]$, $|\text{Diff}(w,r)| \leq |\text{Diff}(w,r')|$, for all $w' \in [K]$.

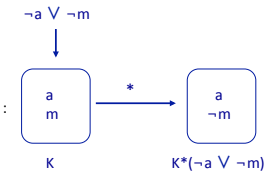


Counterexample

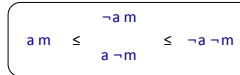
A circuit consists of an adder and a multiplier.

- a : "the adder is working"
- m : "the multiplier is working"

Adders are more reliable than multipliers and hence :



Dalal Preorder:



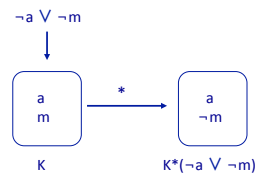
$$\Rightarrow K^*(\neg a \vee \neg m) \equiv (\neg a \wedge m) \vee (a \wedge \neg m)$$

Counterexample

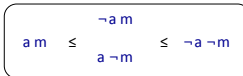
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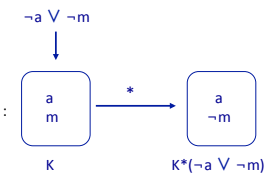
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Counterexample

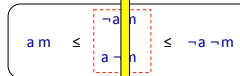
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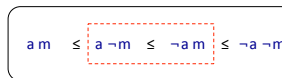


Dalal Preorder:



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PD Preorder:

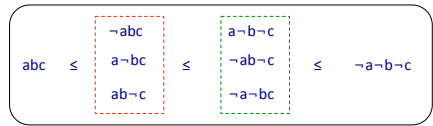


$$\Rightarrow K^*(\neg a \vee \neg m) \equiv (a \wedge \neg m) \quad \checkmark$$

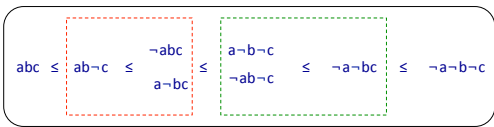
Example

$$c \triangleleft a = b$$

$$K \equiv a \wedge b \wedge c$$



Dalal Preorder



PD Preorder

Parameterised Difference Preorders

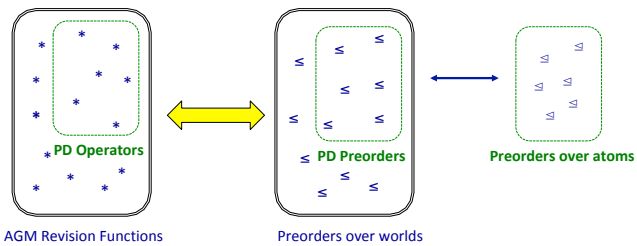
Let \preceq be a total preorder over atoms. For a set of atoms S , and an atom y , define $S_y = \{x \in S : x \preceq y\}$.

The PD preorder \leq generated from \preceq that is assigned to a theory K is defined as follows:

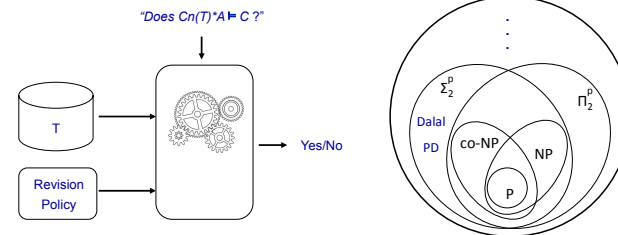
$r \leq r'$ iff there is a $w \in K$ such that for all $w' \in K$ one of the following holds:

- $|\text{Diff}(w,r)| < |\text{Diff}(w',r')|$
- $|\text{Diff}(w,r)_y| = |\text{Diff}(w',r')_y|$, for all atoms y .
- $|\text{Diff}(w,r)| = |\text{Diff}(w',r')|$, and for some atom y , $|\text{Diff}(w,r)_y| > |\text{Diff}(w',r')_y|$ and moreover $|\text{Diff}(w,r)_q| = |\text{Diff}(w',r')_q|$, for all $q \preceq y$

Axiomatic Characterization of PD Operators



Computational Complexity of a BR Solver



- Dalal's operator belongs to the second layer of the polynomial hierarchy (needs at most $\log(n)$ calls to an NP-oracle).
- PD Operators also belong to the second layer of the polynomial hierarchy (needs at most n^2 calls to an NP-oracle).

Computational Complexity of a BR Solver

"Does $Cn(T) \models A \models C$?"

- Dalal's operator belongs to the second layer of the polynomial hierarchy (needs at most $\log(n)$ calls to an NP-oracle).
- PD Operators also belong to the second layer of the polynomial hierarchy (needs at most $n^{1/2}$ calls to an NP-oracle).
- If T is Horn, and the query is Horn and of bounded length, then PD operators can be processed in **linear time**.

A Scalable Belief Revision Solver

"Does $Cn(T) \models A \models C$?"

- Increase expressivity (e.g. go beyond Horn belief bases, or allow the atoms-preorder to vary).
- Use **domain-specific information on relevance**.to (partially) build the atoms-preorder.

Conclusion

Conceptual Challenges:

A

B

- A DP-complete definition of belief states.
- A domain-specific account of relevance-sensitive revision.
- Reconcile iteration and relevance.

Practical Challenges:

"Does $Cn(T) \models A_1 \wedge A_2 \wedge \dots \wedge A_n \models C$?"

Trade generality for efficiency in order to deal with:

- Representational cost.
- Computational complexity.