

Projection in the Epistemic Situation Calculus with Belief Conditionals

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Belief Revision in Dynamic Environments

Suppose we want to have dinner at a restaurant:

- ▶ We don't know that the restaurant is Italian
- ▶ We believe:
 1. usually, the specialty is burger
 2. but in Italian rest.s, it's pizza or pasta
- ▶ We can take action:
 1. order the specialty
 2. ask if restaurant is Italian

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Belief projection: After actions n_1, \dots, n_k , do we believe α ?

E.g.: After we order the specialty and then find out the restaurant is Italian, do we believe that we **will get a dish** but **don't know which**?

Belief Revision in the Situation Calculus

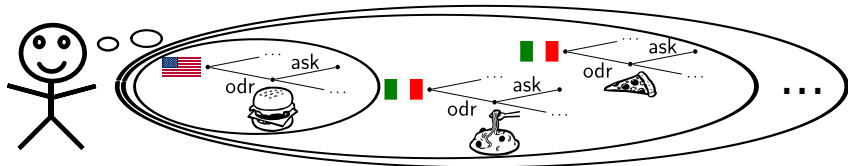
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E.g.: Truth in a model (in a variant of Shapiro et al. [AIJ-2011]):

$$f, w \models [\text{odr}][\text{ask}]\mathbf{B}(\exists x.D(x) \wedge \neg\mathbf{B}D(x))$$



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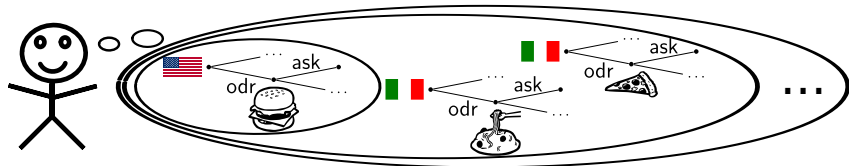
- ▶ We can take action:

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$$\Omega \wedge I \wedge \mathbf{O}(\Omega, \Gamma) \models [\text{odr}][\text{ask}]\mathbf{B}(\exists x.D(x) \wedge \neg\mathbf{B}D(x))$$



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- Solution:**
1. elimination of **actions** using regression
 2. elimination of **beliefs** by reduction to first-order reasoning

Elimination of Actions: The Objective Case

Regression (due to Reiter):

- ▶ Push actions inwards
- ▶ Replace $[r]F(\vec{t})$ and $SF(r)$ with the RHS from the action theory
- ▶ Yields a formula without actions

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How to push actions inwards of **B** modalities?

Theorem:

$$\models \Box [a]\mathbf{B}(\phi \Rightarrow \psi) \equiv \neg SF(a) \wedge \mathbf{B}(\neg SF(a) \wedge [a]\phi \Rightarrow [a]\psi) \vee \\ SF(a) \wedge \mathbf{B}(SF(a) \wedge [a]\phi \Rightarrow [a]\psi)$$

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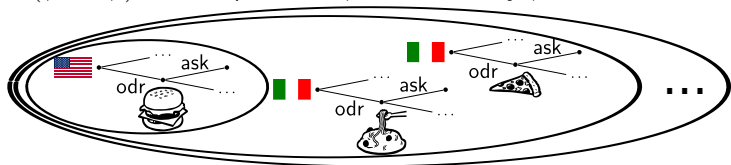
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Elimination of Beliefs: The Idea

- ▶ $\mathbf{B}(\phi \Rightarrow \psi)$ iff most plausible ϕ -worlds satisfy ψ



- ▶ Every sphere can be represented by an objective sentence γ_i
- ▶ $\mathbf{B}(\phi \Rightarrow \psi)$ iff first ϕ -consistent γ_i entails $\phi \supset \psi$

$$\gamma_0 = \neg I \wedge (S(x) \equiv x = \text{burger})$$

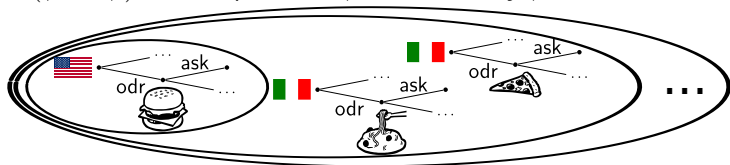
$$\gamma_1 = I \supset (S(\text{pasta}) \vee S(\text{pizza}))$$

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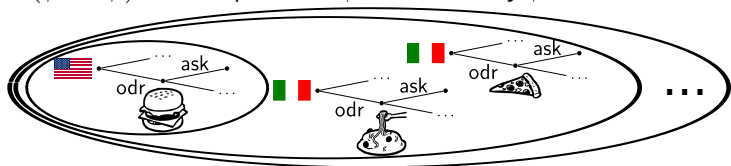
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Conclusion

Solved **belief projection** in the Situation Calculus:

1. Elimination of actions: formula about initial beliefs
2. Elimination of beliefs: series of first-order entailments

Working implementation based on Lakemeyer and Levesque [KR-2014]

Future work:

- ▶ Progression of beliefs
- ▶ Regression for Spohn-style logics e.g., Delgrande and Levesque [KR-2012]