

Belief Revision and Progression of KBs in the Epistemic Situation Calculus

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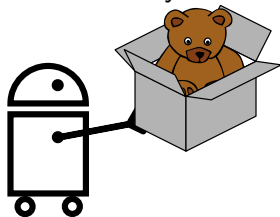
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Actions and Beliefs

Robot is holding a box, does not know what is in it, but

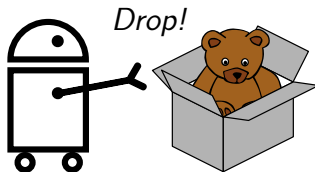
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2. considers fragility more plausible than it being metallic
3. knows it is not broken yet



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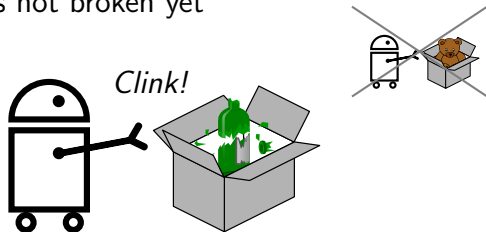
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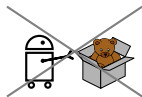
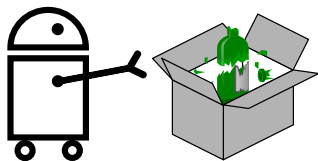
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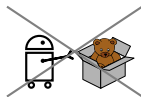
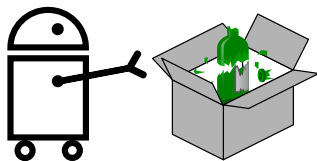


How to reason about this?

Actions and Beliefs

Robot is holding a box, does not know what is in it, but

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If 1–3 is **all** it believed initially, what is **all** it believes now?

Disclaimer: talk includes improvements over paper (journal version in preparation)

Logic for Actions and Beliefs

First-order logic with modalities:

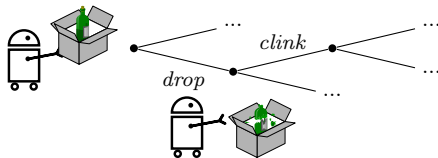
- ▶ α holds after action A $[A]\alpha$
- ▶ α holds forever $\Box\alpha$
- ▶ if ϕ held, ψ would hold $\mathbf{B}(\phi \Rightarrow \psi)$ $\mathbf{B}\psi$
- ▶ all we believe is $\phi_i \Rightarrow \psi_i$ $\mathbf{O}\{\phi_1 \Rightarrow \psi_1, \dots, \phi_m \Rightarrow \psi_m\}$
- ▶ before forgetting \mathcal{P} , —" — $\mathbf{O}_{\mathcal{P}}\{\text{—" —}\}$

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Semantics: worlds specify initial and future truth of fluents



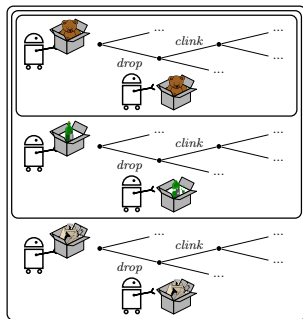
$$w \models \neg B \wedge [drop]B$$

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Semantics: possible worlds ranked by plausibilities



$$e \models \mathbf{B}\neg B \wedge [drop]\mathbf{B}\neg B$$

$$e \models [drop][clink]\mathbf{B}B \quad (\text{due to revision})$$

All We Believe ...

- ▶ Only-believing uniquely determines belief structure
- ▶ Related to Levesque's only-knowing, Pearl's Z-Ordering
- ▶ Subsumes only-knowing α by conditional $\neg\alpha \Rightarrow \perp$

Theorem: Unique-Model Property

$\mathbf{O}\{\phi_1 \Rightarrow \psi_1, \dots, \phi_m \Rightarrow \psi_m\}$ has unique model if ϕ_i, ψ_i are obj.

Theorem generalizes for $\mathbf{O}_{\mathcal{P}}\{\phi_1 \Rightarrow \psi_1, \dots, \phi_m \Rightarrow \psi_m\}$

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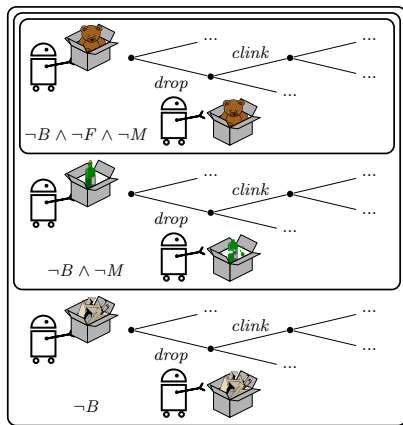
$\mathcal{O}\{\phi_1 \Rightarrow \psi_1, \dots, \phi_m \Rightarrow \psi_m\}$ has unique model if ϕ_i, ψ_i are obj.

Usually all we believe is a **Basic Action Theory (BAT)** with

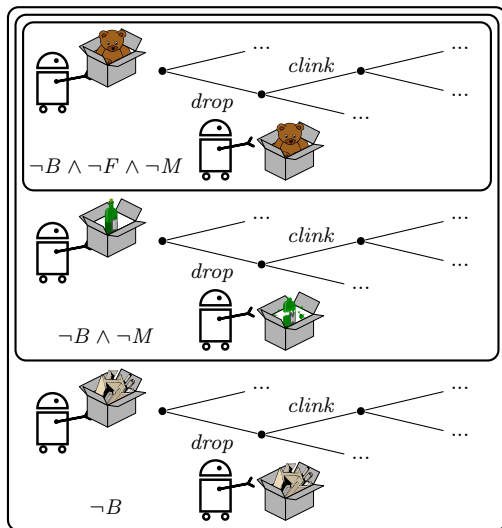
- ▶ initial beliefs Σ_{bel}
- ▶ knowledge about dynamics
 - ▶ physical effect (successor-state axioms due to Reiter):
$$\forall a. \Box[a]B \equiv a = \text{drop} \wedge F \vee B$$
 - ▶ epistemic effect (action A leads to revision by $IF(A)$):
$$\forall a. \Box IF(a) \equiv (a = \text{clink} \supset B \vee M)$$

All We Believe ...

- $O\{\top \Rightarrow \neg F \wedge \neg M,$ believes it is not fragile and not metallic
 $F \vee M \Rightarrow \neg M,$ considers fragility more plausible than metallic
 $B \Rightarrow \perp,$ knows it is not broken yet
dynamic axioms}

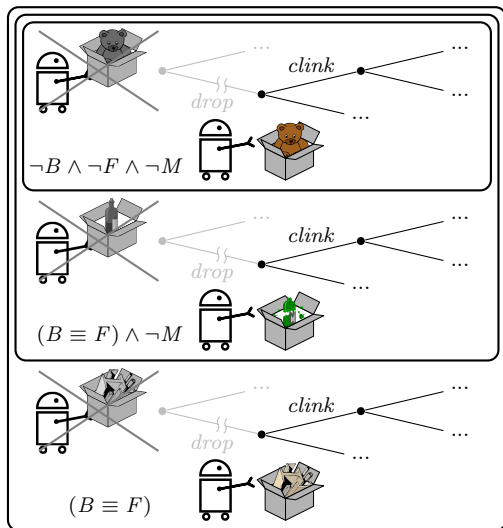


Progression of an Epistemic State



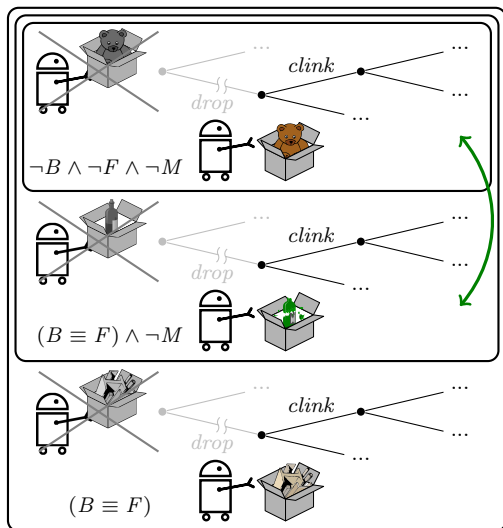
Initially $e \models \mathbf{B}\neg B$

Progression of an Epistemic State



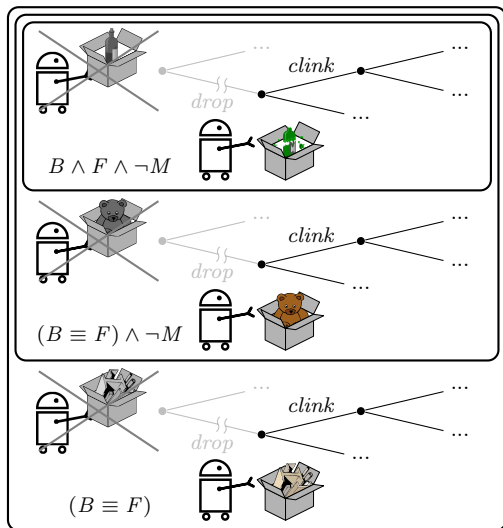
After progression still $e \gg drop \models \mathbf{B}\neg B$

Progression of an Epistemic State



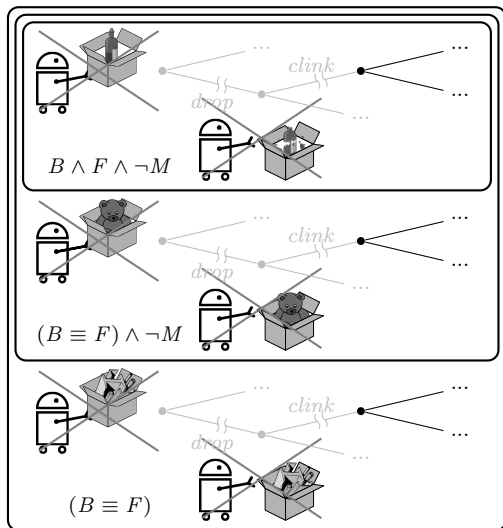
Natural revision by $B \vee M$ promotes B -worlds to the top

Progression of an Epistemic State



After revision $(e \gg \text{drop}) * (B \vee M) \models \mathbf{BB}$

Progression of an Epistemic State



After progression $e \gg drop \gg clink \models \mathbf{BB}$

Progression of a BAT by a Physical Action

- ▶ Similar to Lin and Reiter's progression
- ▶ Let A have no epistemic effect
- ▶ Let \mathcal{F} be fluents of BAT with axioms $\Box[a]F(\vec{x}) \equiv \gamma_F$
- ▶ Let \mathcal{P} be new predicates

Beliefs after doing A

$$\Sigma_{\text{bel}} \gg A = \Sigma_{\text{bel}}^{\mathcal{F}} \cup \{ \neg(\forall \vec{x}. F(\vec{x}) \equiv \gamma_{F_A}^a \mathcal{F}) \Rightarrow \perp \mid F \in \mathcal{F} \}$$

- ▶ Substitute \mathcal{P} for \mathcal{F} to capture pre- A beliefs
- ▶ Assert $\forall \vec{x}. F(\vec{x}) \equiv \gamma_{F_A}^a \mathcal{F}$ to set post- A beliefs

Progression of a BAT by an Epistemic Action

- ▶ Let A have no physical effect
- ▶ Progression $\Sigma_{\text{bel}} \ggg A = \Sigma_{\text{bel}} * IF(A)$
- ▶ Let $\Delta = \{\phi \Rightarrow \psi \in \Sigma_{\text{bel}} \mid \mathbf{O}\Sigma_{\text{bel}} \models \mathbf{B}(\alpha \Rightarrow \phi \supset \psi)\}$
- ▶ Let P be a new predicate

Beliefs after promoting the most-plausible α -worlds

$$\begin{aligned} \Sigma_{\text{bel}} * \alpha &= \{ \top \qquad \qquad \qquad \Rightarrow P \} && \cup \\ & \{ \neg(P \supset \alpha) \qquad \Rightarrow \perp \} && \cup \\ & \{ \neg(\phi \wedge P \supset \psi) \Rightarrow \perp \mid \phi \Rightarrow \psi \in \Delta \} && \cup \\ & \{ \phi \wedge \neg P \qquad \qquad \Rightarrow \psi \mid \phi \Rightarrow \psi \in \Sigma_{\text{bel}} \} \end{aligned}$$

Progression of a BAT by an Epistemic Action

- ▶ Let A have no physical effect
- ▶ Progression $\Sigma_{\text{bel}} \ggg A = \Sigma_{\text{bel}} * IF(A)$
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Beliefs after promoting the most-plausible α -worlds

$$\begin{aligned}\Sigma_{\text{bel}} * \alpha &= \{\top \Rightarrow P\} && \cup \\ &\{\neg(P \supset \alpha) \Rightarrow \perp\} && \cup \\ &\{\neg(\phi \wedge P \supset \psi) \Rightarrow \perp \mid \phi \Rightarrow \psi \in \Delta\} && \cup \\ &\{\phi \wedge \neg P \Rightarrow \psi \mid \phi \Rightarrow \psi \in \Sigma_{\text{bel}}\}\end{aligned}$$

- ▶ P -worlds are the most plausible worlds
- ▶ P -worlds represent promoted α -worlds
- ▶ $\neg P$ -worlds represent original belief structure

Progression of a BAT

Briefly: BAT progression **matches** semantic progression

Theorem: Progression #1

$$\models \mathbf{O}\Sigma \supset [A]\mathbf{O}_{\mathcal{P} \cup \{P\}}(\Sigma \gg A)$$

Roughly: If all we believe is Σ , then all we believe after A is $\Sigma \gg A$.

Theorem: Progression #2

$$\models \mathbf{O}\Sigma \supset [A]\alpha \quad \text{iff} \quad \models \mathbf{O}_{\mathcal{P} \cup \{P\}}(\Sigma \gg A) \supset \alpha$$

Roughly: $\Sigma \gg A$ entails the same beliefs as Σ has after A .

Belief Revision Postulates

- ▶ Alchourron–Gärdenfors–Makinson (AGM) hold
- ▶ Darwiche–Pearl (DP) hold with a little restriction on DP2
Original DP2 is violated because we cannot recover from an inconsistent state
- ▶ Nayak–Pagnucco–Peppas (NPP) violated because the order matters in natural revision

Conclusion and Ongoing/Future Work

- ▶ Situation calculus plus natural revision
 - ▶ Belief progression using only-believing

 - ▶ Other revision schemes, e.g., lexicographic
 - ▶ Projection by regression
 - ▶ Elimination of (nested) beliefs
- } similar to our AAI-15 paper
- ▶ When is progression first-order-definable?
 - ▶ Feasible subclass based on Lakemeyer & Levesque, KR-14
 - ▶ Implementation

Appendix

All We Believe ...

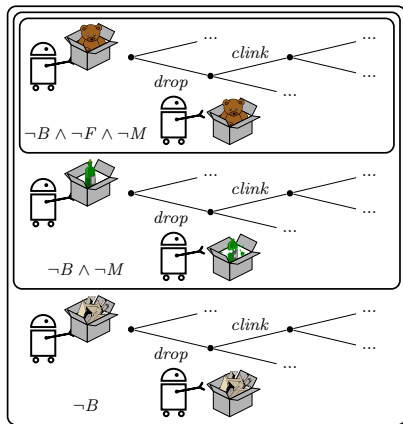
- ▶ Believe it is not fragile and not metallic
- ▶ Fragility is more plausible than metallic
- ▶ Know that it is not broken
- ▶ Know dynamic axioms

$$\top \Rightarrow \neg F \wedge \neg M$$

$$F \vee M \Rightarrow \neg M$$

$$B \Rightarrow \perp$$

(omitted)



1. $(\top \supset \neg F \wedge \neg M) \wedge (F \vee M \supset \neg M) \wedge (B \supset \perp)$
2. $(F \vee M \supset \neg M) \wedge (B \supset \perp)$
3. $(B \supset \perp)$