

# Ten Puzzles and Paradoxes about Knowledge and Belief

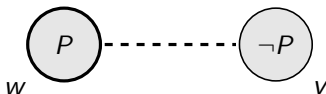
ESSLLI 2013, Düsseldorf

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**Eric Pacuit**

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# Taking Stock



**Epistemic Model:**  $\mathcal{M} = \langle W, \{R_i\}_{i \in \mathcal{A}}, V \rangle$

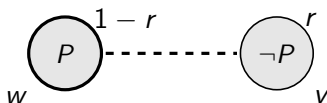
- ▶  $wR_iv$  means  $v$  is compatible with everything  $i$  knows at  $w$ .

**Language:**  $\varphi := p \mid \neg\varphi \mid \varphi \wedge \psi \mid K_i\varphi$

**Truth:**

- ▶  $\mathcal{M}, w \models p$  iff  $w \in V(p)$  ( $p$  an atomic proposition)
- ▶ Boolean connectives as usual
- ▶  $\mathcal{M}, w \models K_i\varphi$  iff for all  $v \in W$ , if  $w \sim_i v$  then  $\mathcal{M}, v \models \varphi$

# Taking Stock



**Epistemic-Plausibility Model:**  $\mathcal{M} = \langle W, \{\sim_i\}_{i \in \mathcal{A}}, \{p_i\}_{i \in \mathcal{A}}, V \rangle$

- ▶  $p_i : W \rightarrow [0, 1]$  are probabilities,  $\sim_i$  is an equivalence relation

**Language:**  $\varphi := p \mid \neg\varphi \mid \varphi \wedge \psi \mid K_i\varphi \mid B^r\psi$

**Truth:**

- ▶  $\llbracket \varphi \rrbracket_{\mathcal{M}} = \{w \mid \mathcal{M}, w \models \varphi\}$
- ▶  $\mathcal{M}, w \models B^r\varphi$  iff  $p_i(\llbracket \varphi \rrbracket_{\mathcal{M}} \mid [w]_i) = \frac{p_i(\llbracket \varphi \rrbracket_{\mathcal{M}} \cap [w]_i)}{\pi_i([w]_i)} \geq r$
- ▶  $\mathcal{M}, w \models K_i\varphi$  iff for all  $v \in W$ , if  $w \sim_i v$  then  $\mathcal{M}, v \models \varphi$

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**Epistemic-Plausibility Model:**  $\mathcal{M} = \langle W, \{\sim_i\}_{i \in \mathcal{A}}, \{\preceq_i\}_{i \in \mathcal{A}}, V \rangle$

- ▶  $w \preceq_i v$  means  $v$  is at least as plausible as  $w$  for agent  $i$ .

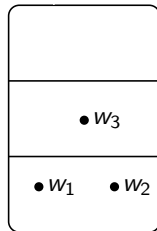
**Language:**  $\varphi := p \mid \neg\varphi \mid \varphi \wedge \psi \mid K_i\varphi \mid B^{\varphi}\psi \mid [\preceq_i]\varphi$

**Truth:**

- ▶  $\llbracket \varphi \rrbracket_{\mathcal{M}} = \{w \mid \mathcal{M}, w \models \varphi\}$
- ▶  $\mathcal{M}, w \models B_i^{\varphi}\psi$  iff for all  $v \in \text{Min}_{\preceq_i}(\llbracket \varphi \rrbracket_{\mathcal{M}} \cap [w]_i)$ ,  $\mathcal{M}, v \models \psi$
- ▶  $\mathcal{M}, w \models [\preceq_i]\varphi$  iff for all  $v \in W$ , if  $v \preceq_i w$  then  $\mathcal{M}, v \models \varphi$

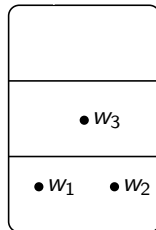
## More on Plausibility Structures

►  $w_1 \sim w_2 \sim w_3$



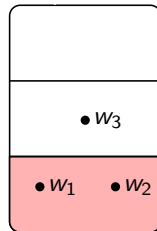
## More on Plausibility Structures

- ▶  $w_1 \sim w_2 \sim w_3$
- ▶  $w_1 \preceq w_2$  and  $w_2 \preceq w_1$  ( $w_1$  and  $w_2$  are equi-plausible)
- ▶  $w_1 \prec w_3$  ( $w_1 \preceq w_3$  and  $w_3 \not\preceq w_1$ )
- ▶  $w_2 \prec w_3$  ( $w_2 \preceq w_3$  and  $w_3 \not\preceq w_2$ )

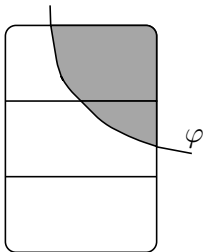


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- ▶  $\{w_1, w_2\} \subseteq \text{Min}_{\preceq}([w_i])$

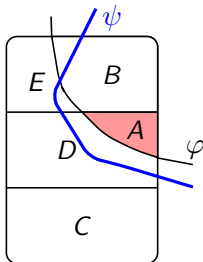


## More on Plausibility Structures



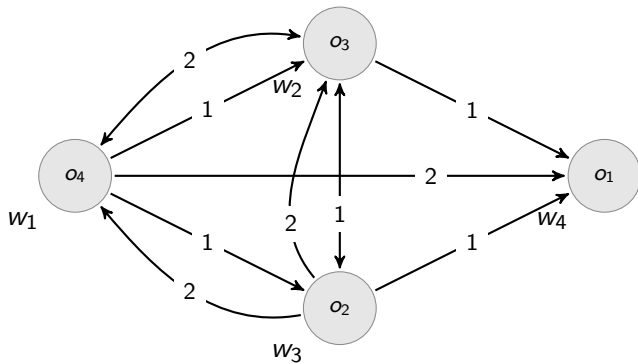
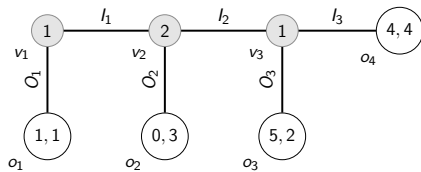


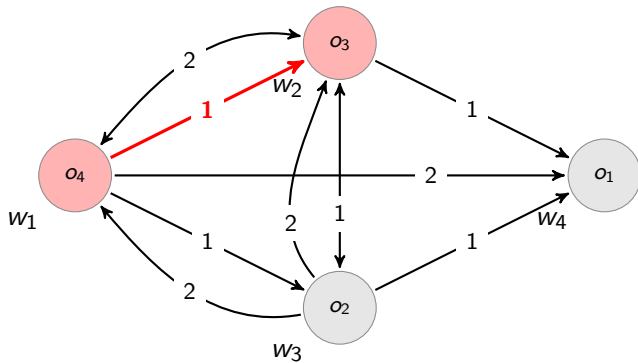
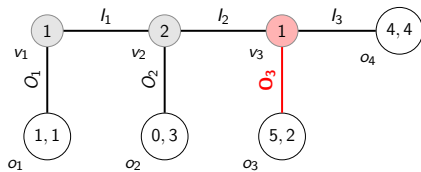
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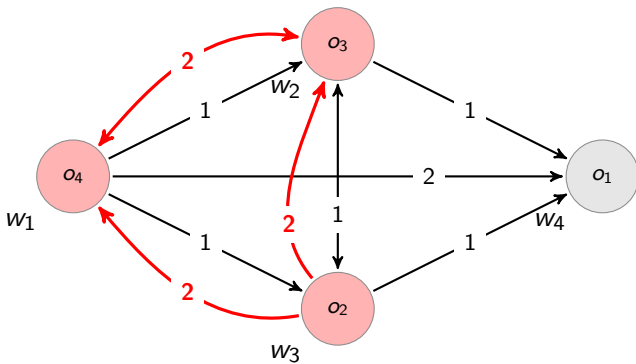
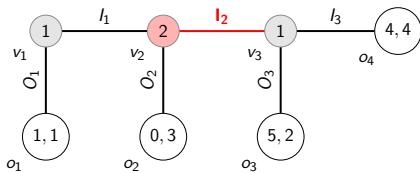


**Conditional Belief:**  $B^{\varphi}\psi$

$$\text{Min}_{\preceq}(W \cap \llbracket \varphi \rrbracket_{\mathcal{M}}) \subseteq \llbracket \psi \rrbracket_{\mathcal{M}}$$







## Game play as public announcements

$$v := \bigvee_{v \rightsquigarrow o} o$$

$$\mathcal{M} = \mathcal{M}^{!v_1}; \mathcal{M}^{!v_2}; \mathcal{M}^{!v_3}; \mathcal{M}^{!o_4}$$

# The Dynamics of Rational Play

A. Baltag, S. Smets and J. Zvesper. *Keep 'hoping' for rationality: a solution to the backward induction paradox*. Synthese, 169, pgs. 301 - 333, 2009.

## Hard vs. Soft Information in a Game

The structure of the game and past moves are 'hard information:  
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## What belief revision policy leads to BI?

**Dynamic Rationality:** The event  $R$  that all players are *rational* changes during the play of the game.

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**Theorem** (Baltag, Smets and Zvesper). Common knowledge of the game structure, of open future and *common stable belief* in dynamic rationality implies common belief in the backward induction outcome.

$$Ck(Struct_G \wedge F_G \wedge [! ]CbRat) \rightarrow Cb(BI_G)$$

When is an example a counterexample?

EP, J.-W. Romeijn and P. Pedersen. *When is an Example a Counterexample?*. Proceedings of TARK, 2013.

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If your friend tells you that she passed the exam, what is the probability that you assign to her completing her PhD and getting a job in the next year?

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What if you are told by Patrick Blackburn that your friend passed the exam?

What if you read it on a list that was posted on the wall?

## Evaluating counterexamples

*. . . information about how I learn some of the things I learn, about the sources of my information, or about what I believe about what I believe and don't believe. If the story we tell in an example makes certain information about any of these things relevant, then it needs to be included in a proper model of the story, if it is to play the right role in the evaluation of the abstract principles of the model.*

Robert Stalnaker. *Iterated Belief Revision*. Erkenntnis 70, pp. 189-209, 2009.

# Belief Change

## Belief Change

Consider the following beliefs of a rational agent:

- $p_1$  All Europeans swans are white.
- $p_2$  The bird caught in the trap is a swan.
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Now suppose the rational agent—for example, You—learn that the bird caught in the trap is black ( $\neg q$ ).

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*Problem:* Logical considerations alone are insufficient to answer this question! Why??

## Belief Change, II

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*Question:* How should the agent incorporate  $\neg q$  into his belief state to obtain a consistent belief state?

*Problem:* Logical considerations alone are insufficient to answer this question!

**There are several logically distinct ways to incorporate  $\neg q$ !**

## Belief Change, II

What extralogical factors serve to determine what beliefs to give up and what beliefs to retain?

## Belief Change, III

Belief revision is a matter of choice, and the choices are to be made in such a way that:

1. The resulting theory squares with the experience;
2. It is simple; and
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## Belief Change, III

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1. The resulting theory squares with the experience;
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3. The choices disturb the original theory as little as possible.

Research has relied on the following related guiding ideas:

1. When accepting a new piece of information, an agent should aim at a minimal change of his old beliefs.
2. If there are different ways to effect a belief change, the agent should give up those beliefs which are least entrenched.

# Belief Revision

A.P. Pedersen and H. Arló-Costa. *"Belief Revision."*. In Continuum Companion to Philosophical Logic. Continuum Press, 2011..

Hans Rott. *Change, Choice and Inference: A Study of Belief Revision and Nonmonotonic Reasoning*. Oxford University Press, 2001.

## AGM Postulates

AGM 1:  $K * \varphi$  is deductively closed

AGM 2:  $\varphi \in K * \varphi$

AGM 3:  $K * \varphi \subseteq \text{Cn}(K \cup \{\varphi\})$

AGM 4: If  $\neg\varphi \notin K$  then  $K * \varphi = \text{Cn}(K \cup \{\varphi\})$

AGM 5:  $K * \varphi$  is inconsistent only if  $\varphi$  is inconsistent

AGM 6: If  $\varphi$  and  $\psi$  are logically equivalent then  $K * \varphi = K * \psi$

AGM 7:  $K * (\varphi \wedge \psi) \subseteq \text{Cn}(K * \varphi \cup \{\psi\})$

AGM 8: if  $\neg\psi \notin K * \varphi$  then  $\text{Cn}(K * \varphi \cup \{\psi\}) \subseteq K * (\varphi \wedge \psi)$

## Counterexample to AGM 2

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## Rott's Counterexample

AGM 7:  $K * (\varphi \wedge \psi) \subseteq Cn(K * \varphi \cup \{\psi\})$

AGM 8: if  $\neg\psi \notin K * \varphi$  then  $Cn(K * \varphi \cup \{\psi\}) \subseteq K * (\varphi \wedge \psi)$

So, if  $\psi \in Cn(\{\varphi\})$ , then  $K * \varphi = Cn(K * \varphi \cup \{\psi\})$

## Rott's Counterexample

There is an appointment to be made in a philosophy department. The position is a metaphysics position, and there are three main candidates: Andrew, Becker and Cortez.

1. Andrew is clearly the best metaphysician, but is weak in logic.
2. Becker is a very good metaphysician, also good in logic.
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**Scenario 1:** Paul is told by the dean, that the chosen candidate is either Andrew or Becker. Since Andrew is clearly the better metaphysician of the two, **Paul concludes that the winning candidate will be Andrew.**

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**Scenario 2:** Paul is told by the dean that the chosen candidate is either Andrew, Becker or Cortez.

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**Scenario 2:** Paul is told by the dean that the chosen candidate is either Andrew, Becker or Cortez.

“ This piece of information sets off a rather subtle line of reasoning. Knowing that Cortez is a splendid logician, but that he can hardly be called a metaphysician, Paul comes to realize that his background assumption that expertise in the field advertised is the decisive criterion for the appointment cannot be upheld. Apparently, competence in logic is regarded as a considerable asset by the selection committee.” **Paul concludes Becker will be hired.**

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“...Rott seems to take the point about meta-information to explain why the example conflicts with the theoretical principles, whereas I want to conclude that it shows why the example does not conflict with the theoretical principles, since I take the relevance of the meta-information to show that the conditions for applying the principles in question are not met by the example.... I think proper attention to the relation between concrete examples and the abstract models will allow us to reconcile some of the beautiful properties with the complexity of concrete reasoning.”

(Stalnaker, 204)

# Iterated Revision

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- I1 If  $\psi \in Cn(\{\varphi\})$  then  $(K * \psi) * \varphi = K * \varphi$ .
- I2 If  $\neg\psi \in Cn(\{\varphi\})$  then  $(K * \varphi) * \psi = K * \psi$



## Iterated Revision

- I1 If  $\psi \in Cn(\{\varphi\})$  then  $(K * \psi) * \varphi = K * \varphi$ .
  - I2 If  $\neg\psi \in Cn(\{\varphi\})$  then  $(K * \varphi) * \psi = K * \psi$
- Postulate I1 demands if  $\varphi \rightarrow \psi$  is a theorem (with respect to the background theory), then first learning  $\psi$  followed by the more specific information  $\varphi$  is equivalent to directly learning the more specific information  $\varphi$ .

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- ▶ Postulate I1 demands if  $\varphi \rightarrow \psi$  is a theorem (with respect to the background theory), then first learning  $\psi$  followed by the more specific information  $\varphi$  is equivalent to directly learning the more specific information  $\varphi$ .
- ▶ Postulate I2 demands that first learning  $\varphi$  followed by learning a piece of information  $\psi$  incompatible with  $\varphi$  is the same as simply learning  $\psi$  outright. So, for example, first learning  $\varphi$  and then  $\neg\varphi$  should result in the same belief state as directly learning  $\neg\varphi$ .

## Stalnaker's Counterexample to I1

<i>UUU</i>	<i>DDD</i>
<i>UUD</i>	<i>DDU</i>
<i>UDU</i>	<i>DUD</i>
<i>UDD</i>	<i>DUU</i>

- ▶ Three switches wired such that a light is on iff all three switches are up or all three are down.

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<i>UUU</i>	<i>DDD</i>
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- ▶ Three switches wired such that a light is on iff all three switches are up or all three are down.
- ▶ Three independent (reliable) observers report on the switches: Alice says switch 1 is *U*, Bob says switch 2 is *D* and Carla says switch 3 is *U*.

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UUD	DDU
UDU	DUD
UDD	DUU

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- ▶ I receive the information that the light is on. What should I believe?

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- ▶ Three switches wired such that a light is on iff all three switches are up or all three are down.
- ▶ Three independent (reliable) observers report on the switches: *Alice says switch 1 is U*, *Bob says switch 2 is D* and *Carla says switch 3 is U*.
- ▶ I receive the information that the light is on. What should I believe?
- ▶ Cautious: *UUU*, *DDD*; Bold: *UUU*

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- Suppose there are two switches:  $L_1$  is the main switch and  $L_2$  is a secondary switch controlled by the first two lights. (So  $L_1 \rightarrow L_2$ , but not the converse)

UUU	DDD
UUD	DDU
UDU	DUD
UDD	DUU

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- ▶ Suppose I receive  $L_1 \wedge L_2$ , this does not change the story.
- ▶ Suppose I learn that  $L_2$ . This is irrelevant to Carla's report, but it means either Ann or Bob is wrong.

## Stalnaker's Counterexample to I1

UUU	DDD
UUD	DDU
UDU	DUD
UDD	DUU

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- ▶ Suppose I learn that  $L_2$ . This is irrelevant to Carla's report, but it means either Ann or Bob is wrong.

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<i>UUD</i>	<i>DDU</i>
<i>UDU</i>	<i>DUD</i>
<i>UDD</i>	<i>DUU</i>

- So,  $L_2 \in Cn(\{L_1\})$  but  
 $(K * L_2) * L_1 \neq K * L_1$ .

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- ▶ Two new independent witnesses, whose reliability trumps that of Alice's and Bert's, provide additional reports on the status of the coins. Carla reports that the coin in box 1 is lying tails up, and Dora reports that the coin in box 2 is lying tails up.
- ▶ Finally, Elmer, a third witness considered the most reliable overall, reports that the coin in box 1 is lying heads up.

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Yet, since  $H_1 \wedge H_2 \in K'$  and  $H_1$  is consistent with  $H_2$ , we must have  $H_1 \wedge H_2 \in K' * H_1$ , which yields a conflict with the assumption that  $H_1 \wedge T_2 \in K' * (T_1 \wedge T_2) * H_1$ .

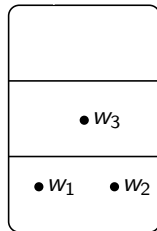
*...[Postulate I2] directs us to take back the totality of any information that is overturned. Specifically, if we first receive information  $\alpha$ , and then receive information that conflicts with  $\alpha$ , we should return to the belief state we were previously in, before learning  $\alpha$ . But this directive is too strong. Even if the new information conflicts with the information just received, it need not necessarily cast doubt on all of that information.*

*(pg. 207–208)*



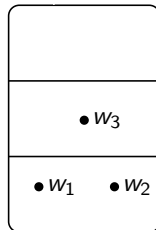
# Informative Actions

►  $w_1 \sim w_2 \sim w_3$



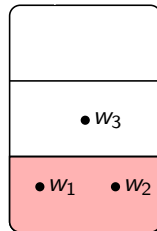
# Informative Actions

- ▶  $w_1 \sim w_2 \sim w_3$
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- ▶  $w_1 \prec w_3$  ( $w_1 \preceq w_3$  and  $w_3 \not\preceq w_1$ )
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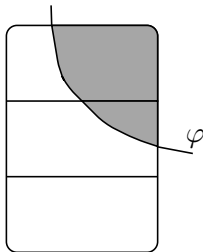


# Informative Actions

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- ▶  $\{w_1, w_2\} \subseteq \text{Min}_{\preceq}([w_i])$

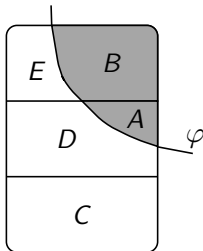


# Informative Actions



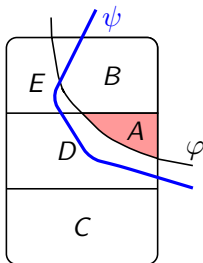
Incorporate the new information  $\varphi$

# Informative Actions



Incorporate the information that  $\varphi$

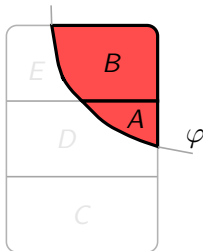
# Informative Actions



**Conditional Belief:**  $B^{\varphi}\psi$

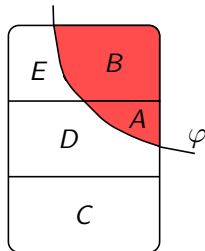
$$\text{Min}_{\preceq}(W \cap \llbracket \varphi \rrbracket_{\mathcal{M}}) \subseteq \llbracket \psi \rrbracket_{\mathcal{M}}$$

## Informative Actions



**Public Announcement:** Information from an infallible source  
 $(!\varphi): A \prec_i B$

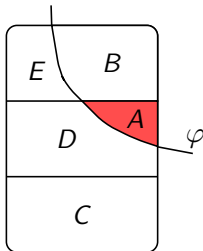
## Informative Actions



**Radical Upgrade:** ( $\uparrow\varphi$ ):  $A \prec_i B \prec_i C \prec_i D \prec_i E$



# Informative Actions



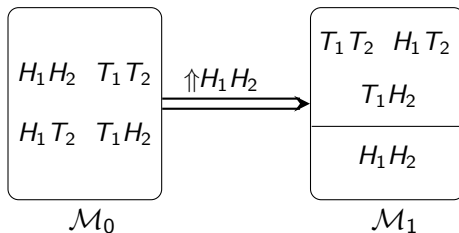
**Conservative Upgrade:**  $(\uparrow\varphi): A \prec_i C \prec_i D \prec_i B \cup E$

## Heuristic Diagnosis of Stalnaker's Example

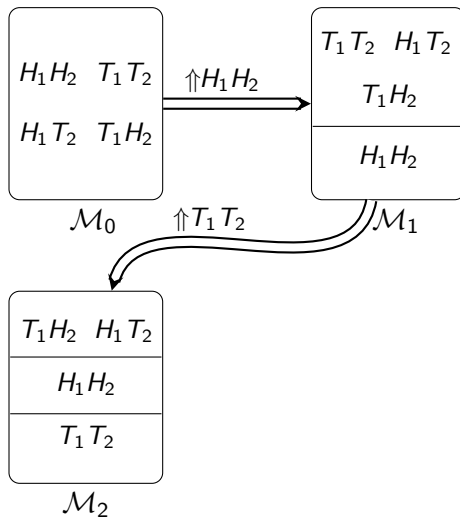
$$\begin{array}{cc} H_1 H_2 & T_1 T_2 \\ H_1 T_2 & T_1 H_2 \end{array}$$

$\mathcal{M}_0$

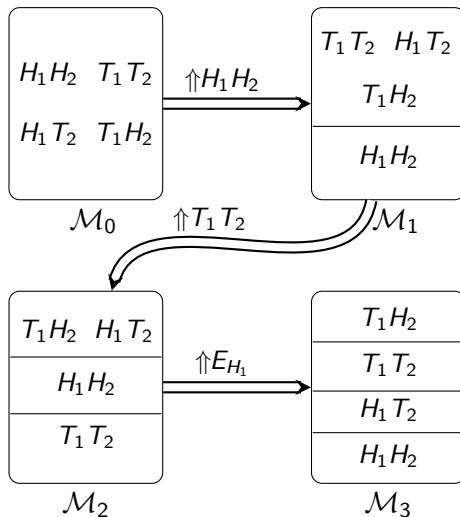
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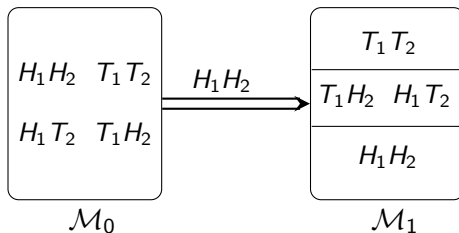


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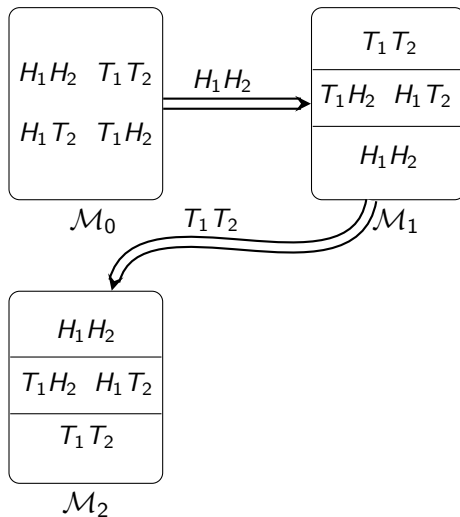
$$\begin{array}{cc} H_1 H_2 & T_1 T_2 \\ H_1 T_2 & T_1 H_2 \end{array}$$

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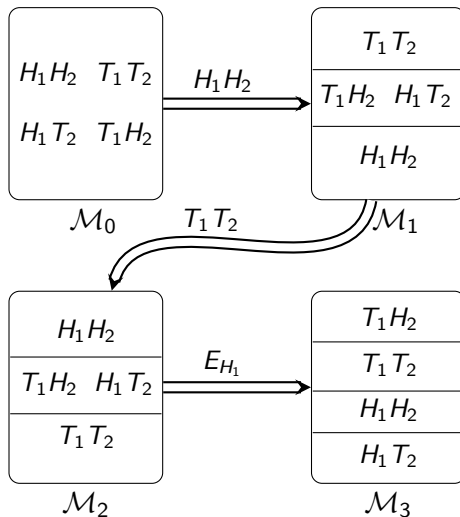


## Heuristic Diagnosis of Stalnaker's Example





# Heuristic Diagnosis of Stalnaker's Example



## What do the Examples Demonstrate?

1. There is no suitable way to formalize the scenario in such a way that the AGM postulates (possibly including postulates of iterated belief revision) can be saved;
2. The AGM framework can be made to agree with the scenario but does not furnish a systematic way to formalize the relevant meta-information; or
3. There is a suitable and systematic way to make the meta-information explicit, but this is something that the AGM framework cannot properly accommodate. Our interest in this paper is the third response, which is concerned with the absence of guidelines for applying the theory of belief revision.

*There are different kinds of independence—conceptual, causal and epistemic—that interact, and one might be able to say more about constraints on rational belief revision if one had a model theory in which causal-counterfactual and epistemic information could both be represented. There are familiar problems, both technical and philosophical, that arise when one tries to make meta-information explicit, since it is self-locating (and auto-epistemic) information, and information about changing states of the world. (pg. 208)*

## A Bayesian Model

1. The reports are independent, the content of the reports are very probable, and the content of subsequent reports are even more probable, thereby canceling out the impact of preceding reports.
2. The meta-information in the example may be such that earlier reports are dependent in a weak sense, so that Elmers report also encourages the agent to change her mind about the coin in the second box.
3. With some imagination, we can also provide a model in which the pairs of reports are independent in the strictest sense, and in which Elmers report is fully responsible for the belief change regarding both coins.

## Discussion, I

- ▶ A proper conceptualization of the event and report structure is crucial (the event space must be rich enough): A theory must be able to accommodate the conceptualization, but other than that it hardly counts in favor of a theory that the modeler gets this conceptualization right.

## Discussion, II

- Belief change by conditioning: There seems to be a trade-off between a rich set of states and event structure, and a rich theory of doxastic actions. How should we resolve this trade-off when analyzing counterexamples to postulates of belief changes over time?

## Discussion, III

- Are there any genuine counterexamples or do we want to reduce everything to misapplication? Under what conditions we can ignore the meta-information, which is often not specified in the description of an example (cf. the work of Halpern and Grünwald on *coarsening at random*).

P. Grünwald and J. Halpern. *Updating Probabilities*. Journal of Artificial Intelligence Research 19, pgs. 243 - 278, 2003.