#### Of judges, aliens and total preorders

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- Introduction
- Pormal Background
- 3 Additional metadata for tpo revision
- Booth and Meyer tpo-revision operators
- Iterating: <u>≺</u>-revision

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#### Motivation

How should a judge change their worldview when presented with new information?

#### Research Context

- Philosophy and artificial intelligence [Fermé and Hansson, 2011]
- Belief change [Darwiche and Pearl, 1997]
  - Nonmonotonic logic
  - Probabilistic reasoning
  - Belief revision
- One-step vs. iterated belief revision

#### Different types of belief

- Belief set [Alchourrón et al., 1985]
- Conditional beliefs [Darwiche and Pearl, 1997]
- Strategy to change conditional beliefs [Booth and Meyer, 2011]

#### Research question

- conditional belief revision operators
- axiomatisation of a family of operators by defining properties
- discuss properties and define concrete example

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## Courtroom example 1

- The agent is a judge in a murder trial, "John" and "Mary" are suspects, the victim might be an alien
- $\bullet \ \Sigma = \{p, q, r\}$ 
  - p = "John is the murderer"
  - q = "Mary is the murderer"
  - r = "The victim is an alien"
- $Int(\Sigma) = W = \{000, 001, 010, 011, 100, 101, 110, 111\}$
- $Mod(p) = [\![p]\!] = \{100, 101, 110, 111\}, 100 \in [\![p]\!]$
- ullet Lower case greek letters used for formulas lpha

#### Belief Sets

- Set of propositions the agent accepts as true at any point in time [Fermé and Hansson, 2011]
- Deductively closed
- Possible for example:  $Cn(\{p \lor q, \neg (p \land q), \neg r\})$

#### Belief Set Revision Postulates<sup>2</sup>

- AGM theory for belief set revision
- minimal change for belief set with new information
- no restrictions on the changes in conditional beliefs

#### **Epistemic States**

- abstract entity  $\mathbb E$  that contain all information an agent need for their reasoning [Darwiche and Pearl, 1997]
- $\bullet$  strategy for reasoning can be modeled as tpo  $\leq_{\mathbb{E}}$  over worlds
- ullet belief sets  $B(\mathbb{E})$  can be extracted from epistemic states
  - Set of most plausible worlds  $min(\top, \leq_{\mathbb{E}})$
  - ullet All sentences true in those worlds:  $Th(min(\top, \leq_{\mathbb{E}}))$

#### Total preorders

- Common tool to handle preference orderings over propositional worlds [Booth and Meyer, 2011]
- binary relation ≤, total, reflexive, transitive
- $\bullet$  < strict,  $\sim$  symmetric closure

#### Preorder example

- Judge beliefs
  - Murderer probably acted alone but possible that they conspired
  - Unlikely, but not impossible, for the victim to be an alien
- $\leq$  over W:  $010 \sim 100 < 000 \sim 110 < 011 \sim 101 < 001 \sim 111$

#### Preorder visualisation

- $\bullet \ [[x]]_{\sim} = \{y \mid y \sim x\}$
- $[[x]] \leq [[y]]$  iff  $x \leq y$

$R_1$	$R_2$	$R_3$	$R_4$
010	000	011	001
100	110	101	111

Table 1: Visualizing a tpo as a linearly ordered set of ranks, as done in [Booth et al., 2006]

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#### Conditional Belief Revision Postulates<sup>3</sup>

- (CR1) If  $v \in [\![\alpha]\!], w \in [\![\alpha]\!]$  then  $v \leq_{\mathbb{E}} w$  iff  $v \leq_{\mathbb{E}*\alpha} w$
- (CR2) If  $v \in \llbracket \neg \alpha \rrbracket, w \in \llbracket \neg \alpha \rrbracket$  then  $v \leq_{\mathbb{E}} w$  iff  $v \leq_{\mathbb{E}*\alpha} w$
- (CR3) If  $v \in [\![\alpha]\!], w \in [\![\neg \alpha]\!]$  then  $v <_{\mathbb{E}} w$  only if  $v <_{\mathbb{E}*\alpha} w$
- (CR4) If  $v \in [\![\alpha]\!], w \in [\![\neg \alpha]\!]$  then  $v \leq_{\mathbb{E}} w$  only if  $v \leq_{\mathbb{E}*\alpha} w$

<sup>&</sup>lt;sup>3</sup>by Darwiche and Pearl [Darwiche and Pearl, 1997] □ → ⟨♂ → ⟨∑ → ⟨∑ → ⟨ ≥ → ⟨ ≥ → ⟨ 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 → | 2 →

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## **Enriching Epistemic States**

- Additional structure  $W^{\pm} = \{x^{\epsilon} \mid x \in W \text{ and } \epsilon \in \{+, -\}\}$
- Interval representing a world  $(w^+,w^-)$
- Worlds are either supported by evidence or not  $w \in [\![\alpha]\!]$  /  $w \in [\![\neg \alpha]\!]$

## ≤-faithful tpo

- ullet original tpo  $\leq$  was an order over W
- ullet  $\leq$  over new  $W^\pm$

## ≤-faithful tpo - definition

- $(\leq 1)$   $\leq$  is a tpo over  $W^{\pm}$
- $(\preceq 2)$   $x^+ \preceq y^+ \text{ iff } x \leq y$
- $(\preceq 3)$   $x^- \preceq y^- \text{ iff } x \leq y$
- $(\preceq 4)$   $x^+ \prec x^-$

## Definition 1 ( $\leq$ -faithful tpo over $W^{\pm}$ [Booth and Meyer, 2011])

Let  $\preceq \subseteq W^{\pm} \times W^{\pm}$ . If  $\preceq$  satisfies  $(\preceq 1)$ - $(\preceq 4)$ , we say  $\preceq$  is a  $\leq$ -faithful tpo (over  $W^{\pm}$ ).

## ≤-faithful tpo visualisation

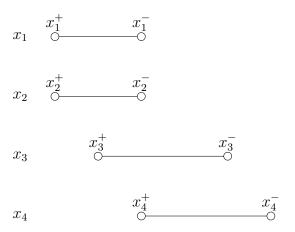


Figure 1: Representation of  $\leq$  over  $W^{\pm}$  using intervals

## Courtroom example: ≤-faithful tpo

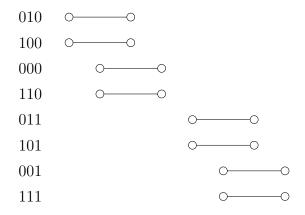


Figure 2: Representation of  $\leq$  over  $W^{\pm}$  for the courtroom example

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#### BM tpo-revision operator

## Definition 2 (Revision operator $*_{\preceq}$ for $\leq$ generated by $\leq$ [Booth and Meyer, 2011])

For each  $\leq$ -faithful tpo  $\preceq$  over  $W^{\pm}$ , refer to  $*_{\preceq}$  as the revision operator for  $\leq$  generated by  $\preceq$  defined by: Set for any  $\alpha \in L$  and  $x \in W$ :

$$r_{\alpha}(x) = \left\{ \begin{array}{l} x^{+} \text{ if } x \in \llbracket \alpha \rrbracket \\ x^{-} \text{ if } x \in \llbracket \neg \alpha \rrbracket \end{array} \right.$$

The revised tpo  $\leq_{\alpha}^*$  is defined by setting, for each  $x,y\in W$ ,

$$x \leq_{\alpha}^{*} y \text{ iff } r_{\alpha}(x) \leq r_{\alpha}(y)$$

#### Courtroom example: Revision Visualised

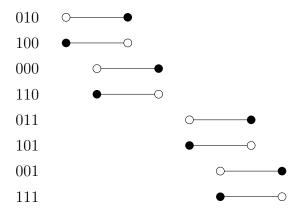


Figure 3: Associating positive and negative representations of worlds after receiving evidence  $\alpha=p$ 

#### Courtroom example: Revision 1

• for  $010, 110 \in W$ , 010 < 110 before, revise by  $\alpha = p$ 

$$010 \in \llbracket \neg \alpha \rrbracket : r_{\alpha}(010) = 010^{-}$$
  
 $110 \in \llbracket \alpha \rrbracket : r_{\alpha}(110) = 110^{+}$ 

- $110^+ \prec 010^-$  is true, set  $110 <_{\alpha}^* 010$
- new tpo  $\leq_{\alpha}^*$  is:  $100 <_{\alpha}^* 110 <_{\alpha}^* 010 <_{\alpha}^* 000 <_{\alpha}^* 101 <_{\alpha}^* 111 <_{\alpha}^* 011 <_{\alpha}^* 001$

## Courtroom example: Revision 2

- new tpo  $\leq_{\alpha}^*$  is:  $100 <_{\alpha}^* 110 <_{\alpha}^* 010 <_{\alpha}^* 000 <_{\alpha}^* 101 <_{\alpha}^* 111 <_{\alpha}^* 011 <_{\alpha}^* 001$
- $min(\top, \leq_{\alpha}^*) = \{100\}$ : "John is the murderer and the victim is not an alien".
- $\leq_{\alpha}^*$  as representation of the conditional beliefs
  - before 010 < 110: "Both suspects being the murderer is less plausible than only Mary being the murderer"
  - now  $110 <^*_{\alpha} 010$ : "Only Mary being the murderer less plausible than both conspiring".

# Properties of BM Revision Operators: Basic properties

```
(*1) \leq_{\alpha}^{*} is a tpo over W
```

(\*2) 
$$\alpha \equiv \gamma \text{ implies } \leq_{\alpha}^* = \leq_{\gamma}^*$$

# Properties of BM Revision Operators: Common rules in iterated belief change

(\*3) If 
$$x, y \in [\alpha]$$
 then  $x \leq_{\alpha}^{*} y$  iff  $x \leq y$ 

(\*4) If 
$$x, y \in \llbracket \neg \alpha \rrbracket$$
 then  $x \leq_{\alpha}^{*} y$  iff  $x \leq y$ 

(\*5) If 
$$x \in [\![\alpha]\!], y \in [\![\neg \alpha]\!]$$
 and  $x \le y$  then  $x <_{\alpha}^* y$ 

## Properties of BM Revision Operators: Supplementary rationality properties

(\*6) If 
$$x \in [\![\alpha]\!], y \in [\![\neg \alpha]\!]$$
 and  $y \leq_{\alpha}^* x$  then  $y \leq_{\gamma}^* x$ 

(\*7) If 
$$x \in [\alpha], y \in [\neg \alpha]$$
 and  $y <_{\alpha}^* x$  then  $y <_{\gamma}^* x$ 

## Family of BM Revision Operators

#### Theorem 1

```
Let * be any revision operator for \leq. Then * is generated from some \leq-faithful tpo \leq over W^{\pm} iff * satisfies (*1)-(*7). [Booth and Meyer, 2011]
```

#### Non-priotized revision

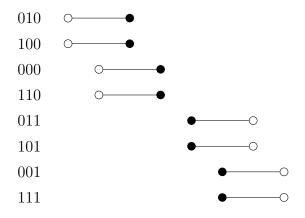


Figure 4: Non-prioritised revision by  $\alpha=r$ 

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## A concrete operator 4: Setup

- Function p mapping worlds to real numbers:  $p:W^{\pm}\mapsto\mathbb{R}$
- Interval representing a world x:  $(p(x^+), p(x^-))$
- Distance between representations:  $p(x^-) p(x^+) = a > 0$
- Define a tpo from p:  $x^{\epsilon} \leq_p y^{\delta}$  iff  $p(x^{\epsilon}) \leq p(y^{\delta})$



#### A concrete operator: Iteration

- Choose initial p so that  $\leq_p = \leq$
- Revise p by  $\alpha$  to  $p * \alpha$ , for every  $x^{\epsilon} \in W^{\pm}$ :

$$(p * \alpha)(x^{\epsilon}) = \begin{cases} p(x^{\epsilon}) \text{ if } x \in \llbracket \alpha \rrbracket \\ p(x^{\epsilon}) + a \text{ if } x \in \llbracket \neg \alpha \rrbracket \end{cases}$$

• Define a revised tpo  $\leq_{p*\alpha}$  from  $p*\alpha$ :  $x^{\epsilon} \leq_{p*\alpha} y^{\delta}$  iff  $(p*\alpha)(x^{\epsilon}) \leq (p*\alpha)(y^{\delta})$ 

## Courtroom Example: A concrete operator

- $\leq_{p*\alpha}$  for  $\alpha = p$
- Choose initial p so that  $\leq_p = \leq$ 
  - $010: (p(010^+), p(010^-)) = (0, a).$
  - $100: (p(100^+), p(100^-)) = (0, a).$
- Revise p by  $\alpha$  to  $p * \alpha$ 
  - $010 \in \llbracket \neg \alpha \rrbracket : (p(010^-), p(010^-) + a) = (a, 2a)$
  - $100 \in \llbracket \alpha \rrbracket : (p(100^+), p(100^-)) = (0, a)$

#### Courtroom Example: Visualised

Figure 5:  $\leq_{p*\alpha}$  for  $\alpha = p$ 

## Courtroom Example: Conditional beliefs 1

010	×		OO
100	×		OO
000		×	0
110		×	0
011			OO
101			0
001			0
111			0

Figure 6:  $\leq_{p*\alpha}$  for  $\alpha = r$ 

## Courtroom Example: Conditional beliefs 2

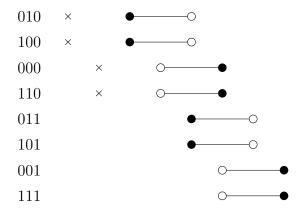


Figure 7:  $\leq_{p*\alpha*\beta}$  for  $\beta=(p\vee q)\wedge(\neg p\vee \neg q)$ 

## Thank You

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