

# Horn belief contraction: remainders, envelopes, complexity

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Sept 12, 2012

- ▶ belief contraction
- ▶ Horn formulas
- ▶ Horn belief contraction
- ▶ open problems

# Belief change

- ▶ how to handle knowledge which is incomplete, imperfect and changing?
- ▶ revision: how to incorporate new information which contradicts previous knowledge?
  - ▶ scientific theory, knowledge base
- ▶ contraction: how to delete knowledge we do not believe anymore to be true?
- ▶ (Levi identity) revision with  $\varphi$  : contract  $\neg\varphi$ , add  $\varphi$
- ▶ Alchourrón, Makinson, Gärdenfors (1985)
- ▶ Fermé, Hansson (2011): *AGM 25 years*

# Belief contraction: an example

- ▶ knowledge base:
  - ▶  $\{a \rightarrow b, b \rightarrow c\}$
- ▶ consequence:
  - ▶  $a \rightarrow c$
- ▶ contract the consequence!
  - ▶ new knowledge base, version I:
    - ▶  $a \rightarrow b$
  - ▶ new knowledge base, version II:
    - ▶  $a, c \rightarrow b$
    - ▶  $b \rightarrow c$

# Belief contraction: basic notions

- ▶  $K$ : theory in **full** propositional logic (belief set), set of formulas closed under logical consequence
- ▶  $\varphi$ : consequence of  $K$  to be contracted
- ▶  $\dot{-}$ : contraction operator
- ▶  $K\dot{-}\varphi$ : result of the contraction

# Belief contraction: (basic) AGM postulates

- ▶ (closure)  $K \dot{-} \varphi$  is a belief set
- ▶ (inclusion)  $K \dot{-} \varphi \subseteq K$
- ▶ (vacuity) if  $\varphi \notin K$  then  $K \dot{-} \varphi = K$
- ▶ (success) if  $\varphi$  is not a tautology then  $\varphi \notin K \dot{-} \varphi$
- ▶ (extensionality) if  $\varphi \equiv \psi$  then  $K \dot{-} \varphi = K \dot{-} \psi$
- ▶ (recovery)  $K \subseteq \text{Cn}((K \dot{-} \varphi) \cup \{\varphi\})$

# Partial meet contraction

- ▶ **remainder** of  $K$  with respect to  $\varphi$ : maximal subtheory of  $K$  not implying  $\varphi$ ; **add a single counter-model of  $\varphi$  to  $K$**
- ▶  $K \perp \varphi$ : family of all remainders
- ▶ selection:  $\gamma(\varphi) \subseteq K \perp \varphi$
- ▶ **partial meet contraction**:

$$K \dot{-} \varphi = \bigcap_{X \in \gamma(\varphi)} X$$

## Theorem

*(AGM) A contraction operator satisfies the AGM postulates iff it is a partial meet contraction.*

# Computational issues

- ▶ reasoning in propositional logic is computationally hard
- ▶ belief change is even harder: Eiter, Gottlob (1992), Nebel (1998), Liberatore (2000)
- ▶ consider belief change in computationally tractable fragments of propositional logic
- ▶ Flouris, Plexousakis, Antoniou (2004): belief contraction in arbitrary logics



# Horn Formulas, entailment

- ▶ Horn clause: at most one unnegated variable, e.g.  
 $C = \bar{a} \vee \bar{b} \vee c$ , written as  $a, b \rightarrow c$ ,  $Body(C) = \{a, b\}$ ,  
 $Head(C) = c$
- ▶ definite clause: exactly one unnegated variable
- ▶ (definite) formula: conjunction of (definite) Horn clauses
- ▶ Horn function: representable by a Horn formula
- ▶ entailment:  $(a, b \rightarrow c) \wedge (c \rightarrow d) \models (a, b \rightarrow d)$
- ▶ implicate:  $K \models C$
- ▶ prime implicate: no subclause is an implicate
- ▶ forward chaining - efficient

# Horn logic in AI

- ▶ reasoning in Horn logic is computationally easy
- ▶ equivalent formalisms: closures, lattices, functional dependencies
- ▶ Horn logic is the framework for many applications, it is natural for human reasoning
- ▶ Poole - Mackworth: *Artificial Intelligence: Foundations of Computational Agents*, 2010:
  - ▶ 'uses rational computational agents and Horn clause logic as unifying threads in this vast field'

# Horn belief contraction

- ▶ Booth, Meyer, Varzinczak (2009)
- ▶ Booth, Meyer, Varzinczak, Wasserman (2010, 2011)
- ▶ Creignou, Papini, Pichler, Woltran (2012) + other fragments
- ▶ Delgrande (2008)
- ▶ Delgrande, Peppas (2011): revision
- ▶ Delgrande, Wassermann (2010, 2011)
- ▶ Fotinopoulos, Papadopoulos (2009)
- ▶ Langlois, Sloan, Szörényi, T. (2008)
- ▶ Ribeiro (2010)
- ▶ Wu, Zhang, Zhang (2011)
- ▶ Zhuang, Pagnucco (2010, 2010, 2011, 2012)

# Our results

- ▶ positive computational result on finding remainders represented by counter-model
- ▶ negative computational result on the Horn formula size of the contraction

# Horn formulas and intersection closure

- ▶ intersection of two vectors:  $(1, 0, 1) \cap (0, 1, 1) = (0, 0, 1)$
- ▶ a Boolean function  $f$  is closed under intersection if  $f(x) = f(y) = 1$  implies  $f(x \cap y) = 1$  (or:  $T(f)$  is closed under intersection)

## Theorem

(McKinsey, 1943)

*A Boolean function is Horn if and only if it is closed under intersection.*

- ▶  $x \oplus y$  is not Horn:  $1 \oplus 0 = 1$ ,  $0 \oplus 1 = 1$ ,  $0 \oplus 0 = 0$ .

# Horn envelope or Horn LUB

- ▶  $Env(\psi)$  is the conjunction of all Horn implicates of  $\psi$
- ▶  $T(Env(\psi))$  is the closure of  $T(\psi)$  under intersection
- ▶  $Env(x \oplus y) = \bar{x} \vee \bar{y}$

# Remainders for Horn formulas

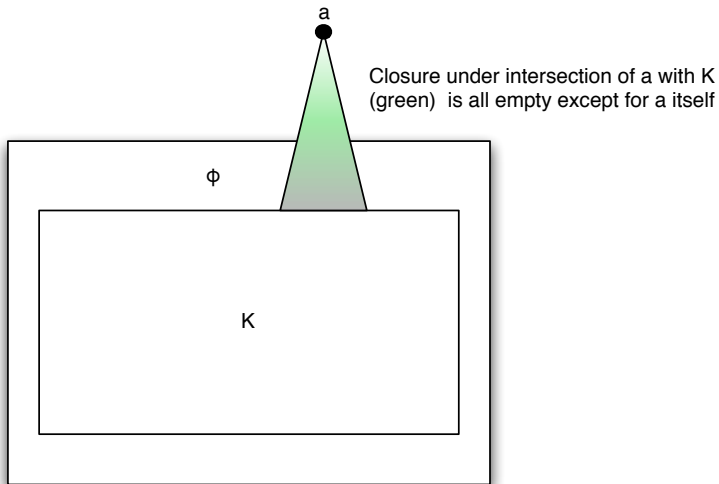
- ▶ Horn belief set  $K$ , consequence  $\varphi$  to be contracted
- ▶ **remainder** (reminder): a maximal subset of  $K$  which does not imply  $\varphi$
- ▶ in terms of truth assignments: a minimal extension of  $T(K)$  not contained in  $T(\varphi)$ ; **not all counter-models work!**
- ▶  **$Env(K \vee C_a) : T(Env(K \vee C_a)) \wedge F(\varphi) = \{a\}$**
- ▶  $a = (1, 0, 1) : C_a = x \wedge \bar{y} \wedge z$

# Question

- ▶ which counter-models of  $\varphi$  can be added as a single point extension?



# Picture of what we need



# Example

- ▶ variables  $a, b, c$
- ▶  $K = a \wedge b, \varphi = a \wedge b$
- ▶ models: 110, 111
- ▶ add counter-model 000: new formula is

$$(a \rightarrow b) \wedge (b \rightarrow a) \wedge (c \rightarrow a)$$

- ▶ add counter-model 001: envelope includes 000, new formula for envelope is

$$(a \rightarrow b) \wedge (b \rightarrow a)$$

not maximal

# Closure, body - building formula

## Definition

(Closure)  $X$ : set of variables

$$Cl_K(X) = \{v : K \models (X \rightarrow v)\}$$

## Definition

(Body-building formula)

$$K^\varphi = \bigwedge_{C \in \varphi} \bigwedge_{v \notin Cl_K(Body(C))} (Body(C), v \rightarrow Head(C))$$

# Characterization of remainders

## Theorem

*Env( $K \vee C_a$ ) is a remainder iff **a satisfies  $K^\varphi$**  and falsifies  $\varphi$ .*

- ▶ new characterization of quasi-closed sets for closures

## Corollary

*Remainders **represented by their 'generating' truth assignments** can be listed with polynomial delay.*

## Example continued

- ▶  $K = a \wedge b$ ,  $\varphi = a \wedge b$
- ▶  $Cl_K(\emptyset) = \{a, b\}$
- ▶  $K^\varphi = (c \rightarrow a) \wedge (c \rightarrow b)$
- ▶ remainders: 000, 010, 100, but **not** 001, 011, 101

# Partial meet contractions

- ▶ a **partial meet contraction** is an intersection of remainders



$$Env \left( K \vee \bigvee_{a \in A} C_a \right)$$

where  $A \subseteq T(K^\varphi) \wedge F(\varphi)$

- ▶ **maxichoice**: singleton, **full meet**: equality

# Question

- ▶ can the new belief sets can be computed efficiently?
- ▶ Eiter, Makino (2008): negative results for envelopes of Horn disjunctions

# Formula that blows up after contraction

- ▶ belief set  $K_n$

$$x_i \rightarrow v_i, \quad y_i \rightarrow v_i, \quad 1 \leq i \leq n$$

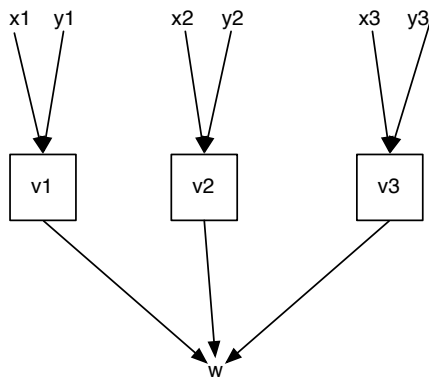
$$v_1, \dots, v_n \rightarrow w$$

- ▶ consequence  $\varphi_n$  to be contracted

$$x_1, y_1, \dots, x_n, y_n, w \rightarrow v_1$$



## Formula that blows up after contraction ( $n = 3$ )



# A blow-up result

## Theorem

- ▶ *Every Horn formula representation of the full meet contraction of  $\varphi_n$  from  $K_n$  has at least  $2^n$  clauses.*
- ▶ *For every  $\epsilon > 0$  and for almost all maxichoice contractions of  $\varphi_n$  from  $K_n$ , every Horn formula representation has at least  $2^{((1/2)-\epsilon)n}$  clauses.*
- ▶ *For almost all partial meet contractions of  $\varphi_n$  from  $K_n$ , every Horn formula representation has at least  $2^n$  clauses.*
- ▶ also applies to **weak** remainders

## Lower bound lemma

- ▶ let  $A$  be a set of truth assignments such every  $u$ -variable and  $w$  is always set to 1,  $v_1$  is always set to 0, and there are altogether  $k$  variables which are set to 0 in some  $a \in A$

### Theorem

*Every Horn formula representing*

$$\text{Env} \left( K \vee \bigvee_{a \in A} C_a \right)$$

*contains at least  $2^k$  clauses.*

# Open problems

- ▶ are there examples where **every** maxichoice/partial meet contraction is large?
- ▶ infra-remainders (Booth et al.), epistemic entrenchment (Zhuang, Pagnucco - Horn cores), semantic approaches
- ▶ Horn belief revision (Delgrande, Peppas)
- ▶ integration of reasoning, revision and learning into an efficient framework for developing knowledge bases (belief revision + **theory revision?**)