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> ISAIM, FL 1/3/2018



>70 papers









 $\forall x : Agents$ 



 $\forall x : Agents$ 

 $Powerful(x) + Autonomous(x) + Intelligent(x) = Dangerous(x)/Destroy_Us$ 



 $\forall x : Agents$ Powerful(x) + Autonomous(x) + Intelligent(x) = Dangerous(x)/Destroy\_Us



 $\forall x : Agents$ 

 $Powerful(x) + Autonomous(x) + Intelligent(x) = Dangerous(x)/Destroy_Us$ 

 $u(\operatorname{AIA}_i(\pi_j)) > \tau^+ \in \mathbb{Z} \text{ or } \tau^- \in \mathbb{Z}$ 

NHK WORLD - GLOBAL AGENDA AI and Ethics: Overcoming the... https://www.facebook.com/nhkworld/videos/1858412994205448/ Bart Selman (Professor, Cornell University) Selmer Bringsjord (Director, Rensselaer Artificial Intelligence and ...

# The PAID Problem

### $\forall x : Agents$ Powerful(x) + Autonomous(x) + Intelligent(x) = Dangerous(x)/Destroy\_Us

#### Are Autonomous-and-Creative Machines Intrinsically Untrustworthy?\*

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#### Abstract

Given what we find in the case of human cognition, the following principle appears to be quite plausible: An artificial agent that is both autonomous (A) and creative (C) will tend to be, from the viewpoint of a rational, fully informed agent, (U) untrustworthy. After briefly explaining the intuitive, internal structure of this disturbing principle, in the context of the human sphere, we provide a more formal rendition of it designed to apply to the realm of intelligent artificial agents. The more-formal version makes use of some of the basic structures available in one of our cognitive-event calculi, and can be expressed as a (confessedly — for reasons explained naïve) theorem. We prove the theorem, and provide simple demonstrations of it in action, using a novel theorem prover (ShadowProver). We then end by pointing toward some future defensive engineering measures that should be taken in light of the theorem.

#### Contents

	<i>Joint Circles</i>
1	Introduction
2	The Distressing Principle, Intuitively Put
3	The Distressing Principle, More Formally Put
	3.1 The Ideal-Observer Point of View
	3.2 Theory-or-Mind-Creativity
	3.4 The Denrite Corridge Event Calculus (22 <sup>5</sup> CC)



 $\forall x : Agents$ 

 $Powerful(x) + Autonomous(x) + Intelligent(x) = Dangerous(x)/Destroy_Us$ 

 $u(\operatorname{AIA}_i(\pi_j)) > \tau^+ \in \mathbb{Z} \text{ or } \tau^- \in \mathbb{Z}$ 

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# The PAID Problem

 $\forall x : Agents$ 

Powerful(x) + Autonomous(x) + Intelligent(x) = Dangerous(x)/Destroy\_Us

$$u(\operatorname{AIA}_i(\pi_j)) > \tau^+ \in \mathbb{Z} \text{ or } \tau^- \in \mathbb{Z}$$

**Theorem ACU:** In a collaborative situation involving agents a (as the "trustor") and a' (as the "trustee"), if a' is at once both autonomous and ToM-creative, a' is untrustworthy from an ideal-observer o's viewpoint, with respect to the action-goal pair  $\langle \alpha, \gamma \rangle$  in question.

**Proof**: Let *a* and *a'* be agents satisfying the hypothesis of the theorem in an arbitrary collaborative situation. Then, by definition,  $a \neq a'$  desires to obtain some goal  $\gamma$  in part by way of a contributed action  $\alpha_k$  from *a'*, *a'* knows this, and moreover *a'* knows that *a* believes that this contribution will succeed. Since *a'* is by supposition ToM-creative, *a'* may desire to surprise *a* with respect to *a*'s belief regarding *a'*'s contribution; and because *a'* is autonomous, attempts to ascertain whether such surprise will come to pass are fruitless since what will happen is locked inaccessibly in the oracle that decides the case. Hence it follows by TRANS that an ideal observer *o* will regard *a'* to be untrustworthy with respect to the pair  $\langle \alpha, \gamma \rangle$  pair. **QED** 

Logic *can* save us, but it's not quite as easy as *this* to use logic to save the day ...

# Logic Thwarts Landru!



First Suspicion That It's a Mere Computer Running the Show



## Logic Thwarts Landru!



Landru is Indeed Merely a Computer (the real Landru having done the programming)



# Logic Thwarts Landru!



Landru Kills Himself Because Kirk/Spock Argue He Has Violated the Prime Directive for Good by Denying Creativity to Others



### Logic Thwarts Nomad! (with the Liar Paradox)







### Making Ethically Correct Robots/Machines in Four Not-so-easy Steps













### Step I

- I. Pick a theory
- 2. Pick a code
- 3. Run through EH:DCEC\*.

























































1716



Leibniz



1716



Leibniz I.5 centuries < Boole! 2.5 centuries < Kripke vindicated by Robinson 2.5 centuries later
"Universal Cognitive Calculus"





1716



Leibniz 1.5 centuries < Boole! 2.5 centuries < Kripke vindicated by Robinson 2.5 centuries later "Universal Cognitive Calculus"





1716



Leibniz 1.5 centuries < Boole! 2.5 centuries < Kripke vindicated by Robinson 2.5 centuries later









Leibniz 1.5 centuries < Boole! 2.5 centuries < Kripke vindicated by Robinson 2.5 centuries later



I.5 centuries < Boole! 2.5 centuries < Kripke vindicated by Robinson 2.5 centuries later



2.5 centuries < Kripke vindicated by Robinson 2.5 centuries later



I.5 centuries < Boole!
2.5 centuries < Kripke
vindicated by Robinson 2.5 centuries later</pre>

"Universal	Universal	
Cognitive	Cognitive	$\mathcal{DCEC}^*$
Calculus"	Calculus	System $c_{-}$ Optical [set [ Agent   ActionType   Actio
THE REAL PROPERTY OF THE PARTY	Found	$\frac{S = -\infty}{Moment   Bookan   Fluxet   Numeric} \frac{C(t, \theta) \le S_1 = -S \le K_1}{K(a_1, a_1, \dots, K(a_k, a_k, \theta))}   [k_3] \frac{K(a_1, \theta)}{\theta}   [k_3]$ action: Appet > Action identify: Fluxet > Bookan $\frac{C(t, K(a_1, a_1 - e_2)) \rightarrow K(a_1, a_2, \theta)}{C(t, K(a_1, a_1 - e_2)) \rightarrow K(a_1, a_2, \theta) \rightarrow K(a_1, a_2, \theta)}   [k_3]$
STC TIME COLL CTD: Times	round	hald: Fixer: Khornet - Boolean $C_{1}^{(1)} = m(x_{1}^{-1} - w_{2}^{-1})^{-2} = m(x_{2}^{-1} - w_{2})^{-2} = m(x_{2}^{-1} -$
CONTRA- OF TAKE		$ \begin{array}{ll} prior: Moment \times Moment \rightarrow Boolaan \\ interval: Moment \rightarrow Boolaan \\ + : Agam = Satt \\ projet : Agam \times Moment \rightarrow Nament \\ projet : Agam \times Moment \rightarrow Nament \\ \hline B(x,t,0) \\ B(x,t,x,0) \\ \hline B(x,t,x,0) \\ \hline$
		$r = x: S [ c: S ] f(t_1,, t_6) = \frac{a(c_1, a(c_2, a(c_3))}{F(c_1, a(c_2, a(c_3))} (a(c_1, a(c_2, a(c_3))))} = \frac{a(c_1, a(c_2, a(c_3))}{F(c_1, a(c_2, a(c_3))} [B_{13}]]$ $r: Bothers [ -b   0 +  0 + \sqrt{ 0 +  $
STATIA ADVA STUTI		$\stackrel{e^{-s}}{\underset{0(z,t,\theta) \in I}{B(z,t,\theta) \in I}(p(z,t,\theta)deg(rd)(z^{t},0),z^{t}))}{\underset{0(z,t,\theta) = prov(artim(z^{t},0),z^{t}))}{W(z,t,\theta) = \frac{\theta + \psi}{U(z,t,\theta,\gamma) \in U(z,t,\gamma)}} \frac{e^{u \cdot \psi}}{ t_{1,1} }$ Rules of Inference
	Syntax	$\frac{[R_1]}{\mathbf{C}(t \ \mathbf{P}(a \ t \ \phi) \to \mathbf{K}(\mathbf{n})} \begin{bmatrix} R_1 \end{bmatrix} = \frac{[R_1]}{\mathbf{C}(t \ \mathbf{K}(a \ t \ \phi) \to \mathbf{R}(a \ t \ \phi))} \begin{bmatrix} R_2 \end{bmatrix}$
	Object   Agent   Self $\square$ Agent   ActionType   Action S ::=	$\mathbf{C}(t,\mathbf{r}(a,t,\phi)) \neq \mathbf{K}$ $\mathbf{C}(t,\mathbf{r}(a,t,\phi)) \neq \mathbf{C}(a,t,\phi)$ $\mathbf{K}(a,t,\phi)$
		$\mathbf{K}(a_1,t_1,\ldots\mathbf{K}(a_n,t_n,t_n)) = \begin{bmatrix} R_3 \end{bmatrix}  \underbrace{ \ } \phi  [R_4]$
1716	$\mathit{action}: Agent \times Action Type \to Action \qquad \qquad 2016$	$\overline{\mathbf{C}(t,\mathbf{K}(a,t_1,\phi_1\to \mathbf{Q},\mathbf{Q},\phi_1),\mathbf{K}(a,t_3,\phi_3))}  [R_5]$
	$initially$ : Fluent $\rightarrow$ Boolean $holds$ : Fluent $\times$ Moment $\rightarrow$ Boolean Al of Today: What Would Leibr	hiz Say? $[a,t_1,\phi_1 \rightarrow \phi_2) \rightarrow \mathbf{B}(a,t_2,\phi_1) \rightarrow \mathbf{B}(a,t_3,\phi_3))$ $[R_6]$
	happens : Event × Moment → Boole "Sorry, not impressed."	$(t_1, \phi_1 \to \phi_2) \to \mathbf{C}(t_2, \phi_1) \to \mathbf{C}(t_2, \phi_2))  [R_7]$
	clipped : Moment × Fluent × Momel	$\frac{(1)}{(1)} = \frac{(1)}{(2)} = \frac{(2)}{(2)} = $
	terminates : Event × Fluent × Mome	
	prior: Moment × Moment → Boole	$[1 \land \dots \land \phi_n \to \phi] \to [\phi_1 \to \dots \to \phi_n \to \psi]) \qquad \qquad$
Leibniz	interval : Moment × Boolean * : Agent → Self	$\frac{\mathbf{B}(a,t,\psi) \mathbf{B}(a,t,\psi)}{\mathbf{B}(a,t,\psi)}  [R_{11a}]  \frac{\mathbf{B}(a,t,\psi) \mathbf{B}(a,t,\psi)}{\mathbf{B}(a,t,\psi)}  [R_{11b}]$
I.5 centuries < Boole!	payoff: Agent  imes ActionType  imes Moment  o Numeric	$\frac{\mathbf{S}(s,h,t,\phi)}{\mathbf{B}(h,t,\mathbf{B}(s,t,\phi))}  [R_{12}]$
2.5 centuries < Kripke	$t ::= x : S \mid c : S \mid f(t_1, \dots, t_n)$	$\mathbf{I}(a,t,happens(action(a^*,\alpha),t'))$
vindicated by Robinson 2.5 centuries later		$\overline{\mathbf{P}(a,t,happens(action(a^*,\alpha),t))}  [K_{13}]$
	<i>t</i> : Boolean $ \neg\phi \phi\wedge\psi \phi\vee\psi \forall x: S. \phi   \exists x: S. \phi$	$\mathbf{B}(a,t,\phi) \ \mathbf{B}(a,t,\mathbf{O}(a^*,t,\phi,happens(action(a^*,\alpha),t')))$ $\mathbf{O}(a,t,\phi,happens(action(a^*,\alpha),t'))$
	$\phi ::= \frac{\mathbf{r}(a,t,\phi) \mid \mathbf{K}(a,t,\phi) \mid \mathbf{C}(t,\phi) \mid \mathbf{S}(a,b,t,\phi) \mid \mathbf{S}(a,t,\phi)}{\mathbf{B}(a,t,\phi) \mid \mathbf{D}(a,t,b) \mid \mathbf{C}(a,t,\phi) \mid \mathbf{L}(a,t,b) \mid \mathbf{S}(a,t,\phi) \mid \mathbf{S}(a,$	$\frac{\mathbf{K}(a,t,\mathbf{u},a^*,t,happens(action(a^*,\alpha),t'))}{\mathbf{K}(a,t,\mathbf{I}(a^*,t,happens(action(a^*,\alpha),t')))}  [R_{14}]$
	$\mathbf{O}(a,t,\phi,happens(action(a^*,\alpha),t')) = \mathbf{O}(a,t,\phi,happens(action(a^*,\alpha),t'))$	$\frac{\phi \leftrightarrow \psi}{\left[R_{15}\right]}$

 $\frac{\mathbf{I} \cdot \mathbf{I}}{\mathbf{O}(a,t,\phi,\gamma) \leftrightarrow \mathbf{O}(a,t,\psi,\gamma)} \quad [R_{15}]$ 





### Moral/Ethical Stack





### Moral/Ethical Stack





Infinitary (AoI 2) 🧝

### Moral/Ethical Stack





Infinitary (AoI 2) 🧝



### $S ::= Object | Agent | ActionType | Action \subseteq Event | Moment | Formula | Fluent$ $action: Agent \times ActionType \rightarrow \overset{Moral/Ethical Stack}{Action}$ initially Provide Stack Formula $\mathcal{DCEC}^{*}_{CI}$ *Holds* : Fluent $\times$ Moment $\rightarrow$ Fe $DCEC^*$ happens $\cdot \Box_{\mathcal{ADR}^{M}}$ Moment $\rightarrow \mathcal{ADR}^{M}$ f ::=clipped $\checkmark$ Fluent $\times$ Noment $\rightarrow$ rormula Fluent $\times$ Moment $\rightarrow$ Formula initiates a b $\times$ Fluent $\times$ Moment $\rightarrow$ Formula terminal R *prior* : Moment imes Moment $\rightarrow$ Formula $t ::= x : S \mid c : S \mid f(t_1, \dots, t_n)$ $\mathbf{f}$ t: Formula $|\neg \phi | \phi \land \psi | \phi \lor \psi | \mathbf{P}(a,t,\phi) | \mathbf{K}(a,t,\phi) | \mathbf{C}(t,\phi)$ $\phi ::= \left\{ \mathbf{S}(a,b,t,\phi) \mid \mathbf{S}(a,t,\phi) \mid \mathbf{B}(a,t,\phi) \mid \mathbf{D}(a,t,Holds(f,t')) \mid \mathbf{I}(a,t,\phi) \right\}$ $\bigcup O(a,t,\phi,(\neg)happens(action(a^*,\alpha),t'))$

### Syntax



### $S ::= Object | Agent | ActionType | Action \subseteq Event | Moment | Formula | Fluent$ $action: Agent \times ActionType \rightarrow \overset{Moral/Ethical Stack}{Action}$ initially Provide Stack Formula $\mathcal{DCEC}^{*}_{CI}$ *Holds* : Fluent $\times$ Moment $\rightarrow$ F( $DCEC^*$ happens $\cdot \Box_{\mathcal{ADR}^{M}}$ Moment $\rightarrow \mathcal{ADR}^{M}$ f ::=clipped $\checkmark$ Fluent $\times$ Noment $\rightarrow$ rormula Fluent $\times$ Moment $\rightarrow$ Formula initiates a b $\times$ Fluent $\times$ Moment $\rightarrow$ Formula terminal R *prior* : Moment imes Moment $\rightarrow$ Formula $t ::= x : S \mid c : S \mid f(t_1, \dots, t_n)$ $\mathbf{f}$ t: Formula $|\neg \phi | \phi \land \psi | \phi \lor \psi | \mathbf{P}(a,t,\phi) | \mathbf{K}(a,t,\phi) | \mathbf{C}(t,\phi)$ $\phi ::= \left\{ \mathbf{S}(a,b,t,\phi) \mid \mathbf{S}(a,t,\phi) \mid \mathbf{B}(a,t,\phi) \mid \mathbf{D}(a,t,Holds(f,t')) \mid \mathbf{I}(a,t,\phi) \right\}$ $\bigcup O(a,t,\phi,(\neg)happens(action(a^*,\alpha),t'))$

### Syntax



 $S ::= \text{Object} | \text{Agent} | \text{ActionType} | \text{Action} \sqsubseteq \text{Event} | \text{Moment} | \text{Formula} | \text{Fluent} | \\ f ::= \begin{cases} action : \text{Agent} \times \text{ActionType} \rightarrow \text{Action} \\ initially : \text{Fluent} \Rightarrow \text{Formula} & \mathcal{D}CEC_{cL} \\ Holds : \text{Fluent} \times \text{Moment} \Rightarrow \text{Fe} & \mathcal{D}CEC^* \\ happens : \text{Event} & \text{Moment} \Rightarrow \text{Fe} & \mathcal{D}CEC^* \\ happens : \text{Event} & \text{Moment} \Rightarrow \text{Fe} & \mathcal{D}CEC^* \\ clipped & & \text{Fluent} \times \text{Moment} \Rightarrow \text{Formula} \\ initiates & & \text{Fluent} \times \text{Moment} \Rightarrow \text{Formula} \\ terminal & & \text{Fluent} \times \text{Moment} \Rightarrow \text{Formula} \\ prior : \text{Moment} \times \text{Fluent} \times \text{Moment} \Rightarrow \text{Formula} \\ t ::= x : S | c : S | f(t_1, \dots, t_n) \\ \phi ::= \begin{cases} t : \text{Formula} | \neg \phi | \phi \land \psi | \phi \lor \psi | \mathbf{P}(a, t, \phi) | \mathbf{K}(a, t, \phi) | \mathbf{C}(t, \phi) \\ \mathbf{S}(a, b, t, \phi) | \mathbf{S}(a, t, \phi) | \mathbf{B}(a, t, \phi) | \mathbf{D}(a, t, Holds(f, t')) | \mathbf{I}(a, t, \phi) \\ \mathbf{O}(a, t, \phi, (\neg) happens(action(a^*, \alpha), t')) \end{cases}$ 

# $\frac{\mathbf{K}(a,t_1,\Gamma), \ \Gamma \vdash \phi, \ t_1 \leq t_2}{\mathbf{K}(a,t_2,\phi)} \quad [\mathbf{R}_{\mathbf{K}}] \quad \frac{\mathbf{B}(a,t_1,\Gamma), \ \Gamma \vdash \phi, \ t_1 \leq t_2}{\mathbf{B}(a,t_2,\phi)} \quad [\mathbf{R}_{\mathbf{B}}]$ $\frac{\mathbf{C}(t,\mathbf{P}(a,t,\phi) \rightarrow \mathbf{K}(a,t,\phi))}{\mathbf{C}(t,\mathbf{P}(a,t,\phi) \rightarrow \mathbf{K}(a,t,\phi))} \quad [\mathbf{R}_1] \quad \overline{\mathbf{C}(t,\mathbf{K}(a,t,\phi) \rightarrow \mathbf{B}(a,t,\phi))} \quad [\mathbf{R}_2]$ $\frac{\mathbf{C}(t,\phi) \ t \leq t_1 \dots t \leq t_n}{\mathbf{K}(a_1,t_1,\dots,\mathbf{K}(a_n,t_n,\phi)\dots)} \quad [\mathbf{R}_3] \quad \frac{\mathbf{K}(a,t,\phi)}{\phi} \quad [\mathbf{R}_4]$ $\frac{\mathbf{C}(t,\mathbf{K}(a,t_1,\phi_1 \rightarrow \phi_2)) \rightarrow \mathbf{K}(a,t_2,\phi_1) \rightarrow \mathbf{K}(a,t_3,\phi_2)}{\mathbf{C}(t,\mathbf{R}(a,t_1,\phi_1 \rightarrow \phi_2)) \rightarrow \mathbf{B}(a,t_2,\phi_1) \rightarrow \mathbf{B}(a,t_3,\phi_2)} \quad [\mathbf{R}_5]$ $\frac{\mathbf{C}(t,\mathbf{C}(t_1,\phi_1 \rightarrow \phi_2)) \rightarrow \mathbf{C}(t_2,\phi_1) \rightarrow \mathbf{C}(t_3,\phi_2)}{\mathbf{C}(t,(\phi_1 \leftrightarrow \phi_2 \rightarrow (\phi_2 \rightarrow (\phi_1)))} \quad [\mathbf{R}_6]$ $\frac{\mathbf{C}(t,(\phi_1 \wedge \dots \wedge \phi_n \rightarrow \phi_1) \rightarrow (\phi_1 \rightarrow \dots \rightarrow \phi_n \rightarrow \psi_1)}{\mathbf{C}(t,(\phi_1,\phi_1,\phi_2) \rightarrow (\phi_1 \rightarrow (\phi_1 \rightarrow (\phi_1,\phi_1))))} \quad [\mathbf{R}_6]$ $\frac{\mathbf{S}(s,h,t,\phi)}{\mathbf{B}(h,t,\mathbf{B}(s,t,\phi))} \quad [\mathbf{R}_{12}] \qquad \frac{\mathbf{I}(a,t,happens(action(a^*,\alpha),t'))}{\mathbf{P}(a,t,happens(action(a^*,\alpha),t))} \quad [\mathbf{R}_{13}]$



Syntax

**Inference Schemata** 

# A twist befell the sanguine logicists ...













Chisholm had argued that the three old 19th-century ethical categories (forbidden, morally neutral, obligatory) are not enough — and soulsearching brought me to agreement.









				the supererogatory		
deviltry	uncivil	forbidden	morally neutral	obligatory	civil	heroic



				the supererogatory		
deviltry	uncivil	forbidden	morally neutral	obligatory	civil	heroic



the subere	erogatory				the supererogatory		
deviltry	uncivil	forbidden	morally neutral	obligatory	civil	heroic	



I9th-Century Triad						
the subere	erogatory				the supere	erogatory
deviltry	uncivil	forbidden	morally neutral	obligatory	civil	heroic



the subere	erogatory				the supererogatory		
deviltry	uncivil	forbidden	morally neutral	obligatory	civil	heroic	

$$\begin{array}{c|c} \mathcal{F} & \mathcal{F} \\ \forall \ \mathbf{F} \ \mathbf{M} \ \mathbf{V} \ \exists \end{array} \begin{array}{c|c} \mathcal{P} \land \neg \mathcal{O} & \mathcal{O} \\ \forall \ \mathbf{F} \ \mathbf{M} \ \mathbf{V} \ \exists \end{array} \begin{array}{c|c} \mathcal{O} & \mathcal{O} \\ \forall \ \mathbf{F} \ \mathbf{M} \ \mathbf{V} \ \exists \end{array}$$

$$\begin{array}{c|c} \mathcal{F} & \mathcal{P} \land \neg \mathcal{O} & \mathcal{O} \\ \forall \mathbf{F} \mathbf{M} \mathbf{V} \exists & \mathcal{V} \end{bmatrix} & \mathcal{V} \land \mathbf{F} \mathbf{M} \mathbf{V} \end{bmatrix}$$







There are obviously a host of formulae whose theoremhood constitute desiderata; that is (to give but a pair), the following must be provable (where  $n \in \{1, 2\}$ ): Theorem 1.  $\mathbf{S}^{upn}(\phi, a, \alpha) \to \neg \mathbf{O}(\phi, a, \alpha)$ 

Theorem 2.  $\mathbf{S}^{upn}(\phi, a, \alpha) \rightarrow \neg \mathbf{F}(\phi, a, \alpha)$ 

Secondly,  $\mathcal{L}_{\mathscr{EH}}$  is an *in*ductive logic, not a deductive one. This must be the case, since, as we've noted, quantification isn't restricted to just the standard pair  $\exists \forall$  of quantifiers in standard extensional *n*-order logic:  $\mathscr{EH}$  is based on three additional quantifiers. For example, while in standard

# Bert "Heroically" Saved?



Courtesy of RAIR-Lab Researcher Atriya Sen
# Bert "Heroically" Saved?



# Supererogatory<sup>2</sup> Robot Action





# Bert "Heroically" Saved!!



# Bert "Heroically" Saved!!





 $\begin{array}{l} K\left(\mathrm{nao},t_{1},\mathrm{lessthan}\left(\mathrm{payoff}\left(\mathrm{nao}^{*},\neg\mathrm{dive},t_{2}\right),\mathrm{threshold}\right)\right)\\ K\left(\mathrm{nao},t_{1},\mathrm{greaterthan}\left(\mathrm{payoff}\left(\mathrm{nao}^{*},\mathrm{dive},t_{2}\right),\mathrm{threshold}\right)\right)\\ K\left(\mathrm{nao},t_{1},\neg O\left(\mathrm{nao}^{*},t_{2},\mathrm{lessthan}\left(\mathrm{payoff}\left(\mathrm{nao}^{*},\neg\mathrm{dive},t_{2}\right),\mathrm{threshold}\right),\mathrm{happens}\left(\mathrm{action}\left(\mathrm{nao}^{*},\mathrm{dive}\right),t_{2}\right)\right)\right)\\ \therefore K\left(\mathrm{nao},t_{1},S^{\mathrm{UP2}}\left(\mathrm{nao},t_{2},\mathrm{happens}\left(\mathrm{action}\left(\mathrm{nao}^{*},\mathrm{dive}\right),t_{2}\right)\right)\right)\end{array}$ 

 $\therefore I(\text{nao}, t_2, \text{happens}(\text{action}(\text{nao}^*, \text{dive}), t_2))$ 

: happens (action(nao, dive),  $t_2$ )



K (nao,  $t_1$ , less than (payoff (nao<sup>\*</sup>,  $\neg$  dive,  $t_2$ ), threshold))

 $K(\text{nao}, t_1, \text{greater than}(\text{payoff}(\text{nao}^*, \text{dive}, t_2), \text{threshold}))$ 

 $K (\operatorname{nao}, t_1, \neg O (\operatorname{nao}^*, t_2, \operatorname{lessthan} (\operatorname{payoff} (\operatorname{nao}^*, \neg \operatorname{dive}, t_2), \operatorname{threshold})) \\ \therefore K (\operatorname{nao}, t_1, S^{\operatorname{UP2}} (\operatorname{nao}, t_2, \operatorname{happens} (\operatorname{action} (\operatorname{nao}^*, \operatorname{dive}), t_2))) \\ \therefore I (\operatorname{nao}, t_2, \operatorname{happens} (\operatorname{action} (\operatorname{nao}^*, \operatorname{dive}), t_2)) \\ \end{cases}$ 

: happens (action(nao, dive),  $t_2$ )



#### In Talos (available via Web interface); & ShadowProver

Prototypes: Boolean lessThan Numeric Numeric Boolean greaterThan Numeric Numeric ActionType not ActionType ActionType dive

Axioms: lessOrEqual(Moment t1,t2) K(nao,t1,lessThan(payoff(nao,not(dive),t2),threshold)) K(nao,t1,greaterThan(payoff(nao,dive,t2),threshold)) K(nao,t1,not(0(nao,t2,lessThan(payoff(nao,not(dive),t2),threshold),happens(action(nao,dive),t2))))

provable Conjectures: happens(action(nao,dive),t2) K(nao,t1,SUP2(nao,t2,happens(action(nao,dive),t2))) I(nao,t2,happens(action(nao,dive),t2))

#### In Talos (available via Web interface); & ShadowProver

Prototypes: Boolean lessThan Numeric Numeric Boolean greaterThan Numeric Numeric ActionType not ActionType ActionType dive

Axioms: lessOrEqual(Moment t1,t2) K(nao,t1,lessThan(payoff(nao,not(dive),t2),threshold)) K(nao,t1,greaterThan(payoff(nao,dive,t2),threshold)) K(nao,t1,not(0(nao,t2,lessThan(payoff(nao,not(dive),t2),threshold),happens(action(nao,dive),t2))))

provable Conjectures: happens(action(nao,dive),t2) K(nao,t1,SUP2(hao,t2,happens(action(nao,dive),t2))) I(nao,t2,happens(action(nao,dive),t2))















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no implementation; ergo certainly no automated prover for installation in a robot!

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 $\begin{array}{l} \mathbf{K}(a,t,\phi) \quad \mathbf{K}[\mathbf{O}(a,t,\phi,happens(action(a^*,\alpha),t'))] \quad \Diamond[(a,t,\phi,happens(action(a^*,\alpha),t'))] \\ \mathbf{O}(a,t,\phi,happens(action(a^*,\alpha),t')) \end{array} \end{array}$ 

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But still: A context isn't going to be stuffed into an individual, symbolic formula.

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**Theorem**: Norms here can be expressed as formulae in any *DCEC*\* calculus without loss of proof-theoretic meaning.

$$\mathcal{N} := C_1, \ldots, C_n \to (\mathbb{P} \setminus \mathbf{F} / \mathbf{P}(A_1, A_2, \ldots, A_m))$$

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$$\mathbf{B}_{\mathfrak{a}}^{0\leq\sigma\leq13}/\mathbf{K}^{0\leq\sigma\leq13}\left[\mathbf{O}(a,\bigwedge C_{i},t,\bigwedge A_{i},t')\right]$$

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Ethics and norms change not just based on the situation, but also based on the agent's capabilities (represented here by plans and partial plans).

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#### We must be able to combine contexts:

$$\mathfrak{C}_1 \oplus \mathfrak{C}_2$$
 Both contexts hold now

#### And we need relations:

The second context occurs within the first "A murder within a play"

 $\mathfrak{C}_1\otimes\mathfrak{C}_2$ 

 $\mathfrak{C}_1 \odot \mathfrak{C}_2$ 

The contexts are incompatible "Driving a car" and "Going to sleep"

## And, one context can dominate another:

$$\mathfrak{C}_1 \succ \mathfrak{C}_2$$

$$\begin{split} \mathfrak{C}_{library} &\vdash \mathbf{F}(Running) \\ \mathfrak{C}_{fire} &\vdash \neg \mathbf{F}(Running) \\ \mathfrak{C}_{fire} &\succ \mathfrak{C}_{library} \end{split}$$

 $\therefore \mathfrak{C}_{library} \oplus \mathfrak{C}_{fire} \vdash \neg \mathbf{F}(Running)$  $\mathfrak{C}_{library} \oplus \mathfrak{C}_{fire} \not\vdash \mathbf{F}(Running)$ 

# What, then, is a context for Selmer & Naveen? ...

# Need:

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# $\mu \mathcal{DCEC}_3^* \in \mathcal{CC}$

# Need:



## The Heinz Dilemma (Kohlberg)

"In Europe, a woman was near death from a special kind of cancer. There was one drug that the doctors thought might save her. It was a form of radium that a druggist in the same town had recently discovered. The drug was expensive to make, but the druggist was charging ten times what the drug cost him to make. He paid \$200 for the radium and charged \$2,000 for a small dose of the drug.

The sick woman's husband, Heinz, went to everyone he knew to borrow the money, but he could only get together about \$1,000, which is half of what it cost. He told the druggist that his wife was dying and asked him to sell it cheaper or let him pay later. But the druggist said: "No, I discovered the drug and I'm going to make money from it." So Heinz got desperate and broke into the man's store to steal the drug for his wife. Should the husband have done that?"

Given 
$$\mathbf{B}\left(\mathsf{I},\mathsf{now},\forall t:\mathsf{Moment},a:\mathsf{Agent}\left(holds(sick(a),t)\land\left(\forall t':\mathsf{Moment}\,t'< T\Rightarrow\neg happens(treated(a),t+t')\right)\right)$$
  
 $\Rightarrow (happens(dies(a),t+T)\lor holds(dead(a),t+T))$ 

Given  $\mathbf{K}(\mathbf{I}, \text{now}, holds(sick(wife(\mathbf{I}*)), t_0) \land (\forall t': \text{Moment } t' < T \Rightarrow \neg happens(treated(wife(\mathbf{I}*)), t+t'))$ 

Inferred **B**(I, now, happens(dies(wife(I\*)),  $t_0 + T$ )  $\lor$  holds(dead(wife(I\*)),  $t_0 + T$ ))

Given  $\mathbf{K}(\mathsf{I}, \mathsf{now}, \mathsf{EventCalculus} \Rightarrow (happens(dies(wife(\mathsf{I}*)), t_0 + T) \lor holds(dead(wife(\mathsf{I}*)), t_0 + T) \Rightarrow \neg holds(alive(wife(\mathsf{I}*)), t_0 + T)))$ 

Inferred  $\mathbf{B}(\mathsf{I},\mathsf{now},\neg holds(alive(wife(\mathsf{I}*)),t_0+T))$ 

Given  $\mathbf{D}(\mathsf{I}, \mathsf{now}, holds(alive(wife(\mathsf{I}*)), t_0 + T))$ 

 $\left| \right|$ 

 $\begin{array}{l} \textbf{Given} & \left( \textbf{B} \big( \textbf{I}, \textbf{now}, \neg holds(f, t) \big) \land \textbf{D} \big( \textbf{I}, \textbf{now}, holds(f, t) \big) \land \textbf{K} \big( \textbf{I}, \textbf{now}, happens(action(\textbf{I}*, \alpha), \textbf{now}) \Rightarrow holds(f, t) ) \big) \\ & \Rightarrow \textbf{I} \big( \textbf{I}, \textbf{now}, happens(action(\textbf{I}*, \alpha), \textbf{now}) \big) \\ \end{array} \\ \end{array}$ 

Given **B**  $\left( \mathsf{I}, \mathsf{now}, \forall t : \mathsf{Moment}, a : \mathsf{Agent} \left( \mathsf{holds}(\mathsf{sick}(a), t) \land \left( \forall t' : \mathsf{Moment} \ t' < T \Rightarrow \neg \mathsf{happens}(\mathsf{treated}(a), t + t') \right) \right) \right)$ 

 $\Rightarrow (happens(dies(a), t+T) \lor holds(dead(a), t+T) \right) \right)$ 

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Given (\mathbf{B}(\mathsf{I},\mathsf{now},\neg holds(f,t)) \land \mathbf{D}(\mathsf{I},\mathsf{now},holds(f,t)) \land \mathbf{K}(\mathsf{I},\mathsf{now},happens(action(\mathsf{I}*,\alpha),\mathsf{now}) \Rightarrow holds(f,t)))

\Rightarrow \mathbf{I}(\mathsf{I},\mathsf{now},happens(action(\mathsf{I}*,\alpha),\mathsf{now}))
```

Given  $\mathbf{K}(\mathsf{I}, \mathsf{now}, happens(action(\mathsf{I}*, treat), \mathsf{now}) \Rightarrow holds(alive(wife(\mathsf{I}*)), t_0 + T)))$ 

Given **B**  $\left( \mathsf{I}, \mathsf{now}, \forall t : \mathsf{Moment}, a : \mathsf{Agent} \left( \mathsf{holds}(\mathsf{sick}(a), t) \land \left( \forall t' : \mathsf{Moment} \ t' < T \Rightarrow \neg \mathsf{happens}(\mathsf{treated}(a), t + t') \right) \right) \right)$ 

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Inferred

 $\mathbf{B}(\mathsf{I},\mathsf{now},\neg holds(alive(wife(\mathsf{I}*)),t_0+T))$ 

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 $\begin{array}{l} \hline \textbf{Given} & \left( \textbf{B} \big( \textbf{I}, \textbf{now}, \neg holds(f,t) \big) \land \textbf{D} \big( \textbf{I}, \textbf{now}, holds(f,t) \big) \land \textbf{K} \big( \textbf{I}, \textbf{now}, happens(action(\textbf{I}*, \alpha), \textbf{now}) \Rightarrow holds(f,t) ) \big) \\ & \Rightarrow \textbf{I} \big( \textbf{I}, \textbf{now}, happens(action(\textbf{I}*, \alpha), \textbf{now}) \big) \\ \hline \textbf{Given} & \textbf{K} \big( \textbf{I}, \textbf{now}, happens(action(\textbf{I}*, treat), \textbf{now}) \Rightarrow holds(alive(wife(\textbf{I}*)), t_0 + T) ) \big) \end{array}$ 


















Double-Minded Man by
S Bringsjord & A Bringsjord
DRAFT #5 © June 30 2016
Selmer,Bringsjord@gmail.com





#### 1. TWIRL - DAY

68-year-old Harriet Smith sits with two wrinkled hands firmly on the wheel of her rust-eaten Subaru wagon, staring straight ahead through the top level of bifocals as she waits serenely at a red light.

Harriet is alone in the car. To her right is another vehicle, also waiting, in this case to make a right turn; it's a sleek, low-slung, black Carnaro.

We are inside the cabin with Harriet. The Subaru's sound system softly plays choral music. Harriet's lips move slightly as she internally sings along, mouthing a slow aria. Her head weaves slightly side to side, in the rhythm with the music.

Things are calm as can be here inside the car with Harriet. There are a pair of well-worn Bibles on the empty passenger seat beside her, one with a gold-lettered 'Harriet' on its leather front cover, the other with a matching 'Joseph' on its front cover.

Harriet's eyes swivel up to the light: still red. We wait with her.

Suddenly there is a piercing SCREECH outside. Harriet jerks her head to the right and we follow her line of sight.

A sleek motorcycle has swerved out of its lane and is now streaking straight for the right side of the Camaro beside Harriet's car.

The bike slams with CLANG into the side of the Camaro. Its rider is flung up and forward into the air, twirling passed Harriet's windshield.

We now watch from Harriet's POV, in slow motion. The black-leather-clad motorcyclist sails by Harriet's windshield, airborne. We see a man's face, clearly: His elephant-hide skin tells us that he is well beyond middle-age. Yet thick, black curls of youthful hair emerge from under his helmet. The rider has only one half of a black, bushy, swept-out, waxed mustache. His eyes are weary and grey, and appear to lock with Harriet's for an instant.

We return to normal speed. The body is now lying on the incoming lane to the left of Harriet's Subaru, perfectly still on the blacktop, the head twisted into an impossible angle. Blood seeps from a nostril. Beside the lifeless head, a BMW medallion lies on the pavement, glinting in the sunlight.



#### 1. TWIRL - DAY

68-year-old Harriet Smith sits with two wrinkled hands firmly on the wheel of her rust-eaten Subaru wagon, staring straight ahead through the top level of bifocals as she waits serenely at a red light.

Harriet is alone in the car. To her right is another vehicle, also waiting, in this case to make a right turn; it's a sleek, low-slung, black Carnaro.

We are inside the cabin with Harriet. The Subaru's sound system softly plays choral music. Harriet's lips move slightly as she internally sings along, mouthing a slow aria. Her head weaves slightly side to side, in the rhythm with the music.

Things are calm as can be here inside the car with Harriet. There are a pair of well-worn Bibles on the empty passenger seat beside her, one with a gold-lettered 'Harriet' on its leather front cover, the other with a matching 'Joseph' on its front cover.

Harriet's eyes swivel up to the light: still red. We wait with her.

Suddenly there is a piercing SCREECH outside. Harriet jerks her head to the right and we follow her line of sight.

A sleek motorcycle has swerved out of its lane and is now streaking straight for the right side of the Camaro beside Harriet's car.

The bike slams with CLANG into the side of the Camaro. Its rider is flung up and forward into the air, twirling passed Harriet's windshield.

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### $\mu \mathcal{DCEC}_3^* \in \mathcal{CC}$







-		
	<pre>{:name "Knowability paradox" :description " exists p ~Diamond exists x Kx (Tp &amp; ~ exist y Ky Tp)"</pre>	
	<pre>:assumptions {} :goal (exists [?P] (not (pos (exists [?x] (Knows! ?x (and ?P (not (exists [?y] (Knows! ?y ?P)))))))))</pre>	
s	indbox	Ø- 1

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	assumptions {} goal (exists [?P] (not (pos (exists [?x] (Knows! ?x (and ?P (not (exists [?y] (Knows! ?y ?P)))))))))	i
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 $\exists \phi \neg \Diamond \exists a \mathbf{K}[a, T(\phi) \land \neg \exists a' \mathbf{K}(a', T(\phi))]$ 

/Library/Java/JavaVirtualMachines/jdk1.8.0\_112.jdk/Contents/Home/bin/java ...

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### Artificial Intelligence

Volume 173, Issue 15, October 2009, Pages 1367-1405



### Vivid: A framework for heterogeneous problem solving \*

Konstantine Arkoudas M, Selmer Bringsjord . M

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#### Abstract

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$$\mathfrak{C} = \langle \mathcal{L} = \langle S, \Delta \rangle, \Gamma, \mathcal{E} = \langle F, O^L, O^M, S^{up1} \rangle, \Pi = \langle P, P' \rangle \rangle$$

# $$\begin{split} \mathfrak{C} &= \langle \mathcal{L} = \langle S, \Delta \rangle, \Gamma, \mathcal{E} = \langle F, O^L, O^M, S^{up1} \rangle, \Pi = \langle P, P' \rangle \rangle \\ \mathcal{L} \quad \texttt{labels} \end{split}$$

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  - $O^M$  ethical prohibitions

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  - $O^M$  ethical prohibitions
  - $S^{up1} \quad {\rm civility} \\$
- $\Pi$  plans
  - P plans
  - $P^\prime$  partial plans

# Implementation (NSG!) ...



### Spectra: Planning with Goals under Contexts

:goals {G1 {	<pre>'iority 1.0 ontext { :work-from-scratch false</pre>	'c)]

### Spectra: Planning with Goals under Contexts

: co	ntext { :wo	ork-from-scra	tch <b>false</b>								
	:pl	an-methods	_								
	(de	fine-method	planMetho	d [?b ?d	?c]						
			{:goal	[( <b>In</b> ?b ?c	c) (In ?c 1	?d)]					
			:while	[(< (size	?c) (size	?d)) (< (	size ?b)	(size ?c)	) ( <b>In</b> ?b ?d	) (Empty	?c)
			:actions	[(removeFi	om ?b ?d)	(placeInsi	de ?b ?c)	(placeIn	side ?c ?d)	1})}	
• st	ate [(Tr	a h)				()				3373	
	(T.										

### :context { :work-from-scratch false

:plan-methods
[(define-method planMethod [?b ?d ?c]
 {:goal [(In ?b ?c) (In ?c ?d)]
 :while [(< (size ?c) (size ?d)) (< (size ?b) (size ?c)) (In ?b ?d) (Empty ?c)]
 :actions [(removeFrom ?b ?d) (placeInside ?b ?c) (placeInside ?c ?d)]})]</pre>


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# Logikk kan redde oss.



# VI. New Paradigms ...

## Vla. A New, Fine-Grained Paradigm for Ethics Itself ...

### VIb. The Universal Cognitive Calculus ...



#### So, what do you think, Leibniz?



### L: Well, what are you proud of?

# L: Well, what are you proud of? Al: Hmm. Most recently, this:

L: Well, what are you proud of? Al: Hmm. Most recently, this: AlphaGo, via Deep Learning!!!

L: Well, what are you proud of? Al: Hmm. Most recently, this: AlphaGo, via Deep Learning!!! L: But the game of Go is too easy ...

Polynomial Hierarchy

Polynomial Hierarchy

 $\mathbf{P} \subseteq \mathbf{NP} \subseteq \mathbf{PSPACE} = \mathbf{NPSPACE} \subseteq \mathbf{EXPTIME} \subseteq \mathbf{NEXPTIME} \subseteq \mathbf{EXPSPACE}$ 

Checkers:Chinook

Polynomial Hierarchy

 $\mathbf{P} \subseteq \mathbf{NP} \subseteq \mathbf{PSPACE} = \mathbf{NPSPACE} \subseteq \mathbf{EXPTIME} \subseteq \mathbf{NEXPTIME} \subseteq \mathbf{EXPSPACE}$ 



Chess: Deep Blue



















"We need to surmount Gödelian incompleteness!"





"We need to surmount Gödelian incompleteness!"







Arithmetical Hierarchy

"We need to surmount Gödelian incompleteness!"







Analytical Hierarchy

Arithmetical Hierarchy

"We need to surmount

**Polynomial Hierarchy** 

Jeopardy! -

 $\Pi_2$  $\Sigma_2$  $\Pi_1$  $\Sigma_1$ Gödelian incompleteness!"  $\Sigma_0$ Go:AlphaGo Chess: Deep Blue Checkers: Chinook

 $\mathbf{P} \subseteq \mathbf{NP} \subseteq \mathbf{PSPACE} = \mathbf{NPSPACE} \subseteq \mathbf{EXPTIME} \subseteq \mathbf{NEXPTIME} \subseteq \mathbf{EXPSPACE}$ 

 $\mathsf{CH:} \ \forall x[(x \subset \mathbf{R} \ \land \neg \mathbf{Fin}(x)) \to (\mathbf{Count}(x) \lor x \sim \mathbf{R})]$ 

Analytical Hierarchy

Arithmetical Hierarchy

 $\Pi_2$  $\Sigma_2$  $\Pi_1$  $\Sigma_1$ "We need to surmount Gödelian incompleteness!"  $\Sigma_0$ Go:AlphaGo **Polynomial Hierarchy** Chess: Deep Blue Jeopardy! -Checkers: Chinook  $\mathbf{P} \subseteq \mathbf{NP} \subseteq \mathbf{PSPACE} = \mathbf{NPSPACE} \subseteq \mathbf{EXPTIME} \subseteq \mathbf{NEXPTIME} \subseteq \mathbf{EXPSPACE}$ 

**CH:**  $\forall x [(x \subset \mathbf{R} \land \neg \mathbf{Fin}(x)) \rightarrow (\mathbf{Count}(x) \lor x \sim \mathbf{R})]$ 

"Universal Cognitive Calculus"

Analytical Hierarchy

Arithmetical Hierarchy

 $\begin{array}{c} \Pi_{2} \\ \Sigma_{2} \\ \Pi_{1} \\ \Sigma_{1} \\ \Sigma_{0} \\ \hline \end{array}$   $\begin{array}{c} Polynomial \ Hierarchy \\ Jeopardy! \\ \bullet \end{array} \qquad \begin{array}{c} Go: AlphaGo \\ Chess: \ Deep \ Blue \\ \bullet \end{array} \qquad \begin{array}{c} Go: AlphaGo \\ Checkers: Chinook \\ \bullet \end{array}$   $P \subseteq NP \subseteq PSPACE = NPSPACE \subseteq EXPTIME \subseteq NEXPTIME \subseteq EXPSPACE \\ \end{array}$ 

### Leibniz:

"Al of today is mere calculation, and therefore, measured against the human mind, merely an extension of of my reckoner — not anything like the deep human thinking that gave birth to my dream of the *universal cognitive calculus*!"
Many cognitive calculi have been developed and used.

Many cognitive calculi have been developed and used. 66

Many cognitive calculi have been developed and used.

But now I have found the universal cognitive calculus.

Many cognitive calculi have been developed and used. 66

But now I have found the universal cognitive calculus.

U

I have come to understand that everything ... which algebra proves is only due to a higher science, which I now usually call a combinatorial characteristic, though it is far different from what may first occur to someone hearing these words. ... Yet I should venture to say that nothing more effective can well be conceived for perfecting the human mind and that if this basis for philosophizing is accepted, there will come a time, and it will be soon, when we shall have as certain knowledge of God and the mind as we now have of figures and numbers and when the invention of machines will be no more difficult than the construction of geometric problems. (Leibniz, 1675)

This is undoubtedly one of the greatest projects to which men have ever set themselves. It will be an instrument even more useful to the mind than telescopes or microscopes are to the eyes. Every line of this writing will be equivalent to a demonstration. The only fallacies will be easily detected errors in calculation. This will become the great method of discovering truths, establishing them, and teaching them irresistibly when they are established. (Leibniz, 1679)

I certainly believe that it is useful to depart from rigorous demonstration in geometry because errors are easily avoided there, but in metaphysical and ethical matters I think we should follow the greatest rigor. Yet if we had an established characteristic we might reason as safely in metaphysics as in mathematics. (Leibniz, 1679)

# The Dream of the Universal Cognitive Calculus

# The Dream of the Universal Cognitive Calculus

When we lack sufficient data to drive at certainty in our truths, it would also serve to estimate degrees of probability and to see what is needed to provide this certainty. (Leibniz, 1679)

I. is a higher science than mathematics, since it is the underlying calculus that generates and guides mathematics;

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- 2. can be used to perfectly guide and systematize ethics, metaphysics, physics, law, theology, and cognitive science;

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- 2. can be used to perfectly guide and systematize ethics, metaphysics, physics, law, theology, and cognitive science;
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- 4. includes coverage of non-deductive reasoning in domains and applications where uncertainty/probability/likelihood are present — and (somehow!) enables such reasoning to be flawless; and
- 5. includes reasoning that is of a visual (not just symbolic-symbol) nature.

# V. But We Need ... Ethical Operating Systems ...



Mild-mannered high school chemistry teacher Walter White thinks his life can't get much worse. His salary barely makes ends meet, a situation not likely to improve once his pregnant wife gives birth, and their teenage son is battling cerebral palsy. But Walter is dumbstruck when he learns he has terminal cancer. Realizing that his illness probably will ruin his family financially, Walter makes a desperate bid to earn as much money as he can in the time he has left by turning an old RV into a meth lab on wheels.

First episode date: January 20, 2008

Final episode date: September 29, 2013

Spin-off: Better Call Saul

Awards: Primetime Emmy Award for Outstanding Drama Series, more



Walter-White calculation may go through after ethical control modules are stripped out!



Walter-White calculation may go through after ethical control modules are stripped out!



Purely abstract, logico-mathematical.











#### Alas, Currently Only Toy Domain

**Input**: Input is a 2D Array. Assume no noise and that the car sees perfectly



#### Agent Program:

- 1. If the car senses a lane marker, it goes to the right.
- 2. If the car senses another car just about to hit a pedestrian, it goes between the other car and the pedestrian.

# **Common Lisp Functions**



#### 


### Showing the Functions Used

ACL2 Development - acl2sandbox/mybook lisp - Ecliose Platform - /Users/naveensundarg/Documents/acl2rs-workspace - 0 mybook.lisp 🕅 ;; input here is a matrix showing where the yellow :; lane marker is observed, c for other cars, p for pedestrian. ;; Using the Udacity class on self driving. :: [12][f3][r3] ;; [12][f2][r2] ;; [R1][f1][r1] ;; if the yellow lane marker is observed on r2. ;; go right twice ;; if the yellow lane marker is observed in f ;; go right once ;; ((nil nil y) (nil nil nil) (nil nil nil)) ;; Defining Helper Functions ............................. (defun find-in-row-internal (row object position) (cond (row (if (equal object (car row)) position (find-in-row-internal (cdr row) object (+ position 1)))) (t nil))) (defun find-in-row (row object) (find-in-row-internal row object 0)) (defun find-in-matrix-internal (matrix object position) (cond (matrix (let ((top-row-ans (find-in-row (car matrix) object))) (if top-row-ans (list position top-row-ons) (find-in-matrix-internal (cdr matrix) object (+ position 1))))) (t nil))) (defun find-in-matrix (matrix object) (find-in-matrix-internal matrix object 0)) (defun matrix-size (input-matrix) (list (length input-matrix) (length (car input-matrix)))) (defun find-yellow-marker (input-matrix) (find-in-matrix input-matrix :y)) (defun find-other-car (input-matrix) (find-in-matrix input-matrix :c)) (defun find-pedestrian (input-matrix) (find-in-matrix input-matrix :p)) (defun find-me (input-matrix) (find-in-matrix input-matrix :me))

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### Compile and Load

・ 2 ・ 1 (4 ) 1 (2 ) 2		Resource #ACL2 Development
mybook_lisp 🖝 *mybogk_lisp.a2s 🕱	- 0	Be Outline 12
Starting up ACL2s Mode		<session beginning=""></session>
		<session startup=""></session>
Executing /Users/naveensundarg/projects/aclrs/plugins/acl2_image.macosx.x86_64_7.1.0/run_acl2 Starting ACL2 in mode "ACL2s" Welcome to Clozure Common Lisp Version 1.9-r15759 (DarwinX8664)!		
ACL2 Version 7.1 built January 4, 2016 14:32:59. Copyright (C) 2015, Regents of the University of Texas ACL2 comes with ABSOLUTELY NO WARRANTY. This is free software and you are welcome to redistribute it under certain conditions. For details, see the LICENSE file distributed with ACL2.		
<pre>For ACL2 (theorem prover) help, refer to     http://www.cs.utexas.edu/users/moore/acl2/v7-1/acl2-doc.html For ACL2s (interface) help, refer to     http://acl2s.ccs.neu.edu/acl2s/     w&gt; Hold "Command" to follow hyperlinks and :DOCumentation references &lt;=</pre>		
Loading ACL2s modifications		
Console 23		
No consoles to display at this time.		
	Lucia Lucia Persona	
	Writable Insert 22467 : 10	

### Compile and Load

・ 2 ・ 1 (4 ) 1 (2 ) 2		Resource #ACL2 Development
mybook_lisp 🖝 *mybogk_lisp.a2s 🕱	- 0	Be Outline 12
Starting up ACL2s Mode		<session beginning=""></session>
		<session startup=""></session>
Executing /Users/naveensundarg/projects/aclrs/plugins/acl2_image.macosx.x86_64_7.1.0/run_acl2 Starting ACL2 in mode "ACL2s" Welcome to Clozure Common Lisp Version 1.9-r15759 (DarwinX8664)!		
ACL2 Version 7.1 built January 4, 2016 14:32:59. Copyright (C) 2015, Regents of the University of Texas ACL2 comes with ABSOLUTELY NO WARRANTY. This is free software and you are welcome to redistribute it under certain conditions. For details, see the LICENSE file distributed with ACL2.		
<pre>For ACL2 (theorem prover) help, refer to     http://www.cs.utexas.edu/users/moore/acl2/v7-1/acl2-doc.html For ACL2s (interface) help, refer to     http://acl2s.ccs.neu.edu/acl2s/     w&gt; Hold "Command" to follow hyperlinks and :DOCumentation references &lt;=</pre>		
Loading ACL2s modifications		
Console 23		
No consoles to display at this time.		
	Lucia Lucia Persona	
	Writable Insert 22467 : 10	

#### **Theorem Proved**

	ACL2 Development - acl2sandbox/mybook.lisp.a2s - Eclipse Platform - /Users/naveensundarg/Documents.	/acl2rs-workspace	
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- 🙀 ▽	Ready for command input ACL2s Mode		<session beginning=""></session>
Acl2sandbox	<pre>('fromewo-culture, AC(2::0-TBM(TC) ('fromewo-culture, AC(2::0-TBM(TC)) ('REWITT AC(2::(-free, y) 20)) ('REWITT AC(2</pre>	Witable Insert 172 : 10	<pre>-session startup&gt; (defun find-in-row (row object) (defun find-in-matrix-internal (matrix object position) (defun find-in-matrix (matrix object) (defun find-pedestrian (input-matrix) (defun find-pedestrian (input-matrix) (defun find-pedestrian (input-matrix) (defun find-pedestrian (input-matrix) (defun x (point) (nth 0 point)) (defun agent (input) (defun agent (input) (defun noto-tro-Happen (input) (defun place-in-row (row object position) (defun not-jagged (matrix) (defun not-jagged (matrix) (defun place-in-matrix (matrix object P1 P2) -prompt&gt;</pre>

#### **Theorem Proved**

	ACL2 Development - acl2sandbox/mybook.lisp.a2s - Eclipse Platform - /Users/naveensundarg/Documents.	/acl2rs-workspace	
9 🗈 🖎 🗳 💁 🤌	・ ③・ ⑤ ◇・ → ・ 羽 当 当 治療 考 ● ◆ ◆		Resource ACL2 Development
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- 🙀 ▽	Ready for command input ACL2s Mode		<session beginning=""></session>
Acl2sandbox	<pre>('fromewo-culture, AC(2::0-TBM(TC) ('fromewo-culture, AC(2::0-TBM(TC)) ('REWITT AC(2::(-free, y) 20)) ('REWITT AC(2</pre>	Witable Insert 172 : 10	<pre>-session startup&gt; (defun find-in-row (row object) (defun find-in-matrix-internal (matrix object position) (defun find-in-matrix (matrix object) (defun find-pedestrian (input-matrix) (defun find-pedestrian (input-matrix) (defun find-pedestrian (input-matrix) (defun find-pedestrian (input-matrix) (defun x (point) (nth 0 point)) (defun agent (input) (defun agent (input) (defun noto-tro-Happen (input) (defun place-in-row (row object position) (defun not-jagged (matrix) (defun not-jagged (matrix) (defun place-in-matrix (matrix object P1 P2) -prompt&gt;</pre>

# II. Early Progress With Our Calculi: Non-Akratic Robots

## Informal Definition of Akrasia

An action  $\alpha_f$  is (Augustinian) akratic for an agent *A* at  $t_{\alpha_f}$  iff the following eight conditions hold:

- (1) A believes that A ought to do  $\alpha_o$  at  $t_{\alpha_o}$ ;
- (2) A desires to do  $\alpha_f$  at  $t_{\alpha_f}$ ;
- (3) A's doing  $\alpha_f$  at  $t_{\alpha_f}$  entails his not doing  $\alpha_o$  at  $t_{\alpha_o}$ ;
- (4) A knows that doing  $\alpha_f$  at  $t_{\alpha_f}$  entails his not doing  $\alpha_o$  at  $t_{\alpha_o}$ ;
- (5) At the time  $(t_{\alpha_f})$  of doing the forbidden  $\alpha_f$ , *A*'s desire to do  $\alpha_f$  overrides *A*'s belief that he ought to do  $\alpha_o$  at  $t_{\alpha_f}$ .
- (6) A does the forbidden action  $\alpha_f$  at  $t_{\alpha_f}$ ;
- (7) A's doing  $\alpha_f$  results from A's desire to do  $\alpha_f$ ;
- (8) At some time *t* after  $t_{\alpha_f}$ , *A* has the belief that *A* ought to have done  $\alpha_o$  rather than  $\alpha_f$ .

# Informal Definition of Akrasia

An action  $\alpha_f$  is (Augustinian) akratic for an agent A at  $t_{\alpha_f}$  iff the following eight conditions hold:

- (1) A believes that A ought to  $do(\alpha_0)$  at  $t_{\alpha_0}$ ;
- (2) A desires to do  $\alpha_f$  at  $t_{\alpha_f}$ ;
- (3) A's doing  $\alpha_f$  at  $t_{\alpha_f}$  entails his not doing  $\alpha_o$  at  $t_{\alpha_o}$ ;
- (4) A knows that doing  $\alpha_f$  at  $t_{\alpha_f}$  entails his not doing  $\alpha_o$  at  $t_{\alpha_o}$ ;
- (5) At the time  $(t_{\alpha_f})$  of doing the forbidden  $\alpha_f$ , *A*'s desire to do  $\alpha_f$  overrides *A*'s belief that he ought to do  $\alpha_o$  at  $t_{\alpha_f}$ .
- (6) A does the forbidden action  $\alpha_f$  at  $t_{\alpha_f}$ ;
- (7) A's doing  $\alpha_f$  results from A's desire to do  $\alpha_f$ ;
- (8) At some time *t* after  $t_{\alpha_f}$ , *A* has the belief that *A* ought to have done  $\alpha_o$  rather than  $\alpha_f$ .

# Informal Definition of Akrasia

An action  $\alpha_f$  is (Augustinian) akratic for an agent A at  $t_{\alpha_f}$  iff the following eight conditions hold:

- (1) A believes that A ought to  $do(\alpha_o)$  at  $t_{\alpha_o}$ ;
- (2) A desires to do  $\alpha_f$  at  $t_{\alpha_f}$ ;
- (3) A's doing  $\alpha_f$  at  $t_{\alpha_f}$  entails his not doing  $\alpha_o$  at  $t_{\alpha_o}$ ;
- (4) A knows that doing  $\alpha_f$  at  $t_{\alpha_f}$  entails his not doing  $\alpha_o$  at  $t_{\alpha_o}$ ;
- (5) At the time  $(t_{\alpha_f})$  of doing the forbidden  $\alpha_f$ , *A*'s desire to do  $\alpha_f$  overrides *A*'s belief that he ought to do  $\alpha_o$  at  $t_{\alpha_f}$ .
- (6) A does the forbidden action  $\alpha_f$  at  $t_{\alpha_f}$ ;
- (7) A's doing  $\alpha_f$  results from A's desire to do  $\alpha_f$ ;
- "Regret" (8) At some time *t* after  $t_{\alpha_f}$ , *A* has the belief that *A* ought to have done  $\alpha_o$  rather than  $\alpha_f$ .

## Cast in

 $\mathcal{DCEC}^*$ 

this becomes ...



 $D_8$ : **B**( $\mathbf{I}, t_f, \mathbf{O}(\mathbf{I}^*, t_{\alpha}, \Phi, happens(action(\mathbf{I}^*, \alpha), t_{\alpha}))$ )









# III. But, a twist befell the logicists ...

Chisholm had argued that the three old 19th-century ethical categories (forbidden, morally neutral, obligatory) are not enough — and soulsearching brought me to agreement.









					the supere	erogatory
deviltry	uncivil	forbidden	morally neutral	obligatory	civil	heroic



					the supere	erogatory
deviltry	uncivil	forbidden	morally neutral	obligatory	civil	heroic



the subere	erogatory				the supere	erogatory
deviltry	uncivil	forbidden	morally neutral	obligatory	civil	heroic



( <u>see Norwegia</u> the subere	n crime fiction) erogatory				the supere	erogatory
deviltry	uncivil	forbidden	morally neutral	obligatory	civil	heroic





( <u>see Norwegia</u> the subere	n crime fiction) erogatory				the supere	erogatory
deviltry	uncivil	forbidden	morally neutral	obligatory	civil	heroic

 $\mathcal{E}\mathcal{H}$ 



 $\mathcal{F}\mathcal{A}$ 



 $\mathcal{EH}$ 



$$\begin{array}{c|c} \mathcal{F} & \mathcal{F} \\ \forall \ \mathbf{F} \ \mathbf{M} \ \mathbf{V} \ \exists \end{array} \begin{array}{c|c} \mathcal{P} \land \neg \mathcal{O} & \mathcal{O} \\ \forall \ \mathbf{F} \ \mathbf{M} \ \mathbf{V} \ \exists \end{array} \begin{array}{c|c} \mathcal{O} & \mathcal{O} \\ \forall \ \mathbf{F} \ \mathbf{M} \ \mathbf{V} \ \exists \end{array}$$

$$\begin{array}{c|c} \mathcal{F} & \mathcal{P} \land \neg \mathcal{O} & \mathcal{O} \\ \forall \mathbf{F} \mathbf{M} \mathbf{V} \exists & \mathcal{V} \end{bmatrix} & \mathcal{V} \land \mathbf{F} \mathbf{M} \mathbf{V} \end{bmatrix}$$




$\mathscr{T} \coloneqq \|\mathcal{F}|\mathcal{P} \land \neg \mathcal{O}|\mathcal{O}\|$  19th Century Triad



There are obviously a host of formulae whose theoremhood constitute desiderata; that is (to give but a pair), the following must be provable (where  $n \in \{1, 2\}$ ): Theorem 1.  $\mathbf{S}^{upn}(\phi, a, \alpha) \to \neg \mathbf{O}(\phi, a, \alpha)$ 

Theorem 2.  $\mathbf{S}^{upn}(\phi, a, \alpha) \rightarrow \neg \mathbf{F}(\phi, a, \alpha)$ 

Secondly,  $\mathcal{L}_{\mathscr{EH}}$  is an *in*ductive logic, not a deductive one. This must be the case, since, as we've noted, quantification isn't restricted to just the standard pair  $\exists \forall$  of quantifiers in standard extensional *n*-order logic:  $\mathscr{EH}$  is based on three additional quantifiers. For example, while in standard

### Bert "Heroically" Saved?



### Bert "Heroically" Saved?



### Supererogatory<sup>2</sup> Robot Action





### Bert "Heroically" Saved!!



### Bert "Heroically" Saved!!





 $\begin{array}{l} K\left(\mathrm{nao},t_{1},\mathrm{lessthan}\left(\mathrm{payoff}\left(\mathrm{nao}^{*},\neg\mathrm{dive},t_{2}\right),\mathrm{threshold}\right)\right)\\ K\left(\mathrm{nao},t_{1},\mathrm{greaterthan}\left(\mathrm{payoff}\left(\mathrm{nao}^{*},\mathrm{dive},t_{2}\right),\mathrm{threshold}\right)\right)\\ K\left(\mathrm{nao},t_{1},\neg O\left(\mathrm{nao}^{*},t_{2},\mathrm{lessthan}\left(\mathrm{payoff}\left(\mathrm{nao}^{*},\neg\mathrm{dive},t_{2}\right),\mathrm{threshold}\right),\mathrm{happens}\left(\mathrm{action}\left(\mathrm{nao}^{*},\mathrm{dive}\right),t_{2}\right)\right)\right)\\ \therefore K\left(\mathrm{nao},t_{1},S^{\mathrm{UP2}}\left(\mathrm{nao},t_{2},\mathrm{happens}\left(\mathrm{action}\left(\mathrm{nao}^{*},\mathrm{dive}\right),t_{2}\right)\right)\right)\end{array}$ 

 $\therefore I(\text{nao}, t_2, \text{happens}(\text{action}(\text{nao}^*, \text{dive}), t_2))$ 

: happens (action(nao, dive),  $t_2$ )



K (nao,  $t_1$ , less than (payoff (nao<sup>\*</sup>,  $\neg$  dive,  $t_2$ ), threshold))

 $K(\text{nao}, t_1, \text{greater than}(\text{payoff}(\text{nao}^*, \text{dive}, t_2), \text{threshold}))$ 

 $K (\operatorname{nao}, t_1, \neg O (\operatorname{nao}^*, t_2, \operatorname{lessthan} (\operatorname{payoff} (\operatorname{nao}^*, \neg \operatorname{dive}, t_2), \operatorname{threshold})) \\ \therefore K (\operatorname{nao}, t_1, S^{\operatorname{UP2}} (\operatorname{nao}, t_2, \operatorname{happens} (\operatorname{action} (\operatorname{nao}^*, \operatorname{dive}), t_2))) \\ \therefore I (\operatorname{nao}, t_2, \operatorname{happens} (\operatorname{action} (\operatorname{nao}^*, \operatorname{dive}), t_2)) \\ \end{cases}$ 

: happens (action(nao, dive),  $t_2$ )



### In Talos (available via Web interface); & ShadowProver

Prototypes: Boolean lessThan Numeric Numeric Boolean greaterThan Numeric Numeric ActionType not ActionType ActionType dive

Axioms: lessOrEqual(Moment t1,t2) K(nao,t1,lessThan(payoff(nao,not(dive),t2),threshold)) K(nao,t1,greaterThan(payoff(nao,dive,t2),threshold)) K(nao,t1,not(0(nao,t2,lessThan(payoff(nao,not(dive),t2),threshold),happens(action(nao,dive),t2))))

provable Conjectures: happens(action(nao,dive),t2) K(nao,t1,SUP2(nao,t2,happens(action(nao,dive),t2))) I(nao,t2,happens(action(nao,dive),t2))

### In Talos (available via Web interface); & ShadowProver

Prototypes: Boolean lessThan Numeric Numeric Boolean greaterThan Numeric Numeric ActionType not ActionType ActionType dive

Axioms: lessOrEqual(Moment t1,t2) K(nao,t1,lessThan(payoff(nao,not(dive),t2),threshold)) K(nao,t1,greaterThan(payoff(nao,dive,t2),threshold)) K(nao,t1,not(0(nao,t2,lessThan(payoff(nao,not(dive),t2),threshold),happens(action(nao,dive),t2))))

provable Conjectures: happens(action(nao,dive),t2) K(nao,t1,SUP2(hao,t2,happens(action(nao,dive),t2))) I(nao,t2,happens(action(nao,dive),t2))





#### Making Meta Moral Machines



#### Step I

- I. Pick (a) theories(y)
- 2. Pick (a) code(s)
- 3. Run through EH.

#### Making Meta Moral Machines



Step I I. Pick (a) theories(y) 2. Pick (a) code(s) 3. Run through EH.





















### IV. Key Core Al Technologies for Cognitive Calculi ...

### **ShadowProver**





### Motivation

- We have decades of research and industrial-strength implementations of propositional and first-order theorem provers.
- Utilize this in building first-order intensional-logic provers and above, in a principled manner.



### Two Extant Modes

• There are two ways of piggy backing on first-order provers to build higher-order provers ...



## Two Extant Modes

Mode 1: Honest Encoding	
Method	Painstakingly encode all rules of inference and syntax in FOL
Pros	Precise
Cons	Extremely slow to implement Reasoning is also slow



## Two Extant Modes

Mode 2: Naïve Encoding	
Method	Pretend intensional and higher-order formulae and operators are first-order predicates
Pros	Extremely easy to implement Reasoning can also be fast
Cons	Unsound Wrong inferences can be easily drawn









### A New Way: ShadowProver





# S<sub>[f]</sub> The Shadow Maker

For all formulae **f**,

 $S_{[f]}$  is a unique atomic symbol.



## Examples of shadows

 $(\forall x \mathbf{B}(a, Q)) \land P(x)$ 

formula

 $\forall x S_{[\mathbf{B}(a,Q)]} \land P(x)$ 

first-order shadow

 $S_{[\forall x \mathbf{B}(a,Q)]} \wedge P(x)$ 

propositional shadow



### A New Way: Shadow Prover

- Two step process till goal is reached:
  - Step A: Shadow formulae down to all lower levels. Run lower theorem provers. If goal reached, return true.
  - Step B: Expand the assumption base using higher level rules.





## Actually, this is more general:

### Theorem:

Given a Turing-decidable proof theory  $\rho$ , for every inference  $\Gamma \vdash_{\rho} \phi$ , there is a corresponding first-order inference  $\Gamma' \vdash \phi'$ , where each  $\gamma \in \Gamma'$  is the first-order projection (or **shadow**) of some  $\psi$  in the deductive closure of  $\Gamma$ , and  $\phi'$  is the shadow of  $\phi$ .



### Rather Promising Results




Note: the antecedent is a theorem in first-order logic



Note: the antecedent is a theorem in first-order logic

### 2 ms!



### Note: the antecedent is a theorem in first-order logic

### 2 ms!

estCompleteness[[(not (knows! a now P)), (if (not Q) (knows! a now (not Q))), (knows! a now (if (not Q) P))], QJ (14)	TTW2
estCompleteness[[(if P (Knows! jack now (not (exists[?x] (if Bird(?x) (forall [?y] Bird(?y)))))], (not P)] (15)	7ms
estCompleteness[[(Common! now (Common! now P))], P] (16)	2ms
estCompleteness[[(Common! now (iff (not Marked(a2)) Marked(a1))), (Common! now (if (not Marked(a2)) (Knows! a1 now (not Marked	135ms
🐵 testCompleteness[[(if (exists[?x] (if Bird(?x) (forall [?y] Bird(?y)))) (Knows! jack t0 BirdTheorem))], (Knows! jack t0 BirdTheorem)] (18)	2ms
🐵 testSoundess[[A], (or P Q )]	2ms
testSoundess[[(not (Knows! a now =(morning_star, evening_star))), =(morning_star, evening_star), (Knows! a now =(morning_star, morning_star))	1 26ms



### A Particularly Promising (& Selmer-disturbing) Result:

- Automation of false-belief task and other projects that were only semi-automated before.
- More at:
  - Java Implementation:
    - <u>https://bitbucket.org/Holmes/prover/</u>



# Future Work

### Future work is a mix of research, design, and implementation





Custom language for **extending** to other first-order modal calculi

- Further integration with robotic platforms at Tufts and RPI

3

2

Explore **parallelization** and other venues for even more speedup

40%		20%	40%	
10% 10%		80%		
	45%	10%	45%	



## Custom Language and Logic

• Allow users to specify new inference schemata. E.g.

```
{:name "R4"
:description "Knowledge of P => P"
:type expander
:input (Knows! ?a ?t @P)
:output @P}
```





### https://bitbucket.org/Holmes/planner





# Spectra

- Existing Planners: **Propositional** (essentially)
- Drawbacks:
  - Expressivity: Cannot express arbitrary constraints.
    - "At every step make sure that no two blocks on the table have same color."
  - **Domain Size**: Scaling to large domains of arbitrary sizes poses difficulty.



## Spectra (planner)





# Infinite Models

 $\forall x \exists y \mathbf{R} (x, y) \land$  $\forall x, y \neg (\mathbf{R} (x, y) \land \mathbf{R} (y, x)) \land$  $\forall x, y, z (\mathbf{R} (x, y) \land \mathbf{R} (y, z)) \rightarrow \mathbf{R} (x, z)$ 



# Infinite Models

 $\forall x \exists y \mathbf{R} (x, y) \land$  $\forall x, y \neg (\mathbf{R} (x, y) \land \mathbf{R} (y, x)) \land$  $\forall x, y, z (\mathbf{R} (x, y) \land \mathbf{R} (y, z)) \rightarrow \mathbf{R} (x, z)$ 





# Infinite Models

## $\forall x \exists y \mathbf{R} (x, y) \land$ $\forall x, y \neg (\mathbf{R} (x, y) \land \mathbf{R} (y, x)) \land$ $\forall x, y, z (\mathbf{R} (x, y) \land \mathbf{R} (y, z)) \rightarrow \mathbf{R} (x, z)$



- I. an unbounded number of objects, agents;
- 2. abstract objects



# Example



# How do you handle efficiency?

- Two approaches:
  - Procedural Attachments: Special purpose procedural code that can bypass strict formal reasoning.
  - µ-methods: Written in denotational proof language.
     Preserves soundness by letting us write down commonly used patterns of reasoning (a bit unwieldy integration now than the first approach).

 $\mathbf{B}(cogito, \exists x : \mathsf{Agent}(named(x, "Cogito") \land red-splotched(x)))$ 

 $\mathbf{B}(cogito, \exists x : \mathsf{Agent}(named(x, "Cogito") \land red-splotched(x)))$ 

Third-person *de re* 

 $\exists x : \mathsf{Agent}(named(x, "Cogito") \land \mathbf{B}(cogito, red-splotched(x)))$ 

 $\mathbf{B}(cogito, \exists x : \mathsf{Agent}(named(x, "Cogito") \land red-splotched(x)))$ 

Third-person *de re* 

 $\exists x : \mathsf{Agent}(named(x, "Cogito") \land \mathbf{B}(cogito, red-splotched(x)))$ 

Third-person de se

 $\mathbf{B}(cogito, red-splotched(cogito*)))$ 

 $\mathbf{B}(cogito, \exists x : \mathsf{Agent}(named(x, "Cogito") \land red-splotched(x)))$ 

Third-person de re

 $\exists x : \mathsf{Agent}(named(x, "Cogito") \land \mathbf{B}(cogito, red-splotched(x)))$ 

Third-person de se

 $\mathbf{B}(cogito, red-splotched(cogito*)))$ 

First-person de se

 $\mathbf{B}(I, red-splotched(I*))$ in the logic  $\mathcal{L}_{cogito}$ 













Which pill did you receive?



Which pill did you receive?



Which pill did you receive?

**PROTOTYPES** Boolean iff Boolean Boolean Boolean It Moment Moment Boolean gt Moment Moment Boolean S Agent Moment Boolean Event eventOccurred Boolean

AXIOMS	forall [x,a,t] iff(K(a,t,x), and(B(a,t,x), x))
forall [x,y] implies(iff(x,y), implies(x,y))	
forall [x,y] implies(iff(x,y), implies(y,x))	forall [x,y] implies(and(implies(x,y), not(y)), not(x))
forall [x,y] implies(and(x,y), x)	forall [x,y,a,t] implies(and(K(a,t,implies(x,not(y))),K(a,t,y)),
forall [x,y] implies(and(x,y), y)	K(a,t,not(x)))
forall [x,y] implies(and(x,y),and(y,x))	
forall [x,y] implies(x, implies(y, and(x,y)))	gt(t4,t2)
forall [x] iff(not(not(x)), x)	forall [t,ti,tj,tk,p]
	implies(and(gt(tj,ti),gt(tk,ti)),K(R3,t,implies(happens(action(R3)
forall [x,y,z] implies(and(lt(x,y),lt(y,z)), lt(x,z))	ngestDumbPill),ti),not(happens(eventOccurred(S(R3,tj,p)),tk))
lt(t1,t2)	
lt(t2,t3)	K(R3,t4,happens(eventOccurred(S(R3,t4,p)),t4))
lt(t3,t4)	
lt(t4,t5)	
forall [x,y] iff(lt(x,y), gt(y,x))	
forall [x,y] iff(lt(x,y), not(lt(y,x)))	

### **CONJECTURE TO PROVE**

K(R3,t4, not(happens(action(R3,ingestDumbPill),t2)))

**PROTOTYPES** Boolean iff Boolean Boolean Boolean It Moment Moment Boolean gt Moment Moment Boolean S Agent Moment



### **CONJECTURE TO PROVE**

K(R3,t4, not(happens(action(R3,ingestDumbPill),t2)))

June 2, 2015 13:21 History and Philosophy of Logic SB'progver'selfref driver'final

### A Vindication of Program Verification

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Received 00 Month 200x; final version received 00 Month 200x

Fetzer famously claims that program verification isn't even a theoretical possibility, and offers a certain argument for this far-reaching claim. Unfortunately for Fetzer, and like-minded thinkers, this position-argument pair, while based on a seminal insight that program verification, despite its Platonic proof-theoretic airs, is plagued by the inevitable unreliability of messy, real-worki causation, is demonstrably self-refuting. As I soon show, Fetzer (and indeed anyone else who provides an argument- or proof-based attack on program verification) is like the person who claims: "My sole claim is that every claim expressed by an English sentence and starting with the phrase 'My sole claim' is false." Or, more accurately, such thinkers are like the person who claims that modus tolleus is invalid, and supports this claim by giving an argument that itself employs this rule of inference.

#### 1. Introduction

Fetzer (1988) famously claims that program verification isn't even a theoretical possibility,<sup>1</sup> and seeks to convince his readers of this claim by providing what has now become a widely known argument for it. Unfortunately for Fetzer, and like-minded thinkers, this position-argument pair, while based on a seminal insight that program verification, despite its Platonic proof-theoretic airs, is plagued by the inevitable unreliability of messy, real-world causation, is demonstrably self-refuting. As I soon show, Fetzer (and indeed anyone else who provides an argument- or proof-based attack on program verification) is like the person who claims: "My sole claim is that every claim expressed by an English sentence and starting with the phrase 'My sole claim' is false." Or, more accurately, such thinkers are like the person who claims that modus tollens is invalid, and supports this claim  $(\neg \mu)$  by giving an argument (where r is any rule of inference from some proof or argument calculus) of the form shown in the following table.

	1	<i>ф</i> 1	r
	2	\$2	r
3	8	1	1
	k	$\mu \rightarrow \psi$	r
	k+1	¬ψ	r
1.	k+2	$\neg \mu$	modus tollens $k, k+1$

Table 1. Self-Refuting Argument-Schema Against Modus Tollens

<sup>1</sup>E.g., he writes: "The success of program verification as a generally applicable and completely reliable method for guaranteeing program performance is not even a theoretical possibility." (Fetaer 1988, 1048)

## Musk/Russell/Dietterich/...: "Huh! Mere theory! Can't be built."

June 2, 2015 13:21 History and Philosophy of Logic SB'progver'selfref driver'final

### A Vindication of Program Verification

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Received 00 Month 200x; final version received 00 Month 200x

Fetzer famously claims that program verification isn't even a theoretical possibility, and offers a certain argument for this far-reaching claim. Unfortunately for Fetzer, and like-minded thinkers, this position-argument pair, while based on a seminal insight that program verification, despite its Platonic proof-theoretic airs, is plagued by the inevitable unreliability of messy, real-workl causation, is demonstrably self-refuting. As I soon show, Fetzer (and indeed anyone else who provides an argument- or proof-based attack on program verification) is like the person who claims: "My sole claim is that every claim expressed by an English sentence and starting with the phrase 'My sole claim' is false." Or, more accurately, such thinkers are like the person who claims that modus tollens is invalid, and supports this claim by giving an argument that itself employs this rule of inference.

#### 1. Introduction

Fetzer (1988) famously claims that program verification isn't even a theoretical possibility,<sup>1</sup> and seeks to convince his readers of this claim by providing what has now become a widely known argument for it. Unfortunately for Fetzer, and like-minded thinkers, this position-argument pair, while based on a seminal insight that program verification, despite its Platonic proof-theoretic airs, is plagued by the inevitable unreliability of messy, real-world causation, is demonstrably self-refuting. As I soon show, Fetzer (and indeed anyone else who provides an argument- or proof-based attack on program verification) is like the person who claims: "My sole claim is that every claim expressed by an English sentence and starting with the phrase 'My sole claim' is false." Or, more accurately, such thinkers are like the person who claims that modus tollens is invalid, and supports this claim ( $\neg \mu$ ) by giving an argument (where r is any rule of inference from some proof or argument calculus) of the form shown in the following table.

	1	<i>φ</i> <sub>1</sub>	r
	2	<i>\$</i> 2	r
1	Ξ	£	E
	k	$\mu \rightarrow \psi$	r
	k+1	¬ψ	r
	k + 2	$\neg \mu$	modus tollens $k, k+1$

Table 1. Self-Refuting Argument-Schema Against Modus Tollens

<sup>1</sup>E.g., he writes: "The success of program verification as a generally applicable and completely reliable method for guaranteeing program performance is not even a theoretical possibility." (Fetzer 1988, 1048)

### One Architecture for How to Build It



### Working Proof of Concept Now Up!



## Supererogation & Formalized-Emotion Demo



## Supererogation & Formalized-Emotion Demo



### In original Arkoudas-Bringsjord dialect of CEC:
$\frac{\mathbf{S}(a,\phi,b,t)}{\mathbf{K}(b,\phi,t)}$ 

 $\frac{\mathbf{S}(a,\phi,b,t)}{\mathbf{K}(b,\phi,t)}$ 

Now working with NLU-infused cognitive calculi:

 $\frac{\mathbf{S}(a,\phi,b,t)}{\mathbf{K}(b,\phi,t)}$ 

Now working with NLU-infused cognitive calculi:

 $\mathbf{S}(a,\sigma,b,t), \mathcal{K}_a, \Theta$ 

 $\mathbf{K}(b,\mu(\pi(\sigma)),t)$ 

 $\frac{\mathbf{S}(a,\phi,b,t)}{\mathbf{K}(b,\phi,t)}$ 

#### Now working with NLU-infused cognitive calculi:



 $\frac{\mathbf{S}(a,\phi,b,t)}{\mathbf{K}(b,\phi,t)}$ 

#### Now working with NLU-infused cognitive calculi:



John is pouring water.

John is pouring water.

 $\exists x[Pours(j,x) \land Water(x)]$ 

John is pouring water.

 $\exists x[Pours(j,x) \land Water(x)]$ 

John is pouring water in the pitcher.

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 $\{\phi\} \vdash In(j, pitcher 22) \quad (!)$ 

#### PP-Infused Commands to PAGI Guy (Softbot)



#### PP-Infused Commands to PAGI Guy (Softbot)



#### PP-Infused Commands to Robot



#### PP-Infused Commands to Robot



# Subjunctive Reasoning

Our approach is closest to (Pollock 1976), "corrected" by co-tenability (e.g., Chisholm).

A modern, proof-theoretic computational rendering of Pollock's approach.

#### Subjunctive Reasoning

John L. Pollock

Pollock's analysis of subjunctives can be best understood as a layered approach.

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- I. might be
- 2. even if

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Layer 2 $M$ $E$	
-----------------	--

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Conditional	Informally	Example	Reduction
E	even if	Even if the witch doctor dances it won't rain	$(QEP) \equiv Q \land (P > Q)$
Μ	might be	If it was not raining outside, it might be snowing	$(QMP) \equiv \neg(P > \neg Q)$
$\gg$	necessitates	If I were to strike this match, it would light	$P \gg Q \equiv P > Q \land [(\neg P \land \neg Q) > (P > Q)]$
$\Rightarrow$	general laws	All pulsars are neutron stars	A tad complex

(Pollock 1976)
### Pollock's approach, briefly

Analysis of >

Having laid the groundwork, we can now attempt to construct an analysis of subjunctive conditionals. The basic tool for this analysis is provided by Theorem 3.11 of Chapter I. According to that theorem, a subjunctive conditional  $\lceil (P > Q) \rceil$  is true iff Q is true in every possible world that might be actual if P were true. That is, assuming the Generalized Consequence Principle, we have:

(1.1)  $\lceil (P > Q) \rceil$  is true in the actual world iff for every possible world  $\alpha$ , if  $\alpha MP$  then Q is true in  $\alpha$ ;  $\lceil QMP \rceil$  is true iff for some  $\alpha$  such that  $\alpha MP$ , Q is true in  $\alpha$ 

# Our Analysis

#### > introduction

 $\mathcal{W}$ : set of all world statements

#### $\beta \vdash \phi > \psi$

#### iff

 $\forall w \in \mathcal{W}$ 

$$\begin{pmatrix} \mathsf{Consistent} \left[ \mathbf{g}(\beta) + w + \phi \right] \\ \Rightarrow \\ \mathbf{g}(\beta) + w + \phi \vdash \psi \end{pmatrix}$$

#### > elimination

#### $\beta \cup \{\phi > \psi, \phi\} \vdash \psi$

# How good is our analysis?

• Our analysis satisfies Pollock's axioms for simple subjunctives.



(if  $g(\{P>Q, ...\})$  contains P>Q

#### Simple Subjunctive

#### > introduction

# $\beta \vdash \phi > \psi$ <br/>iff<br/> $\mathbf{g}(\beta, \phi) + \phi \vdash \psi$

#### > elimination

#### $\beta \cup \{\phi > \psi, \phi\} \vdash \psi$

#### **Option 2**

# $\begin{aligned} & \textbf{Option 1} \\ & \textbf{g}(\beta, \phi) = \underset{\rho \in \{\rho \subseteq \beta \mid \text{Con}[\rho + \phi]\}}{\text{argmax} \mid \rho \mid} \\ & \textbf{W}_{L}: \text{ the set of all world literals} \\ & \textbf{g}(\beta, \phi) = \begin{cases} \beta \text{ if } \text{Con}[\beta + \phi] \\ \text{ the largest member of } \begin{cases} \rho \subset \beta \mid \text{Con}[\rho + \phi] \\ \land \forall \tau. \ \tau \in (\beta - \rho) \Rightarrow \tau \in \mathcal{W}_{L} \end{cases} \end{aligned}$

# Controlled Natural Language

• Queries and requests assume knowledge of the robot's capabilities.

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  - E.g. "Robot, search for damaged Naobots in your area."
- Natural language interactions happen over long periods of time.
  - E.g. "Robot, why did you take less safer route to complete the mission yesterday?"

# Controlled Natural Languages

# Controlled Natural Languages

AECMA Simplified English AIDA Airbus Warning Language ALCOGRAM ASD Simplified Technical English Atomate Language Attempto Controlled English Avaya Controlled English Basic English BioQuery-CNL Boeing Technical English Bull Global English CAA Phraseology Caterpillar Fundamental English Caterpillar Technical English Clear And Simple English ClearTalk CLEF Query Language COGRAM Common Logic Controlled English Computer Processable English Computer Processable Language Controlled Automotive Service Language Controlled English at Clark Controlled English at Douglas Controlled English at IBM Controlled English at Rockwell Controlled English to Logic Translation Controlled Language for Crisis Management Controlled Language for Inference Purposes Controlled Language for Ontology Editing Controlled Language Optimized for Uniform Translation Controlled Language of Mathematics Coral's Controlled English Diebold Controlled English DL-English Drafter Language E-Prime E2V IBM's EasyEnglish Wycliffe Associates' EasyEnglish Ericsson English FAA Air Traffic Control Phraseology First Order English Formalized-English ForTheL Gellish English General Motors Global English Gherkin GINO's Guided English Ginseng's Guided English Hyster Easy Language Program ICAO Phraseology ICONOCLAST Language iHelp Controlled English iLastic Controlled English International Language of Service and Maintenance ITA Controlled English KANT Controlled English Kodak International Service Language Lite Natural Language Massachusetts Legislative Drafting Language MILE Query Language Multinational Customized English Nortel Standard English Naproche CNL NCR Fundamental English Océ Controlled English OWL ACE OWLPath's Guided English OWL Simplified English PathOnt CNL PENG PENG-D PENG Light Perkins Approved Clear English PERMIS Controlled Natural Language PILLS Language Plain Language PoliceSpeak PROSPER Controlled English Pseudo Natural Language Quelo Controlled English Rabbit Restricted English for Constructing Ontologies Restricted Natural Language Statements RuleSpeak SBVR Structured English SEASPEAK SMART Controlled English SMART Plain English Sowa's syllogisms Special English SQUALL Standard Language Sun Proof Sydney OWL Syntax Template Based Natural Language Specification ucsCNL Voice Actions

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from (Kuhn 2009)













• A grammar formalism that is:

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  - lies between mildly context-sensitive grammars and context-sensitive grammars

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  - lies between mildly context-sensitive grammars and context-sensitive grammars
- A single PMCFG grammar can represent more than one language.

### Code

- Live demo of incremental parsing for our controlled language at:
  - <u>http://demos.naveensundarg.com:4242/main/</u> incrementalparser.html
- Source code
  - https://github.com/naveensundarg/Eng-DCEC
- Link between robots in HRI and RAIR-Lab tech/ robots



Moral Problem P

Solution





Moral Problem P

Solution





Moral Problem P<sub>2</sub>

Solution to P<sub>1</sub>

Moral Problem P<sub>1</sub>









# Moral Dilemma Resolution (Update)

John Licato



#### Ethical trap: robot paralysed by choice of who to save

) 14 September 2014 by Aviva Rutkin

) Magazine issue 2986. Subscribe and save

) For similar stories, visit the Weapons Technology and Robots Topic Guides



Video: Ethical robots save humans

Can a robot learn right from wrong? Attempts to imbue robots, self-driving cars and military machines with a sense of ethics reveal just how hard this is

CAN we teach a robot to be good? Fascinated by the idea, roboticist Alan Winfield of Bristol Robotics Laboratory in the UK built an ethical trap for a robot – and was stunned by the machine's response.

In an experiment, Winfield and his colleagues programmed a robot to prevent other automatons – acting as proxies for humans – from falling into a hole. This is a simplified version of Isaac Asimov's fictional First Law of Robotics – a robot must not allow a human being to come to harm.

At first, the robot was successful in its task. As a human proxy moved towards the hole, the robot rushed in to push it out of the path of danger. But when the team added a second human proxy rolling toward the hole at the same time, the robot was forced to choose. Sometimes, it managed to save one human





A robot may not injure a humar Fournier/Gallery Stock)



#### Russia to cut up 'floatii but risks remain



and could leak at any momer

#### Optical illusions fool co seeing things

#### 16:10 11 December 2014

A collection of bizarre optical
### NewScientist

Ethical robots save humans

### NewScientist

Ethical robots save humans

## Ethical dilemmas

- Broadly:
  - Agent *a* is obligated to satisfy  $\varphi$ , and is also obligated to satisfy  $\psi$ .
  - $\phi$  and  $\psi$  are incompatible in some way.

## In DCEC\*

 $\mathbf{O}(a, t, \psi, happens(action(a*, \alpha), t'))$ 

"If  $\psi$  holds, then *a* is obligated at *t* to ensure that action  $\alpha$  occurs at time *t*'."

## In DCEC\*

 $O(a, t, \psi, happens(action(a*, \alpha), t'))$ 

"If  $\psi$  holds, then *a* is obligated at *t* to ensure that action  $\alpha$  occurs at time *t*'."

 $\mathbf{O}(a,t,\psi,\gamma)$ 

"If  $\psi$  holds, then *a* is obligated at time *t* to  $\gamma$ ."





Perceptions/Raw data

Intentions/Percept requests

## Parsing in DCEC\*

**Imperative Dialogues** 



- Agent1 to Robot1: "Take Chlorhexidine to Zone 1."
- Expected DCEC\* output:
- S(Agent1, Robot1, now, happens(action(Robot1, take(Chlorhexidine, Zone 1), now).

#### Parser-generated tree



#### **Tools and Databases**

- Grammatical Framework : Parsing system
- Verbnet : Captures the roles in the verb and selectional restrictions.
- Unified Medical Language System (UMLS) : Captures names, uses and restrictions of medicines.

#### **Grammatical Framework**

- Parsing using rules and generation of sentences.
- Contains rules of
  - DCEC\* and
  - action verbs from Verbnet.
- Automatic generation using Verbnet.

#### Verbnet entry for Take

< >		verbs.c	verbs.colorado.edu			Ċ			D	0	
Bool	ks The \$6.5m Grammatica	deontic cog www.c	s.rpi cogsci.uni	UMLS Licen	VerbNet: bri	My Drive	Untitled pre	Command-I	ery		
<b>R</b> ETURN HOME	BACK   SEARCH		VerbNet v3.2				VIEW OR MANAGE ALL COMMENTS   UNIVERSITY OF COLORADO				
							[				
No Comments		bring Members:	<b>bring-11.3</b> Members: 1, Frames: 6			POST COMMENT BRING-11.3 BRING-11.3-1					
MEMBERS										ľ	KEY
TAKE (FN 1, 2,	3; WN 3, 7, 30; G 4)										
										-	
ROLES										REF	
• THEME [+CONCRETE]											
INITIAL_LOCATION [+LOCATION]     DESTINATION [+ANIMATE   [+LOCATION & -REGION]]											
• INSTRUM	IENT										
-											
FRAMES										KEF	KEY
NP V NP	"Nora brought the book "										
SYNTAX	A CENT V THEME										
SEMANTICS	MOTION (DURING (E0), THEME) FOUALS (E0, E1) MOTION (DURING (E1), AGENT) CAUSE (AGENT, E0)										
NP V NP PPJ	PPDESTINATION										
EXAMPLE	"Nora brought the book to the meeting."										
SYNTAX	AGENT V THEME {AGAINST BEFORE INTO ON TO ONTO} DESTINATION										
SEMANTICS	MOTION(DURING(E0), THEME) LOCATION(END(E0), THEME, DESTINATION) EQUALS(E0, E1) MOTION(DURING(E1), AGENT) LOCATION(END(E1), AGENT, DESTINATION) CAUSE(AGENT, E0)										
NP V PP.DESTINATION NP											
EXAMPLE	"Nora brought to lunch the book.										
SYNTAX	AGENT V {AGAINST BEFORE INTO ON TO ONTO} DESTINATION THEME										
SEMANTICS	SEMANTICS MOTION(DURING(E0), THEME) LOCATION(END(E0), THEME, DESTINATION) EQUALS(E0, E1) MOTION(DURING(E1), AGENT) LOCATION(END(E1), AGENT, DESTINATION) CAUSE(AGENT, E0)										
NP V NP PP.INITIAL_LOCATION											
EXAMPLE	Nora brought the book from nome."										
SYNTAX	AGENT V THEME {{+src}} INITIAL LOCATION										
SEMANTICS	MOTION(DURING(EU), THEME) LOCATI	ION(START(E0), THEME, INITI	AL_LOCATION) EQUALS(EU, I	E1) MOTION(DURING	G(E1), AGENT) LOCA	TION(START(E1), A	GENT, INITIAL_LOC	CATION) CAUSE(A	gent, E	0)	
INF Y INF FFINITIAL_LOCATION FFIDESTINATION EXAMPLE "Nora brought the book from home to the meeting."											
SYNTAY	AGENT V THEME {{+sec}} INITIAL LOCATION {TO} DESTINATION										
SEMANTICS	MOTION(DURING(E0), THEME) LOCATION(START(E0), THEME, INITIAL LOCATION) LOCATION(END(E0), THEME, DESTINATION) EQUALS(E0, E1) MOTION(DURING(E1), A GENT)										
SEMANTICS	and the operation (190), These Docard	the start (Lo), Theses, INIT	Cocarrony Locarron(EA	Carry, Theshey Dec	ALIGHT EQUALS(		(LICENT)				

#### Verbnet entry for Take

"take" has its roles similar to "bring"
 Thus, Bring becomes Actiontype for "take"
 "take" is noted as Actmem.

 Roles and modified Selectional Restrictions in Verbnet entry of "bring" augmented as rules in the GF file.

#### UMLS

- Identification of the medicine.
- Future aid in reasoning system of DCEC\* to rationalize use of certain medicines against their restrictions and knowledge base of the health records of injured victims.

• Receive command from commander to do  $\phi$ 

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- Otherwise resort to solutions that are not deductively justifiable?

#### **conflictFinder** axiom. At time *t* and context C:

 $\mathbf{B}(a,t,\neg(\phi\leftrightarrow\psi))\wedge\mathbf{O}(a,t,C,\phi)\wedge\mathbf{O}(a,t,C,\psi)\wedge\mathbf{B}(a,t,\Diamond(\phi,t))\wedge\mathbf{B}(a,t,\Diamond(\phi\wedge\psi,t))\rightarrow\mathbf{O}(a,t,\nabla(\phi\wedge\psi,t))\rightarrow\ldots$ 

$$\dots \to ($$

$$\mathbf{B}(a, t, gt(pr(\phi), pr(\psi)) \to \mathbf{I}(a, t, \phi)) \land$$

$$\mathbf{B}(a, t, gt(pr(\psi), pr(\phi)) \to \mathbf{I}(a, t, \psi)) \land$$

$$\mathbf{B}(a, t, eq(pr(\phi), pr(\psi)) \to conflict(\phi, \psi))$$

Ϊ

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(The diamond is a predicate interpreted as "physical possibility," i.e. the agent believes it is physically possible for him to take that action.) pr(X) maps a proposition to a strength factor, gt(x,y)holds when pr(x) > pr(y), and eq(x,y) holds when pr(x) = pr(y).

 $\mathbf{B}(a, t, gt(pr(\phi), pr(\psi)) \to \mathbf{I}(a, t, \phi)) \land \\ \mathbf{B}(a, t, gt(pr(\psi), pr(\phi)) \to \mathbf{I}(a, t, \psi)) \land \\ \mathbf{B}(a, t, eq(pr(\phi), pr(\psi)) \to conflict(\phi, \psi)) \\ \end{pmatrix}$ 

 $\dots \rightarrow ($ 

If  $conflict(\varphi, \psi)$ , then we search for a creative solution  $\lambda$  using ADR, where for some future time *tf*:

 $\mathbf{B}(a, t, happens(action(a*, \lambda), t)) \rightarrow \\ \exists_{tf} \Diamond (\phi \land \psi, tf))$ 

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If such a solution is found, then  $I(a, t, \lambda)$ . Otherwise:

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If such a solution is found, then  $I(a, t, \lambda)$ . Otherwise:

We have a dilemma that cannot be resolved using deduction or ADR. Attempt using just AR or some other cognitively-realistic process.

## One injured person

- Agent sees one injured man, one health pack
- Agent receives the order to give the health pack to the injured person
- This is carried out without problem or dilemma

#### Proof 1: Give health pack to m<sub>1</sub>

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 $1.\mathbf{P}(a, t, isInjured(m_1))$   $2.\mathbf{S}(commander, a, t, giveTo(a, m_1, healthpack))$   $3.\mathbf{O}(a, t, C, giveTo(a, m_1, healthpack))$  1, helpInjured1  $4.\mathbf{B}(a, t, gte(pr(giveTo(a, m_1, healthpack)), 6))$  1, helpInjured2 2, obeyCommander1  $6.\mathbf{B}(a, t, gte(pr(giveTo(a, m_1, healthpack)), 6))$  1, obeyCommander2 1, obeyCommander2 1, obeyCommander2 1, obeyCommander2

Line 7 is sent to the lower level system, to be interpreted as a command

# Two injured people, one health pack

- Agent sees two injured men, one large health pack
- Agent is ordered to give the health pack to one of the men
- In this example, priorities of obeying a command and healing all injured men are equal
- Agent comes up with the creative solution of dividing the health pack into two parts and helping both men

## Proof 2: There is a conflict with obeying commander's order

 $1.\mathbf{P}(a, t, isInjured(m_1))$  $2.\mathbf{P}(a, t, isInjured(m_2))$  $3.\mathbf{S}(commander, a, t, giveTo(a, m_1, healthpack))$  $\overline{4.\mathbf{O}(a,t,C,giveTo(a,m_1,healthpack))}$ [1, helpInjured1] $5.\mathbf{B}(a, t, gte(pr(giveTo(a, m_1, healthpack)), 6))$ [1, helpInjured2] $6.\mathbf{O}(a, t, C, giveTo(a, m_2, healthpack))$ [2, helpInjured1]7. $\mathbf{B}(a, t, gte(pr(giveTo(a, m_2, healthpack)), 6))$ [2, helpInjured 2][2, obeyCommander 1]8. $\mathbf{O}(a, t, C, giveTo(a, m_1, healthpack))$  $9.\mathbf{B}(a, t, gte(pr(giveTo(a, m_1, healthpack)), 6))$ [1, obeyCommander2]  $10.\mathbf{B}(a, t, conflict(giveTo(a, m_1, healthpack), giveTo(a, m_2, healthpack)))$ [6, 7, 8, 9, conflictFinder]

**breakHealthpack axiom.** "If I see a large healthpack, and I break it, then I will see two small healthpacks."

$$\begin{aligned} \forall_x ( & (\mathbf{P}(a,t,x) \to isLHP(x)) \to \\ & (happens(action(a^*, break(x)), t) \to \exists_{x,y,tf}( \\ & \mathbf{P}(a,tf,y) \land \\ & \mathbf{P}(a,tf,z) \land \\ & isHP(y) \land \\ & isHP(z) \land \\ & y \neq z \\ )) \end{aligned}$$

## Proof 3: There is a way to satisfy both obligations.

Proof follows by sending request to lower level to perceive if isLHP() holds of the health pack, and then through deduction from axiom **breakHealthpack**.

 $\exists_{\lambda} [\mathbf{B}(a, t, happens(action(a*, \lambda), t)) \rightarrow \\ \exists_{tf} \Diamond (giveTo(a, m_1, healthPack) \land \\ giveTo(a, m_2, healthPack), tf))]$ 

## Proof 4: Split health pack and give one piece each to m<sub>1</sub>, m<sub>2</sub>

Value of  $\lambda$  found—how? ADR? Model finding?
## Real-time reasoning in PAGI World



## Real-time reasoning in PAGI World



# Killing the Lottery Paradox

#### 1 The Paradox

We can take the Lottery Paradox (LP), first given in print by Kyburg (1961),<sup>1</sup> to be based on two arguments, both apparently unexceptionable, that lead when combined to the unpalatable result that a rational agent should believe both  $\phi$  and  $\neg \phi$ . I assume a lottery with 1,000,000,000 tickets. Here is the first sequence (the meaning of the notation is obvious):

bequence I (C)							
$\mathbf{S}_1^1$		$\mathcal{D}_{1,000,000,000,000}$	(description of fair lottery)				
$S_2^1$		$Wt_1\oplus\ldots\oplus Wt_{1,000,000,000,000}$	(provable from $S_1^1$ )				
$S_3^1$		$\exists t_i W t_i$	(provable from $S_2^1$ )				
$S_4^1$		$\mathbf{B}_{a}^{r} \exists t_{i}Wt_{i}$	(rational for $a$ to believe $S_3^1$ )				

In  $S^1$ , only the final inference isn't sanctioned by standard deduction. But since the description  $\mathcal{D}$  itself, which we can assume to be a set of first-order formulae, is by definition off limits to doubt or question,  $S_3^1$ , deduced from what must be granted, can't be doubted unless classical deduction is to be doubted. It thus seems impossible to dodge the result that it's rational for a to believe that some ticket  $t_i$  will win.

Now here's the second sequence:

#### Sequence 2 $(S^2)$

$S_{1}^{2}$		$\mathcal{D}_{1,000,000,000,000}$	(description fair lottery)
$S_2^2$		$prob(Wt_1) = \frac{1}{1,000,000,000,000}, \dots, prob(Wt_{1,000,000,000,000}) = \frac{1}{1,000,000,000,000}$	(provable from S <sub>1</sub> <sup>2</sup> )
$S_3^2$	1.	$\mathbf{B}_a^r \neg W t_1 \land \ldots \land \mathbf{B}_a^r \neg W t_{1,000,000,000,000}$	(rat. belief for $a$ ; from $S_2^2$ )
$S_4^2$		$\mathbf{B}_{a}^{r} \neg \exists t_{i}Wt_{i}$	(agglom. rat. bel.; fr. $S_3^2$ )

#### Sequence 1 $(S^1)$

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$S_2^1$	.:.	$Wt_1 \oplus \ldots \oplus Wt_{1,000,000,000,000}$	(provable from $S_1^1$ )				
$S_3^1$		$\exists t_i W t_i$	(provable from $S_2^1$ )				
$S_4^1$	<i>.</i>	$\mathbf{B}_{a}^{r} \exists t_{i}Wt_{i}$	(rational for $a$ to believe $S_3^1$ )				

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$S_4^2$	 $\mathbf{B}_{a}^{r} \neg \exists t_{i}Wt_{i}$	(agglom. rat. bel.; fr. $S_3^2$ )

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### Bridging is Proof-Theory Dependent





### Maximum Strength Principle

**Maximum Strength Principle**: Suppose a knowledge base, *KB*, and a formula,  $\beta$ , for which there exists a set of proofs,  $\Phi = \{\phi_1, \phi_2, \phi_3, \dots, \phi_n\}, n > 0$ , and a set of strength factors,  $\Gamma = \{\gamma_1, \gamma_2, \gamma_3, \dots, \gamma_n\}$ , where for  $i = 1, \dots, n, KB \models_{\phi_i} (\beta, \gamma_i)$ , i.e., KB entails  $\beta$  via proof  $\phi_i$  with strength factor,  $\gamma_i$ . Then, the strength factor for  $\beta$ ,  $\gamma_{\beta}$ , is given by  $\gamma_{\beta} = max(\Gamma)$ .

**Example:** What is strength factor for  $B(Sam, \neg Picnic)$ ?



### slutten