# Artificial Intelligence II

CSC 720—Spring 2010

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January 17, 2011

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# Logical rationality

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### Logic and rationality

#### Logic as instrumental

- An analytical tool
- A representational tool
- A computational tool
- Logic proper

#### Logic as a norm for thinking

- Prescriptions for representation
- Prescriptions for reasoning
- Logicism

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Logic

# Logic provides an analytical tool

- Logical analysis can apply to all types of representations
- Precise concepts for expressing meanings
  - How to describe things with words
  - Language and syntax
  - · Meaning and semantics
- Precise concepts for critiquing meanings
  - How to tell if your words meant what you intended
  - Inference and proof
  - Analytical concepts
- Formal inference systems which "preserve truth"
  - Not a guarantee of correct answers!
  - Not a guarantee of useful answers!
  - Not a guarantee of intelligible answers!

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Logic

# Formal representations and computational mechanisms

- Expressing logical descriptions and inferential connections
  - Predicate, modal, and model-theoretic logics
  - Description logics
  - · Microtheories and metatheories
- Computing logical inference and learning
  - Resolution-based logic programming systems
  - Answer-set programming systems
- Computing theory revision and identification
  - Reason maintenance systems
  - Inductive logic programming and PAC learning

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#### Logio

# There are many different logics

### Propositional and first-order logics

Subject-independent building blocks

### Other logical languages "build in" different concepts

- Higher-order logics (set-theoretic, categorical, ...)
- Modal logics (necessitative, dynamic, ...)
- Model-theoretic logics (probability, topology, ...)
- Philosophical logics (deontic, epistemic, ...)
- Commonsense logics (nonmontonic, fuzzy, ...)
- Computational logics (temporal, functional, ...)

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Logicism

### Logicism

### Normative logical rationality

- Beliefs must be consistent
- Inferences must be sound
- Inferences must be complete
  - If it's sound, do it!
- Knowledge of logic must be complete
  - No insistence that general knowledge is complete
- Learning and action must preserve consistency

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Logicism

# Consistency

#### Emerson's thesis

• "A foolish consistency is the hobgoblin of little minds"

#### Minsky's corollary

Only small minds can be consistent for very long

### Niven's corollary

"Some mistakes we must carry with us"

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Logicism

### Soundness

Soundness is not sufficient

•  $A \vdash A \land (A \lor A)$ 

Minsky: adding control axioms does not help

 $egin{aligned} A \ A 
ightarrow B \ ext{``Avoid concluding $B''$} \ \hline B \wedge ext{``Avoid concluding $B''$} \end{aligned}$ 

Soundness is not necessary

• At(door) ⊢ [Walk-to(desk)]At(desk)

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Logical knowledge

# Logical omniscience

Full knowledge of logical consequences

- If P is known and  $P \models Q$ , then Q is known too
- If P and Q are inconsistent, the inconsistency is known
- To ensure consistency, one must have full knowledge of consequences

Necessary for logical rationality

 To ensure consistency, one must have full knowledge of consequences

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Logical knowledge

# Modal logics of knowledge and belief

Suppose that  $\Box \phi$  means "I know that  $\phi$ "

• Then  $\Box \phi \rightarrow \phi$  seems right

Suppose that  $\Box \phi$  means "I believe that  $\phi$ "

• Then  $\Box \phi \rightarrow \phi$  seems wrong

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Logical knowledge

# Kripke semantics

A form of possible world semantics for necessity

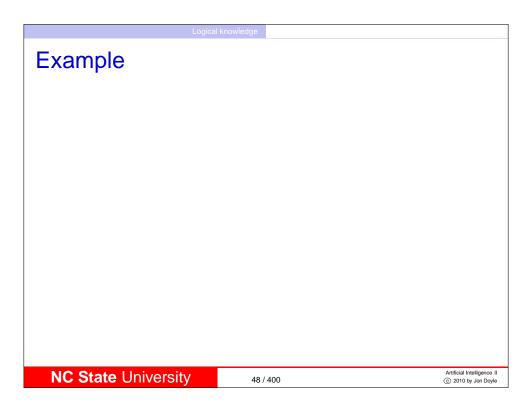
- $\Box \phi$  is true if  $\phi$  is true in all possible worlds
- $\Box \phi$  is true if  $w \models \phi$  for all  $w \in W$

Insight: what is possible varies across logics

- Capture this variation in an accessibility relation S between possible worlds in W
- Accessibility = what is possible with respect to a possible world
- $\Box \phi$  is true in world w if  $w' \models \phi$  for all  $w' \in S(w)$
- Disputed axioms correspond to different accessibility relations

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Logical knowledge

# Modal logic axiom schemata

- $K: \Box(\alpha \to \beta) \to (\Box\alpha \to \Box\beta)$ 
  - Deductive closure of knowledge
  - All models
- $T: \Box \phi \rightarrow \phi$ 
  - Knowledge implies truth
  - · Reflexive models
- *PI* (or 4):  $\Box \phi \rightarrow \Box \Box \phi$ 
  - Positive introspection: "I know I know what I know"
  - Transitive models
- *NI* (or *E* or 5):  $\neg \Box \phi \rightarrow \Box \neg \Box \phi$ 
  - Negative introspection: "I know I don't know what I don't know"
  - Euclidean models

Logical knowledge

### Axiomatic modal logic

- Base logic *K* = axiomatic predicate logic
  - + Axiom scheme  $K : \Box(\alpha \to \beta) \to (\Box\alpha \to \Box\beta)$
  - + Necessitation rule: From  $\alpha$ , infer  $\Box \alpha$

#### **Epistemic logics**

- Logic T = K + scheme T
- Logic S4 = T + scheme PI
- Logic S5 = S4 + scheme NI

#### **Doxastic logics**

- Logic K4 = S4 T
- Logic K5 = S5 T

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Logical learning

# Logical views of thinking

#### Mental states modeled as logical theories

- Consistent set of logical sentences
- Theory = consequentially closed set of logical sentences
  - · Usually modeled as deductively closed

### Reasoning modeled as theory evolution

- Distinguish change in view from logical inference
  - Add, remove, or change statements
  - Same or changing language

# Monotonicity and nonmonotonicity

Temporal mappings from instants to mental states

- Monotonic:  $t \le t' \to \mathsf{Th}(t) \subseteq \mathsf{Th}(t')$
- Nonmonotonic:  $t \le t' \not\to \mathsf{Th}(t) \subseteq \mathsf{Th}(t')$
- Ordinary reasoning is temporally nonmonotonic

Logical mappings from axiom sets to theories

- Monotonic:  $A \subseteq A' \to \mathsf{Th}(A) \subseteq \mathsf{Th}(A')$
- Nonmonotonic:  $A \subseteq A' \not\rightarrow \mathsf{Th}(A) \subseteq \mathsf{Th}(A')$
- Ordinary logic is logically monotonic

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# A practical problem

### Your predicament:

- You think the English test is on Tuesday
- You think the math test is on Wednesday
- You hear your classmate Alice wish that the tests were not on the same day

What do you do?

### Ideal belief or theory revision

### Theory A = Cn(A) as the object of change

- Addition  $A + x = Cn(A \cup \{x\})$
- Contraction A x removes x from A if possible
- Revision A + x consistently adds x to A
- Levi identity:  $A + x \stackrel{\text{def}}{=} (A \neg x) + x$

#### Quine's minimum mutilation principle

- What is minimized?
- · Rescher's preferred maximal consistent subsets
- What sort of preferences?

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### Candidates for revision

#### Some candidates for consideration

- $A \Downarrow x \stackrel{\text{def}}{=} \{B \subseteq A \mid B \nvdash x\}$
- $A \downarrow ^* x \stackrel{\text{def}}{=} \{ Cn(B) \mid B \in A \downarrow x \}$
- $A \downarrow x \stackrel{\text{def}}{=} \max_{\subset} (A \Downarrow x)$

#### Some candidates for contractions

- Maxichoice: choose one from A ↓ x
- Partial meet: intersect a subset of  $A \downarrow x$
- Full meet:  $\bigcap A \downarrow x$

### AGM contraction axioms

#### Alchourrón, Gärdenfors, and Makinson axioms

- $(\dot{-}1)$   $A \dot{-} x$  is a theory whenever A is
- $(\dot{-2})$   $A \dot{-} x \subseteq A$
- $(\dot{-}3)$  If  $x \notin Cn(A)$ , then  $A \dot{-} x = A$
- $(\dot{-}4)$  If  $\nvdash x$ , then  $x \notin Cn(A \dot{-}x)$
- $(\dot{-}5)$  If  $\vdash x \leftrightarrow y$ , then  $A \dot{-} x = A \dot{-} y$
- $(\dot{-}6)$   $A \subseteq Cn((A \dot{-} x) + x)$  whenever A is a theory
- (  $\dot{}$   $\dot{}$
- ( $\dot{-}8$ ) If  $x \notin A \dot{-} (x \wedge y)$ , then  $A \dot{-} (x \wedge y) \subseteq A \dot{-} x$  whenever A is a theory

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# Another perspective

#### Epistemic entrenchment

- Ordering over propositions in theories
- x < y means give up x before y</li>
  - $x \le y$  if  $x \vdash y$
  - $x \le y$  iff  $x \notin A (x \land y)$  or  $\vdash x \land y$

### Conditions on contractions

#### Gärdenfors and Makinson axioms

- $(\leq 1)$  If  $x \leq y$  and  $y \leq z$ , then  $x \leq z$
- $(\leq 2)$  If  $x \vdash y$ , then  $x \leq y$
- $(\leq 3)$  Either  $x \leq x \land y$  or  $y \leq x \land y$
- ( $\leq$ 4) If A is consistent, then  $x \leq y$  for all y iff  $x \notin A$
- (≤5) If  $x \le y$  for all x, then  $\vdash y$

#### Relating the perspectives

• Theorem: the axiom sets are equivalent

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### What determines entrenchment?

### AGM approach based on coherence among beliefs

- Coherence conditions on theories (deductive closure and consistency) and on contractions
- No explicit separation between types of beliefs, only differing levels of entrenchment
- Entrenchment apparently exogenous to standard attitudes (belief, desire, intention)

#### Why one order and not another?

- Entrenchment from agent preferences
- Entrenchment from structure of memory

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Meaning

# Identifying logical states of mind

How does one tell what an agent believes?

- Ask questions about what is believed?
- Infer from observed behavior?
- Ask for explanations of behavior?
- Observe in brain?

Later: economists give a different answer

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Meaning

# Logical and other semantics

Logical semantics is based on denotation

### Other conceptions

- Embodiment and causal connection
- Operational
- Pragmatic
- Red Queen semantics

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Meaning

# Reflection versus requirement

- Necessitation rule:  $\phi$ , therefore  $Know(\phi)$
- Knowledge schema:  $Know(\phi) \rightarrow \phi$
- Adding axiom  $Know(\phi)$  produces  $\phi$
- Axiom  $Know(\phi)$  acts as a specification or requirement of different character than merely adding  $\phi$ 
  - "You are getting sleepy, very sleeeeeepy"
- Force of requirement depends on constitution that enforces the knowledge schema

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