





# FROM COMPUTATION TO AGENCY: WHAT, HOW, AND WHO

Johan van Benthem

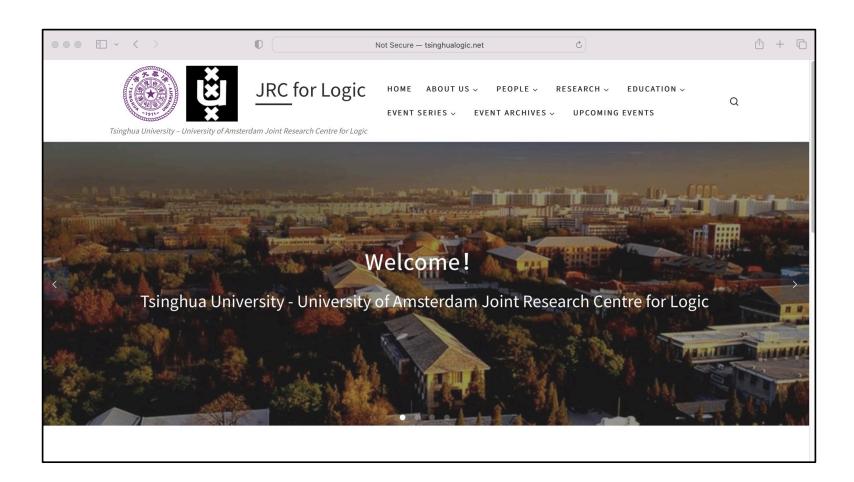
14 December 2022

Logic and Thinking course, Tsinghua University















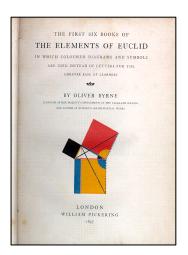
# Since Antiquity: Philosophy, Mathematics

Aristotle Logic, knowledge, argumentation

**Euclid** Proofs and constructions/algorithms







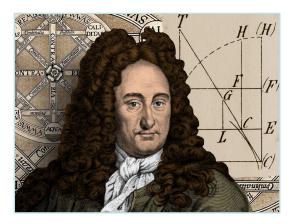


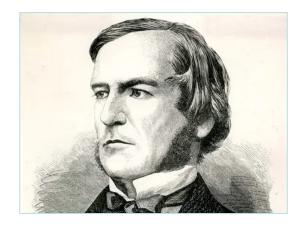




# **Add Mechanical Computation**















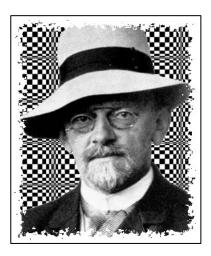
#### The Foundational Era



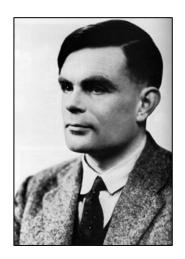




# Logic, Proof, Computation















#### 1930s The Grand Foundational Results

Kurt Gödel

What can be proved, but: Incompleteness theorems

**Alan Turing** 

What can be computed, but: Uncomputable problems

Theoretical, yet turned out to be highly practical Impossibilities requires deep study of possibilities







### In Praise of Impossibility

#### **AFFINITEITEN**

Wat beweegt ons denken? In deze rubriek verschijnen de mooiste odes van het digitale platform Bij Nader Inzien in druk.

#### Lof der onmogelijkheid

e wetenschap stormt van succes naar succes, de technologie serveert mirakels. De media zijn vol van can do-nieuws en optimistische toekomstkijkers. Vanwaar toch die eenzijdige aandacht voor het mogelijke?

In 1931 bewees Kurt Gödel zijn Onvolledigheidsstelling, het hoogtepunt van de moderne logica. Exacte wiskundige theorieën kunnen nooit de volledige waarheid over hun domein bewiizen. Gödels analyse bevatte vele thema's en verhaalwendingen die hele onderzoeksgebieden openden.

Maar wat mij het sterkste trof, en treft, is het loutere idee dat het onmogelijke even belangrijk is als het mogelijke voor ons begrip van de wereld. En het onmogelijke kan worden onderzocht met dezelfde methoden als het mogelijke.

Wiskunde is abstract, dus universeel. Onmogelijkheden heersen overal. Turings artikel dat de moderne computer definieerde (ondenkbaar zonder Gödel: iets wat de patriottistische speelfilm The Imitation Game verzwijgt), heeft als centraal resultaat dat er geen methode bestaat die altijd bepaalt of een programma op een input een antwoord zal produceren. Turings bewijs van die onmogelijkheid gaf niettemin scherpe

informatie over wat een berekening wel is en wat rekenen kan presteren. Evenzo begrijpen we na Gödel onvergelijkelijk veel beter wat wiskundige bewijzen zijn, en wat ze kunnen. Het onmogelijke informeert ons over het mogeliike, ze horen bii elkaar, Welbeschouwd is de hele wetenschapsgeschiedenis voortschrijdend inzicht in twee verstrengelde zaken: wat wel en wat niet kan.

Is dit nu een filosofisch idee, zoals de uitnodiging voor dit stukie luidde? Voor mii is de grens tussen filosofie en wiskunde vloeiend. In een Clausewitziaanse symmetrie: beide zijn een voortzetting van de ander 'met andere

De vervlechting van mogelijkheid en onmogelijkheid bleek een aardschok die mijn denkwereld blijvend veranderde. Ik denk sindsdien dat wij allen gebaat zijn met actief opsporen en erkennen van onmogelijkheden.

Inzien dat can't do net zo informatief is als can do in wat wij mogen verwachten in wetenschap, technologie en maatschappij helpt ons vooruit - en het kweekt ook bescheidener mensen.

O AUTEUR Johan van Benthem





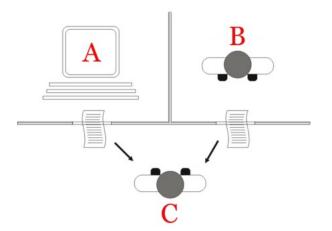


#### The Turing Test (1950)

Turing machines well-chosen abstraction of human capabilities

In principle applicable to many intelligent tasks

**Scenario** Can we tell a computer apart from a human in natural conversation?



Benchmark for broader field of Artificial Intelligence

Replacement as a goal, or mixed systems?







### **Computer Science Themes**







#### How to Make It Work: General Themes in CS

Machine building tradition 19th century to 1930s (Zuse)

von Neumann architecture 1940s

programming languages 1950s

program correctness 1960s

How you compute, ever more important theme

Computing produces not just output, but behavior

Distributed computing: societies 1980s

Finite and infinite computation 1990s

many of these themes are entangled with logic







#### **Case Study:**

**Logics of Programs and Actions** 







### 1960s - 1970s Correctness and Program Logics

**Correctness concerns:** 

how can we be sure a program does what it is supposed to do?

prove for given program in suitable logic system many approaches to achieving such goals do one particular example here:

dynamic logics for imperative programs







## **Program Semantics: State Transitions**

#### Imperative program

usual logical formulas describe what is

Here: instructions to do: x = 3, x = y + 1, x = x - 2

variables: addresses, registers

computer memory: assignment of values to variables

just like assignments for standard first-order logic

Semantics: model **M** with state transitions

**M**, **s**, **t**  $\mid$ =  $\pi$  some successful execution of

program  $\pi$  in **M** starts in **s** and ends in **t** 



atomic instructions work as follows

**M**, s, t |= x := T iff 
$$t = s [x := [[T]]^{M, s}]$$

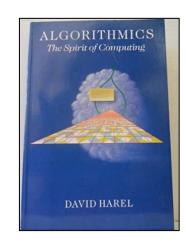
program constructions

sequential composition  $\pi 1$ ;  $\pi 2$ 

conditional choice IF  $\phi$  THEN  $\pi$ 1 ELSE  $\pi$ 2

iteration WHILE  $\phi$  DO  $\pi$ 

Also general structures in any action: program structure in **cooking!** Also |





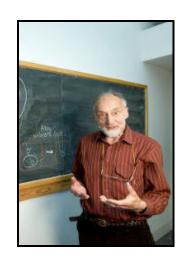




#### **Hoare Calculus**

**(P)** S **(Q)** if program S starts in a state where **precondition** P is true, each succesful execution ends in a state with **postcondition** Q true

$\{P\}S\{A\}$	${A}T{R}$
{P} S	; T {R}
{P & E} S {Q}	$\{P \& \neg E\} T\{Q\}$
{P} IF E	THEN S ELSE T {Q}
{I} S {I	1}
{I} WHILE E DO	O S {I & ¬E}
{P} S	{Q}
{P & A}	S{Q v B}









## **General Dynamic Logic of Structured Action**

PDL language with two components:

statements 
$$p \mid \neg \phi \mid \phi \land \psi \mid \langle \pi \rangle \phi$$

programs a 
$$| \pi 1 ; \pi 2 | \pi 1 \cup \pi 2 | \pi^* | (\phi)$$
?

Can write regular expressions for actions

such as 
$$(a \cup b)^*$$
,  $(a^*; b^*)^*$ 

Can define all the Hoare operations



Conditional Choice IF  $\varepsilon$  THEN  $\pi_1$  ELSE  $\pi_2$  (( $\varepsilon$ )?;  $\pi_1$ )  $\cup$  (( $\neg \varepsilon$ )?;  $\pi_2$ )

Guarded Iteration WHILE  $\varepsilon$  DO  $\pi$  (( $\varepsilon$ )? ;  $\pi$ )\* ; ( $\neg \varepsilon$ )?

partly inspired by a philosophical book on modal logic





# Some Key Reasoning Principles

- All principles of the minimal modal logic for all modalities [π]
- Computation rules for decomposing program structure:

$$<\pi_1;\pi_2>\phi \leftrightarrow <\pi_1><\pi_2>\phi$$
 $<\pi_1\cup\pi_2>\phi \leftrightarrow <\pi_1>\phi \lor <\pi_2>\phi$ 
 $<\phi?>\psi \leftrightarrow \phi \land \psi$ 
 $<\pi^*>\phi \leftrightarrow \phi \lor <\pi><\pi^*>\phi$ 

• The Induction Axiom  $(\phi \& [\pi^*](\phi \to [\pi]\phi)) \to [\pi^*]\phi$ .







#### **Uses of PDL: Broader Influences**

#### **Program semantics**

but challenge of parallel computation

Mathematics: unify **abstract algebra** of regular expressions and **modal logic** 

Abstract computability theory (on any data structures, not just the natural numbers)

but also crossed to other fields

Philosophy of action

**Epistemic notions**: common knowledge is  $[(\cup_{i \in G} \sim_i)^*] \varphi$ 

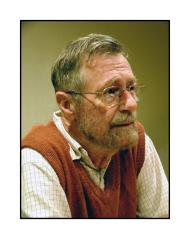






## **Further Views of Logic and Programs**

'Structured programming' methodology not prove correctness after the programming has been done, but work in tandem: design programs together with logical correctness statements



Design programming languages closer to logic: functional programming (LISP, Haskell, etc.) logic programming (PROLOG, etc.)







#### IV

### From Action to Agency





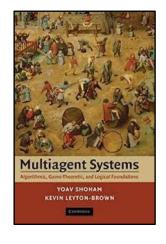


# **Modern Computation: From Action to Agency**

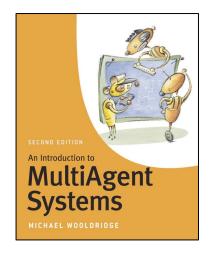


















#### What, How, Who

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#### Computation as social agency: What, how and who



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#### ABSTRACT

Computation today is interactive agency in social networks. In this discussion paper, we look at this trend through the lens of logic, identifying two main lines. One is 'epistemization', making computational tasks refer explicitly to knowledge or beliefs of the agents performing them. The other line is using games as a model for computation, leading to 'gamification' of classical tasks, and computing by agents that may have preferences. This provides ingredients for a fundamental theory of computation that shifts from what is computed to how it is computed and by whom, moving from output to social behavior. The true impact of this shift is not in learning how to replace humans, but in creating new societies where humans and machines interact. While we do not offer a Turing-style account of this richer world, we discuss what becomes of three classical themes: the Universal Machine, Church's Thesis and the Turing Test.<sup>1</sup>

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#### V

# **Information Dynamics**







# **Information Dynamics**

The Restaurant Three people order drinks: water, beer, wine. A new waiter comes with 3 glasses. There are 6 ways these could be distributed. Solved by 2 questions, 1 inference.

知 闻 说 亲 zhi wen shuo qin

Knowledge comes from: hearing from others, proof, or experience.













#### **Question and Answer**



# Q "Is this the Tsinghua Old Gate? A "Yes"

Q conveys: does not know, thinks the other knows, wants to know

A creates knowledge of facts, about others, common knowledge.







# The Tsinghua Old Gate These Days





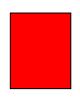






#### **Three Cards**

John, Mary, Paul get one card each







John Red Mary White Paul Blue

Mary asks John: Do you have the blue card? Who knows the deal of the cards now?

John answers: No.

Who knows what now?

Cheryl's birthday is one of 10 possible dates.

May 15 May 16 May 19 June 17 June 18

July 14 July 16

August 14 August 15 August 17

Cheryl tells the month to Albert and the day to Bernard.

Albert says, "I don't know the birthday, but I know Bernard doesn't know either." Bernard then says,"I didn't know at first, but now I do know."

Albert then says, "Now I also know Cheryl's birthday." When is Cheryl's birthday?







# **Major Themes in One Small Scenario**

information

knowledge

information update

knowledge change

multi-agent

knowledge about facts, about others

communication

interaction, games

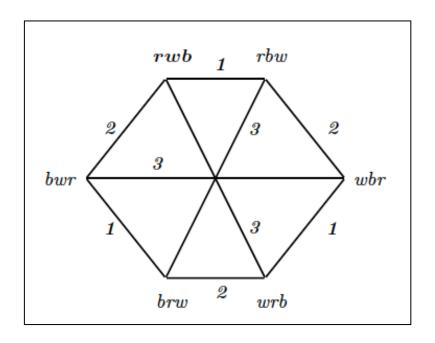
social groups







#### **Information Diagram**



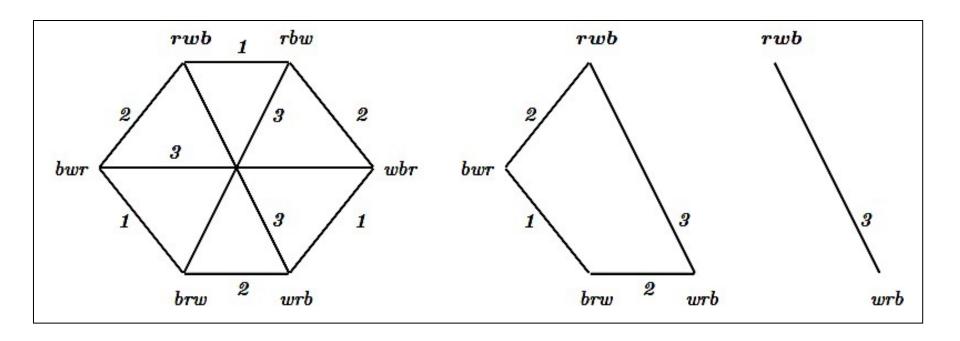
points ~ possible deals of cards uncertainty lines ~ what agents can(not) observe knowledge: what is true in all your current options







# **CS Influence: Information Change and Updates**



Final state John and Mary know the cards, Paul does not.

But Paul knows that the others know, and in fact,

this is common knowledge in the group







#### VI

#### **Ideas From Philosophy Enter**

Modeling Knowledge in Epistemic Logic







# **Enter the Philosophers: Modal Logic**

Once the tools of modern mathematical logic were available philosophers started using them to study the laws of reasoning for fundamental notions in their field like necessity, possibility, time, knowledge, belief, obligation, and so on

Basic technical paradigm: Modal Logic

Considers truth of propositions in different 'possible worlds'
that are suitably connected by 'accessibility relations'
In what follows we look at one such case: knowledge

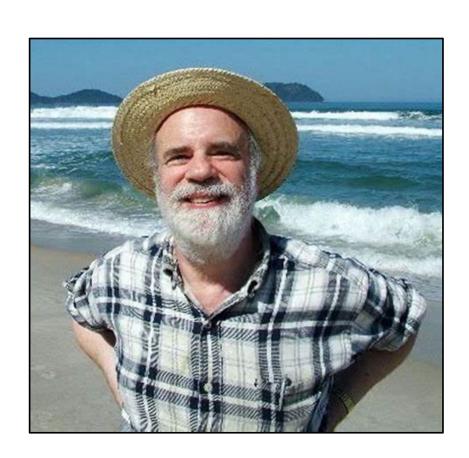
But the earlier dynamic logic of action is another instance







# Saul Kripke









#### Knowledge, Formal and Natural Language

Language 
$$\mathbf{p} \mid \neg \varphi \mid (\varphi \land \psi) \mid \mathbf{K}_{i}\varphi$$

defined 
$$\langle i \rangle \phi := \neg K_i \neg \phi$$
 'consider possible'

Question: "φ?" Answer: "Yes".

$$\neg K_Q \phi \wedge \neg K_Q \neg \phi$$

$$K_{O}(K_{A}\phi \vee K_{A}\neg \phi)$$

$$<\mathbf{Q}>(\mathbf{K}_{\mathbf{A}}\phi\vee\mathbf{K}_{\mathbf{A}}\neg\phi)$$

**Q** does not know that φ

**Q** does not know whether φ

 $K_{\mathbf{Q}}(K_{\mathbf{A}}\phi \vee K_{\mathbf{A}}\neg \phi)$  **Q** knows that **A** knows whether  $\phi$ 

afterwards: common knowledge C<sub>{Q, A}</sub>φ







# **Epistemic Models and Semantics**

**semantic information**: range of options for the real world (other important kinds of information also exist in logic)

epistemic model  $M = (W, \{\sim_i\}_i, V)$ 

W worlds/points, epistemic accessibility relations ~i,

(for now: equivalence relation: reflexive, symmetric, transitive)

valuation V: truth values for proposition letters at worlds

truth definition M, s |=  $K_i \varphi$  iff for all t  $\sim_i$  s: M, t |=  $\varphi$ 

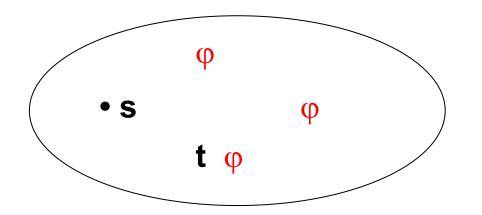


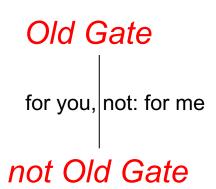




### **Semantics Supports Helpful Pictures**

knowledge: true according to my semantic information





truth definition M, s  $= K_i \varphi$  iff for all t  $\sim_i$  s: M, t  $= \varphi$ 







### Valid Principles

|=  $\phi$  φ is **valid**:  $\phi$  true in all models at all points logical consequence  $\Phi$  |=  $\psi$ : validity of implication  $\&\Phi \to \psi$ 

#### valid

$$K(\phi \rightarrow \psi) \rightarrow (K\phi \rightarrow K\psi)$$
 distribution  $K(\phi \wedge \psi) \leftrightarrow (K\phi \wedge K\psi)$   $K\phi \rightarrow \phi$  veridicality  $K\phi \rightarrow KK\phi$  positive introspection  $\neg K\phi \rightarrow K\neg K\phi$  negative introspection







# **Complete Multi-S5 Axiom System**

1 all valid principles and inference rules of propositional logic

e.g., Modus Ponens from  $\varphi$ ,  $\varphi \rightarrow \psi$  infer  $\psi$ 

2 principles of the minimal modal logic (K)

$$K(\phi \rightarrow \psi) \rightarrow (K\phi \rightarrow K\psi), <>\phi \leftrightarrow \neg K\neg \phi$$

From already proved  $\varphi$  infer  $K\varphi$  Necessitation Rule

3 S5 axioms

 $K\phi \rightarrow \phi$  (reflexivity)  $K\phi \rightarrow KK\phi$  (transitivity)  $\neg \phi \rightarrow K \neg K\phi$  (symmetry)







# Digression: Common Knowledge in Groups

Notation everybody knows  $E_{G}\phi \neq C_{G}\phi$  common knowledge

$$M, s \models C_G \phi$$
 iff for all  $t$  that are reachable from  $s$  by some finite sequence of arbitrary  $\rightarrow_i$  steps ( $i \in G$ ):  $M, t \models \phi$ 

Theorem The complete epistemic logic with common knowledge is axiomatized by the following two principles in addition to the minimal epistemic logic, where EG is the earlier modality for 'everybody in the group knows':

$$C_G \phi \leftrightarrow (\phi \land E_G C_G \phi)$$
 Fixed-Point Axiom  
 $(\phi \land C_G (\phi \rightarrow E_G \phi)) \rightarrow C_G \phi$  Induction Axiom







### **Outlook, Philosophy**

knowledge is more than information

S5 axioms unreasonable idealization for knowledge?

omniscience, (positive, negative) introspection

Richer views of knowledge proposed by philosophers justified true belief (Plato)

information in the (most) relevant worlds (Dretske)

stable belief under true new information ...

all these richer notions are studied in logic today







### Criticisms of Logical Omniscience

 $K(\phi \rightarrow \psi) \rightarrow (K\phi \rightarrow K\psi)$  Do we know all known consequences of what we know? Assuming we know the basic laws of logic, we would then know all logical consequences of what we know.

#### **Unlikely!**

Still, there are some defenses:

The modality K models ascribed\implicit knowledge

Current topic: model the more fine-grained information provided by logical inference, and by computation ...







#### **Student Question**

#### About the Three Cards:

Is not there a cognitive or computational **cost** to Paul of arriving at the knowledge he gets from the scenario?

Yes, but this requires us to modeling acts of inference and other information updates more finely, maybe bringing in notions like (working) **memory** and **attention** from the psychological literature

So we get to a connection with empirical sciences







### **Outlook, Cognitive Science**

#### Indeed, epistemic logic meets cognitive psychology

Our logical system is an idealized model

What happens in reality?

reasoning about what others know:

#### **Theory of Mind**

growing ability in children

how many levels of iteration can humans achieve?

experiments by logicians, psychologists, game theorists





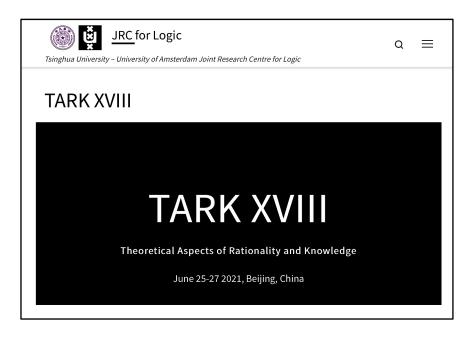


### **Epistemic Logic: Emerged Across Disciplines**

Philosophy 1960s Sociology 1960s

Economics 1970s Computer science 1980s

Cognitive psychology 1990s Back to philosophy 200s









# **Challenging But Exciting Triangle**

#### Logic, Computer Science, Cognitive Science

Logic produces largely theoretical analyses that we construct

[Although this has led to concrete computing machines!]

Even CS is still about things we can **design** to suit our purposes:

programming languages and computing devices

Natural language and ordinary reasoning emerged in evolutionary

history, not designed by us, not easy to change/'improve'

but this is also exciting, and generates many research questions







#### VII

### **Dynamic-Epistemic Logic**

#### Mixing Philosophy and CS Themes







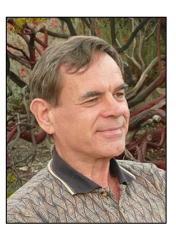
# **Dynamic Logics of Information**

Informational acts satisfy precise logical axioms describing what happens to one's existing knowledge through an informational event:

$$[!\varphi]K_i\psi \leftrightarrow (\varphi \rightarrow K_i(\varphi \rightarrow [!\varphi]\psi))$$

Cooperation of computer science, logic and philosophy.







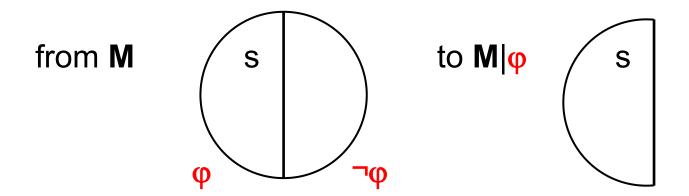






#### **Update with True Information, Picture**

epistemic model M, s ~ group information state actual world s (seen as such by the external modeler) learning that φ is true eliminates all ¬φ-worlds



hard information







#### **Update with True Information, Words**

event !φ of receiving true new information φ φ is true at actual world, perhaps at others

public **announcement** (or public silence ...), or just as well public **observation** (needs no words)

update to **submodel M** $|\phi$  with domain { t  $\in$  M | M, t  $|= \phi$ }

just simplest case: many other informational events







### Public Announcement Language & Semantics

#### simple pilot system for richer dynamic-epistemic logics

#### PAL language

grammar of multi-agent epistemic logic plus [!φ]ψ

#### PAL semantics

 $\mathbf{M}, s \models [!\phi]\psi$  iff if  $\mathbf{M}, s \models \phi$ , then  $\mathbf{M}|\phi, s \models \psi$ 







### **PAL Axiom System**

In technical settings, we often write modal box I for K

#### axiom system for PAL

- 1 all proof principles of multi-agent S5
- 2 all proof principles of basic modal logic for [!φ]

plus RE: if 
$$|-\phi \leftrightarrow \psi$$
, then  $|-\alpha(\phi) \leftrightarrow \alpha(\psi)$ 

- **3** recursion axioms for postconditions  $\psi$  in  $[!\phi]\psi$ :
- (a)  $[!\varphi]p \leftrightarrow (\varphi \rightarrow p)$  for proposition letters p and the propositional constant T

(b) 
$$[!\varphi] \neg \psi \leftrightarrow (\varphi \rightarrow \neg [!\varphi] \psi)$$

(c) 
$$[!\varphi](\psi \wedge \alpha) \leftrightarrow ([!\varphi]\psi \wedge [!\varphi]\alpha)$$

(d) 
$$[!\varphi]\Box_i\psi \leftrightarrow (\varphi \rightarrow \Box_i(\varphi \rightarrow [!\varphi]\psi))$$
 (e)  $[!\varphi][!\psi]\alpha \leftrightarrow [!(\varphi \land [!\varphi]\psi)]\alpha$ 

(e) 
$$[!\varphi][!\psi]\alpha \leftrightarrow [!(\varphi \land [!\varphi]\psi)]\alpha$$







#### **Quick Look at Two Axioms**

(d) 
$$[!\varphi]\Box_i\psi \leftrightarrow (\varphi \rightarrow \Box_i(\varphi \rightarrow [!\varphi]\psi))$$
 (e)  $[!\varphi][!\psi]\alpha \leftrightarrow [!(\varphi \land [!\varphi]\psi)]\alpha$ 

- (d) Knowledge that results from true new information can be analyzed as conditional knowledge that the agent has beforehand about the effect of the new information
- (e) The dynamic effect of two consecutive information updates can be simulated by one update with respect to a suitable conjunction involving a dynamic modality [this law explains many subtle phenomena from the earlier literature]







#### VIII

# **Epistemization**







### **Epistemization: A Few Examples**

#### **Epistemic specifications**

Robot stops: when it knows it has reached the goal.

#### **Knowledge programs**

Act when you know that the condition holds.

#### Know your program/plan

More abstract notion, not fully explained

More general: ethics

Must help when (I know that) you are sick.

Must know whether you are sick?







### General issues Then: Action and Knowledge

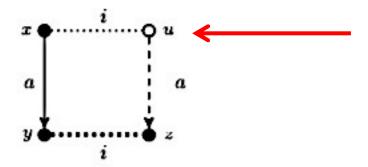
Standard logical principles for knowledge and action separately

$$K[a]\phi \rightarrow [a]K\phi$$

only valid for epistemically transparent actions

(I know that, after drinking, I behave stupidly, but unfortunately...)

FACT  $K_i[a]\varphi \to [a]K_i\varphi$  holds in an epistemic process graph G iff G satisfies the following property:  $\forall xyz : ((xR_ay \land y \sim_i z) \to \exists u : (x \sim_i u \land uR_az))$ .









# Laws Embody Assumptions About Agents!

 $K[a]\phi \rightarrow [a]K\phi$  alternative interpretation in game theory Perfect Recall uncertainty after action can only come from uncertainty you had before

Attention to agency again: what sort of agents are we studying?

Also with the putative converse  $[a]K\phi \rightarrow K[a]\phi$ . Is this valid?

Expresses: No Learning, No Miracles

one can only gain new knowledge by

observing new events with known preconditions

holds for simple observable actions, not epistemic !p







#### IX

#### **Gamification**



Much like a game with different actors with different information, different abilities (think: humans, machines), and different goals

if goals are aligned, we get **cooperative games**If goals are at odds, we get **competitive games**Now in addition to **actions**, we must think about **strategies** 

Here is one simple scenario testing the robustness of standard computing tasks:

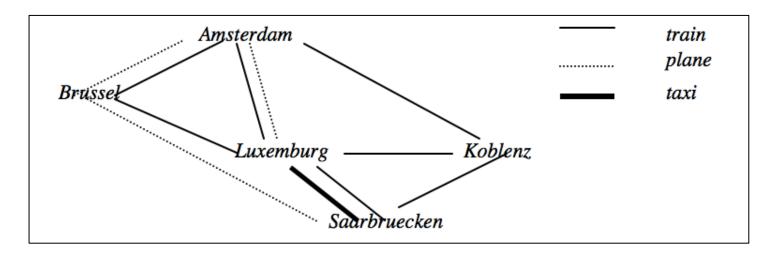






#### **Gamification: Changing Environments**

Sabotaging algorithmic tasks. Agents should cope.



**Strategies** are the interactive solution that we need.

Also get: new logic with model changing in evaluation.

#### **Complexity** jump:

model checking Pspace-complete, logic undecidable.

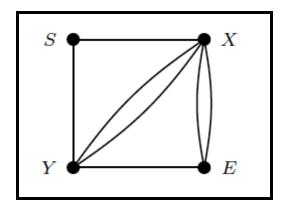


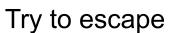




### **Gamification: Learning**

#### **Teaching Game**







Zermelo



**NEMO** children

Background: Zermelo's Theorem

Current uses: cognitive experiments.

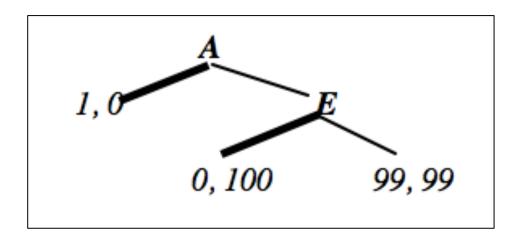






#### The Surplus of Games: Goals, Preference

Agency and games involve much more than information processing, and pure strategic interaction:

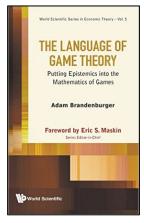


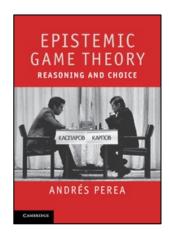
Reasoning to the bold-face (or any other) strategy involves knowledge, action, but also **goals**, **preferences** and **beliefs**.











New look at many game-theoretic themes, such as information-dynamic scenarios for game solution.

Even the very notion of game identity becomes **agent-dependent**, because of players' preferences, beliefs, abilities, and this also shows in the logic.



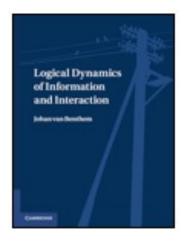


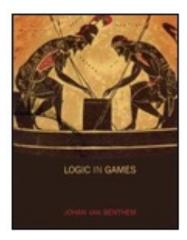


# **Logical Studies of Agency in Games**

#### Logic + Games + Agency = Theory of Play















### **Argumentation Games**

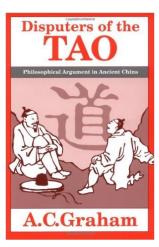
Argumentation is also a game

Lorenzen dialogue games

Game semantics for computing









Back to where it all began for logic?







#### X

# **The Temporal Long Term**







#### From Termination to Infinite Behavior

Single informational actions form longer **histories** of games. **Strategies** are plans enforcing histories, obeying logical laws:

$$\{G, i\}\varphi \lor \{G, j\}$$
 Always  $\neg \{G, i\}\varphi$ 

Histories, finite or infinite, show new structure of their own: logics of limit behavior that can only be seen over time.

Surprising scenarios: self-fulfilling, self-refuting assertions.

Same in formal learning theory with limit learning.

CS: infinite streams and co-algebra | Evolutionary game theory.

**Current topic: Interface logics of agency - dynamical systems** 



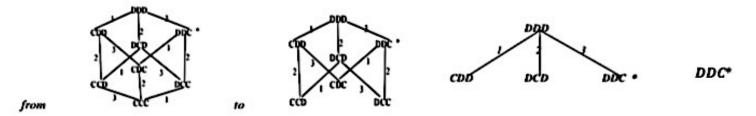




### Muddy Children, PAL Programs

After playing outside, two of three children have mud on their foreheads. They can only see the others, so they do not know their own status. (This is an inverse of our card games.) Now their Father says: "At least one of you is dirty". He then asks: "Does anyone know if he is dirty?" Children answer truthfully. As questions and answers repeat, what happens?

The puzzle is often solved in reasoning, or an ad-hoc mix of reasoning steps and update. Here is the solution via a sequence of PAL updates:



#### program structure in communication

WHILE you don't know your status !"don't know"; !"I know"

; IF THEN ELSE WHILE DO even ||







### PAL\*, Logic of Programmed Conversation

add regular program algebra to PAL

!φ; !ψ (composition) !φ U !ψ (choice)  $(!φ)^*$  (iteration)

**Theorem** Validity in PAL\* is non-axiomatizable.

**Proof** SAT for PAL\* can encode the Recurrent Tiling Problem.

**Open problem** May be wrong modeling, better use **protocol models** restricting available update histories: simple logics of conversation analysis/planning?

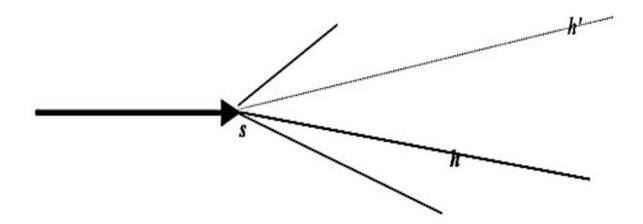






# **Long-Term Dynamics and Limit Behavior**

Infinite histories of (update) computation can be described in epistemic-temporal logics





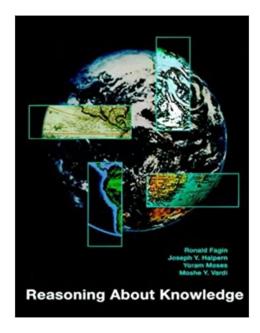




### **Both Ways Again: From Logic to CS**

Protocol analysis in computer science (since 1980s)

Agents exchanging information, while also maintaining privacy studied using epistemic-temporal logics





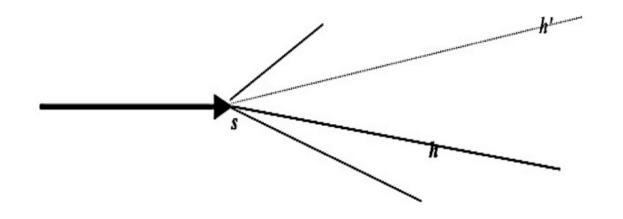


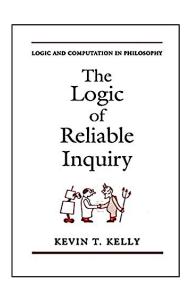


### **Philosophy: Formal Learning Theory**

Modeling inquiry in science, but also daily practice cases

Infinite histories of (update) events, methods from Topology





#### Formal learning theory

What we come to know/believe over time

needs temporal logics that extend our dynamic-epistemic logics







# XI

# **Al Today**



#### Many interactions with logic and philosophy

Automated theorem proving

Expert systems

Knowledge bases

Multi-agent systems

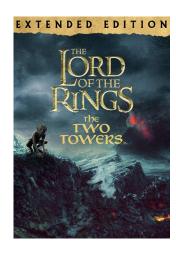






#### AI = ML? The Challenge of Machine Learning





Just blind emergence of conclusions? no representation or inference

Logic and judgment: not necessary, not even possible?

The mind has lost out to the brain?







### **Beyond Shallow Scare Rhetoric**

Leitgeb, van Lambalgen neural nets ~ nonmonotonic logics
lcard et al. conditional logics match the causal hierarchy
Grohe et al. modal logics classify types of learning systems
recent findings State spaces of ML systems reduce to wellknown logical models under natural information reductions

lots of exciting research at Logic - ML interface today too early for an integration, but will happen once the dust settles







### XII

#### **Conclusion**







Logic and computation form a natural historical unity, both in classical style and in modern agency styles

The classical foundational results from the 1930s. still govern what is (im-)possible

The interface of computing as agency and human behavior is a constant source of new logical perspectives and theories

logic, philosophy, computer science, AI and cognitive science meet







### **PS Student Question: Probability**

How does all the above logical analysis fit with **probability**?

Dynamic-epistemic logics interface with **Bayesian epistemology**Combined update logics that integrate qualitative logic parts

with quantitative probabilistic parts

But much more generally: fast-growing current literature on many **Interfaces of logic and probability** 

May be just what we need when studying the role of rational individual agents in a society with largely statistical phenomena like flows of public opinion