# Introduction to Epistemic Reasoning in Interaction

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- Philosophy (social philosophy, epistemology)
- ▶ Game Theory
- Social Choice Theory
- ► AI (multiagent systems)

#### What is a rational agent?

- maximize expected utility (instrumentally rational)
- react to observations
- revise beliefs when learning a *surprising* piece of information
- understand higher-order information
- plans for the future
- asks questions
- **▶** ????

There is a jungle of formal systems!

- logics of informational attitudes (knowledge, beliefs, certainty)
- ▶ logics of action & agency
- ► temporal logics/dynamic logics
- ▶ logics of motivational attitudes (preferences, intentions)

(Not to mention various game-theoretic/social choice models and logical languages for reasoning about them)

#### There is a jungle of formal systems!

- ► How do we compare different logical systems studying the same phenomena?
- ▶ How *complex* is it to reason about rational agents?
- ▶ (How) should we *merge* the various logical systems?
- What do the logical frameworks contribute to the discussion on rational agency?

and logical languages for reasoning about them)

- playing a game (eg. a card game)
- having a conversation
- executing a social procedure
- making a group decision (eg., coordination problem)

**....** 

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D. Lewis. Convention. 1969.

M. Chwe. Rational Ritual. 2001.

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What should they do?

R. Sugden. *The Logic of Team Reasoning*. Philosophical Explorations (6)3, pgs. 165 - 181 (2003).

# Goals for today

- 1. An Introduction to (Formal) Tools for Analytic Philosophy
  - Strategic reasoning
  - Epistemic reasoning

focus on intuitions not technical details

2. Epistemic Reasoning in Games

#### Just Enough Game Theory

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- description of the players' interests (i.e., preferences),

It does not specify the actions that the players do take.

A **solution concept** is a systematic description of the outcomes that may emerge in a family of games.

This is the starting point for most of game theory and includes many variants: Nash equilibrium, backwards inductions, or iterated dominance of various kinds.

These are usually thought of as the embodiment of "rational behavior" in some way and used to analyze game situations.

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For this course, **solution concepts** are more of an *endpoint*.

#### Some Formal Details

- ► Strategic Games
- ► Nash Equilibrium
- Extensive Games
- Backwards Induction

#### Strategic Games

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- N is a finite set of players
- ▶ for each  $i \in N$ ,  $A_i$  is a nonempty set of **actions**
- ▶ for each  $i \in N$ ,  $\succeq_i$  is a **preference relation** on  $A = \prod_{i \in N} A_i$  (Often  $\succeq_i$  are represented by **utility functions**  $u_i : A \to \mathbb{R}$ )

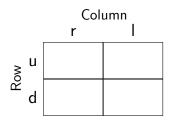
#### Strategic Games: Comments on Preferences

▶ Preferences may be over a set of consequences C. Assume  $g: A \to C$  and  $\{\succeq_i^* \mid i \in N\}$  a set of preferences on C. Then for  $a, b \in A$ ,

$$a \succeq_i b \text{ iff } g(a) \succeq_i^* g(b)$$

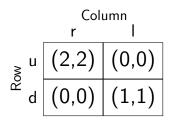
- ▶ Consequences may be affected by exogenous random variable whose realization is not known before choosing actions. Let  $\Omega$  be a set of states, then define  $g: A \times \Omega \to C$ . Where  $g(a|\cdot)$  is interpreted as a *lottery*.
- ▶ Often  $\succeq_i$  are represented by **utility functions**  $u_i : A \to \mathbb{R}$

#### Strategic Games: Example



- $ightharpoonup N = \{Row, Column\}$
- $(u,r) \succeq_{Row} (d,l) \succeq_{Row} (u,l) \sim_{Row} (d,r)$   $(u,r) \succeq_{Column} (d,l) \succeq_{Column} (u,l) \sim_{Column} (d,r)$

#### Strategic Games: Example



- ► *N* = {*Row*, *Column*}
- ►  $A_{Row} = \{u, d\}, A_{Column} = \{r, l\}$
- ▶  $u_{Row}: A_{Row} \times A_{Column} \rightarrow \{0, 1, 2\},$   $u_{Column}: A_{Row} \times A_{Column} \rightarrow \{0, 1, 2\}$  with  $u_{Row}(u, r) = u_{Column}(u, r) = 2,$   $u_{Row}(d, l) = u_{Column}(d, l) = 2,$ and  $u_{x}(u, l) = u_{x}(d, r) = 0$  for  $x \in N$ .

#### Nash Equilibrium

Let  $\langle N, \{A_i\}_{i \in N}, \{\succeq_i\}_{i \in N} \rangle$  be a strategic game

For  $a_{-i} \in A_{-i}$ , let

$$B_i(a_{-i}) = \{a_i \in A_i \mid (a_{-i}, a_i) \succeq_i (a_{-i}, a_i') \ \forall \ a_i' \in A_i\}$$

 $B_i$  is the **best-response** function.

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 $B_i$  is the **best-response** function.

 $a^* \in A$  is a **Nash equilibrium** iff  $a_i^* \in B_i(a_{-i}^*)$  for all  $i \in N$ .

# Strategic Games Example: Bach or Stravinsky?

$$\begin{array}{c|cc}
b_c & s_c \\
b_r & 2,1 & 0,0 \\
s_r & 0,0 & 1,2
\end{array}$$

$$\begin{array}{c|cc} & b_c & s_c \\ b_r & 2.1 & 0.0 \\ s_r & 0.0 & 1.2 \end{array}$$

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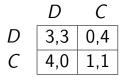
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 $(s_r, s_c)$  is a Nash Equilibrium

# Another Example: Mozart or Mahler?

	Мо	Ма
Мо	2,2	0,0
Ma	0,0	1,1

# Another Example: Prisoner's Dilema



#### Extensive Games

In strategic games, strategies are chosen *once* and for all at the start of the game

**Extensive games** are explicit descriptions of the **sequential structure** of the decision problem encountered by the players in a strategic situation.

#### **Extensive Games**

- ► A set N of players
- A set H is a set of sequences, or histories, that is "closed" and contains all finite prefixes. I.e.,
  - The empty sequence is in H
  - If  $(a_k)_{k=1,...,K} \in H$  and L < K then  $(a_k)_{k=1,...L} \in H$
  - If an infinite sequence (a<sub>k</sub>)<sub>k=1</sub><sup>∞</sup> satisfies (a<sub>k</sub>)<sub>k=1,...,L</sub> ∈ H for each L ≥ 1, then (a<sub>k</sub>)<sub>k=1</sub><sup>∞</sup> ∈ H

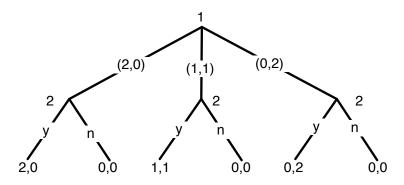
#### **Extensive Games**

- ▶ Let  $Z \subseteq H$  be the set of **terminal** histories.
- ▶ A function  $P: H Z \rightarrow N$
- ▶ For each  $i \in N$ , a relation  $\succeq_i$  on Z.
- ▶ For an nonterminal history h, let  $A(h) = \{a \mid (h, a) \in H\}$

## Extensive Games: Example

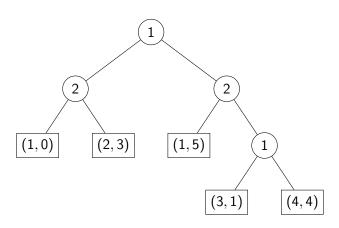
Suppose two people use the following procedure to share two desirable goods. One of them proposes an allocation, which the other accepts or rejects. In the event of rejection, neither person receives either of the objects. Each person cares only about the number of objects he obtains.

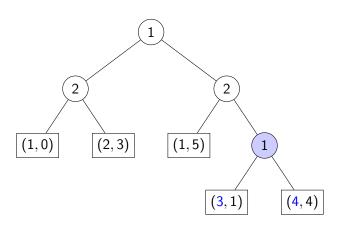
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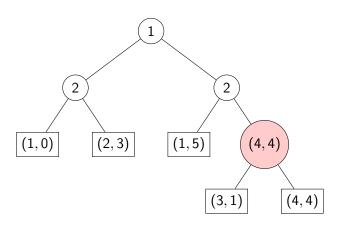


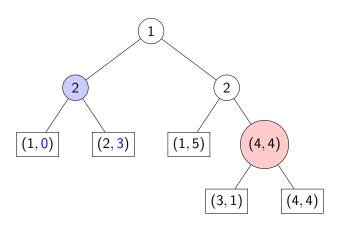
#### **Backwards Induction**

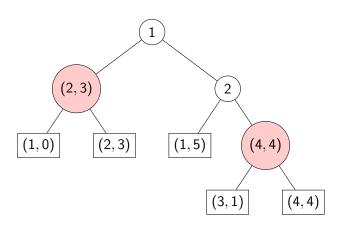
Invented by Zermelo, Backwards Induction is an iterative algorithm for "solving" and extensive game.

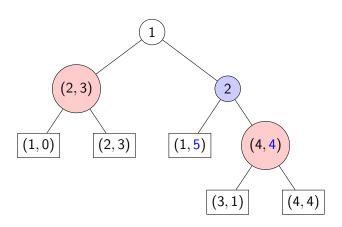


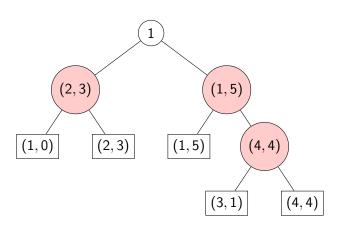


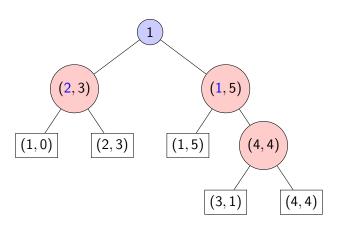


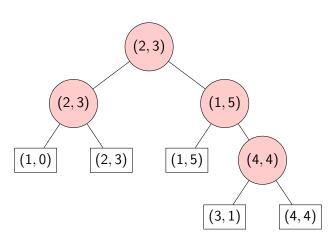


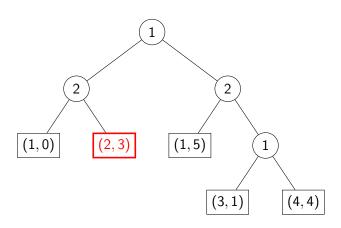


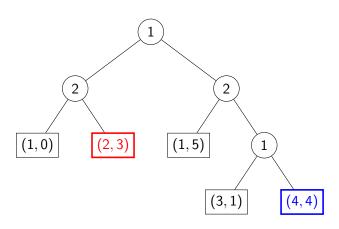












Is anything missing in these models?

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R. Aumann and J. H. Dreze. *Rational Expectation in Games*. American Economic Review (2008).

## Two questions

▶ What should the players *do* in a game-theoretic situation and what should they expect? (Assuming everyone is **rational** and recognize each other's rationality)

What are the assumptions about rationality and the players' knowledge/beliefs underlying the various solution concepts? Why would the agents' follow a particular solution concept?

To answer these questions, we need a (mathematical) framework to study each of the following issues:

- ► Rationality: "Ann is rational"
- Knowledge/Beliefs: "Bob believes (knows) Ann is rational"
- Higher-order Knowledge/Beliefs: "Ann knows that Bob knows that Ann is rational", "it is common knowledge that all agents are rational".

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We assume each agent **rational** in the sense that the agent **maximizes his expected utility given his current information** 

(See Savage, Ramsey, Aumann & Anscombe, Jeffrey, etc.)

## Game Theory: Uncertainty

#### The players may be

- uncertain about the objective parameters of the environment
- imperfectly informed about events that happen in the game
- uncertain about action of the other players that are not deterministic
- uncertain about the reasoning of the other players

#### Much more to discuss here!

# Describing the Players Knowledge and Beliefs

Fix a set of possible states (**complete descriptions of a situation**). Two main approaches to describe beliefs (knowledge):

- Set-theortical (Kripke Structures, Aumann Structures): For each state and each agent i, specify a set of states that i considers possible.
- Probabilistic (Bayesian Models, Harsanyi Type Spaces): For each state, define a (subjective) probability function over the set of states for each agent.

### Just Enough Epistemic Logic

J. Hintikka. Knowledge and Belief. 1962, recently republished.

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  - "It is raining"
  - "The talk is at 2PM"
  - "The card on the table is a 7 of Hearts"

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- ▶ Define  $L\varphi$  as  $\neg K \neg \varphi$

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 $L\varphi$ : " $\varphi$  is an epistemic possibility"

 $KL\varphi$ : "Ann knows that she thinks  $\varphi$  is possible"

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- ▶  $V : At \rightarrow \wp(W)$  is a valuation function assigning propositional variables to worlds

### Just Enough Epistemic Logic

### Example

Suppose there are three cards: 1, 2 and 3.

Ann is dealt one of the cards, one of the cards is placed face down on the table and the third card is put back in the deck.

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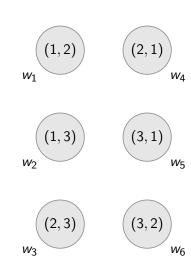
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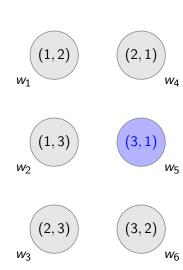
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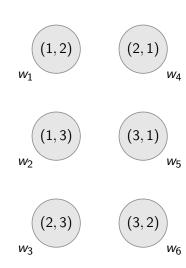
Ann receives card 3 and card 1 is put on the table



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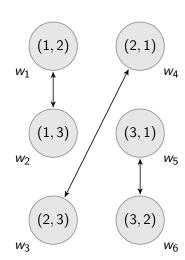
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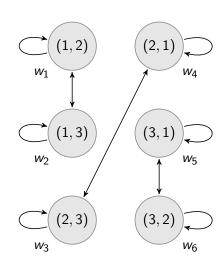
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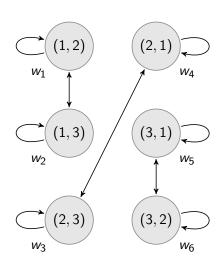
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Suppose  $H_i$  is intended to mean "Ann has card i"

 $T_i$  is intended to mean "card i is on the table"

Eg., 
$$V(H_1) = \{w_1, w_2\}$$



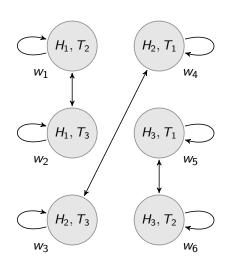
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Given 
$$\varphi \in \mathcal{L}$$
, a Kripke model  $\mathcal{M} = \langle W, R, V \rangle$  and  $w \in W$ 

 $\mathcal{M}, w \models \varphi$  means "in  $\mathcal{M}$ , if the actual state is w, then  $\varphi$  is true"

Given  $\varphi \in \mathcal{L}$ , a Kripke model  $\mathcal{M} = \langle W, R, V \rangle$  and  $w \in W$ 

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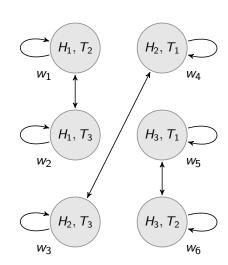
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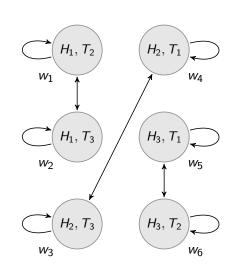
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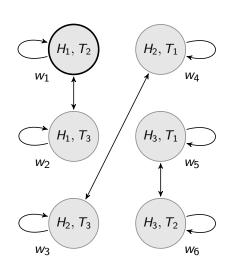
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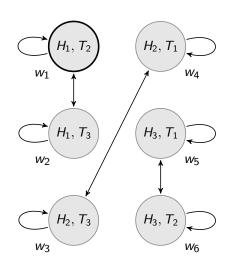
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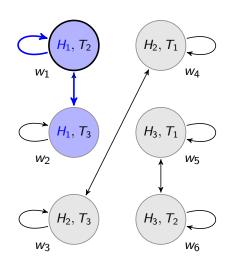
$$\mathcal{M}, \textit{w}_1 \models \textit{KH}_1$$



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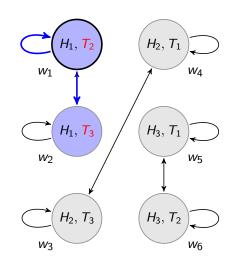
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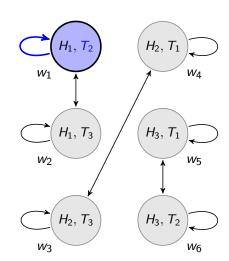
$$\mathcal{M}, w_1 \models KH_1$$
  
 $\mathcal{M}, w_1 \models K \neg T_1$ 



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$$\mathcal{M}, w_1 \models LT_2$$



### Some Questions

Should we make additional assumptions about R (i.e., reflexive, transitive, etc.)

What idealizations have we made?

### Some Notation

A Kripke Frame is a tuple  $\langle W, R \rangle$  where  $R \subseteq W \times W$ .

 $\varphi$  is valid in a Kripke model  $\mathcal{M}$  if  $\mathcal{M}, w \models \varphi$  for all states w (we write  $\mathcal{M} \models \varphi$ ).

 $\varphi$  is valid on a Kripke frame  $\mathcal{F}$  if  $\mathcal{M} \models \varphi$  for all models  $\mathcal{M}$  based on  $\mathcal{F}$ .

Modal Formula | Property | Philosophical Assumption

Modal Formula	Property	Philosophical Assumption
$K(\varphi \to \psi) \to (K\varphi \to K\psi)$	_	Logical Omniscience

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$ eg {\it K} \bot$	Serial	Consistency

## Multi-agent Epistemic Logic

The Language:  $\varphi := p \mid \neg \varphi \mid \varphi \wedge \psi \mid K\varphi$ 

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## Multi-agent Epistemic Logic

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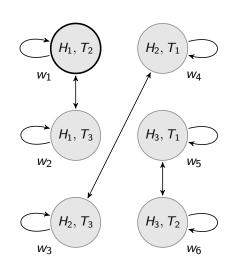
## Multi-agent Epistemic Logic

- ►  $K_A K_B \varphi$ : "Ann knows that Bob knows  $\varphi$ "
- ▶  $K_A(K_B\varphi \lor K_B\neg \varphi)$ : "Ann knows that Bob knows whether  $\varphi$
- ▶  $\neg K_B K_A K_B(\varphi)$ : "Bob does not know that Ann knows that Bob knows that  $\varphi$ "

Suppose there are three cards: 1, 2 and 3.

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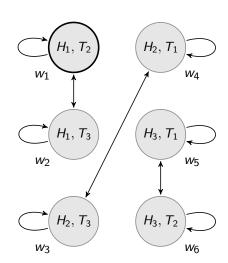
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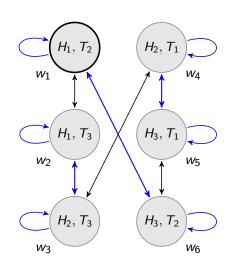
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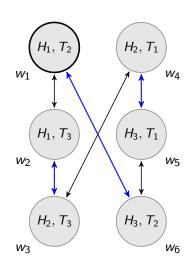
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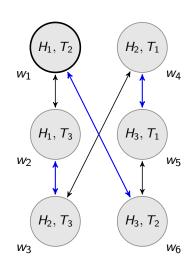


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$$\mathcal{M}, w \models K_B(K_AH_1 \vee K_A \neg H_1)$$

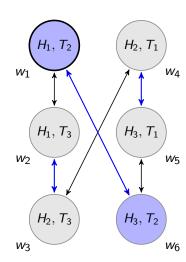


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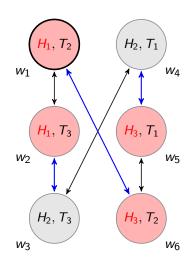


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# Example (1)

Suppose there are two friends Ann and Bob are on a bus separated by a crowd. Before the bus comes to the next stop a mutual friend from outside the bus yells "get off at the next stop to get a drink?".

Say Ann is standing near the front door and Bob near the back door. When the bus comes to a stop, will they get off?

D. Lewis. Convention. 1969.

M. Chwe. Rational Ritual. 2001.

# Three Views of Common Knowledge

- 1.  $\gamma := i$  knows that  $\varphi$ , j knows that  $\varphi$ , i knows that j knows that  $\varphi$ , j knows that i knows th
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  - s entails  $\varphi$
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  - H. Clark and C. Marshall. Definite Reference and Mutual Knowledge. 1981.
- J. Barwise. Three views of Common Knowledge. TARK (1987).

G. Sillari and P. Vanderscraaf. *Common Knowledge*. Stanford Encyclopedia of Philosophy Entry.

R. Cubitt and R. Sugden. *Common knowledge, salience and convention: a reconstruction of David Lewis' game theory.* Economics and Philosophy **19** (2003) pgs 175 - 210.

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CP: "It is common knowledge that P"

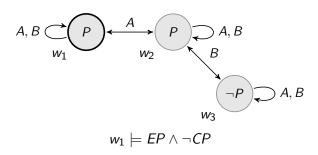
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Is common knowledge different from everyone knows?

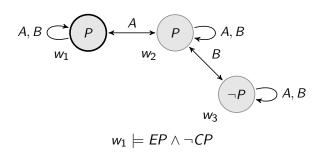
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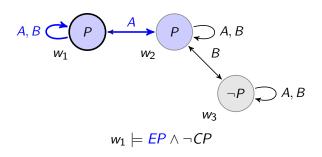
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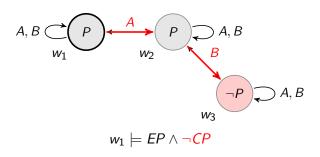
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## Common Knowledge

CP: "It is common knowledge that P" — "Everyone knows that everyone knows that  $\cdots P$ ".

Is common knowledge different from everyone knows?



# Common Knowledge

The operator "everyone knows P", denoted EP, is defined as follows

$$EP := \bigwedge_{i \in \mathcal{A}} K_i P$$

 $w \models CP$  iff every finite path starting at w ends with a state satisfying P.

 $CP \rightarrow ECP$ 

$$CP \rightarrow ECP$$

Suppose you are told "Ann and Bob are going together," and respond "sure, that's common knowledge." What you mean is not only that everyone knows this, but also that the announcement is pointless, occasions no surprise, reveals nothing new; in effect, that the situation after the announcement does not differ from that before. ...the event "Ann and Bob are going together" — call it P — is common knowledge if and only if some event call it Q — happened that entails P and also entails all players' knowing Q (like all players met Ann and Bob at an intimate party). (Robert Aumann)

Just Enough Epistemic Logic

$$P \wedge C(P \rightarrow EP) \rightarrow CP$$

Two players Ann and Bob are told that the following will happen. Some positive integer n will be chosen and one of n, n+1 will be written on Ann's forehead, the other on Bob's. Each will be able to see the other's forehead, but not his/her own.

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Do the agents know there numbers are less than 1000?

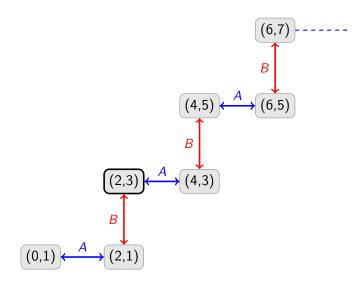
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Suppose the number are (2,3).

Do the agents know there numbers are less than 1000?

Is it common knowledge that their numbers are less than 1000?

## Just Enough Epistemic Logic



# Epistemic Foundations of Game Theory

A. Brandenburger. The Power of Paradox: Some Recent Developments in Interactive Epistemology. International Journal of Game Theory, Vol. 35, 2007, 465-492.

K. Binmore. Rational Decisions. Princeton University Press, 2009.

J. van Benthem. *Logic in Games*. Texts in Logic and Games, University of Amsterdam Press (forthcoming in 2010).

EP and O. Roy. Interactive Rationality. Book manuscript (forthcoming).

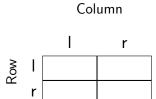
# Footballer Example

A and B are players in the same football team. A has the ball, but an opposing player is converging on him. He can pass the ball to B, who has a chance to shoot. There are two directions in which A can move the ball, left and right, and correspondingly, two directions in which B can run to intercept the pass. If both choose left there is a 10% chance that a goal will be scored. If they both choose right, there is a 11% change. Otherwise, the chance is zero. There is no time for communication; the two players must act simultaneously.

What should they do?

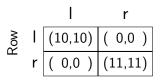
R. Sugden. *The Logic of Team Reasoning*. Philosophical Explorations (6)3, pgs. 165 - 181 (2003).

## Coordination Problems



## Coordination Problems

### Column



#### Column

$$\begin{array}{c|cccc}
 & I & r \\
 & I & (10,10) & (0,0) \\
 & r & (0,0) & (11,11)
\end{array}$$

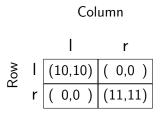
Row: What should I do?

#### Column

$$\begin{array}{c|cccc}
 & I & r \\
 & 1 & (10,10) & (0,0) \\
 & r & (0,0) & (11,11)
\end{array}$$

**Row**: What should I do? (r if the probability of Column choosing r is  $> \frac{10}{21}$  and l if the probability of Column choosing l is  $> \frac{11}{21}$ )

## Coordination Problems



Row: What should we do?

#### Column

$$\begin{array}{c|cccc}
 & I & r \\
 & 1 & (10,10) & (0,0) \\
 & r & (0,0) & (11,11)
\end{array}$$

**Team Reasoning**: escape from the infinite regress? why should this "mode of reasoning" be endorsed?

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$$inf(R): x, y \rightarrow z$$

$$inf(R): x_1, \ldots x_n, \neg(x_1, \ldots, x_n, \neg z) \rightarrow z$$

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Awareness of Common Reason: for all  $i \in N$  and all propositions x,

$$R^N(x) \Rightarrow R_i[R^N(x)]$$

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$$inf(R_i): R^N(x) \to x$$

Common Attribution of Common Reason: for all  $i \in N$ , for all propositions x for which i is not the subject

$$inf(R^N): x \to R_i(x)$$

## Common Reason to Believe to Common Belief

**Theorem** The three previous properties can generate any hierarchy of belief (i has reason to believe that j has reason to believe that... that x) for any x with  $R^N(x)$ .

```
inf(R_i): R^N[opt(v, N, s^N)],

R^N[ each i \in N endorses team maximising with respect to N and v],

R^N[ each member of N acts on reasons] \rightarrow ought(i, s_i)
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 $R_i[ought(i, s_i)]$ : i has reason to choose  $s_i$ 

```
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*i* acts on reasons if for all  $s_i$ ,  $R[ought(i, s_i)] \Rightarrow choice(i, s_i)$ 

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 $opt(v, N, s^N)$ :  $s^N$  is maximal for the group N w.r.t. v

```
inf(R_i): R^N[opt(v, N, s^N)],

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Thank you!