

# Linear Algebraic Representation of Knowledge State of Agent

Satoshi Tojo

JAIST

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# Outline

- 1 Introduction
- 2 Linear Algebraic Semantics for Modal Logic
- 3 Linear Algebraic Semantics for Multi-agent Communication
- 4 Conclusions

# Introduction

- One of the most important aspects of multi-agent communication is changes of agent's knowledge or belief (cf. Gärdenfors 2003)
- Nowadays, such changes are well-discussed in terms of modal logic, as Dynamic Epistemic Logic (DEL)
- We show a computational tool of DEL for multi-agent communication



George de La Tour: Le Tricheur à l'as de carreau

$\varphi$ :  $a$  has the ace of diamonds.

$B_x\varphi$  :  $x$  believes that  $\varphi$ .

$B_b\varphi$

$b$

$c$

$B_c\neg\varphi$

$B_d\neg\varphi$

$B_a\varphi$

$a$

$\neg\varphi$

$\neg\varphi$

$d$



*George de La Tour: Le Tricheur à l'as de carreau*

$\varphi$ :  $a$  has the ace of diamonds.

$B_x\varphi$  :  $x$  believes that  $\varphi$ .

$B_b\varphi$

$b$

$c$

$B_c\varphi$

~~$B_c\neg\varphi$~~

$B_d\neg\varphi$

$B_a\varphi$

$\varphi$

$a$

$d$



*George de La Tour: Le Tricheur à l'as de carreau*

$\varphi$ :  $a$  has the ace of diamonds.

$B_x\varphi$  :  $x$  believes that  $\varphi$ .

$B_b\varphi$   
 $B_bB_c\varphi$

$b$

$c$

$B_c\varphi$   
 ~~$B_c\neg\varphi$~~   
 $B_cB_b\varphi$

$B_d\neg\varphi$

$B_a\varphi$   
 $B_aB_c\varphi?$

$a$

$d$



*George de La Tour: Le Tricheur à l'as de carreau*

# Issues

In the picture, we can see many aspects of belief change of agents triggered by an informing action by others.

- Liar
- Belief revision
- Reliability of news source
- Mutual belief
- Channel/ Whisper /Announcement
- Awareness

How can we formalize these troublesome situations in logic, or in an efficient, scalable and reliable computation system?



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- 2 Linear Algebraic Semantics for Modal Logic**
- 3 Linear Algebraic Semantics for Multi-agent Communication
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# Linear Algebraic Approach to Kripke Semantics

Historical development:

- Frame properties (Lemmon & Scott 1977)
- **Boolean matrix approach** for
  - ▶ bisimulation for modal logic (Fitting 2003).
  - ▶ belief revision & fusion of belief logic (Liau 2004).
  - ▶ DEL with communication channels (Tojo 2013, Hatano, Sano & Tojo 2015).
- Real-valued matrix approach for belief revision & update of belief logic (Fusaoka et al. 2007)
- Relational algebraic approach for modal logic of knowledge (Berghammer & Schmidt 2006).

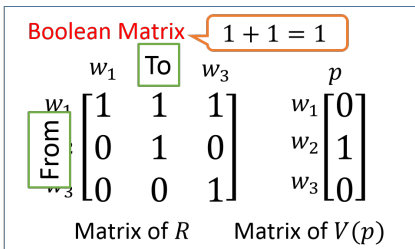
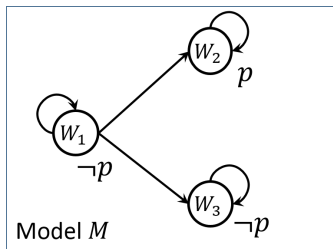
# Linear Algebraic Approach to Kripke Semantics

Define a Kripke Model  $\mathfrak{M} = (W, R, V)$  by:

$$W = \{w_1, w_2, w_3\},$$

$$R = \{(w_1, w_1), (w_1, w_2), (w_1, w_3), (w_2, w_2), (w_3, w_3)\},$$

$$V(p) = \{w_2\}.$$



# Syntax & Semantics

- $\text{PROP} = \{p, q, \dots\}$  is a finite set of propositional variables.

$$\text{Form}_{\text{ML}} \ni A ::= p \mid \neg A \mid (A \vee A) \mid \diamond A$$

- Given any  $\mathfrak{M} = (W, R, V)$  and any  $w \in W$ ,

$$\begin{array}{ll} \mathfrak{M}, w \models p & \text{iff } w \in V(p), \\ \mathfrak{M}, w \models \neg A & \text{iff } \mathfrak{M}, w \not\models A, \\ \mathfrak{M}, w \models A \vee B & \text{iff } \mathfrak{M}, w \models A \text{ or } \mathfrak{M}, w \models B, \\ \mathfrak{M}, w \models \diamond A & \text{iff for some } v \in W : wRv \text{ and } \mathfrak{M}, v \models A. \end{array}$$

# Matrix Representation of Kripke Semantics

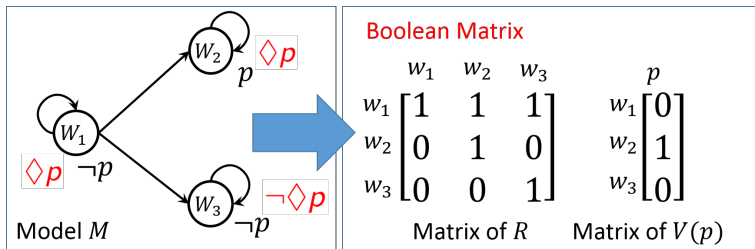
- Accessibility relation  $R \mapsto$  a square matrix  $R^M$
- Valuation  $V(p) \mapsto$  a column vector  $(V(p))^M$

A column vector  $\|A\|_{\mathfrak{M}}$  is defined by:

$$\begin{aligned}\|p\|_{\mathfrak{M}} &:= \overline{(V(p))^M}, \\ \|\neg A\|_{\mathfrak{M}} &:= \overline{\|A\|_{\mathfrak{M}}}, \\ \|A \vee A\|_{\mathfrak{M}} &:= \|A\|_{\mathfrak{M}} + \|A\|_{\mathfrak{M}}, \\ \|\diamond A\|_{\mathfrak{M}} &:= R^M \|A\|_{\mathfrak{M}}.\end{aligned}$$

$$\overline{\begin{bmatrix} 1 \\ 0 \\ 0 \end{bmatrix}} = \begin{bmatrix} 0 \\ 1 \\ 1 \end{bmatrix} \quad \begin{bmatrix} 1 \\ 0 \\ 0 \end{bmatrix} + \begin{bmatrix} 1 \\ 1 \\ 0 \end{bmatrix} = \begin{bmatrix} 1 \\ 1 \\ 0 \end{bmatrix}$$

## Example: the column vector of $\diamond p$



$$\|\diamond p\| := R^M \|p\| = R^M (V(p))^M = \begin{bmatrix} 1 & 1 & 1 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} 0 \\ 1 \\ 0 \end{bmatrix} = \begin{bmatrix} 1 \\ 1 \\ 0 \end{bmatrix} .$$

$$\|\square p\| = \|\neg \diamond \neg p\| = \overline{\|\diamond \neg p\|} = \overline{R \|\neg p\|} = \overline{R \overline{\|p\|}}$$

Kripke semantics becomes an extended truth table calculation.

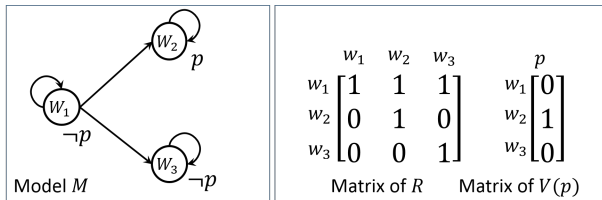
# Matrix Representation of Frame Properties

Name	Formula	Matrix Reformulation
Reflexive	T $\Box p \rightarrow p$	$R = R + \mathbf{E}$
Symmetric	B $p \rightarrow \Box \Diamond p$	$R = {}^tR$ (or $R = {}^tR + R$ )
Transitive	4 $\Box p \rightarrow \Box \Box p$	$R = R^2 + R$
Serial	D $\Box p \rightarrow \Diamond p$	$R^t R = R^t R + E$ (or $\mathbf{1} = R\mathbf{1}$ )
Euclidean	5 $\Diamond p \rightarrow \Box \Diamond p$	$R = {}^t R R + R$

- $\mathbf{E}$ : a unit square matrix
- $\mathbf{1}$ : a column vector of all 1s
- ${}^tR$ : the transposition of the matrix  $R$

$$\mathbf{E} = \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix}, \quad \mathbf{1} = \begin{bmatrix} 1 \\ 1 \end{bmatrix}, \quad R = \begin{bmatrix} 1 & 1 \\ 0 & 1 \end{bmatrix} \Rightarrow {}^tR = \begin{bmatrix} 1 & 0 \\ 1 & 1 \end{bmatrix}.$$

# Example: Verification of a Frame Property



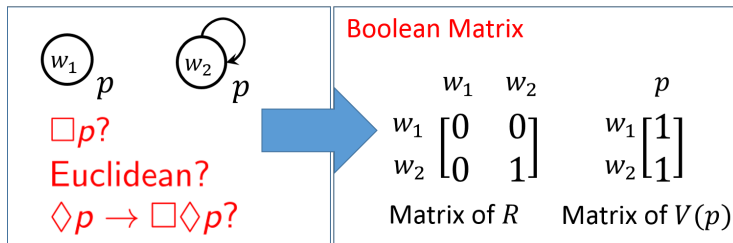
Let us check whether  $R$  is transitive ( $R = R^2 + R$ ).

$$\begin{bmatrix} 1 & 1 & 1 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix} = \underbrace{\begin{bmatrix} 1 & 1 & 1 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} 1 & 1 & 1 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix}}_{\begin{bmatrix} 1 & 1 & 1 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix}} + \begin{bmatrix} 1 & 1 & 1 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix}$$

$R$  is transitive.



# Difficulty of The Ordinary Approach



- The verification of the Euclideanness property  
 $\Rightarrow R = {}^t R R + R$
- The truth of a formula with the nested modal operators.  
 $\Rightarrow \|\diamond p \rightarrow \square \diamond p\| = \overline{R\|p\|} + \overline{R R\|p\|} = \mathbf{1}$

Belief Calculator(ver. 0.6.4) \*

File Edit View Run Help

### Kripke Model Editor

Worlds(W) : Cardinality of worlds(#W)

Agents(G) : Cardinality of agents(#G)

Relations( $R_{a_i}$ ) : agent id

w <sub>1</sub>	w <sub>2</sub>	w <sub>3</sub>	w <sub>4</sub>	w <sub>5</sub>
w <sub>1</sub> ,1	1	1	0	0
w <sub>2</sub> ,0	1	1	0	0
w <sub>3</sub> ,0	0	1	0	0
w <sub>4</sub> ,1	1	1	1	0
w <sub>5</sub> ,0	0	1	0	

Channels( $C_{ab}$ ) : a,b = G : world id

a <sub>1</sub>	a <sub>2</sub>	a <sub>3</sub>
a <sub>1</sub> ,0	0	0
a <sub>2</sub> ,0	0	1
a <sub>3</sub> ,1	1	1

Valuations(V) : Cardinality of propositions(#Prop)

p <sub>1</sub>	p <sub>2</sub>	p <sub>3</sub>
w <sub>1</sub> ,1	0	1
w <sub>2</sub> ,0	1	0
w <sub>3</sub> ,1	0	1
w <sub>4</sub> ,1	0	1
w <sub>5</sub> ,1	1	0

### Calculator

ID  p c<sub>ab</sub> ~ V  $\wedge$   $\rightarrow$   $\diamond$   $\square$  ( ) R<sub>a</sub> U : ? I<sub>a</sub> T B A D S

```

---
? Wto T =
{[(Ref[a_1]) a_1] Wto {[(Ref[a_1]) [(Ref[a_1]) a_1]]} =
{[(Ref[a_1])
-----
{[(Ref[a_1])
-----
w_1 | 1.0000
w_2 | 1.0000
w_3 | 1.0000
w_4 | 1.0000
w_5 | 1.0000

---
resultant truth set =
{[(Ref[a_1]) a_1] Wto {[(Ref[a_1]) [(Ref[a_1]) a_1]]} =
{[(Ref[a_1])
-----
w_1 | 1.0000
w_2 | 1.0000
w_3 | 1.0000
w_4 | 1.0000
w_5 | 1.0000

---
Given formula is valid on the model.
Given formula is satisfiable on the model.
The model is NOT updated.
--- end stat calculation ---
---end: truth set of [(Ref[a_1]) a_1] Wto {[(Ref[a_1])[(Ref[a_1])a_1]} ---
Done[52] calculate truth set
  
```

Control Progress

Ready.

Belief Calculator(ver. 0.6.4)

File Edit View Run Help

Kripke Model Editor

Rand<sub>w</sub> Rand<sub>f</sub> Refl<sub>f</sub> Sym<sub>f</sub> Reset

Worlds(W) : Cardinality of worlds(#W)

Agents(G) : Cardinality of agents(#G)

Relations(R<sub>a</sub>)<sub>a ∈ G</sub> : agent id  E 0 1 Rand<sub>R</sub>

	w_1	w_2	w_3	w_4
w_1	1	1	1	0
w_2	1	1	1	0
w_3	0	1	0	0
w_4	1	1	1	1
w_5	0	1	1	0

Channels(C<sub>ab</sub>)<sub>a,b ∈ G</sub> : world id  E 0 1 Rand<sub>C</sub>

	a_1	a_2	a_3
a_1	0	0	0
a_2	0	0	1
a_3	1	1	1

Valuations(V) : Cardinality of propositions(#Prop)

	p_1	p_2	p_3
w_1	1	0	1
w_2	0	1	0
w_3	1	0	1
w_4	1	0	1
w_5	1	1	0

Ready

Belief Calculator(ver. 0.6.4) \*

File Edit View Run Help

**Kripke Model Editor**

Rand<sub>M</sub>
 Rand<sub>F</sub>
 Ref<sub>F</sub>
 Sym<sub>F</sub>
 Reset

Worlds(W) : Cardinality of worlds(#W) 5

Agents(A) : Cardinality of agents(#A) 3

Relations(R) : Agent id 1 E 0 1 Rand<sub>V</sub>

w,1	w,2	w,4	w,5
w,1,1	0	0	
w,2,0	0	0	
w,3,0	0	0	
w,4,1	1	0	
w,5,0	0		

Rand<sub>M</sub>
 Rand<sub>F</sub>
 Ref<sub>F</sub>
 Sym<sub>F</sub>
 Reset

Valuations(V) : Cardinality of propositions(#Prop) 3 E 0 1 Rand<sub>V</sub>

p,1	p,2	p,3
w,1,1	0	1
w,2,0	1	0
w,3,1	0	1
w,4,1	0	1
w,5,1	1	0

Ready

**Calculator**

ID 1

$\neg$   $\wedge$   $\rightarrow$   $\diamond$   $\square$   $()$   $\dots$   $R_a U : ?$   $I_a^b$   $T B 4 D 5$

```

w1:
  Who ? =
  (([Kref(a_1)] a_1) Who ([Kref(a_1)] ([Kref(a_1)] a_1))) =
  ([Kref(a_
  -----
  a_1 | 1.0000
  a_2 | 1.0000
  a_3 | 1.0000
  a_4 | 1.0000
  a_5 | 1.0000

w1 truth set =
(a_1) a_1) Who ([Kref(a_1)] ([Kref(a_1)] a_1))) =
  ([Kref(a_
  -----
  a_1 | 1.0000
  a_2 | 1.0000
  a_3 | 1.0000
  a_4 | 1.0000
  a_5 | 1.0000

Given formula is valid on the model.
Given formula is satisfiable on the model.
The model is NOT updated.
---- and stat calculation ----
----and: truth set of [Kref(a_1)] a_1) Who ([Kref(a_1)]([Kref(a_1)]a_1) ---->
some[2] calculate truth set
  
```

Control Progress

Belief Calculator(ver. 0.6.4)

File Edit View Run Help

**Kripke Model Editor**

Rand<sub>w</sub>
 Rand<sub>f</sub>
 Ref<sub>f</sub>
 Sym<sub>f</sub>
 Reset

Worlds(W) : Cardinality of worlds(#W)

Agents(A) : Cardinality of agents(#A)

Relations

$$p \quad c_{ab} \quad \neg \quad \vee \quad \wedge \quad \rightarrow \quad \diamond \quad \square \quad ( ) \quad \dots \quad R_a \quad U \quad ; \quad ? \quad \downarrow^a \quad \dots \quad T \quad B \quad 4 \quad D \quad 5$$

w <sub>1</sub>	w <sub>2</sub>	w <sub>3</sub>	w <sub>4</sub>	w <sub>5</sub>
0	1	0	0	0
1	1	1	1	0
0	1	0	0	0

Channels(C<sub>ab</sub>)<sub>a,b ∈ A</sub> : world id  E 0 1 Rand<sub>0</sub>

a <sub>1</sub>	a <sub>2</sub>	a <sub>3</sub>
0	0	0
0	0	1
1	1	1

Valuations(V) : Cardinality of propositions(#Prop)  E 0 1 Rand<sub>v</sub>

p <sub>1</sub>	p <sub>2</sub>	p <sub>3</sub>
0	0	1
1	1	0
0	1	0
0	1	1
1	1	0

Calculator

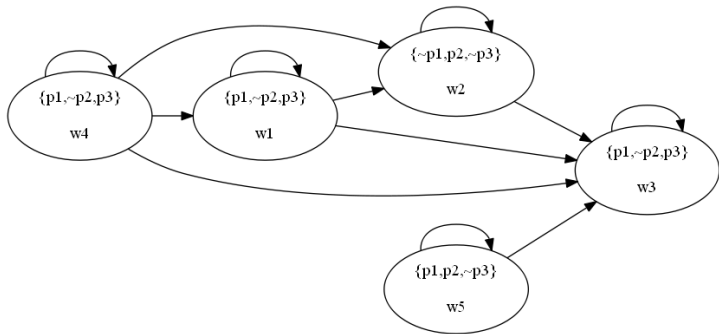
ID   $p \quad c_{ab} \quad \neg \quad \vee \quad \wedge \quad \rightarrow \quad \diamond \quad \square \quad ( ) \quad R_a \quad U \quad ; \quad ? \quad \downarrow^a \quad \dots \quad T \quad B \quad 4 \quad D \quad 5$

```

evalfml truth set =
(((Wre(a1)) p1) Wto (((Wre(a1)) ((Wre(a1)) p1))) +
(((Wre(a1
-----
p1 | 1.0000
p2 | 1.0000
p3 | 1.0000
p4 | 1.0000
p5 | 1.0000
-----
- Given formula is valid on the model.
- Given formula is satisfiable on the model.
- The model is NOT undecid.
---- end stat calculation ----
----end: truth set of [(Wre(a1)) p1] Wto (((Wre(a1)) ((Wre(a1)) p1))) ----
Some[S2] calculate truth set
  
```

Control Progress

Ready



rel\_a1

Belief Calculator(ver. 0.6.4) \*

File Edit View Run Help

### Kripke Model Editor

Worlds(W) : Cardinality of worlds(#W)

Agents(G) : Cardinality of agents(#G)

Relations( $R_{i,a} \in G$  : agent id)  E 0 1 Rand<sub>R</sub>

```

Submit task: verify frame properties
Thread : pool-1-thread-1(27)
<---begin: frame property verification
Reflexivity(T) ---> 1
Symmetricity(B) ---> 0
Transitivity(4) ---> 1
Seriality(D) ---> 1
Euclidianness(5)---> 0
- Valid formulas: T4D
<---end: frame property verification
Done[58] verify frame properties
        
```

### Calculator

$R_i$  U : ? ↓<sub>b</sub> TB4D5

```

model
  W Wo T =
  ([[Wrel(a_1)] p_1] Wto ([[Wrel(a_1]] ([[Wrel(a_1)] p_1))) =
  ([[Wrel(a_
  -----
  p_1 | 1.0000
  p_2 | 1.0000
  p_3 | 1.0000
  p_4 | 1.0000
  p_5 | 1.0000
  -----
  -----
  resultant truth set =
  ([[Wrel(a_1)] p_1] Wto ([[Wrel(a_1]] ([[Wrel(a_1)] p_1))) =
  ([[Wrel(a_
  -----
  p_1 | 1.0000
  p_2 | 1.0000
  p_3 | 1.0000
  p_4 | 1.0000
  p_5 | 1.0000
  -----

- Given formula is valid on the model.
- Given formula is satisfiable on the model.
- The model is NOT updated.
----- end stat calculation -----
<---end: truth set of [[Wrel(a_1)] p_1] Wto ([[Wrel(a_1]] ([[Wrel(a_1)] p_1) -----
Done[52] calculate truth set
        
```

### Valuations(V) : Cardinality of propositions(#Prop) E 0 1 Rand<sub>V</sub>

	p <sub>1</sub>	p <sub>2</sub>	p <sub>3</sub>
w <sub>1</sub>	1	0	1
w <sub>2</sub>	0	1	0
w <sub>3</sub>	0	1	1
w <sub>4</sub>	0	1	1
w <sub>5</sub>	1	1	0

Ready.

Belief Calculator(ver. 0.6.4) \*  
 File Edit View Run Help

Calculator

4  $\Box p \rightarrow \Box \Box p$

Agents(G) : Cardinality of agents(#G) 3

Relations(R)<sub>a ∈ G</sub> : agent id 1 E 0 1 Rand<sub>R</sub>

resultant truth set =  
 (([Wrel{a\_1}] p\_1) Wto ([Wrel{a\_1}] ([Wrel{a\_1}] p\_1)))  
 -----  
 w\_1 | 1.0000  
 w\_2 | 1.0000  
 w\_3 | 1.0000  
 w\_4 | 1.0000  
 w\_5 | 1.0000  
 ---  
 - Given formula is valid on the model.

Valuations(V) : Cardinality of propositions(#Prop) 3 E 0 1 Rand<sub>v</sub>

	p_1	p_2	p_3
w_1	1	0	1
w_2	0	1	0
w_3	1	0	1
w_4	0	0	1
w_5	1	1	0

Control Progress

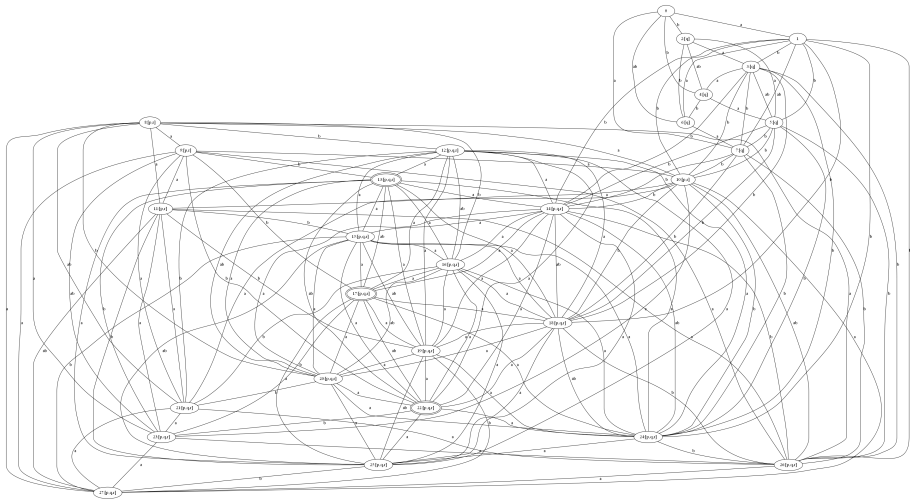
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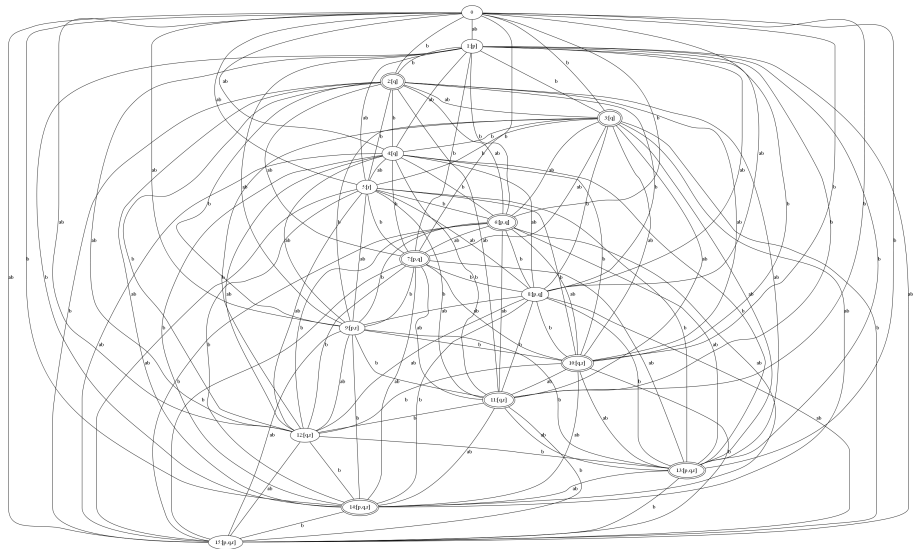
---
3 Wto ? =
([Wrel{a_1}] p_1) Wto ([Wrel{a_1}] ([Wrel{a_1}] p_1)) =
-----
w_1 | 1.0000
w_2 | 1.0000
w_3 | 1.0000
w_4 | 1.0000
w_5 | 1.0000
---
---
resultant truth set =
([Wrel{a_1}] p_1) Wto ([Wrel{a_1}] ([Wrel{a_1}] p_1)) =
-----
w_1 | 1.0000
w_2 | 1.0000
w_3 | 1.0000
w_4 | 1.0000
w_5 | 1.0000
---
---
- Given formula is valid on the model.
- Given formula is satisfiable on the model.
- The model is NOT updated.
---- end stat calculation ----
----end: truth set of [Wrel{a_1}] p_1 Wto ([Wrel{a_1}]([Wrel{a_1}]p_1)) ---->
Done[32] calculate truth set
  
```



# Spaghetti of Accessibility



# Spaghetti of Accessibility



## Interim Summary

Our approach can cover the following topics:

- Matrix representation of graph of a Kripke model
- Computation of the truth value of a formula
- The validity and the satisfiability of a formula
- Frame properties (reflexivity, symmetricity, transitivity, seriality and Euclideaness)

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# Multi-agent Communication

For Multi-agent system, we propose:

- Logic of belief with communication channels and its dynamic operators
- A linear algebraic reformulation for proposed operators
- Dynamic change of belief by matrix calculation

# Digression: what is communication?

If you are alone in the universe ...

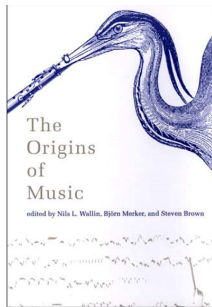


11

- Have you possessed language?
- Some claim we need language to think.

# Further Digression: what is language?

Is there any meaning  
in music?



In the primordial era, music  
and language were one.

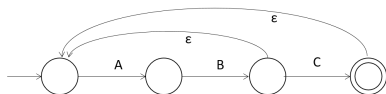
Meaningful part

Language

What are remained?  
Emotion/Feeling *e.g.*,  
pleasure, sorrow, anger,  
....

# CFG and RG

- Language of domestic finch:  $((ab)^+c)^+$



- Human language

- ▶ CFG - NPDA

- ★ We came to see a movie to Shibuya.
- ★ We came to Shibuya to see a movie.
- ★ (\*) We came to see to Shibuya a movie.

- ▶ Dutch crossing

- ★ He said that A saw B help C feed the dogs.
- ★ Hij zegt dat A B C de honden zag helpen voeren.



# Logical Studies for Multi-agent communication

Historical development:

- **DEL** for public announcements (Plaza 1989 etc.)
- Integration of communication channels into DEL
  - ▶ Two-dimensional approach of Facebook logic (Seligman et al. 2011, Sano & Tojo 2013).
  - ▶ Linear algebraic approach of DEL (Tojo 2013).

It is unknown whether resulting logics of two-dimensional approach is decidable.

We extend our linear algebraic approach for Dynamic Logic of Relation Changers (DLRC) to handle communication channels.

# Syntax

- $\text{PROP} = \{p, q, \dots\}$  is a finite set of propositional variables.
- $G = \{a, b, \dots\}$  is a finite set of agents.

$$A ::= p \mid c_{ab} \mid \neg A \mid A \vee B \mid B_a A$$

- $c_{ab}$ : “there is a channel from agent  $a$  to agent  $b$ .”
- $B_a A$ : “agent  $a$  believes  $A$ .”

# Kripke Semantics

Let us extend our Kripke semantics by a channel relation.

- $\mathfrak{M} = (W, (R_a)_{a \in G}, (C_{ab})_{a,b \in G}, V)$  is a Kripke model.
- $C_{ab} \subseteq W$  is a channel relation s.t.  $C_{aa} = W$ .

Given any  $\mathfrak{M} = (W, (R_a)_{a \in G}, (C_{ab})_{a,b \in G}, V)$  and any  $w \in W$ ,

$$\mathfrak{M}, w \models c_{ab} \quad \text{iff} \quad w \in C_{ab}$$

$$\mathfrak{M}, w \models B_a A \quad \text{iff} \quad \text{for all } v \in W : wR_a v \text{ implies } \mathfrak{M}, v \models A.$$

The truth set  $\llbracket A \rrbracket_{\mathfrak{M}}$  is defined by:

$$\llbracket A \rrbracket_{\mathfrak{M}} = \{ w \in W \mid \mathfrak{M}, w \models A \}.$$

# Hilbert-style Axiomatization $\mathbf{HK}_c$

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- (**Taut**)  $A$ ,  $A$  is a tautology  
(**K**<sub>[B]</sub>)  $B_a(A \rightarrow B) \rightarrow (B_a A \rightarrow B_a B)$  ( $a \in G$ )  
(**Selfchn**)  $c_{aaa}$  ( $a \in G$ )  
(**MP**) From  $A$  and  $A \rightarrow B$ , infer  $B$   
(**Nec**<sub>[B]</sub>) From  $A$ , infer  $B_a A$  ( $a \in G$ )
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## Theorem

This axiomatization is decidable, sound and complete for the previous Kripke semantics.

# Conditional Private Announcement $[A \downarrow_b^a]$

$[A \downarrow_b^a]$  : “Agent  $a$  sends a message  $A$  to agent  $b$  via a channel.”

When the communication succeeds?

Our assumptions:

- There should be a channel from  $a$  to  $b$ .
- Agent  $a$  believes the content of the message, to avoid Moore sentences.

## Semantics of $[A \downarrow_b^a]$

$$\mathfrak{M}, w \models [A \downarrow_b^a]B \quad \text{iff} \quad \mathfrak{M}^{A \downarrow_b^a}, w \models B$$

where  $\mathfrak{M}^{A \downarrow_b^a} = (W, (R'_a)_{a \in G}, (C_{ab})_{a,b \in G}, V)$  and  $(R'_c)_{c \in G}$  is defined as:

- If  $c = b$ , for all  $x \in W$ ,

$$R'_b(x) := \begin{cases} R_b(x) \cap \llbracket A \rrbracket_{\mathfrak{M}} & \text{if } \mathfrak{M}, x \models c_{ab} \wedge B_a A \\ R_b(x) & \text{otherwise.} \end{cases}$$

- Otherwise,  $R'_c := R_c$ .

Agent  $b$  restricts his/her belief by  $\llbracket A \rrbracket_{\mathfrak{M}}$  if

- there is a channel from  $a$  to  $b$ ,
- agent  $a$  believes the content of the message.

Other agents than  $b$  do not change beliefs.

# Hilbert-style Axiomatization $\mathbf{HK}_c[\cdot \downarrow_b^a]$

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In addition to all the axioms and rules of  $\mathbf{HK}_c$ , we add:

$$[A \downarrow_b^a]p \quad \leftrightarrow \quad p,$$

$$[A \downarrow_b^a]c_{cd} \quad \leftrightarrow \quad c_{cd},$$

$$[A \downarrow_b^a]\neg B \quad \leftrightarrow \quad \neg [A \downarrow_b^a]B,$$

$$[A \downarrow_b^a](B \vee C) \quad \leftrightarrow \quad [A \downarrow_b^a]B \vee [A \downarrow_b^a]C,$$

$$[A \downarrow_b^a]B_c B \quad \leftrightarrow \quad B_c [A \downarrow_b^a]B \quad (c \neq b)$$

$$[A \downarrow_b^a]B_b B \quad \leftrightarrow \quad ((c_{ab} \wedge B_a A) \rightarrow B_b(A \rightarrow [A \downarrow_b^a]B)) \wedge \\ (\neg(c_{ab} \wedge B_a A) \rightarrow B_b [A \downarrow_b^a]B)$$

**(Nec<sub>[A↓<sub>b</sub><sup>a</sup>]</sub>)** From  $B$ , infer  $[A \downarrow_b^a]B$

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## Theorem

This is a decidable, sound and complete axiomatization for the previous Kripke semantics.

# PDL-extension of Our Syntax

- $\text{PROP} = \{p, q, \dots\}$  is a finite set of propositional variables.
- $G = \{a, b, \dots\}$  is a finite set of atomic programs.
- We regard each agent's belief as an atomic program.

$$\begin{aligned}\alpha &::= a \mid (\alpha \cup \alpha) \mid (\alpha; \alpha) \mid ?A \\ A &::= p \mid c_{ab} \mid \neg A \mid A \vee A \mid [\alpha]A\end{aligned}$$

- $[a]$  corresponds to the accessibility of agent  $a$ , that is  $R_a$ .



# The Relation Changer $[A \downarrow_b^a]$

$[A \downarrow_b^a]$ : If  $c_{ab} \wedge B_a A$  then restrict  $R_b$  to  $A$  else keep  $R_b$ .

If  $X$  then  $\alpha$  else  $\beta \stackrel{\text{def}}{\Leftrightarrow} (?X; \alpha) \cup (? \neg X; \beta)$ .

$$\begin{aligned}\alpha_b &:= \text{if } c_{ab} \wedge B_a A \text{ then } b; ?A \text{ else } b \\ &:= (?(c_{ab} \wedge B_a A); b; ?A) \cup (? \neg(c_{ab} \wedge B_a A); b)\end{aligned}$$

$$R_b'^M = \|\?(c_{ab} \wedge B_a A)\| R_b^M \|\?A\| + \|\? \neg(c_{ab} \wedge B_a A)\| R_b^M$$

# PDL semantics

$\llbracket R_a \rrbracket_M$	$:=$	$R_a$
$\llbracket \pi \cup \pi' \rrbracket_M$	$:=$	$\llbracket \pi \rrbracket_M \cup \llbracket \pi' \rrbracket_M$
$\llbracket \pi; \pi' \rrbracket_M$	$:=$	$\llbracket \pi \rrbracket_M \circ \llbracket \pi' \rrbracket_M$
$\llbracket ?\varphi \rrbracket_M$	$:=$	$\{(w, w) \in W^2 \mid w \in \llbracket \varphi \rrbracket_M\}$
$\llbracket p \rrbracket_M$	$:=$	$V(p)$
$\llbracket C_{ab} \rrbracket_M$	$:=$	$C_{ab}$
$\llbracket \neg\varphi \rrbracket_M$	$:=$	$W \setminus \llbracket \varphi \rrbracket_M$
$\llbracket \varphi \vee \psi \rrbracket_M$	$:=$	$\llbracket \varphi \rrbracket_M \cup \llbracket \psi \rrbracket_M$
$\llbracket [\pi]\varphi \rrbracket_M$	$:=$	$\{w \in W \mid \llbracket \pi \rrbracket_M(w) \subseteq \llbracket \varphi \rrbracket_M\}$

# Matrix Representation of Channel and Programs

A column vector  $\|A\|_{\mathfrak{M}}$  is defined by:

$$\begin{aligned}\|p\|_{\mathfrak{M}} &:= (V(p))^M, \\ \|c_{ab}\|_{\mathfrak{M}} &:= \frac{C_{ab}^M}{|C_{ab}^M|}, \\ \|\neg A\|_{\mathfrak{M}} &:= \overline{\|A\|_{\mathfrak{M}}}, \\ \|A \vee A\|_{\mathfrak{M}} &:= \overline{\|A\|_{\mathfrak{M}} + \|A\|_{\mathfrak{M}}}, \\ \|[\alpha]A\|_{\mathfrak{M}} &:= R_{\alpha}^M \overline{\|A\|_{\mathfrak{M}}}, \\ \|\mathbf{a}\|_{\mathfrak{M}} &:= R_{\mathbf{a}}^M, \\ \|\alpha \cup \beta\|_{\mathfrak{M}} &:= \|\alpha\|_{\mathfrak{M}} + \|\beta\|_{\mathfrak{M}}, \\ \|\alpha; \beta\|_{\mathfrak{M}} &:= \|\alpha\|_{\mathfrak{M}} \|\beta\|_{\mathfrak{M}}, \\ \|\?A\|_{\mathfrak{M}} &:= \begin{cases} 1 & \text{if } i = j \text{ and } \|A\|_{\mathfrak{M}}(i) = 1, \\ 0 & \text{otherwise.} \end{cases}\end{aligned}$$

## Example

Suppose that there are channels between agent  $a$  and  $b$  in every world, and agent  $a$  believes  $p$  at  $w_2$ .

$$\begin{aligned} & \llbracket ?(c_{ab} \wedge B_a p) \rrbracket^M R_b^M \llbracket ?p \rrbracket^M = \llbracket ?c_{ab} \rrbracket^M \llbracket ?B_a p \rrbracket^M R_b^M \llbracket ?p \rrbracket^M \\ & = \begin{pmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{pmatrix} \begin{pmatrix} 0 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 0 \end{pmatrix} \begin{pmatrix} 1 & 1 & 1 \\ 1 & 1 & 1 \\ 1 & 1 & 1 \end{pmatrix} \begin{pmatrix} 0 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 0 \end{pmatrix} = \begin{pmatrix} 0 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 0 \end{pmatrix} \end{aligned}$$

After we calculate also the remaining part of  $R'_b$ , i.e.,

$\llbracket ?\neg(c_{ab} \wedge B_a p) \rrbracket^M R_b^M$ , we combine both results to obtain updated relation  $R'_b$  of agent  $b$  as:

$$\begin{aligned} R'_b & = \llbracket ?(c_{ab} \wedge B_a p) \rrbracket^M R_b^M \llbracket ?p \rrbracket^M + \llbracket ?\neg(c_{ab} \wedge B_a p) \rrbracket^M R_b^M \\ & = \begin{pmatrix} 0 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 0 \end{pmatrix} + \begin{pmatrix} 1 & 1 & 1 \\ 0 & 0 & 0 \\ 1 & 1 & 1 \end{pmatrix} = \begin{pmatrix} 1 & 1 & 1 \\ 0 & 1 & 0 \\ 1 & 1 & 1 \end{pmatrix} \end{aligned}$$

Belief Calculator(ver. 0.6.4) \*

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Kripke Model Editor

Worlds(W) : Cardinality of worlds(#W)

Agents(G) : Cardinality of agents(#G)

Relations( $R_a$ )  $a \in G$  : agent id

w_1	w_2	w_3
w_1,1	1	1
w_2,0	1	1
w_3,0	0	1
w_4,1	1	1
w_5,0	0	1

Channels( $C_{ab}$ )  $a,b \in G$  : world id

a_1	a_2	a_3
a_1,0	0	0
a_2,0	0	1
a_3,1	1	1

Valuations(V) : Cardinality of propositions(#Prop)

p_1	p_2	p_3
w_1,1	0	1
w_2,0	1	0
w_3,1	0	1
w_4,1	0	1
w_5,1	1	0

Calculator

ID:  |  $p \ \% \ \sim \ \vee \ \wedge \ \rightarrow \ \diamond \ (\ )$  |  $R_a \ U : \ ? \ \downarrow \ \% \ \mid \ \text{TB4DS}$

↓  $\begin{matrix} a \\ b \end{matrix}$   $\left[ A \downarrow \begin{matrix} a \\ b \end{matrix} \right]$

Channels( $C_{ab}$ )  $a,b \in G$  : world id

	a_1	a_2	a_3
a_1	0	0	0
a_2	0	0	1
a_3	0	1	1

Control Progress

Ready

# Collective Belief Revision

We do not specify the recipients in advance. We may expand our static syntax  $\mathcal{L}$  with a dynamic operator  $[\varphi\downarrow^H]$  ( $H \subseteq G$ ) whose reading is 'after a group  $H$  of agents sends information  $\varphi$  via communication channels'. Given a Kripke model  $\mathfrak{M} = (W, (R_a)_{a \in G}, (C_{ab})_{a,b \in G}, V)$  and a world  $w \in W$ , we define the semantics of  $[\varphi\downarrow^H]\psi$  by:

$$\mathfrak{M}, w \models [\varphi\downarrow^H]\psi \quad \text{iff} \quad \mathfrak{M}^{\varphi\downarrow^H}, w \models \psi,$$

where  $\mathfrak{M}^{\varphi\downarrow^H} = (W, (R'_a)_{a \in G}, (C_{ab})_{a,b \in G}, V)$  and  $R'_a$  is defined as follows: for all  $w \in W$ , if there is some  $b \in H$  such that  $w \in C_{ba}$  and  $\mathfrak{M}, w \models B_b \varphi$ , we put

$$R'_a(w) := R_a(w) \cap \llbracket \varphi \rrbracket_{\mathfrak{M}}.$$

Otherwise, we put  $R'_a(w) := R_a(w)$ .

# Hilbert Style Axiomatization

In addition to all the axioms and rules of  $\mathbf{K}_c$ , we add:

$$\begin{aligned}[\varphi \downarrow^H] p &\leftrightarrow p, \\[\varphi \downarrow^H] c_{ab} &\leftrightarrow c_{ab}, \\[\varphi \downarrow^H] \neg \psi &\leftrightarrow \neg [\varphi \downarrow^H] \psi, \\[\varphi \downarrow^H] (\psi \vee \chi) &\leftrightarrow [\varphi \downarrow^H] \psi \vee [\varphi \downarrow^H] \chi, \\[\varphi \downarrow^H] B_a \psi &\leftrightarrow (\bigvee_{b \in H} (c_{ba} \wedge B_b \varphi) \rightarrow B_a (\varphi \rightarrow [\varphi \downarrow^H] \psi)) \\ &\quad \wedge (\neg (\bigvee_{b \in H} (c_{ba} \wedge B_b \varphi)) \rightarrow B_a [\varphi \downarrow^H] \psi) \\ (\mathbf{Nec}_{[\varphi \downarrow^H]}) &\text{ From } \psi, \text{ infer } [\varphi \downarrow^H] \psi\end{aligned}$$

# Outline

- 1 Introduction
- 2 Linear Algebraic Semantics for Modal Logic
- 3 Linear Algebraic Semantics for Multi-agent Communication
- 4 Conclusions**



# Conclusions

- What we have done
  - ▶ Matrix representation of accessibility in Kripke semantics
  - ▶ Matrix representation of relation changer: a sequence of program (transitivity of relation) is represented by a product of matrices
- What we have not done
  - ▶ Rumor: a transitive closure of collective belief revision
  - ▶ Reliability: each agent may choose which to believe
  - ▶ So many indices; can we control the order of matrix/vector calculation by covariant/contra-variant tensors?

# References

- Ryo Hatano, Katsuhiko Sano, and Satoshi Tojo. [Linear algebraic semantics for multi-agent communication](#). In Proc. of the 7th International Conference on Agents and Artificial Intelligence, volume 1, pages 172-181, 2015.
- Ryo Hatano, Katsuhiko Sano, and Satoshi Tojo. [Teaching modal logic from linear algebraic viewpoints](#). In Proc. of the 4th International Conference on Tools for Teaching Logic, pages 55-64, 2015. (Also, extended version is in: Journal of Logics and their Applications vol.4, no.1, 2017)