

# Multi-Agent-Contexts Systems for Reasoning and Acting in Heterogeneous Environments

*Stefania Costantini*

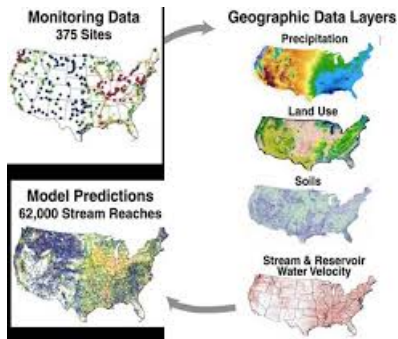
University of L'Aquila, Italy

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# Data Representation and Knowledge Exchange

- The importance of data/knowledge exchange in Artificial Intelligence (AI) applications is constantly increasing.
- In many application domains, it is necessary to comprise and elaborate information provided by multiple sources.



# Data Representation and Knowledge Exchange in Logical Agents

Multi-Agent Systems (MAS) are particularly suited for AI distributed applications. Our interest: logical agents.

- Logic-based data management and exchange are therefore important aspects of knowledge representation and reasoning in logical agents.
- Non-monotonic reasoning crucial for:
  - definition of patterns for knowledge exchange;
  - definition of modalities for knowledge integration and exploitation.



# DACMAS: Data-Aware Commitment-based Multi-Agent System (MAS)

A recent interesting data-centric agent architecture, knowledge representation via ontologies.

- *Institutional* agent which owns a “global” (DLR-Lite) TBox, specifying the domain in which the MAS operates.
- Each participating agent is equipped with its local ABox (consistent with the TBox, mutual consistency not required).
- Commitment-based Communication.
- Patterns for simple reactive and proactive rules.



# Our view of DACMAS

DACMAS: yet another agent architecture or useful Meta-Model for Multi-Agent Systems?

- Particularly interesting for a general specification of knowledge management and communicative features.
- Allows for affordable verification.
- Very general about an agent program's definition, so it can be specialized to many existing agent-oriented logic languages.
- Missing: access to external knowledge sources.



# Accessing External Sources

- Agents & Artifacts approach: postulates that a (homogeneous) description is available for such sources, that can in general be manipulated by agents.
- (managed) Multi-Context Systems (mMCSs): drop the assumption of making external sources in some sense homogeneous: rather, the approach deals explicitly with their different representation languages and semantics.
- mMCSs: allow for datalog-like non-monotonic queries to external sources, called “bridge rules”.



# Bridge Rules in mMCSs

## Bridge Rule Syntax

$$o(s) \leftarrow (c_1 : p_1), \dots, (c_j : p_j), \\ \text{not } (c_{j+1} : p_{j+1}), \dots, \text{not } (c_m : p_m).$$

where the  $c_i$ s are *contexts*, i.e., external knowledge sources, and  $o$  is a knowledge integration operator dealt with by a *management function*.

Management function: responsible for the integration of the new knowledge in the destination context.



# mMCSs Definitions

- Multi-context System  $M = (C_1, \dots, C_n)$ , each  $C_i$  consisting of an underlying logic  $L$ , a knowledge base, a set of bridge rules and a management function, where  $L = (KB_L; Cn_L; ACC_L)$ .
- Data state  $S = (S_1, \dots, S_n)$  for  $M$ , where  $S_i$  is a data state for  $C_i$ , i.e., an acceptable set of consequence of its knowledge base according to the logic.





# mMCSs Semantics

## Equilibrium

$S$  is an equilibrium for  $M$  iff each  $S_i$  is “stable” w.r.t. the application of bridge rules, given the associated management function.

A management function for a context is called *local consistency (lc-) preserving* iff, after bridge rule application, the resulting data state is consistent.



# DACMACS

Data-Aware Commitment-based managed Multi-Agent-Context Systems)

- Agents can query (sets of) contexts, but contexts cannot query agents.
- Agents are equipped with bridge rules, whose application is however activated via special *trigger rules*, which allow a bridge rule to be invoked upon certain conditions and/or according to a certain timing.
- The result of a bridge rule is interpreted as an agent-generated internal event, and captured by reactive rules which may determine modifications to the agent's ABox.



# Bridge Rules in DACMACS

## Bridge Rule Syntax

$A(\hat{x})$  **determined by**  $E_1, \dots, E_k, \text{not } G_{k+1}, \dots, \text{not } G_r$

where each of the  $E_i$ s and the  $G_i$ s are datalog queries to external context, whose reference is either locally known or provided by the Institutional agent via a query  $\text{Role@inst}(role)$



# Bridge Rules in DACMACS

Trigger Rule: proactively enables a bridge rule

$Q(\hat{x})$  **enables**  $A(\hat{y})$  [*Time* | *Frequency*]

Bridge-Update Rule: incorporates new knowledge

*upon*  $A(\hat{x})$  **then**  $\beta(\hat{x})$

$\beta(\hat{x})$  specifies the operator, management function and actions to be applied to  $\hat{x}$ .



# Example: Personalized Healthcare

Paula, 78, lively and beautiful lady



# Example: Medical Assistant Agent

## The patient: basic conditions

```
person(paula). age(paula, 78).  
special_condition(X, elderly) :- person(X), age(X, A), A > 70.  
has_disease(paula, cardiac_insufficiency).  
takes_medicament(P, anticoagulant) :-  
    has_disease(P, cardiac_insufficiency).
```



# Example: Medical Assistant Agent (cont'd)

## Symptom: extreme weakness

Possible cause: low hemoglobin level (value less than 10)

*has\_symptom(paula, extreme\_weakness).*

*symptom\_cause(extreme\_weakness, hemoglobin\_level).*

*blood\_test(hemoglobin\_level).*

*anomalous\_value(P, hemoglobin\_level) :-*

*person(P), value(P, hemoglobin, V),  $V \leq 10$ .*



## Example: Medical Assistant Agent (cont'd)

Whenever it is the case, a query can be enabled to the knowledge base which records blood test results, so as to obtain most recent values.

### Trigger Rule

*person(P) AND has\_symptom(P, S) AND  
symptom\_cause(S, T) AND blood\_test(T) AND  
Spec@inst(Rec, blood\_tests\_records) enables  
blood\_test\_result(Paula, T, V, Rec).*





# Example: Medical Assistant Agent (cont'd)

## Bridge Rule and Bridge-Update Rule

*blood\_test\_result*( $P, T, V, Rec$ ) **determinedby**  
*value*( $P, T, V$ ) : *Rec*.

**upon** *value*( $P, T, V$ ) **then** *add*(*value*( $P, T, V$ )).



## Example: Medical Assistant Agent (cont'd)

Hemoglobin value too low: enable query an external diagnostic knowledge base about possible causes.

### Trigger Rule

*person(P) AND has\_disease(P, D) AND  
special\_condition(P, S) AND anomalous\_value(P, V) AND  
Spec@inst(Diag, medical\_diagnosis) enables  
poss\_causes(P, D, S, V, C, Diag).*



# Example: Medical Assistant Agent (con'd)

## Bridge Rule and Bridge-Update Rule

*poss\_causes*( $P, D, S, V, C, Diag$ ) **determinedby**  
*poss\_causes*( $P, D, S, V, C$ ) : *Diag*.

**upon** *poss\_causes*( $P, D, S, V, C, Diag$ ) **then**  
*infer\_plausible*( $P, D, S, V, C, R$ ).

The agent is thus able to reason about the returned diagnostic hypotheses, given the local data available about patient's history  
Result: hemorrhages as side-effect of a medicaments

Situation now hopefully under control



# Semantics

- DACMAS: operational, transition system.
- mMCSs: equilibria, where bridge rules are deemed to be applied whenever applicable.
- DACMACS: equilibria, extended w.r.t. mMCSs, because bridge rule applicability and incorporation of results must be proactively enabled.



# Semantics (cont'd)

## Explicit updates

$\Pi = \Pi_1, \Pi_2, \dots$  is the sequence of finite updates performed to agents' and contexts' private knowledge bases at time instants  $t_1, t_2, \dots$

## Update Operator

$\mathcal{U}$  is the tuple composed of the operators that each agent or context employs for incorporating the new knowledge.



# Semantics (cont'd)

## Timed Data State

is a tuple  $S^T = (S_1^T, \dots, S_n^T)$  such that each  $S_i^T$  is an element of  $Cn_i$  at time  $T$ . The timed data state  $S^0$  is an equilibrium according to a definition analogous to mMCSs. Then, data states evolve according to updates and to bridge and bridge-update rule application.

Bridge rule applicability changes, depending upon trigger rules.



# Semantics (cont'd)

## DACMACS Equilibria

A timed data state  $S^T = (S_1^T, \dots, S_n^T)$  is an equilibrium iff it is stable w.r.t. bridge and bridge-update rule application, performed after considering the current update.



# Properties

- *Safe evolution trajectory* of a DACMACS: sequence of equilibria w.r.t. agents' and contexts' knowledge base updates.
- *Local Consistency*: like mMCS, a DACMACS enjoys Local Consistency iff all management functions are *local consistency (lc-) preserving*.
- *Global Consistency*: not required.





# Conclusions

- DACMACS = DACMAS + mMCS =  
Data-centric agents + knowledge exchange with external knowledge bases
- Issue: a-priori and run-time verification
- Extension: Agents and Contexts exchange Ontological Definitions
- Extension: use acquired ontological definitions for positive and negative explanations, remember the sources of new definitions, update level of trust and reputation.



# The End!

Thank You for your Attention:-) Questions?

