

# Dynamic Generation of Agent Communities from Distributed Production and Content-Driven Delivery of Knowledge

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# **Dynamic Generation of Agent Communities from Distributed Production and Content-Driven Delivery of Knowledge**

- 1. Introduction**
- 2. Multi-agent collaborative production**
  - Features and structure**
  - Interaction within markets**
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# 1. Introduction

Intro

Multi-agent system

Case study

Dynamic of markets

Conclusions

## ❑ Collaborative knowledge management

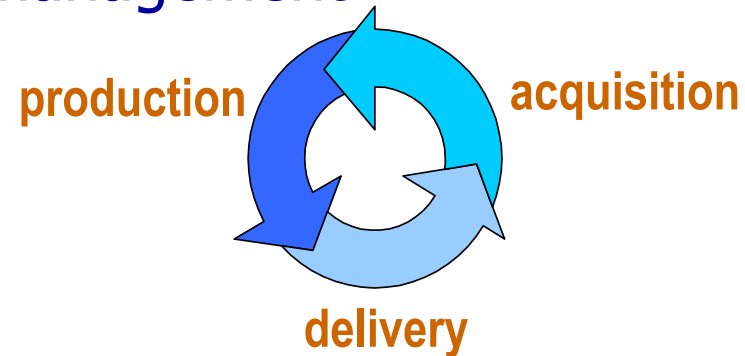
- KM processes
- Distributed system
- Collaborative creation
- Task coordination needed

## ❑ Creation or production

- Different interaction policies: compete, cooperate, negotiate
- Structured interaction

## ❑ Delivery

- Content-driven
- Communities of interest



# 2. Multi-agent collaborative production

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- ❑ Producers' collaboration (e.g. instructional designers)
  - Asynchrony
    - Development, exchange and evaluation of proposals are asynchronous.
    - Different pace of creation
  - Different levels of knowledge (Domain-level knowledge)
  - Decision privileges (e.g. lecturers vs. assistants)
  - Conflicts
- ❑ Multi-agent architecture motivation
  - Facilitates coordination when collaborating (e.g., compose a new educational resource)
  - Allows different interaction styles (e.g., compete, cooperate, or negotiate)
  - Organizes interaction in distributed, but interconnected domains of interaction

# System features

Intro

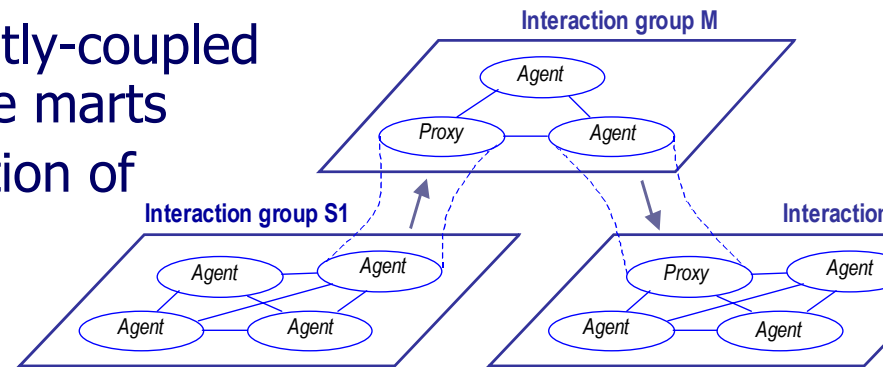
Multi-agent system

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Conclusions

- ❑ From a functional perspective...
  - Consolidation of knowledge that is produced
- ❑ From a structural perspective...
  - Multi-tiered structure
  - Agents operate in tightly-coupled hierarchical knowledge marts
  - Progressive consolidation of knowledge
- ❑ From a behavioural perspective...
  - Affiliation of agents into marts
  - Evolution of marts



# Interaction within marts

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## □ Principles

- Agent rationality modeled as preference relationships  $k1 > k2$  or relevance functions  $u(k)$
- Relevant aspects modeled as RDF triples (object, attribute, value):
  - Submitter's hierarchical level
  - Fulfilment of goals
  - Time-stamp

## □ Message exchange

- Message types
  - **proposal** ( knowledge, interaction )
  - **consolidate** ( knowledge, interaction )
- Multicast, reliable transport facility

# Consolidation protocol

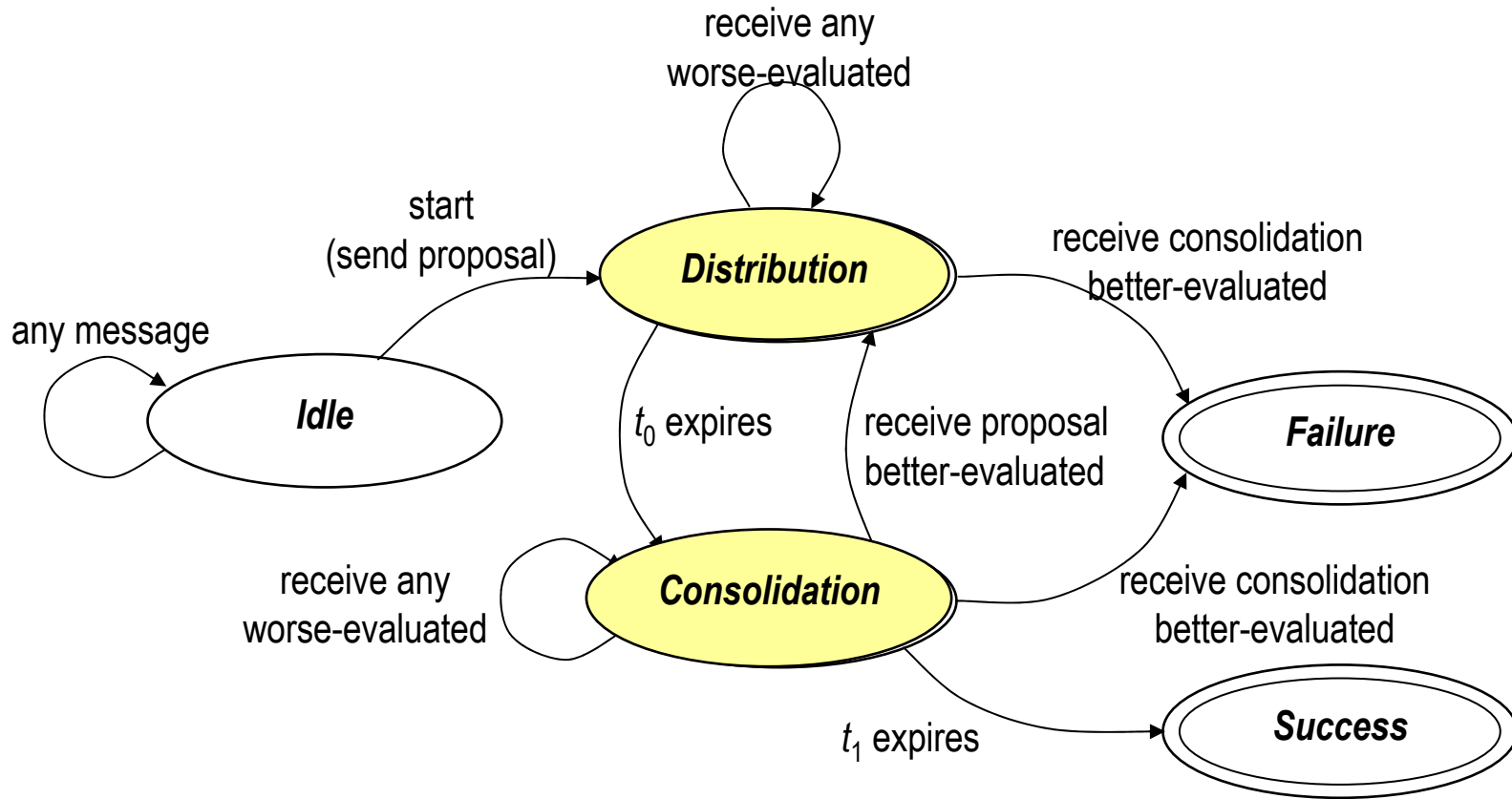
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# 3. Case study

## Intro

### ❑ Learning Object

- Course titled “Introduction to XML”

## Multi-agent system

### ❑ Roles

- 3 instructional designers, represented by agents  $A1..A3$
- $A1$  is a docent coordinator

## Case study

### ❑ Task

- Development of the TOC
- $A1$  submits  $p$ ,  $A2$  submits  $q$ ,  $A3$  does nothing

### ❑ Proposals

- $p$  = Proposed manifest file with 6 chapters
- $q$  = Modified manifest file, divides up chapter 5 in two

## Dynamic of markets

### ❑ Evaluation criteria

- Fulfillment of objectives
- Actor's rank

## Conclusions



# Course of the protocol

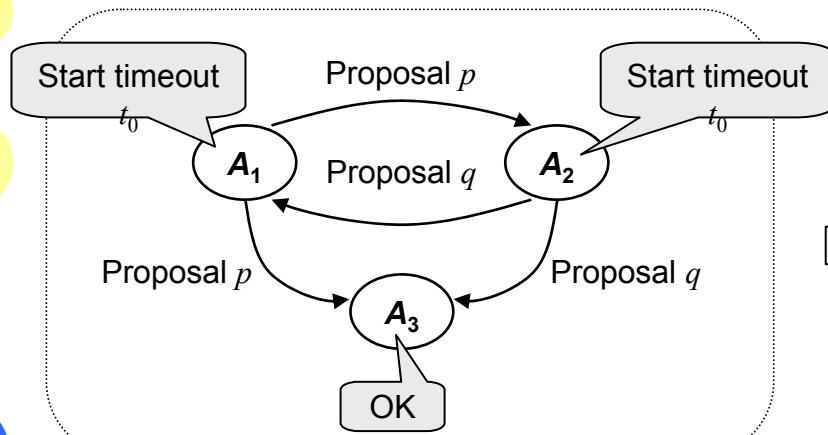
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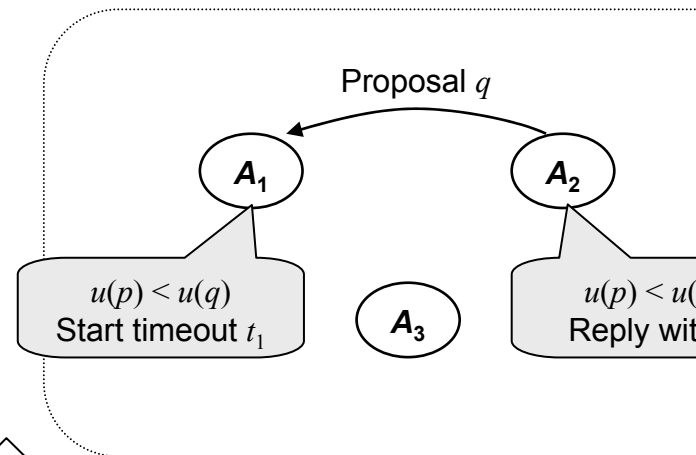
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Conclusions

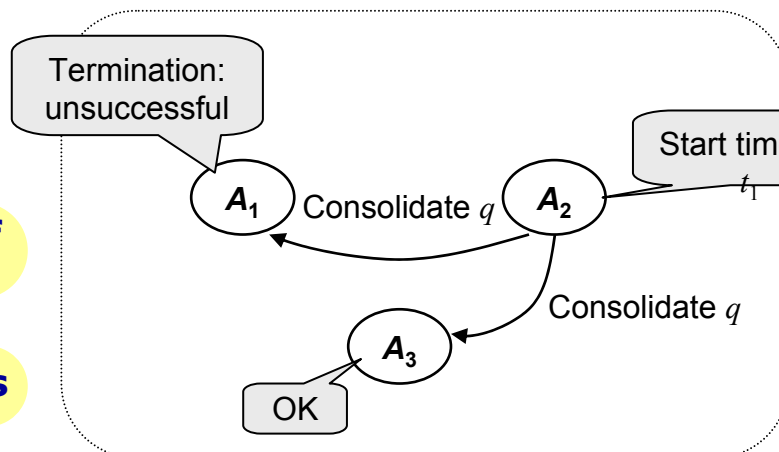


Initial exchange of proposals

$t_0$  expires

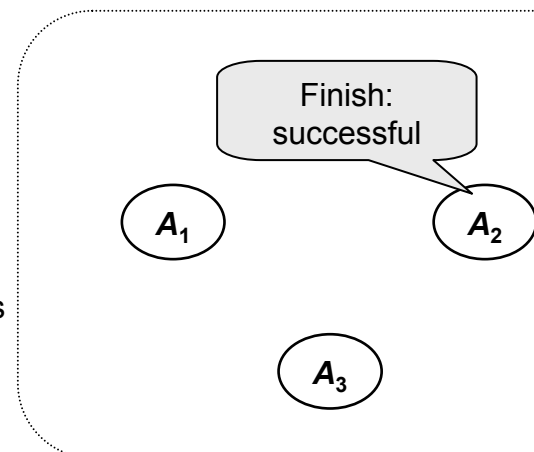


After receiving proposals



Consolidation after  $t_0$  expiration

$t_1$  expires



After  $t_1$  expiration

# Results: quality (grade of fulfilment)

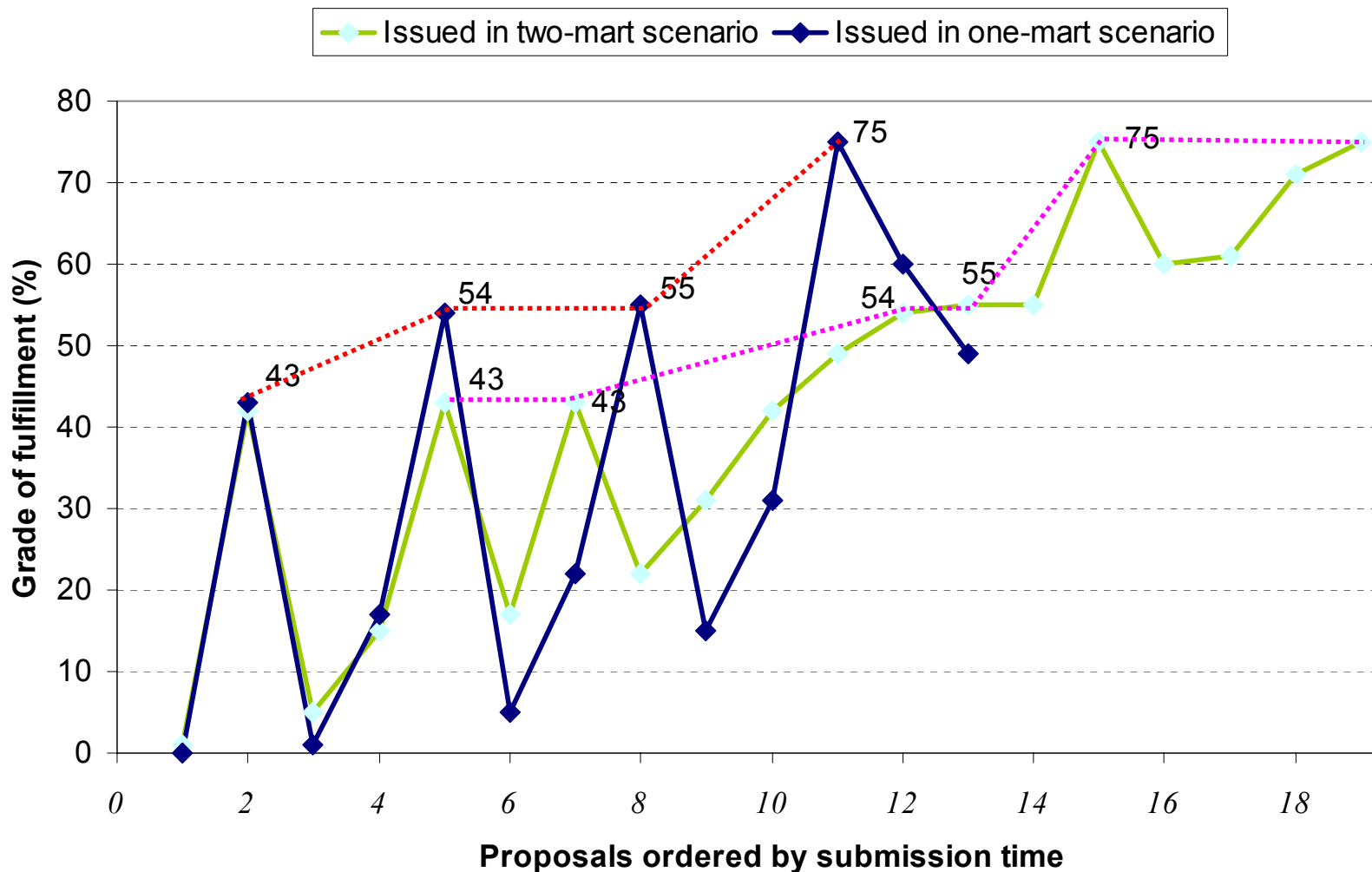
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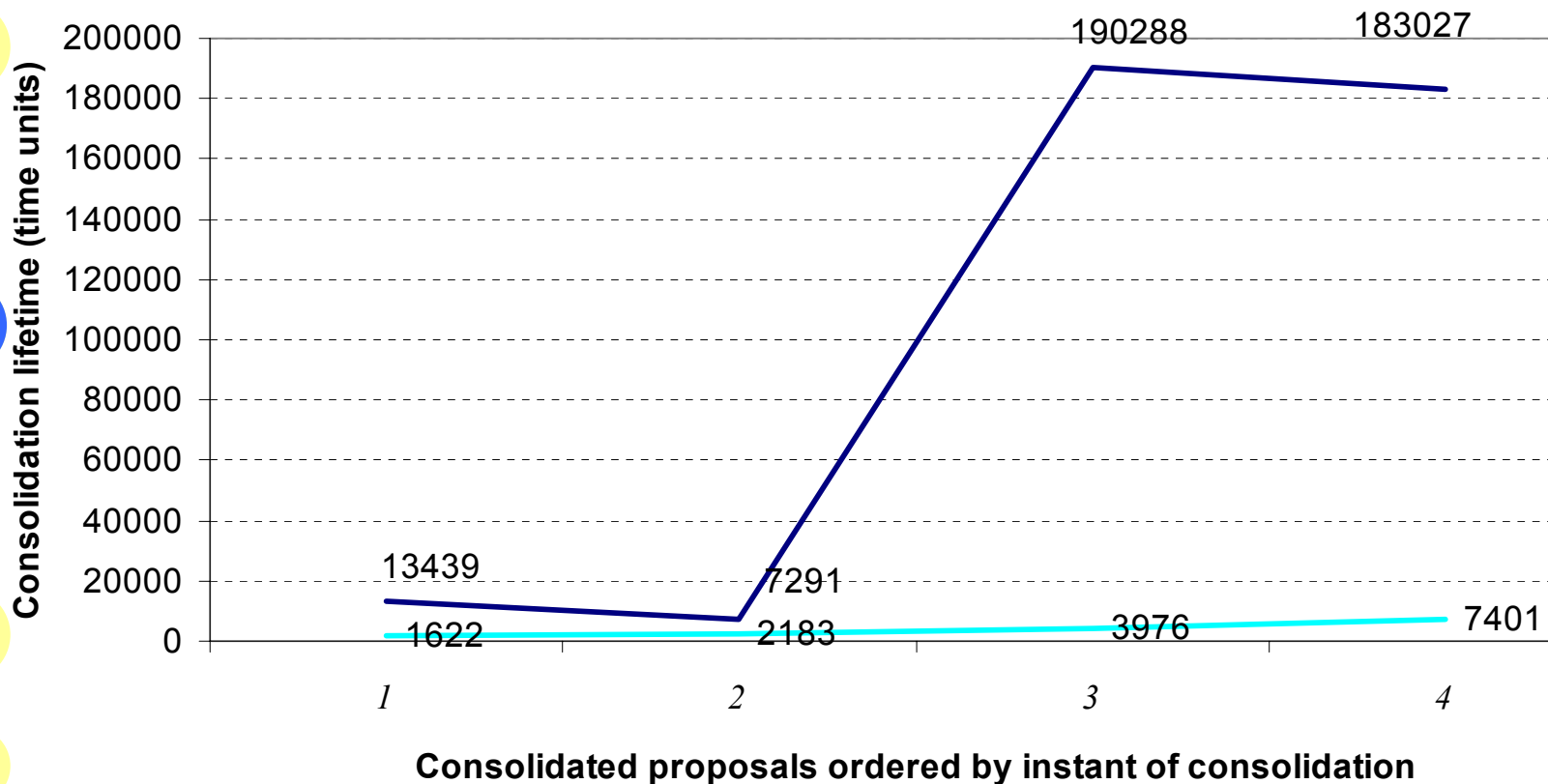
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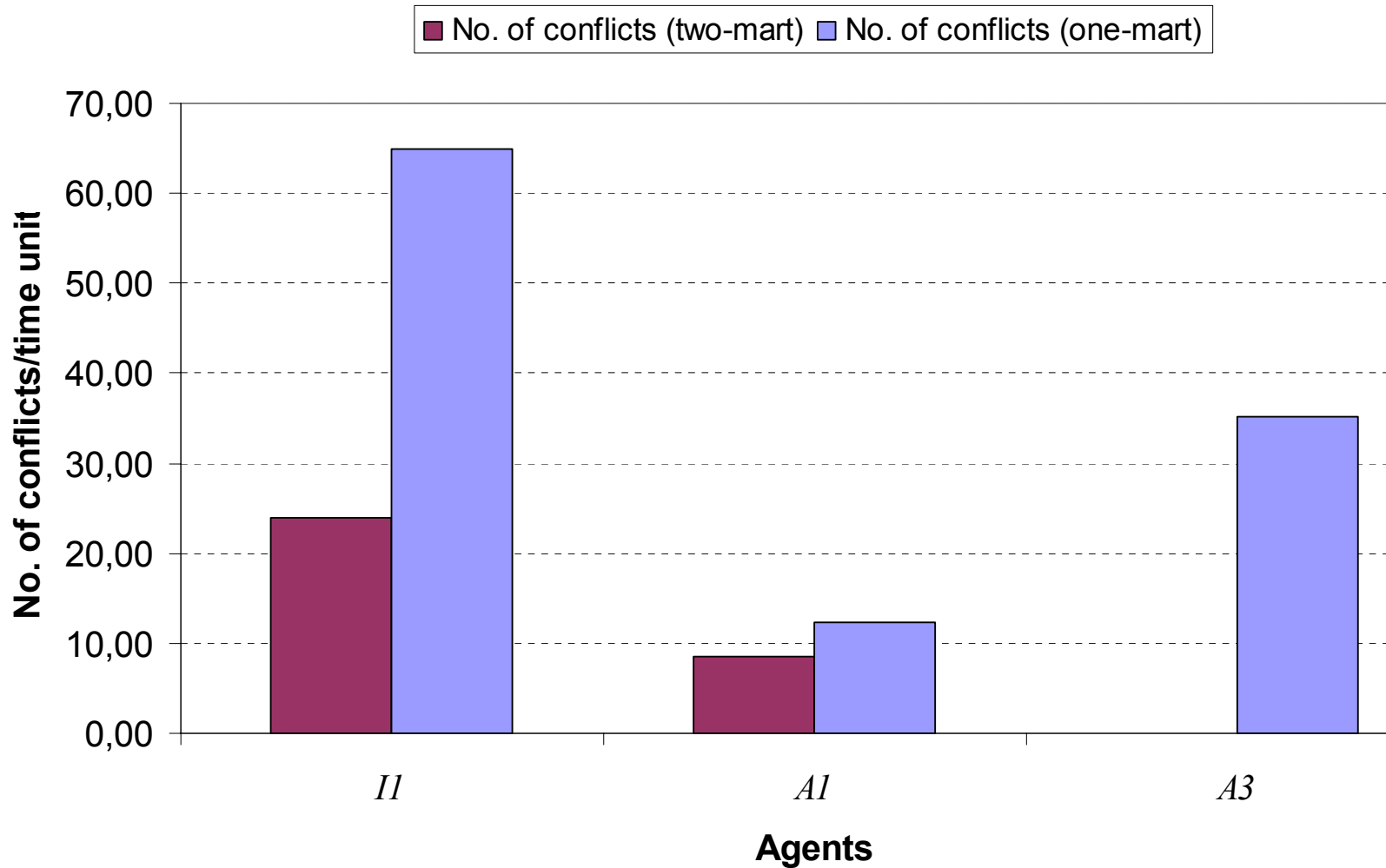
# Results: consolidation lifetime

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# Results: number of conflicts

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- Dynamic of markets
- Conclusions



# 4. Dynamics of markets

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Multi-agent system

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Conclusions

- Dynamics of collaborative groups
  - Agents affiliate to markets depending on the kind of knowledge that they produce
  - Markets evolve (merge or divide) depending on the kind of knowledge consolidated within them
- Agents arrangement
  - Cognitive distance  $d_k$  between agents and markets
  - Defined from dissimilarity between issued proposals' attributes
  - Agents operate in the *nearest* market
  - Agents relocate based on Knowledge production
- Evolution of groups
  - Market fusion/division
  - MajorClust algorithm

# Dynamic of markets

## Intro

## Multi-agent system

## Case study

## Dynamic of markets

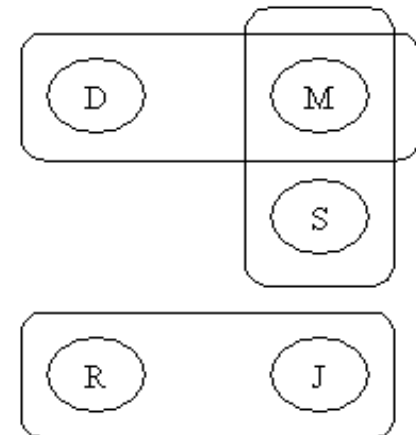
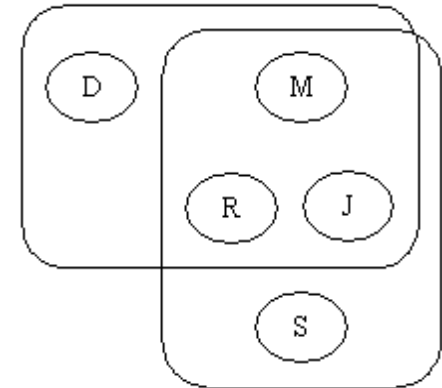
## Conclusions

### ❑ Information brokering services

- Content-driven delivery
- Filters to deliver contents of interest
- Publish/subscribe pattern

### ❑ Communities of users

- User agents subscribe to items of interest
- User agents produce (publish) items
- Brokers' routing tables are built
- Routing tables contain (hide) users' layout into communities of interest



## Intro

## Multi-agent system

## Case study

## Dynamic of markets

## Conclusions

### □ Effective communications

- Reduce amount of info shared by brokers
- Reduce distance among agents and their interested marts

### □ Evaluate

- Mart's optimal size
- Cost of agent's relocation related to brokers communication efforts
- Impact of mart's evolution in the service

### □ Find best clustering algorithm

- *K*-means, COBWEB, MajorClust,... etc

# 5. Conclusions

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## □ Features

- Bottom-up, multi-agent approach to collaborative knowledge production systems
- Dynamic building of user communities
- Applicable to other collaborative KM production tasks
  - e-Book & learning objects composition
  - Calendar organization
  - Software development (analysis & design)

## □ Improvements

- Further validation in multi-tiered scenarios
- Test of mixed interaction styles (retract, substitute, reject)
- Evaluation of dynamic evolution of markets