

Organizations and MAS

Les Gasser*

Graduate School of Library and Information Science

University of Illinois at Urbana-Champaign

gasser@uiuc.edu

* With thanks to collaborators: Jean-Pierre Briot,
Kathleen Carley, Toru Ishida, and Makoto Yokoo

Aims of This Tutorial

- **Present an overview and motivations for research into MAS organizations**
- **Communicate major perspectives of the field**
- **Create links to Multi-Agent Systems R&D issues**
- **Survey several major systems, experiments, and results**

(Personal, current) Motivations for thinking about organization

- A primary concern of Library Science is “information organization and access”
- A principle LIS theme is:
Access to organized information is {easier, more effective, more efficient} than access to unorganized information...

So both information and access should be organized

- “Mutual structuration” of access and information (and hence of information-using communities)
- Viewing information (e.g. “documents”) as active, with agency, not as passive, objective

➔ *Collective (Self-)Organization of Information*

Current Projects

I. Collective (Self-)Organization of Information

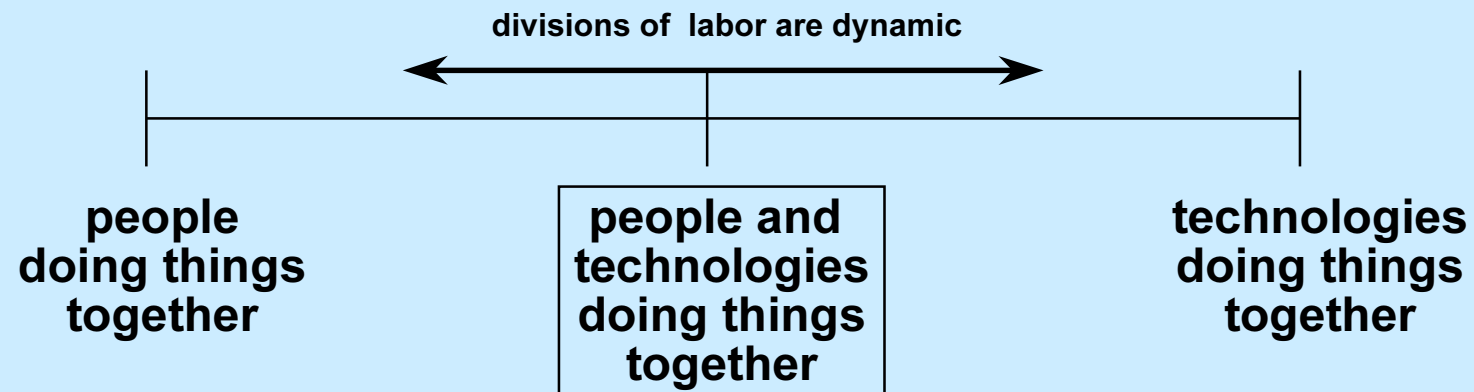
- **Language evolution: Creation and dynamics of language, (lexicon, syntax, dynamic semantics, use)**
- **Collective dynamics of web (hypermedia) structure (+access)**
- **Dynamically adaptive life-long personal information collections**
- **Information quality dynamics**
- **Resource description/discovery for agent systems**

II. MACE/MAST

- **Scalable (to very large scale) experimental infrastructure for MAS *research***
- **Java-based, “large-grain agent” focus**
- **Distributed deterministic discrete-event simulation; data mgmt**
- **PC to supercomputer (cluster) platforms**

Why Consider Organizations?

The MAS Landscape



Corkill and Lander's Principles of Agent Organization

Organization becomes more important with:

- **Increases in number of agents**
- **Increases in duration of agent activities**
- **Increases in repetitiveness of activities**
- **Increases in resource sharing**
- **Increases in collaboration**
- **Increases in agent specialization**
- **Decreases in agent capability**
- **Decreases in resource slack**

....All of which are occurring in MAS applications areas

Other Motivations....

- **Current conditions and forces mean the online information and services landscape will be non-uniform**
- **Patterns of activity will thus be non-uniform, i.e. organized**
- **Patterns will conform to (and influence) existing social arrangements**
- **Patterns are likely to be localized and semi-redundant**
- **Organization, (e.g., specialization and division of labor) can be a response to resource limitation and local opportunity**
- **Patterns provide stability and predictability**

Hypotheses About MAS Organizations

- 1. MAS are fundamentally organizational systems.**
- 2. As such they will exhibit many features common to existing organizational systems.**
- 3. Hence,**
 - To understand/build them we can leverage existing organizational concepts and tools;**
 - The better we do this, the better MAS will integrate with their contexts of use;**
 - Certain evolutionary and contextual features of MAS will necessarily drive them toward 2 above.**

Basic Questions

Conceptualization:

How do we describe organization?

Empirical & Theoretical Taxonomy:

What forms of organization exist?

Theory:

What elements and relationships govern the nature, form, and behavior of organizational systems?

Mechanism and Implementation:

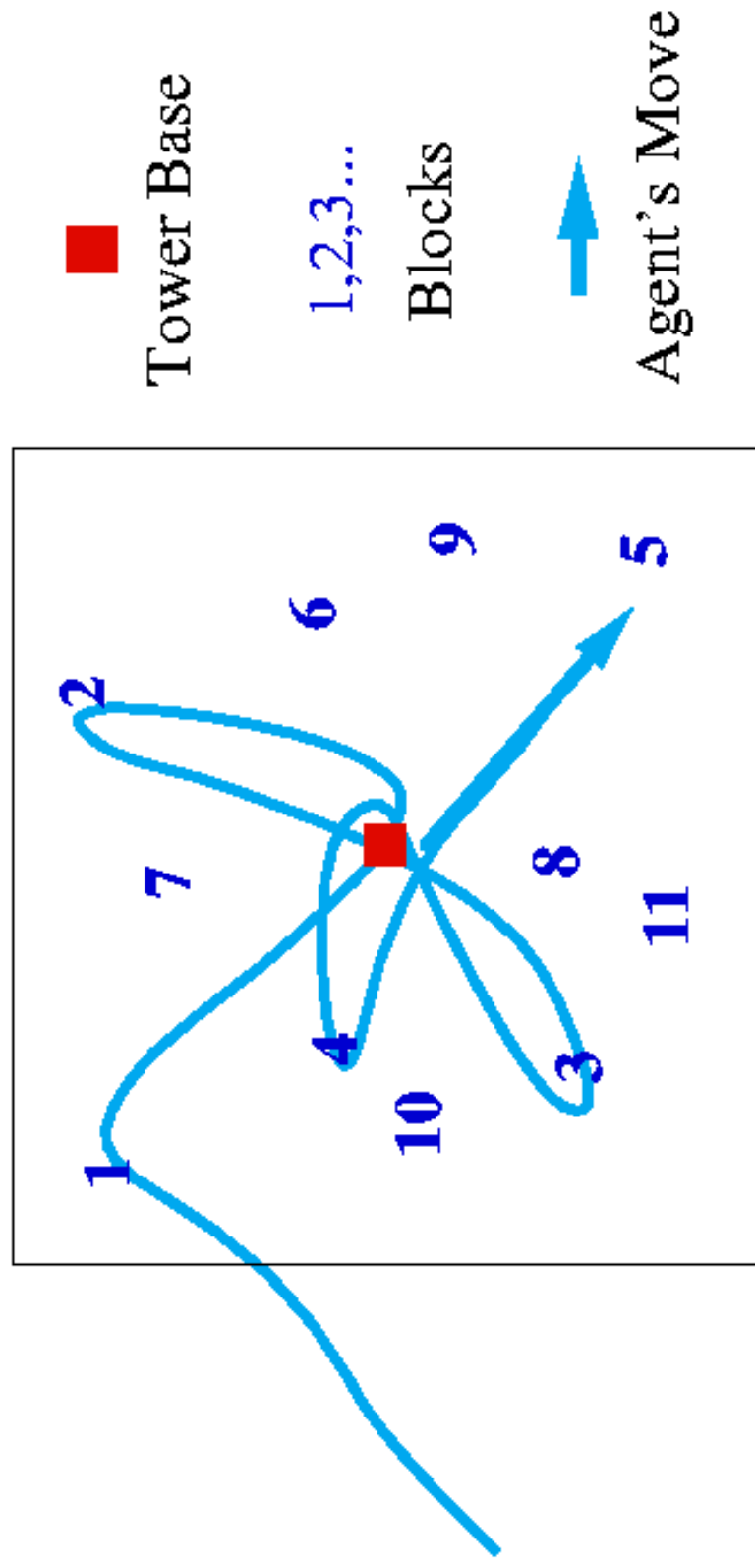
What organization mechanisms are possible and tractable?

Let's take a simple example*....

*** thanks to Toru Ishida**

The Tower of Babel

A New Testbed for Organization Design



Goal: To build a tower by stacking the blocks starting from number 1 as efficiently as possible.

The Tower of Babel (Details)

- 1) **Problem space:** In a grid space, sequentially numbered blocks are randomly scattered. The base of the tower is located at the center of the grid.
- 2) **Move:** Each agent can move to any neighboring node in a unit of time. When an agent and a block are placed on the same node, the agent can carry that block.
- 3) **Space conflicts:** Except for the base, only one block at a time can occupy a node. Agents cannot share a node with any other agent.

Why the Tower of Babel ?

1. The Tower of Babel includes a good amount of **parallelism**, but also requires **sequential planning**.
(Not like making an ant hill, but is similar to constructing a building.)
2. The Tower of Babel is **easy to solve with a single agent**, but becomes **more difficult as the number of agents increases**.
(As parallelism increases, conflicts among agents frequently occur.)

Experiments on Various Agent Types

1. Basic Agents

Plan to solve the Tower of Babel.

No communication among agents.

2. Coordinating Agents

Select goals depending on other agents' decisions.


Agents inform their goals to other agents.

3. Organizational Agents

Change goals depending on organizational situations.

Agents can leave blocks halfway to the base, so that they can pickup other blocks.

No. of agents which can efficiently work



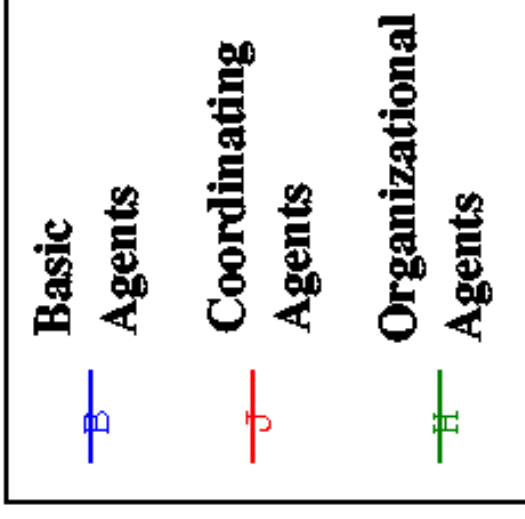
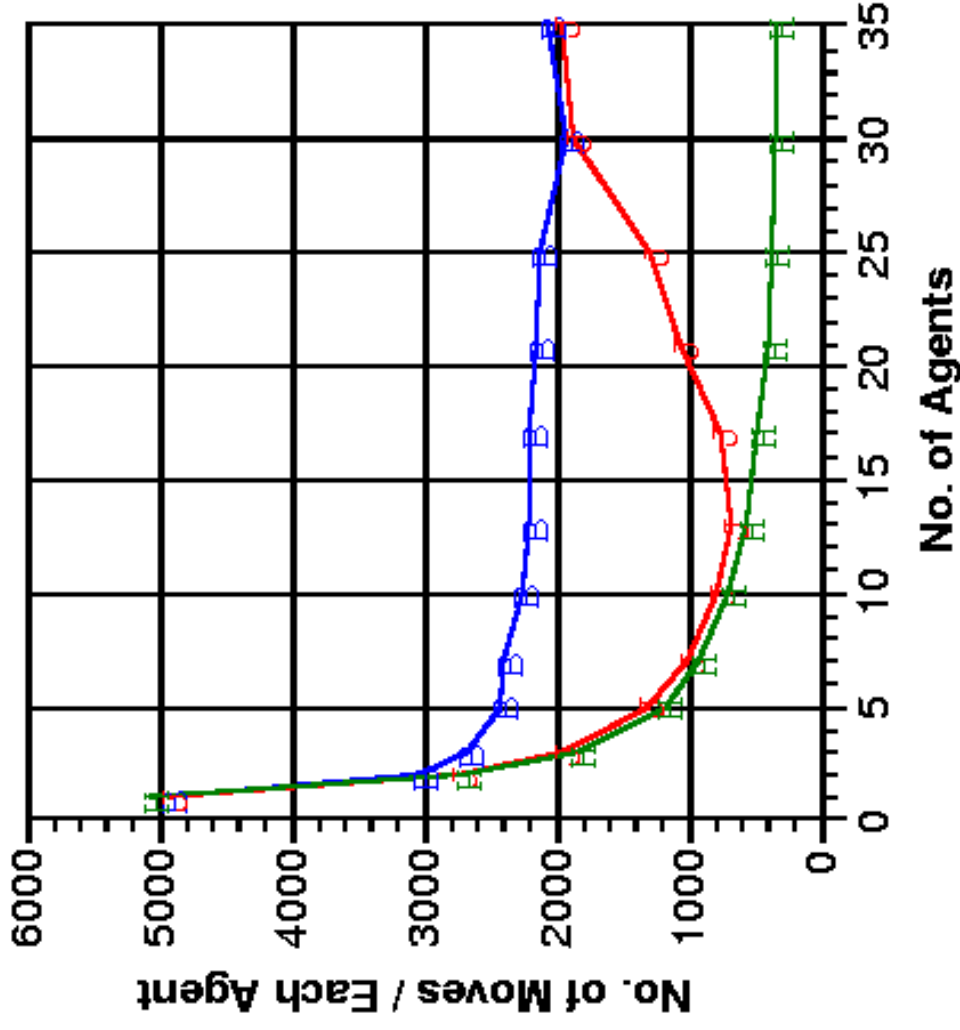
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20

Experimental Evaluation

50 x 50 grid space
100 blocks
200 obstacles
(randomly positioned)



Implicit Organization

Designing utility functions so that organizations emerge.

Utility Function

$$w \text{ Local_Contribution} + (1-w) \text{ Global_Contribution}$$

Local Contribution

Individual Efficiency: Move any block towards the base.

Conflict Avoidance: Avoid being blocked by other agents.

Global Contribution

Group Efficiency: Move a block to be stacked next.

Conflict Avoidance: Avoid blocking other agents.

How to design such an appropriate utility function in general?

High-Level Outline.....

Motivations

Introduce three interlocking perspectives

Theoretical: Organizational models and concepts

Phenomenological: Organizations as phenomena

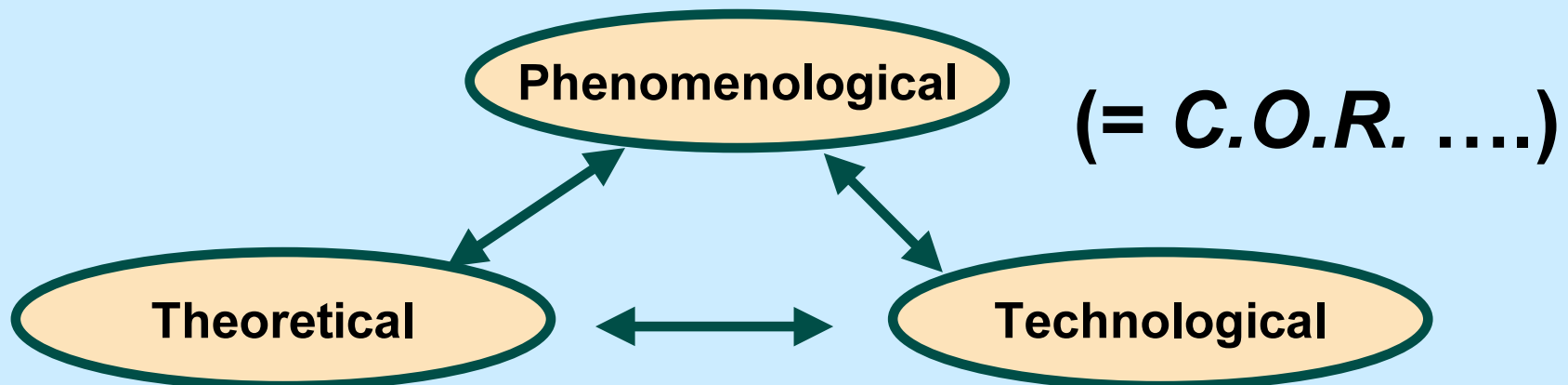
Technological: Organizations as technologies

Examine a variety of systems and projects from these three views

Conclusions

Perspectives on Organizations

- I. **Phenomenological**: description/analysis/explanation of existing (human, computational, biological, physical, etc.) organizations.
- II. **Technological**: Organizations as social technologies for solving complex problems, for overcoming “individual” limitations (cognitive, physical, temporal, institutional...), and as efficiency/optimization strategies.
- III. **Theoretical**: Abstract and general models of possibilities, limits, and mechanisms of organization.



Vision

Science: Are there general principles of organizing?

Industry: Organizational Engineering

what if analysis to evaluate:

redesigns

restructuring

impact of new technologies

impact of policies

**Pedagogy: Learning about organizing & organizations
through hands on simulated experimentation down to the
gradeschool level**

Theoretical Perspective

**Abstract and general
models of possibilities,
limits, and mechanisms
of organization.**

Theory:

What elements and relationships govern the nature, form, and behavior of organizational systems?

■ = structural elements of theory

■ = content of theory

- What conditions lead to the formation or dissolution of particular organizational forms?
- How do complexity and uncertainty in environments, tasks, and technologies shape organizational forms? (*contingency theory*)
- What are the fundamental limits to organizational forms and behavior and how are these limits constituted?

"People living and working in a business system cannot change it. Their perspectives are foreshortened, their information gathering and measurement systems reinforce the past, and their incentives encourage continuity. Archimedes proclaimed, 'Give me where to stand, and I will move the earth.' But where should those who might change a business system be standing?"

"The answer is that every organization needs two business systems.....the 'surface system' and the 'deep system.' The surface system is comprised of the organized tasks of the business processes, with their attendant jobs, structures, systems, and values. But this surface system is in periodic need of major change. Accomplishing that change is the job of the deep system.

"The deep system creates no customer value; it makes no products and delivers no services. It doesn't process orders, develop new products, or create value for customers. Rather it monitors, governs, adjusts, and reforms the surface system that does create customer value. A company's deep system bears the responsibility for detecting external changes, determining what those changes mean, and intervening to modify or transform the surface system accordingly. The deep system, working beneath the surface, embodies the capacity to change.

"The deep system continually hurls challenges: Is this still the right way or the best way to do things? If not, what is? The deep system ensures that the appropriate internal change-moderate or radical-takes place, shaping and reshaping the organization to take account of, and whenever possible take advantage of, ongoing external change."

Michael Hammer,

"Beyond Reengineering: How the Process-Centered Organization is changing Our Work and Our Lives."

Deep Systems of Organization

Agents, Tasks, Processes, Knowledge

Organizational Architectures

Organization Concepts & Structure

**Shallow,
specific**

**Deep,
general**

Levels of Abstraction in MAS

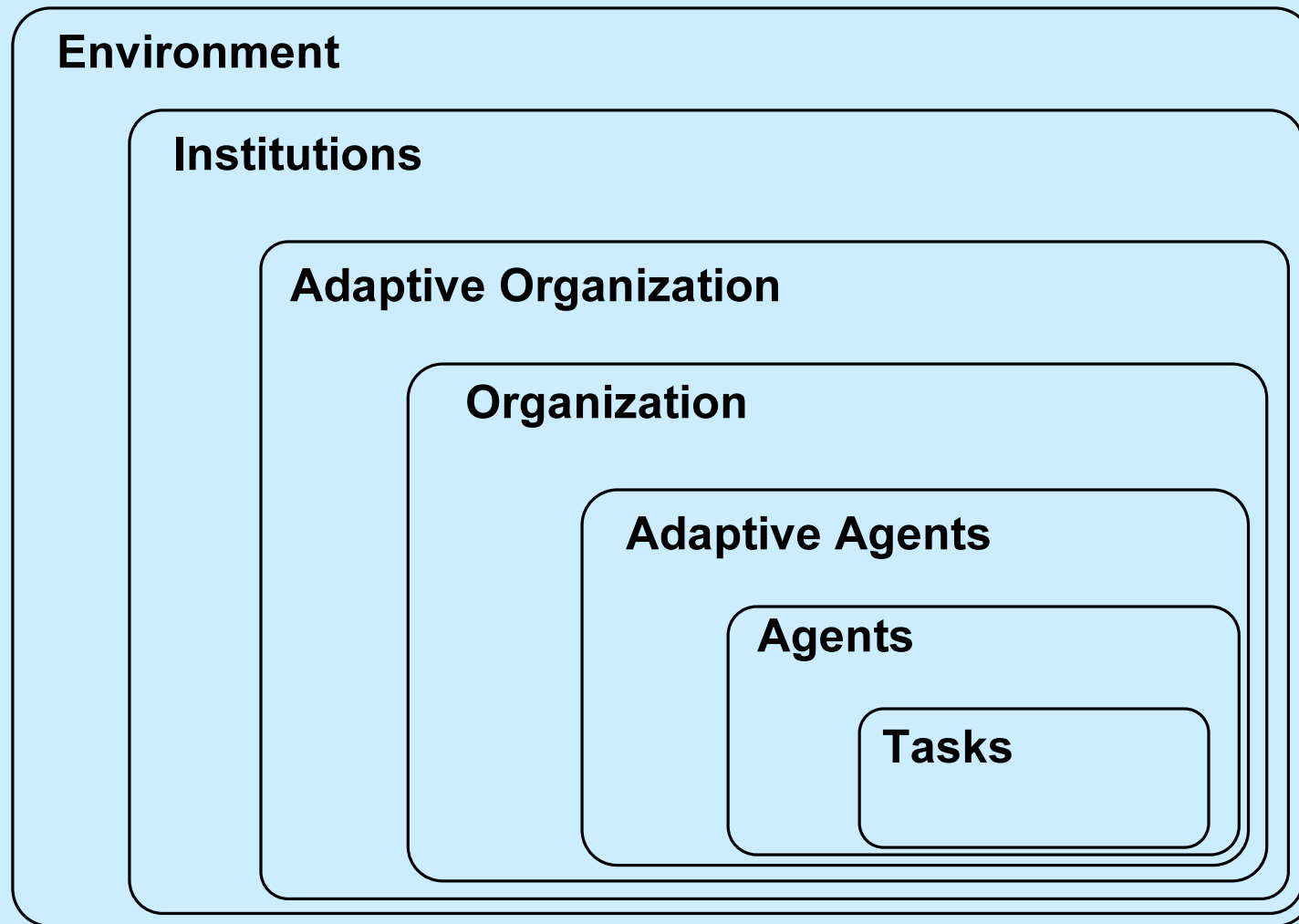
Theory of Social Organization

Theory of Modeling/Problem Solving
(e.g., problem frameworks; algorithms)

Theory of Implementation
(e.g. programming languages; communication)



Multiple Levels of Analysis Needed



Ashby's Concepts

("Principles of the Self-Organizing System", 1962)

The “hard core” of the concept of organization is “conditionality”: the relationship between A and B is conditional on the state or value of C.

Thus:

- ✦ The general theory of “organization” is coextensive with the theory of functions of >1 variable.**
- ✦ The opposite of “organized” is “reducible”**

A system is described by a “product space” - a set of configuration *possibilities* - some subset of which indicates *actual configurations* of the system.

Conditionality implies “communication” among parts (whose converse is independence)

Communication implies *constraint*: a *correlation* between events/state A and event/state B (i.e., a constraint on which (A,B) pairs can occur).

Organization* is a *constraint* on the *product space* of *possibilities

This view of organization is *subtractive* (limits in the product space), whereas some other conceptions (e.g., in biology and sometimes in MAS) are *additive*.

Product space contains more than is manifested in actuality. Thus:

- **Product space represents the uncertainty of the *observer*: what could happen**
- **Changes in observer can lead to changes in product space.**
- ***Theory of organization is concerned with properties that are fundamentally relational between observer and thing***

Conditionality in a system implies thinking of a whole and its parts.

Dynamic analysis may consider parts or wholes, so

- ***Organization* and *Dynamics* are independent concepts**

Any dynamic system can be made to display a variety of arbitrarily assigned “parts”

Whether or not a system is reducible depends on the point of view of an *observer who assigns these parts*.

A “machine” is a set S of internal states, I of inputs or external states, and a mapping $I \times S$ into S .

A machine’s (system’s) organization:

- ✦ **Specify the system by specifying S and I**
- ✦ ***Specify the organization by specifying the mapping, f , i.e., the conditionality among states***

“Good” organizations:

No organization is good in all circumstances

Organization is “Good” if it is stable around some *assigned* (not arbitrary) equilibrium: if it keeps an *assigned* set of variables within *assigned* limits.

Thus goodness is also a relation between organization and observer, who makes the “*assignments*”

Stability must be defined with respect to a *set of disturbances*

Finally, a “good” organization is *a relation between a set of disturbances and an assigned equilibrium.*

Conceptualizations Of “Organization”

Patterns of Action and Knowledge. (*patterning*)

Integration. (interaction, interdependencies)

Compositionality. (...individuals)

Stability/Flexibility. (architecture)

Coordination. (order amplification)

Supra-individuality. (“roles”, “tasks”, “knowledge”)

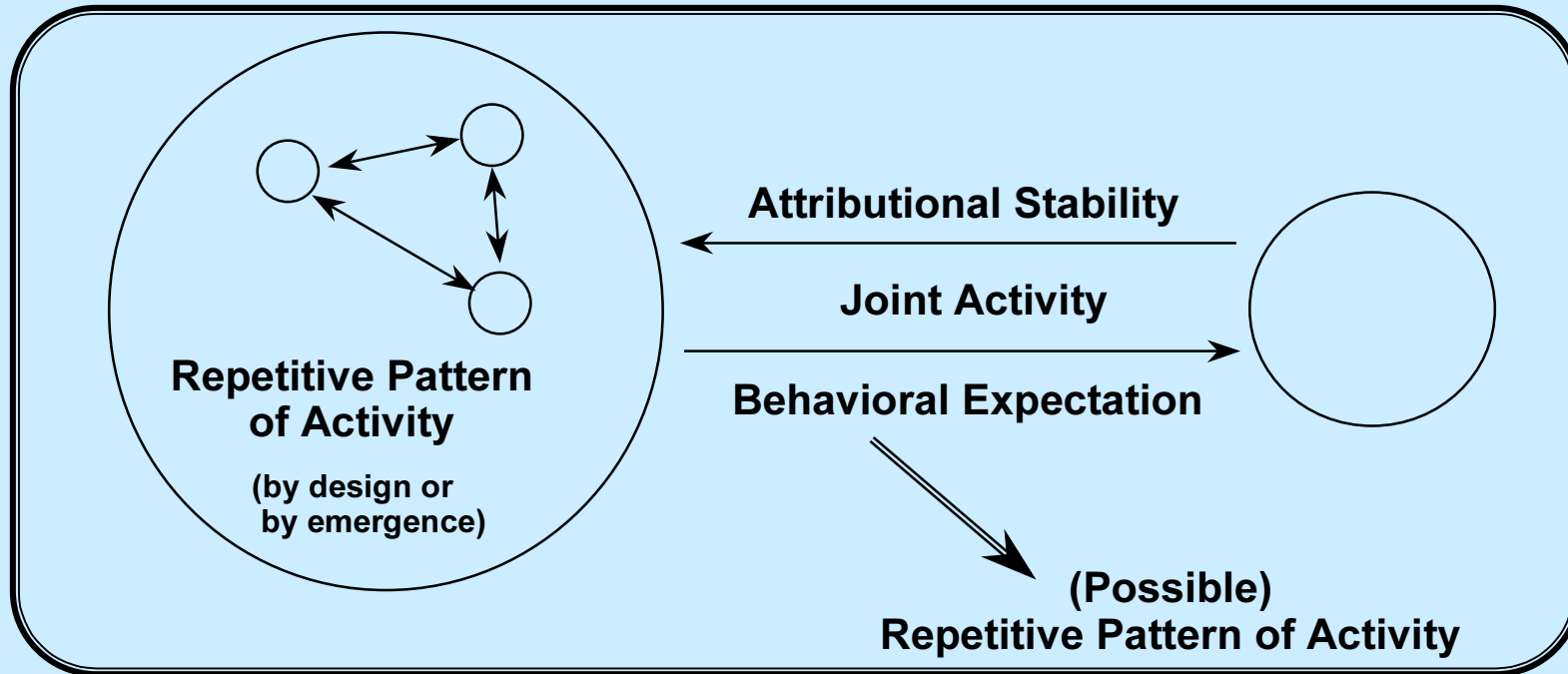
State of Functional Irreducibility. (Ashby)

Recursivity. (suborganizations, overlap)

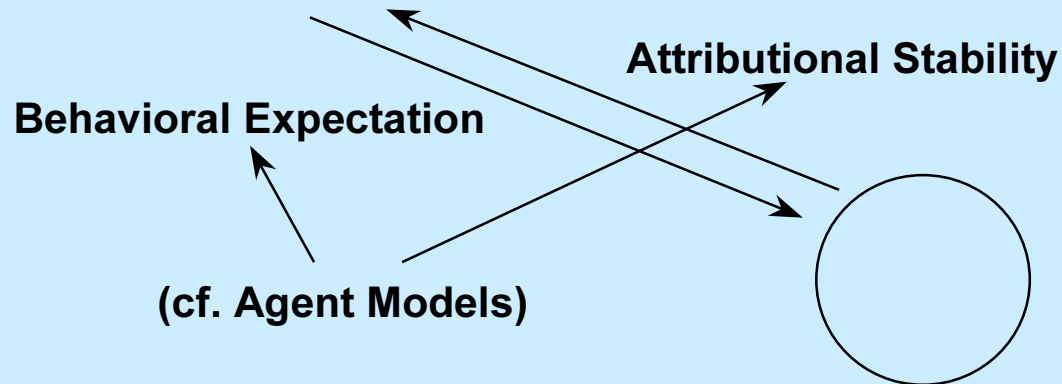
Multi-level representation/causality. (embedded time cycles)

Potentials/Differentials. (power, affiliation)

Organizations as Activity Patterns



(etc.....)



Theoretical Taxonomy & Design:

What forms of organization are possible?

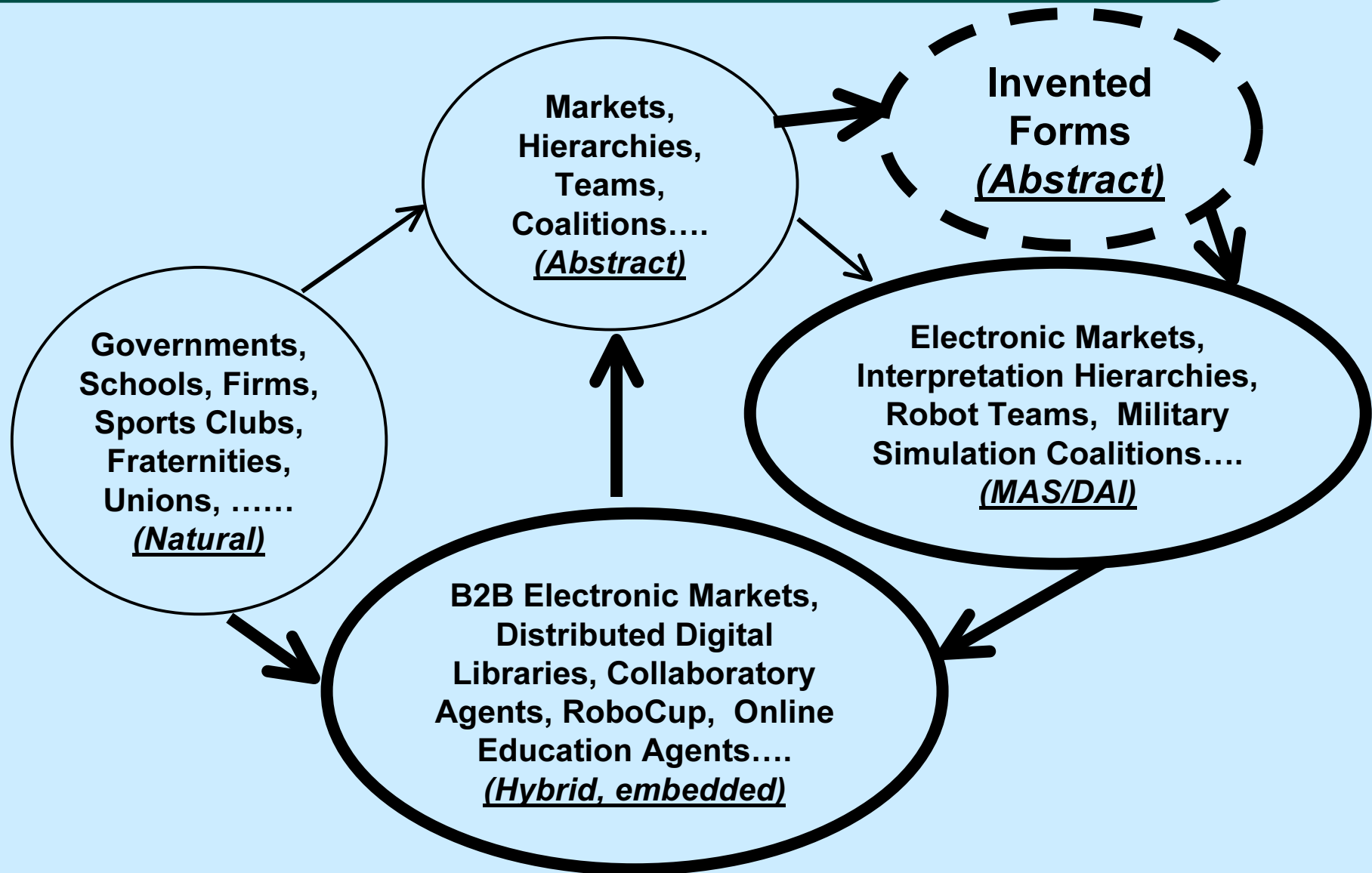
Given a body of *theory* (which embodies conceptual machinery) and *empirical taxonomy* (which embodies the present and the past)

- **What forms are missing from the landscape and why?**
- **What new forms can be invented & put in place?**
- **How can we predict their behavior, success, failure, etc.**
- **What forms are impossible, impractical, or unrealistic?**
- **How can we know these things?**

Empirical & Theoretical Taxonomy & Design:

What forms of organization could exist?

How should they be classified and created?



***Examples of
Specific Modern Theories***

Structuration Theory

(Giddens)

Some tenets:

Structures are “dual”: they are “both the medium and the outcomes of the practices which constitute social systems.”

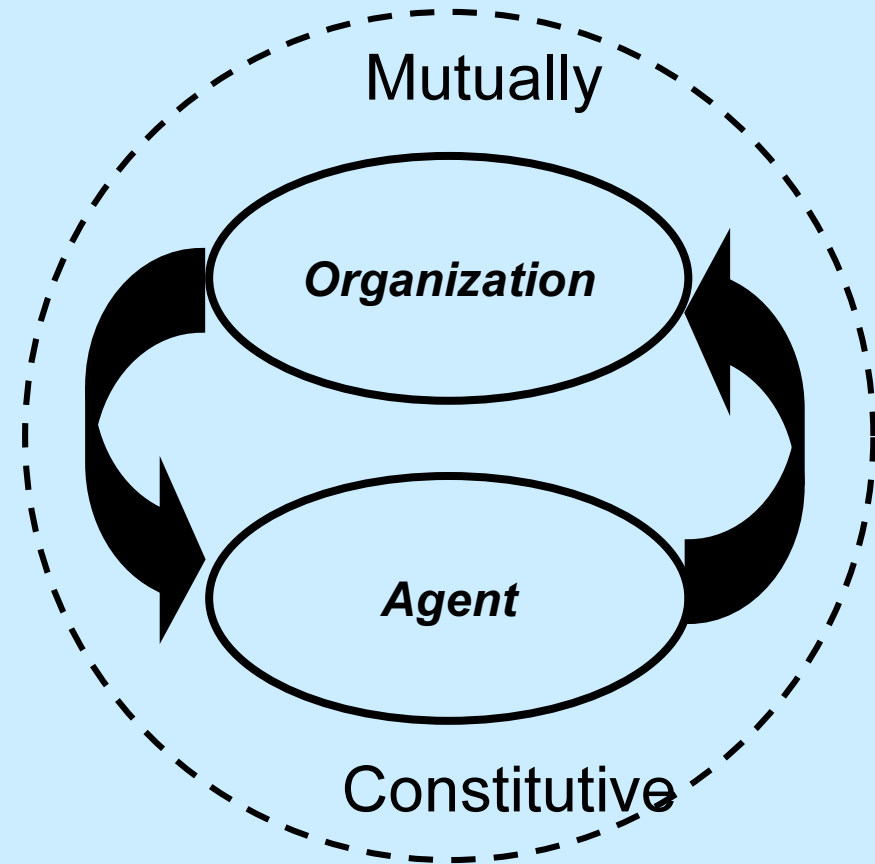
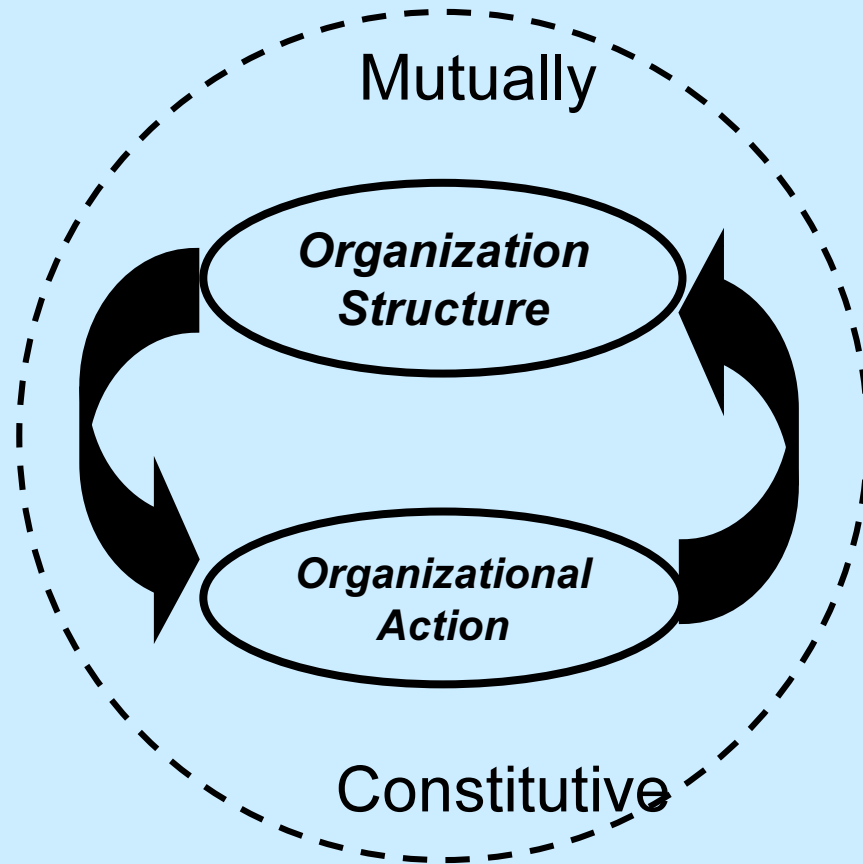
Peoples’ practices constitute structures

Practices reproduced by the recursive enactment of structures

Practice and structure presuppose each other

Structures are the principles that pattern practices

Intricacies of Structuration Theory



Sensemaking Theory

(K. Weick, Sensemaking in Organizations, 1995)

Definitions:

Sense Making (i.e., *active construction*)

“Structuring the unknown”

“Placing stimuli into a framework”

“A recurring cycle that uses retrospective accounts to explain surprises”

7 Properties of Sensemaking Theory

(K. Weick, Sensemaking in Organizations, 1995)

Grounded in identity construction

Retrospective

Enactive of sensible environments

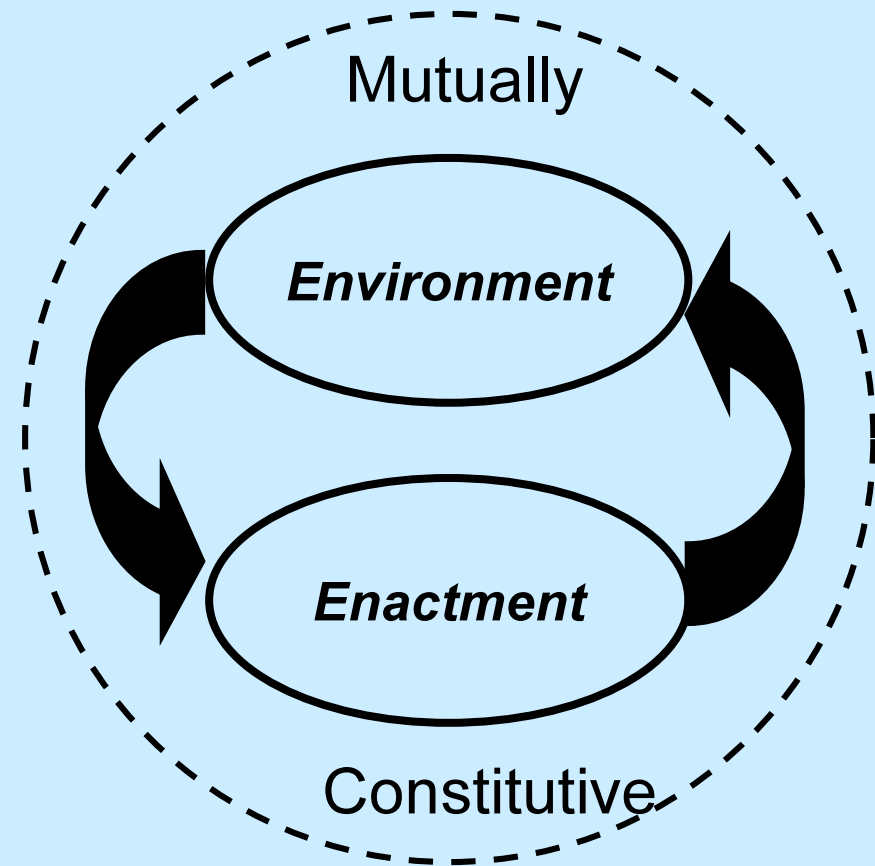
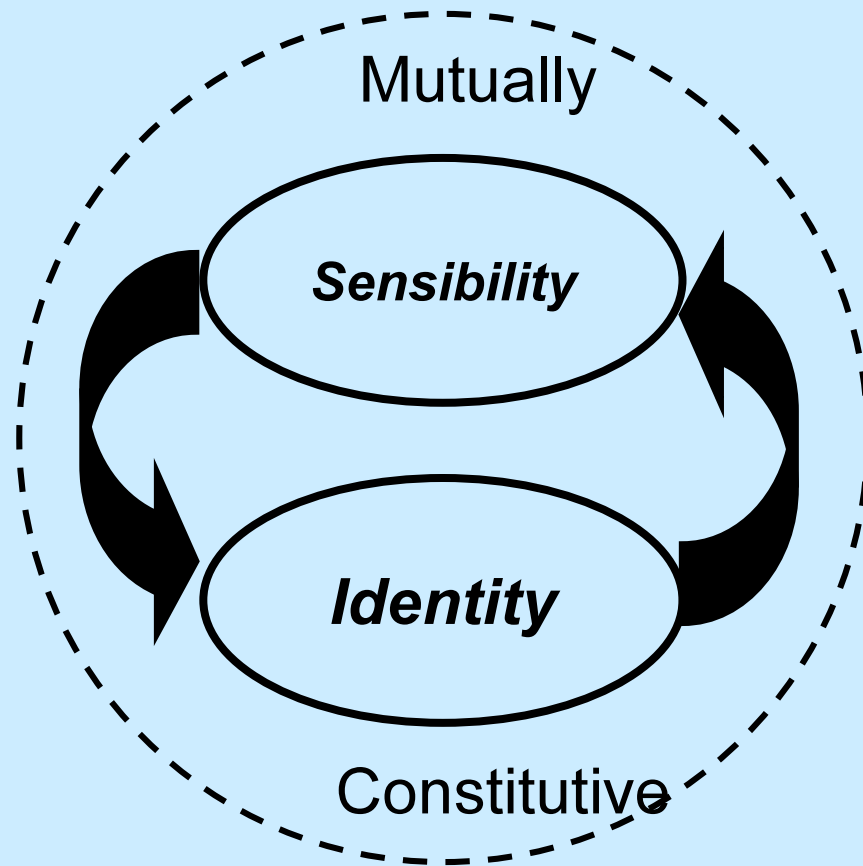
Social [collective sensemaking]

Focused on and by extracted cues

Ongoing

Driven by plausibility rather than accuracy

Two Cyclic Aspects of Sensemaking Theory



Perspectives Often Missing from the Social Science View

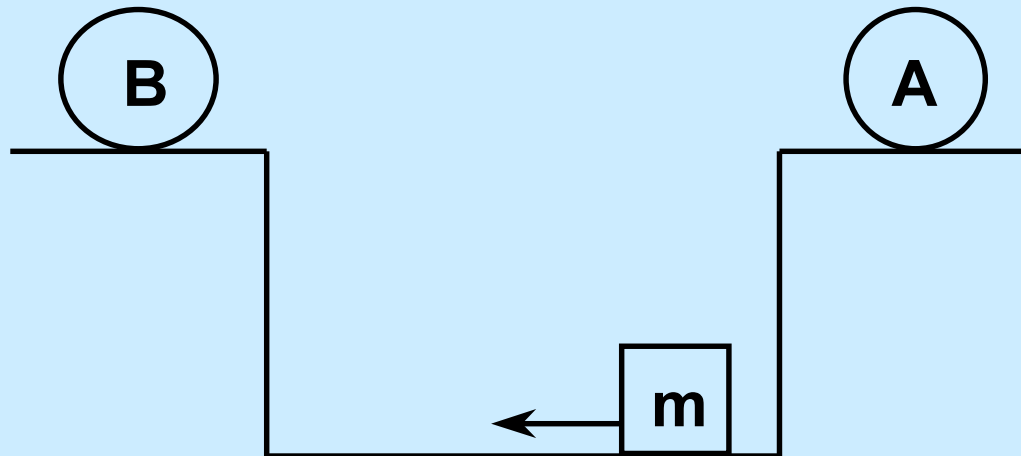
- ***Constructive experimental methodologies***
- ***Clear accounts of the computational limitations of social processes***
- ***Principled representations of objects, attributes, and processes.***

Perspectives Often Missing from the MAS/DAI View

- ***Fundamental mutability*** and negotiated character of order and structure at all levels of representation and action
- ***Mutual construction*** of structures and realities
- ***Retrospectively oriented*** accounts of action and knowledge. [This is a more fundamental change in perspective and theory for Computer Science]

Coordinated Attack

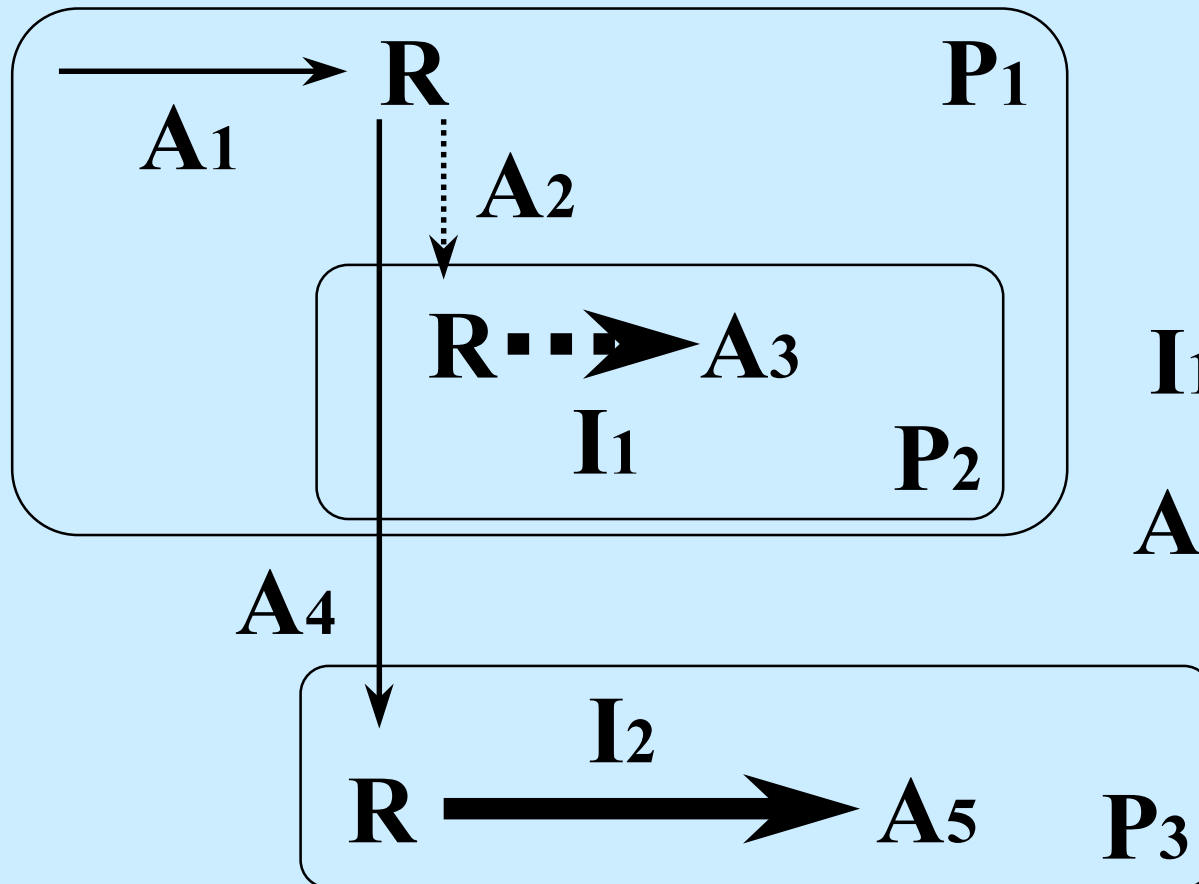
Two allied generals are stationed on opposite hills. In order to successfully attack the enemy in the valley, they must attack together. General A sends a messenger to General B, with the message “Attack at dawn!”



Common Knowledge

Common knowledge of a fact P —that state in which “Everyone knows that everyone knows.....that everyone knows P ” for any number of ‘everyone knows’.

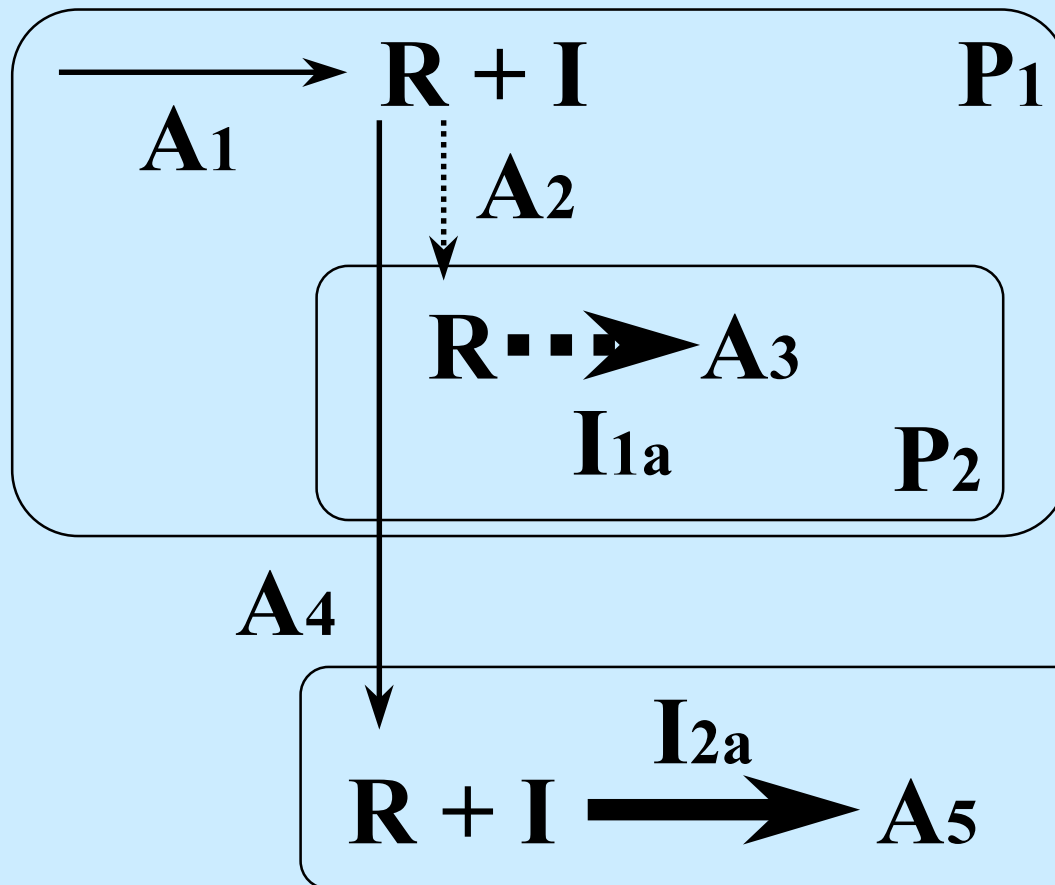
Action-at-a-Distance



$I_1 = I_2 ?$

$A_3 = A_5 ?$

Action-at-a-Distance

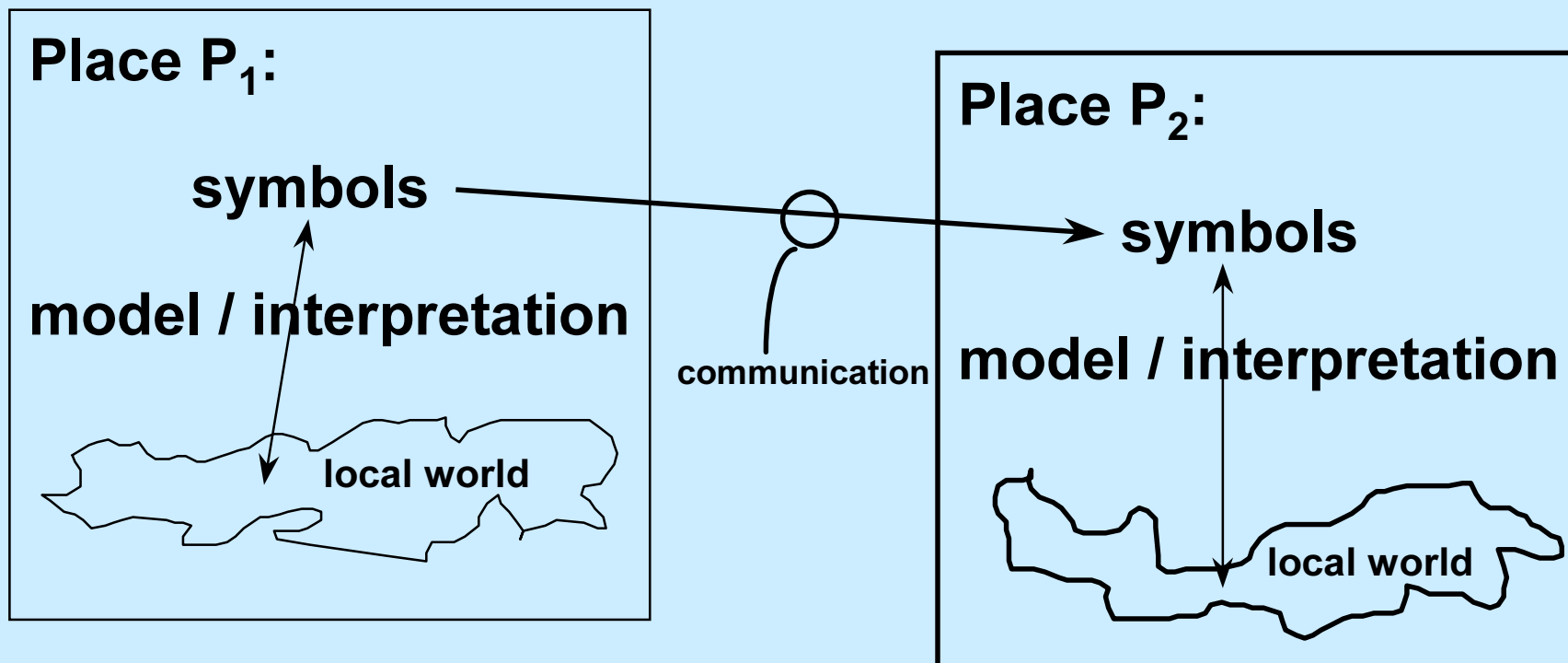


$I_{1a} = I_{2a} ?$

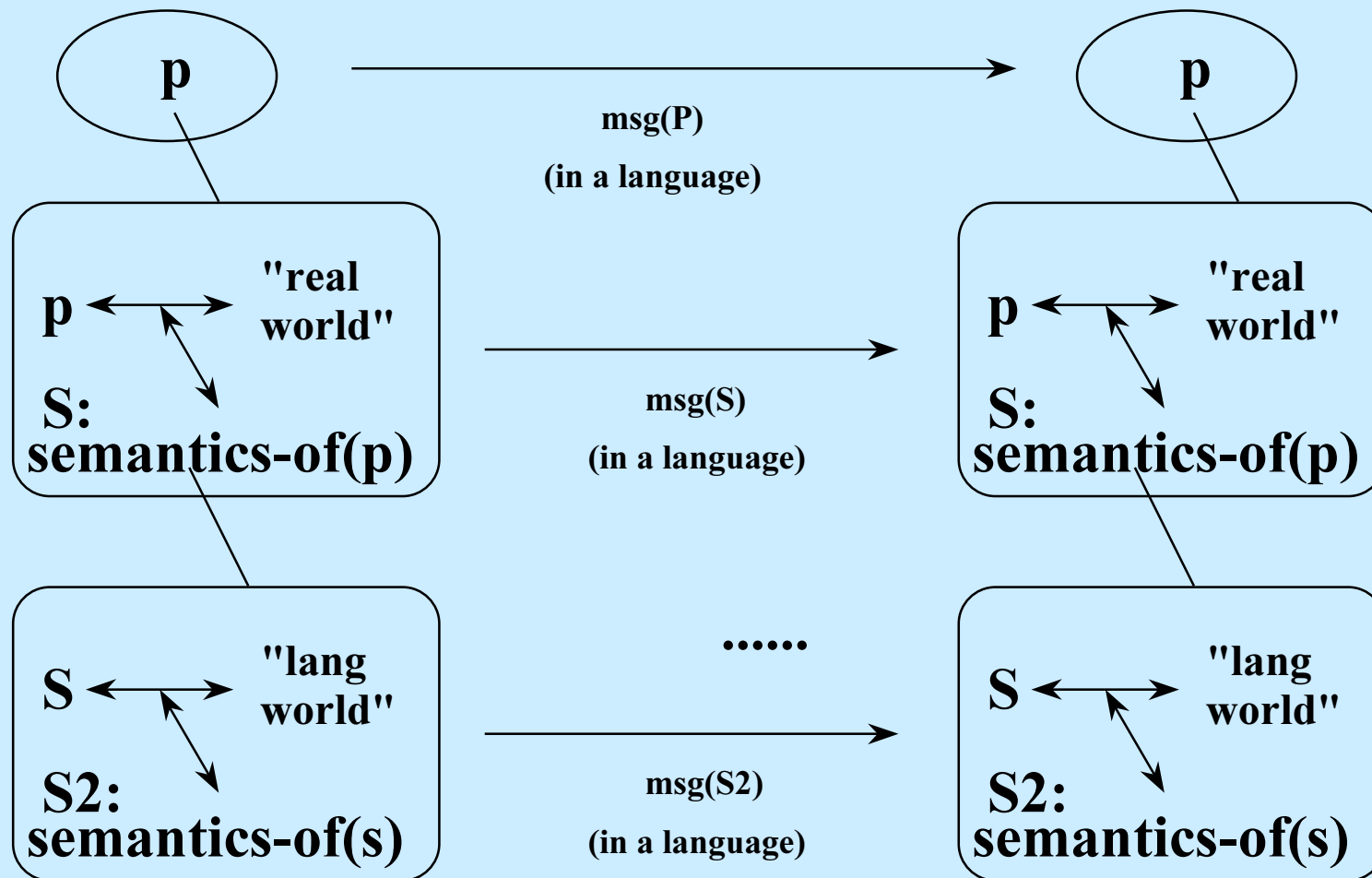
$A_3 = A_5 ?$

Distributed Semantics

Consider semantic distribution over space, time, etc.



Distributed Interpretations

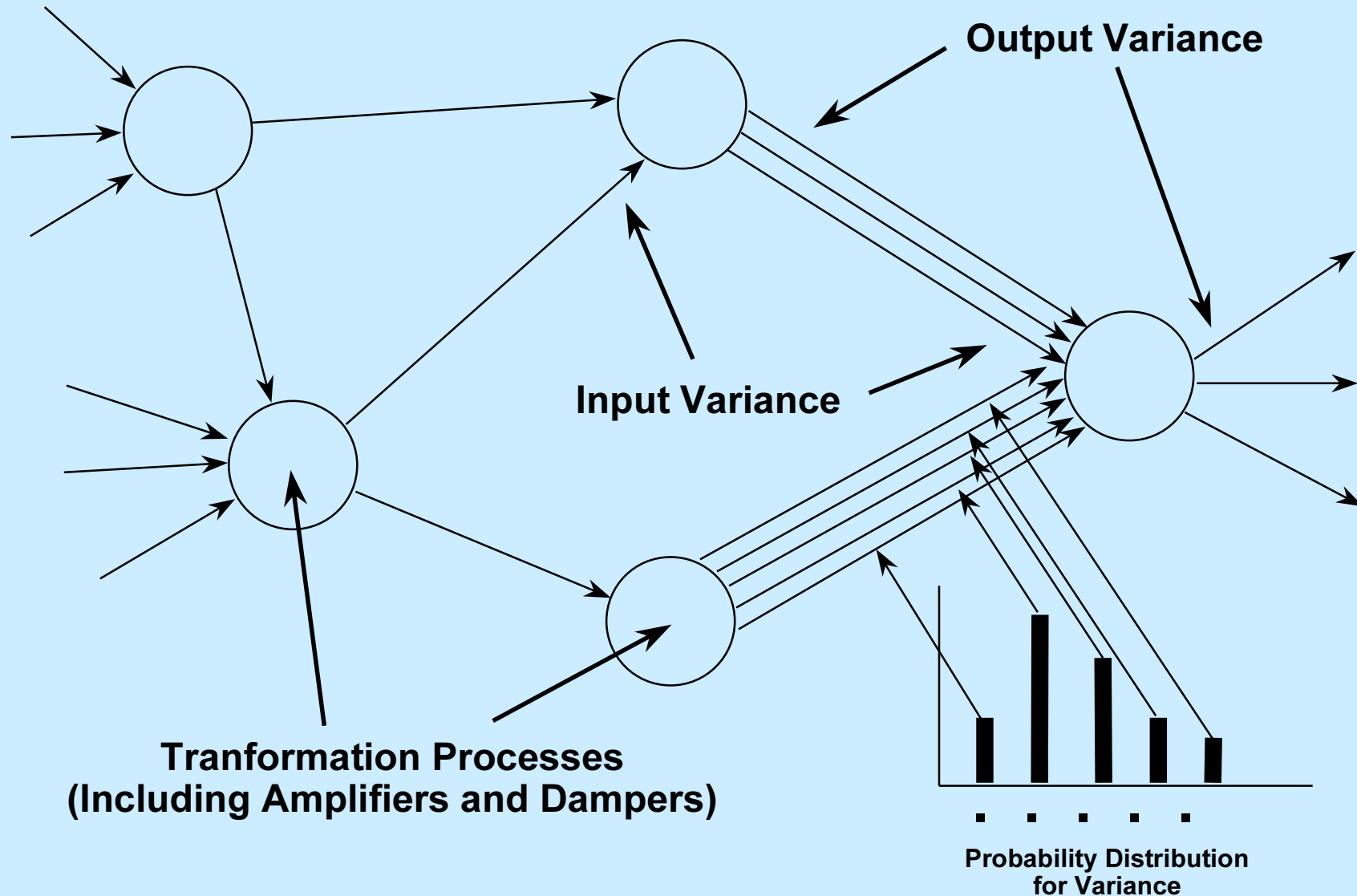


***Understanding Coordination:
a Fundamental Aspect of
Organization***

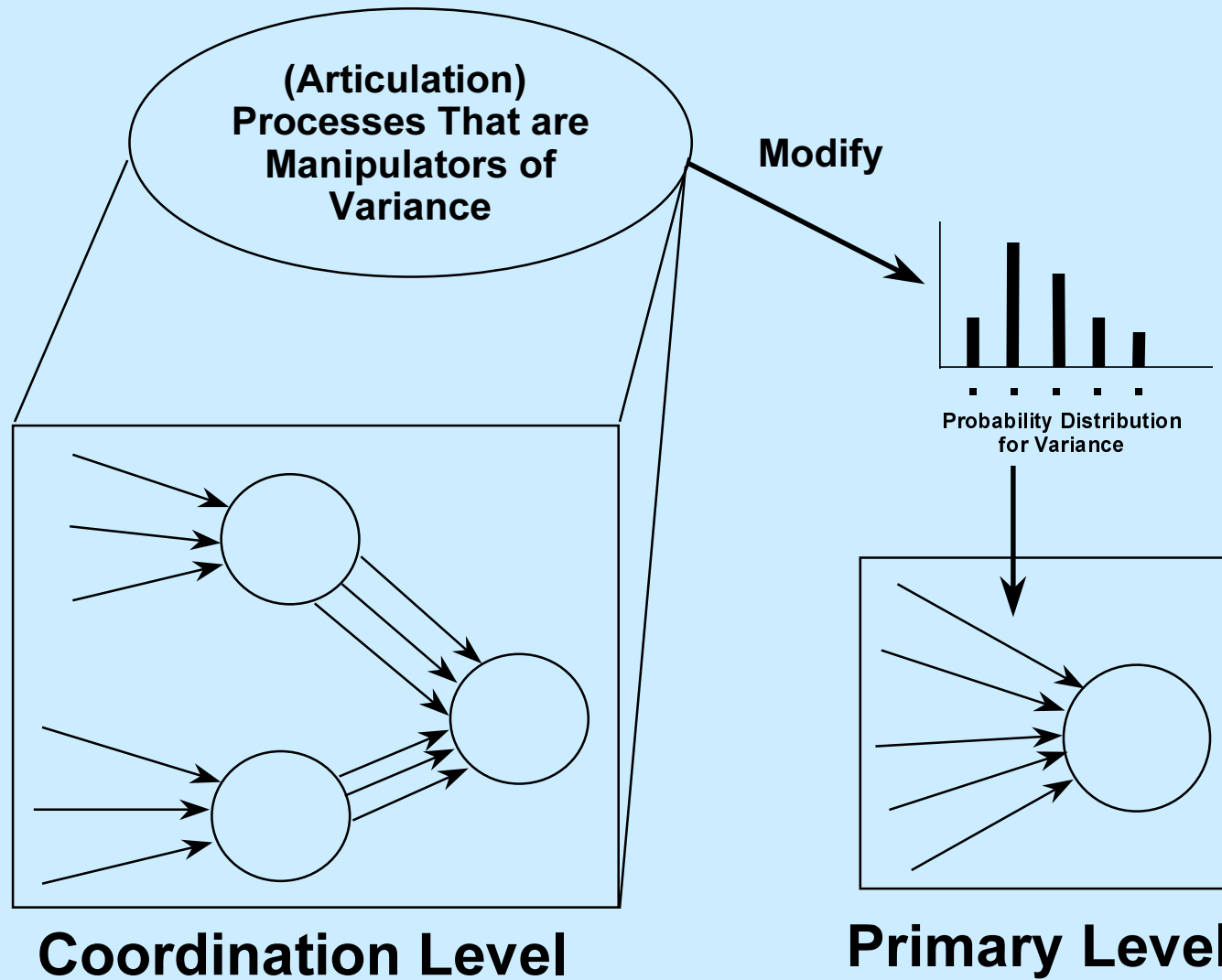
Coordination Definitions

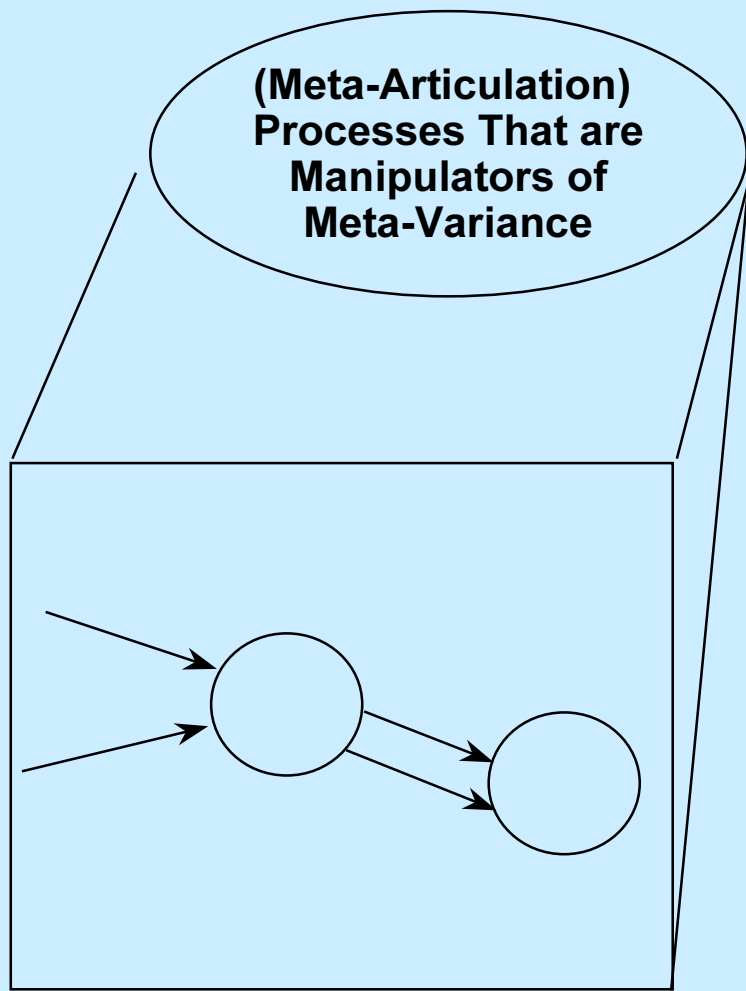
- **“The act of exchanging materials or information to achieve a business purpose.”** (Majchrzak)
- **“Management of dependencies”** (e.g. Malone and Crowston, others)
- **“Control of (reduction of) output variance in a multi-component system”** (Gasser and Majchrzak current working definition, with roots on STS theory.)

Coordination Model: Primary Tasks & Processes



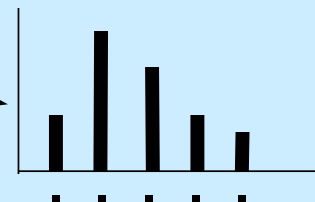
Coordination is a Meta-Level Activity



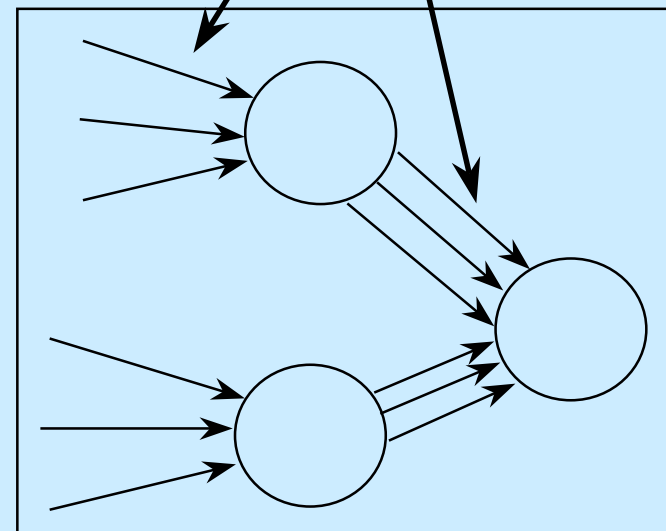


Meta-Coordination Level

Modify



**Probability Distribution
for Variance**



Coordination Level

Coordination Space

Nodes:

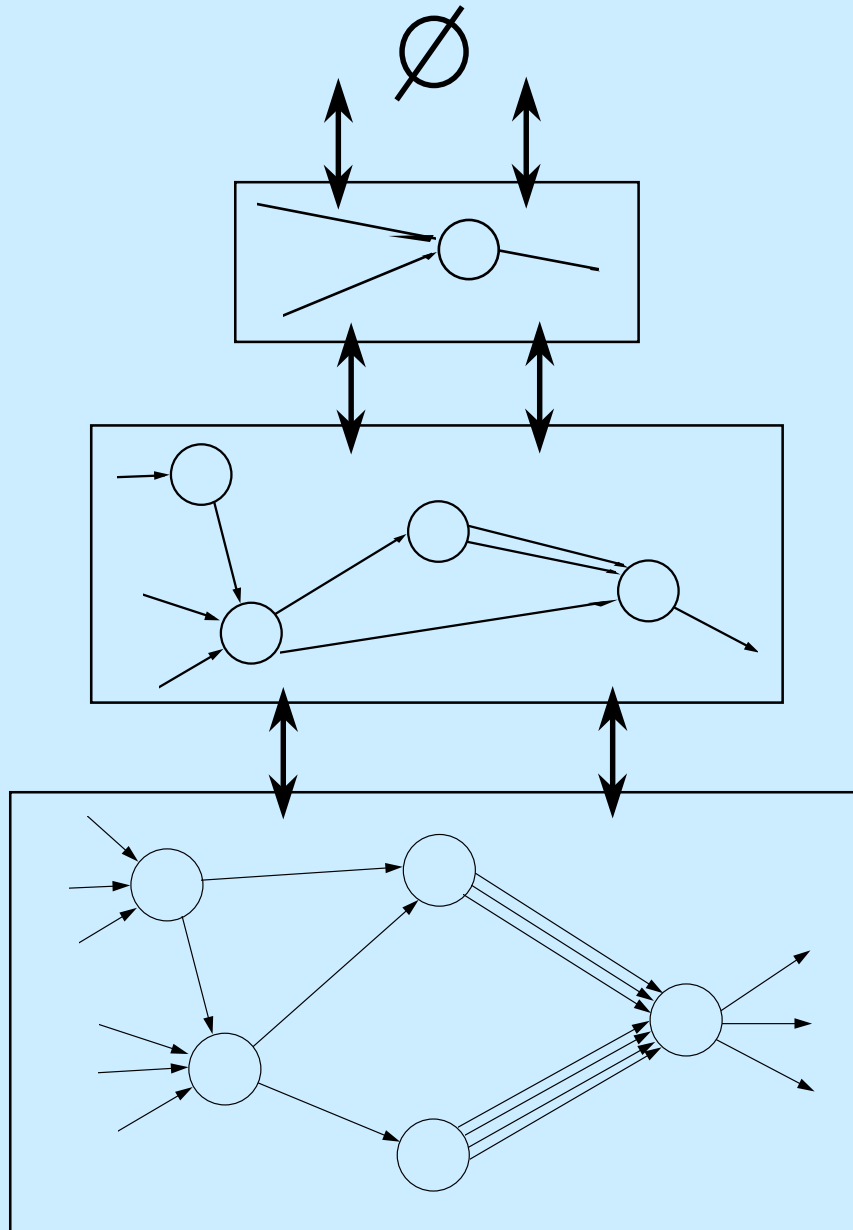
Alternative primary task architectures.

Operators:

1. Manipulations of variance probabilities using meta-level task structures.
2. Manipulations of primary-task architecture (e.g. primary redesign).

Success Measures:

Control of output variance over a range of input conditions

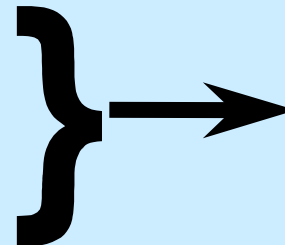


Hypotheses:

1. There must be an upward convergence to zero to effectively control variance.
2. The cumulative cost of successive upward layers of coordination must not exceed the value of the primary level.

Some Predictor Variables

Buffer Sizes
Shared task performance
Cross-activity dependencies
Nature of shared objects
Input variability
Purpose of work



Predict to:
Coordination
Attributes

Example Attributes of Coordination

Need for coordination

(How much variance control is needed?)

Speed (How rapidly is variance controlled?)

Formality (How much variance is controlled via culture?)

Interactiveness (How mutual/negotiated is variance control?)

Direction (How directed is variance control?)

Physical/virtual (Are interdependencies physical?)

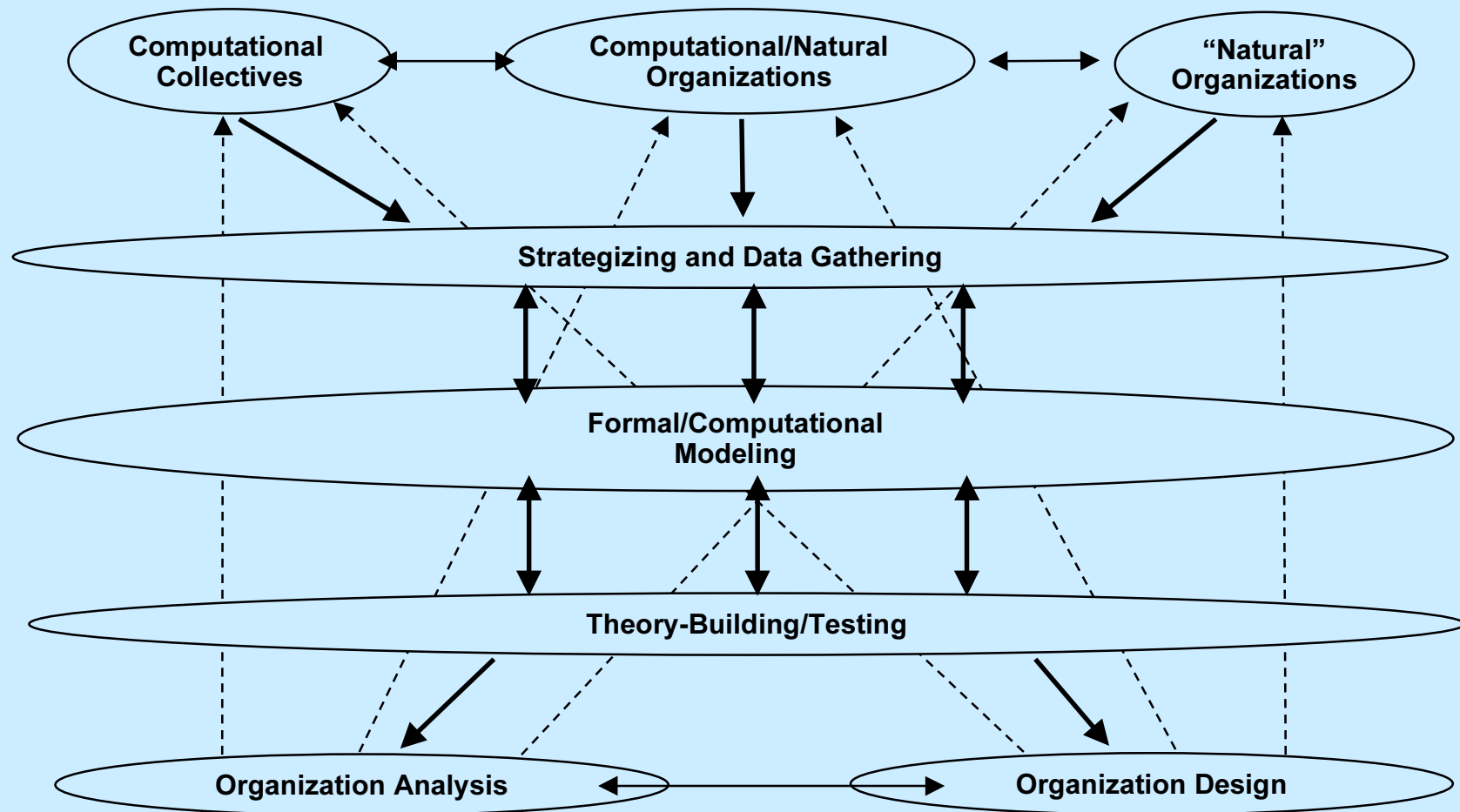
Phenomenological Perspective

Description/analysis/explanation of existing (human, computational, biological, physical, etc.) organizations.

What is COR?

- ***Computational:***
 - Computational approaches to organizational phenomena: ontologies, theories, activity/structure simulations, coordination algorithms, design/analysis tools
 - Computational Organizations: comprising computational participants
- ***Organization:***
 - Mid-range, non-individualist focus
 - Explications of micro-mezzo-macro links
- ***Research:***
 - Innovations in description, analysis, theory, and methods
 - Clear principles, descriptions, and theory embodied in tools, methods and applications

Computational Organization Research



History

- **Builds on**
 - distributed artificial intelligence
 - organization theory
 - social networks
 - team theory
 - multi-agent logic
 - artificial life, chaos theory, complexity theory
 - task analysis
 - computational sociology
- **Annual workshops on Computational and Mathematical Organization Theory (CMOT)**
- **CMOT Journal, Journal of Artificial Societies and Social Simulation**

Convergence of Opportunity and Capability

- **Need for results**
- **Available data**
- **Formalizable theories/models**
- **Modeling technologies**
- **Computational methods and computational resources**
- **Ability to apply results**
- **An emerging community of research and practice with the multidisciplinary skills to bring these together**

Contributions to Organization Theory

- **Adding new representational machinery (e.g., formalization, structure measurement, cognitive features)**
- **Increasing model scale and complexity**
- **Checking logical consistency**
- **Computational model as test of necessity of theoretical explanation.**
- **Computational model as hypothesis generator.**
- **Adding dynamics and exploiting longitudinal relationships**
- **Simulations as encodings of complex knowledge**

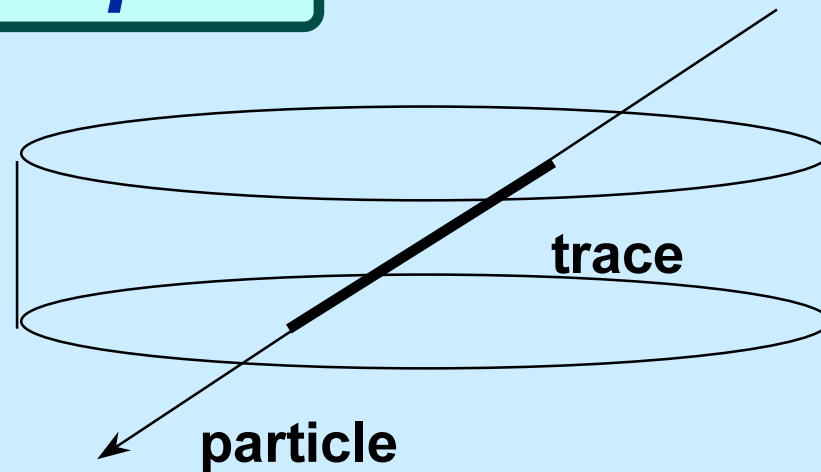
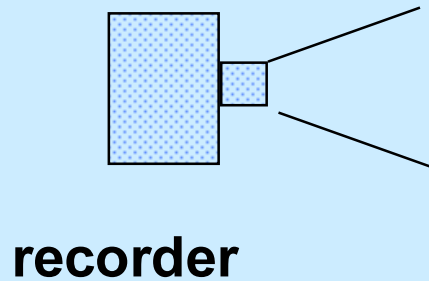
Contributions to CS/AI

- **Large-scale qualitative simulation**
- **Aggregation/disaggregation of distributed objects**
- **Online/offline coordination algorithms**
- **Organizational and multiagent learning**
- **(and more)**

Some More General Scientific Problems Related to MAS, Addressable via COR

- **Empirical and behavioral theories of social dynamics, social dilemmas, and distributed decisionmaking**
- **Distributed semantics: negotiation of workable shared meanings across time, space, culture, situations, etc.**
- **Flexibility/stability: how/why do some collectives persist and adapt over time in the face of change, and how/why do others dissolve?**
- **Uncertainty: How can we generate processes for cost-effective distributed management of uncertainty and outcome variance?**
- **Sociotechnical impacts on organizational performance: How can we link sociotechnical variables to quantitative organizational performance measures for human-machine organizations?**

Cloud Chamber Metaphor



You record the trace, not the particle!

Organizations, too, leave (recordable and recorded) traces of activity:

**Records,
Documents
Technological links.....**

Organizations can be (are being) instrumented to record such traces (e.g., data warehouses)

Thus COR Links Phenomenology and Theory

View Organizations as dynamic, temporal, spatial:

1. Structures of activity (e.g., process)

2. Structures of knowledge and meaning:

Meanings captured through networks of association

Meanings captured through structure of representations

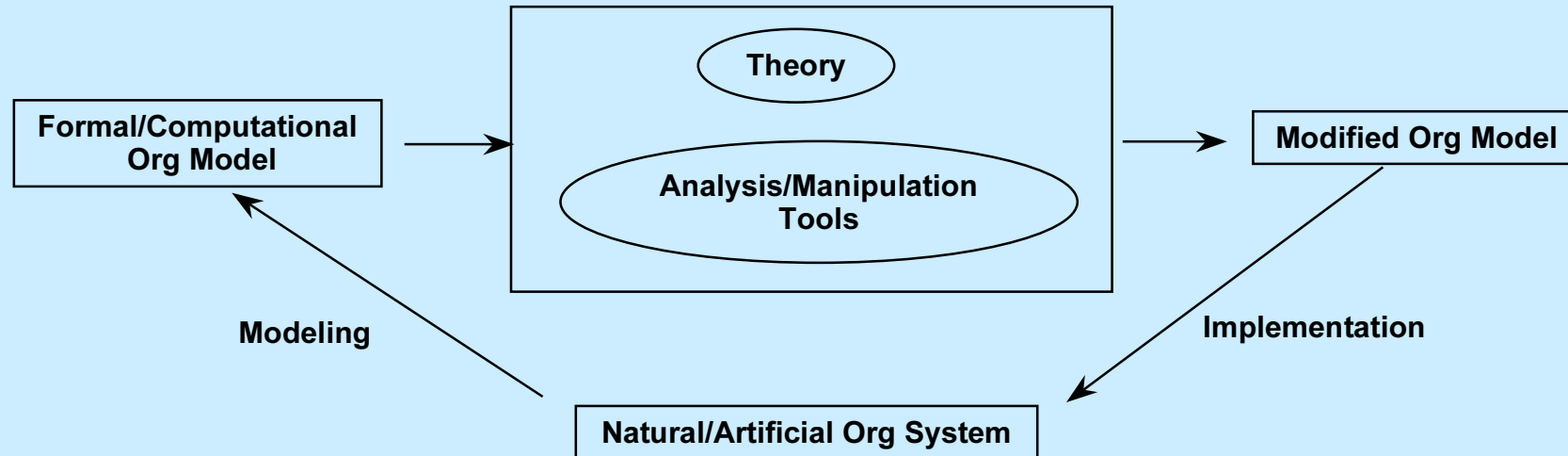
We can now begin to:

1) Recover these structures from traces

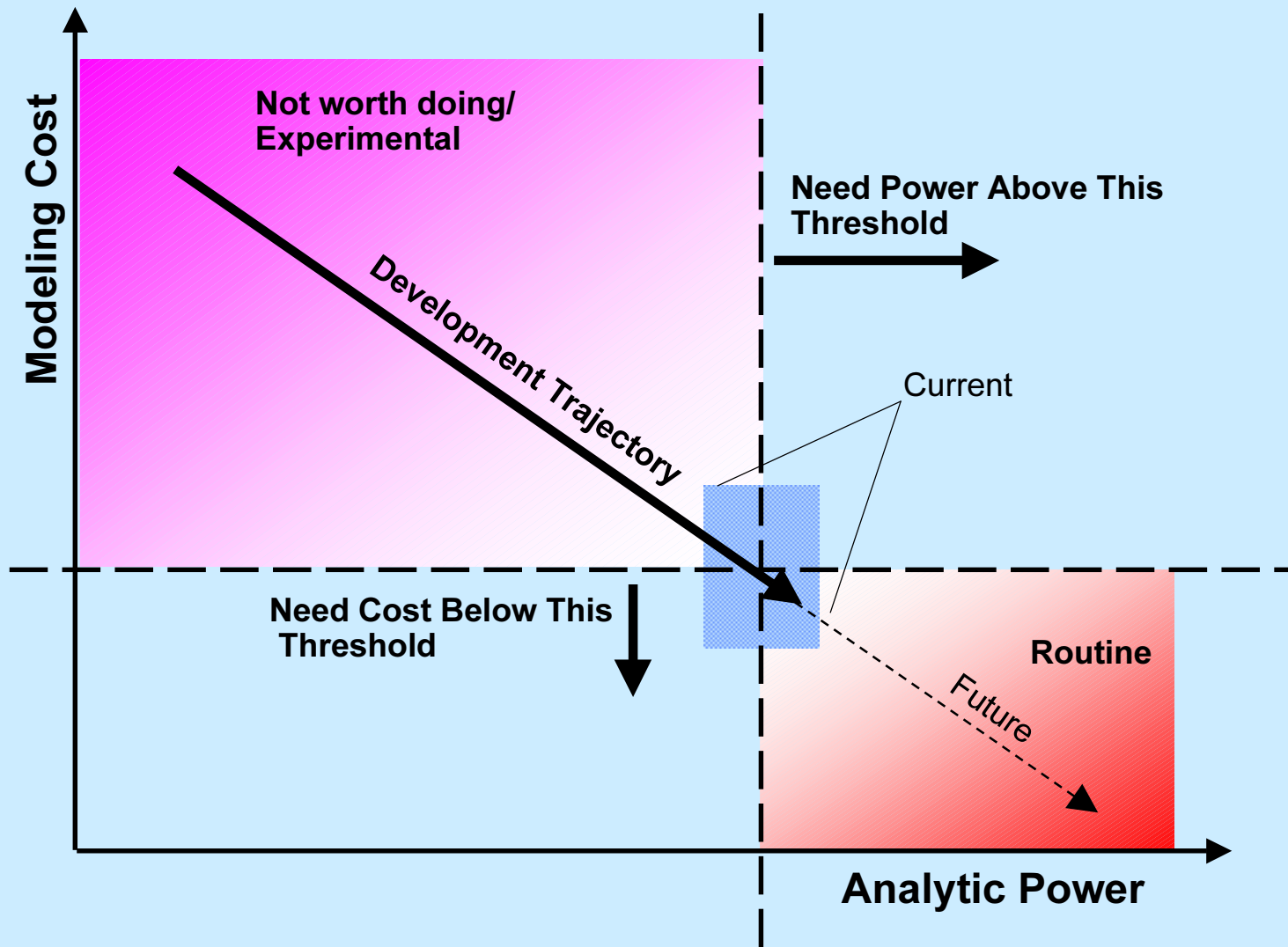
2) Model, simulate, analyze, and design them

3) Link them to other variables for explanation and theory-building

Analytical Process and Assumptions



- **Modelability assumption:** Orgs can be modeled
- **Performance differential assumption:** Org performance can be differentiated.
- **Manipulability assumption:** Org models can be manipulated
- **Designability assumption:** Orgs are designable (as vs evolvable or growable)
- **Practicality assumption:** Models can be reduced to practice (implemented)
- **Pragmatic assumption:** The whole process is cost-effective.



A few examples...

- **VDT/Vite** (Levitt et al.)
- **ACTS/Plural Soar** (Carley, Prietula)
- **CORPS** (Carley)
- **Elm** (Carley)
- **HITOP-A** (Gasser/Majchrzak)
- **Organizational Learning** (Lant, Mezias)
- **I-Know** (N. Contractor)
- **Logical analysis** (M. Masuch)
- **Org Consultant** (Burton/Obel)
- **TAEMS** (Decker, Lesser, et al.)
- **Articulator/Process MetaModel** (Scacchi)
- ***ACTION/TOP Modeler*** (Gasser/Majchrzak)

ACTION/TOP Modeler Overview

**ACTION: 4 year, \$10M University/Industry effort
(USC, National Center for Manufacturing Sciences,
HP, Digital, TI General Motors, +++)**

Ca. 30,000 lines of LISP/C code, Sun Workstations

**35,000 relationships among ca. 1000 elements in 'pluggable'
constraint-based theory-driven analysis design system.**

TOP Modeler: Commercial version of ACTION

**Wintel platforms, Visual Basic. Complete redesign with
database-driven architecture**

Research Themes of ACTION and TOP Modeler:

- 1. Theories of Technology-Organizations-People (TOP) integration**
- 2. TOP-integration design and analysis processes and methodologies**
- 3. Visualization and display of organizations, TOP-integration factors, and TOP-integration relationships from many perspectives**
- 4. Theories of modeling and implementation for 1, 2, and 3.**
 - Qualitative (not numerical/mathematical) models**
 - Object and frame-based representations**
 - Constraint-based representations**
 - Eventually, dynamic process representations**
- 5. Knowledge and mechanisms for explanation, teaching, and learning**
- 6. General mechanisms and frameworks to support 1-5, and that are usable for other MOT-oriented research.**
- 7. Adaptive Processes:**
 - Management of significant distributed, multi-party (Industry-University) project**
 - Team-oriented local management structures**
 - Innovative software development processes (cyclic prototyping)**
 - Concurrent engineering of theory and software.**

³ Joint work with I. Hulthage, B. Leverich, J. Lieb, and A. Majchrzak

Three Pillars of ACTION/TOP Modeler

**Develop Usable Methodology
for Applying Theory to Organization
Analysis, Design, and Development Problems**

**Develop and Integrate Theory for
Analyzing, Designing, and Developing
TOP-Integrated Organizations**

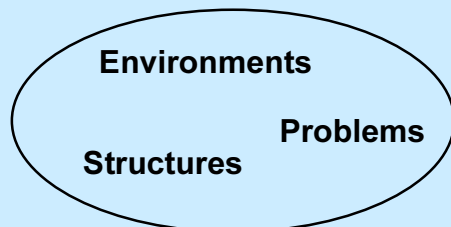
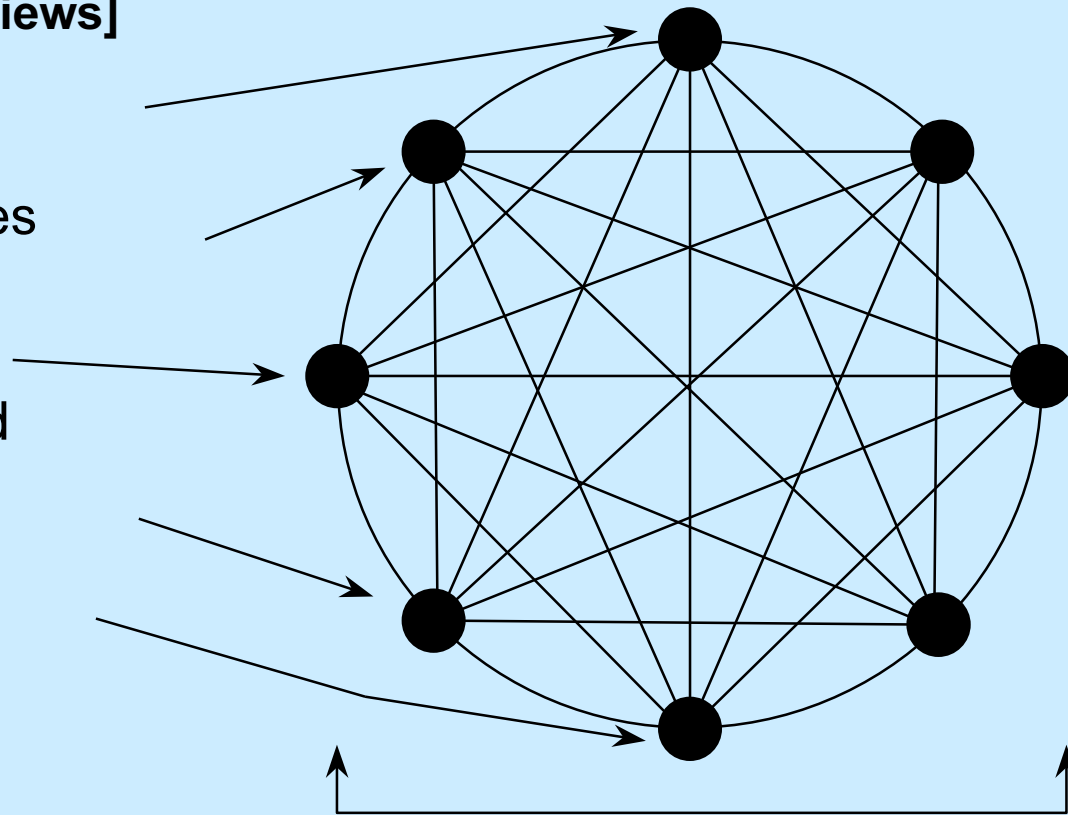
Develop Software to

- 1. Capture Knowledge and Data**
- 2. Manage complexity of Analysis and Design**
- 3. Provide clear, traceable explanations and information**
- 4. Provide a theory development and exploration tool (methods development)**
- 5. Provide teaching and learning assistance and environment**
- 6. Provide reusable modeling tool for other domains**

TOP Modeler Incorporates Multiple Organizational Perspectives

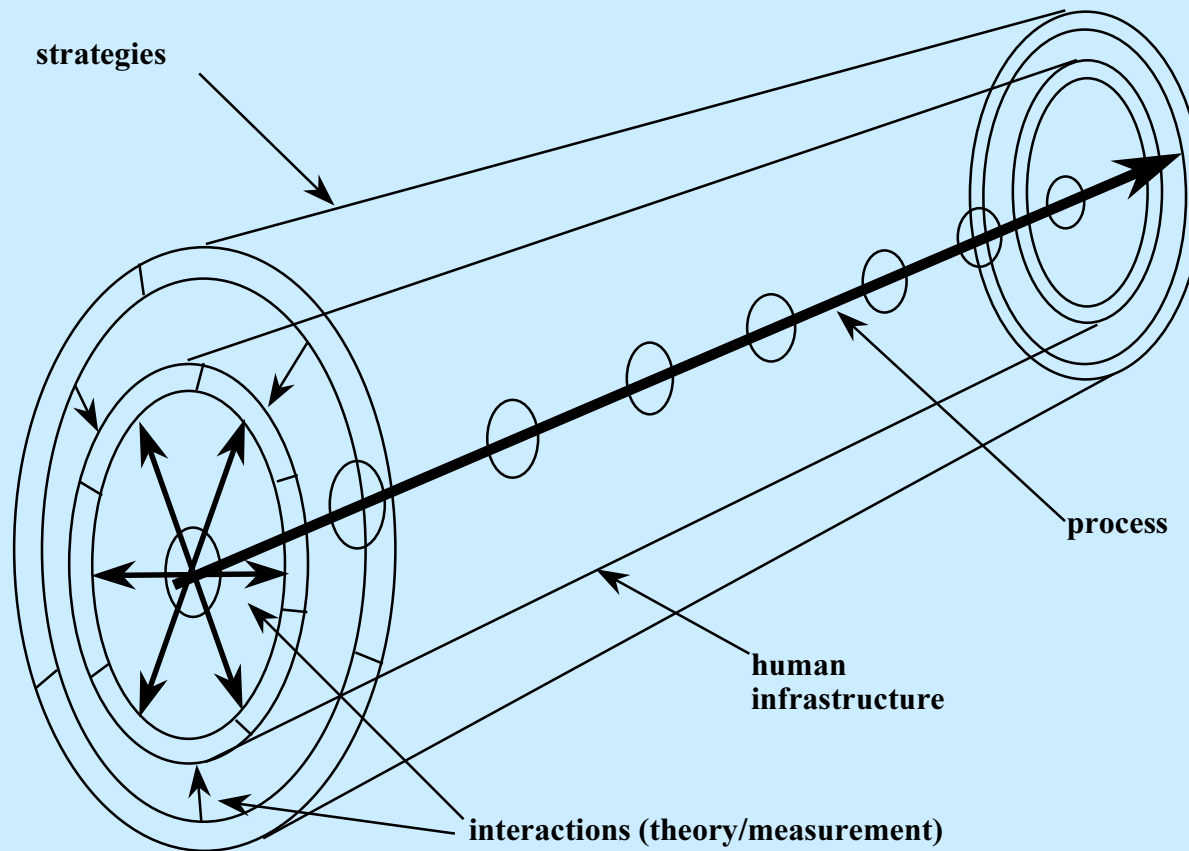
[Organizational meta-views]

- Technology/Process
- Economics/Resources
- Power/Authority
- Performance/Reward
- External Relations
- +++

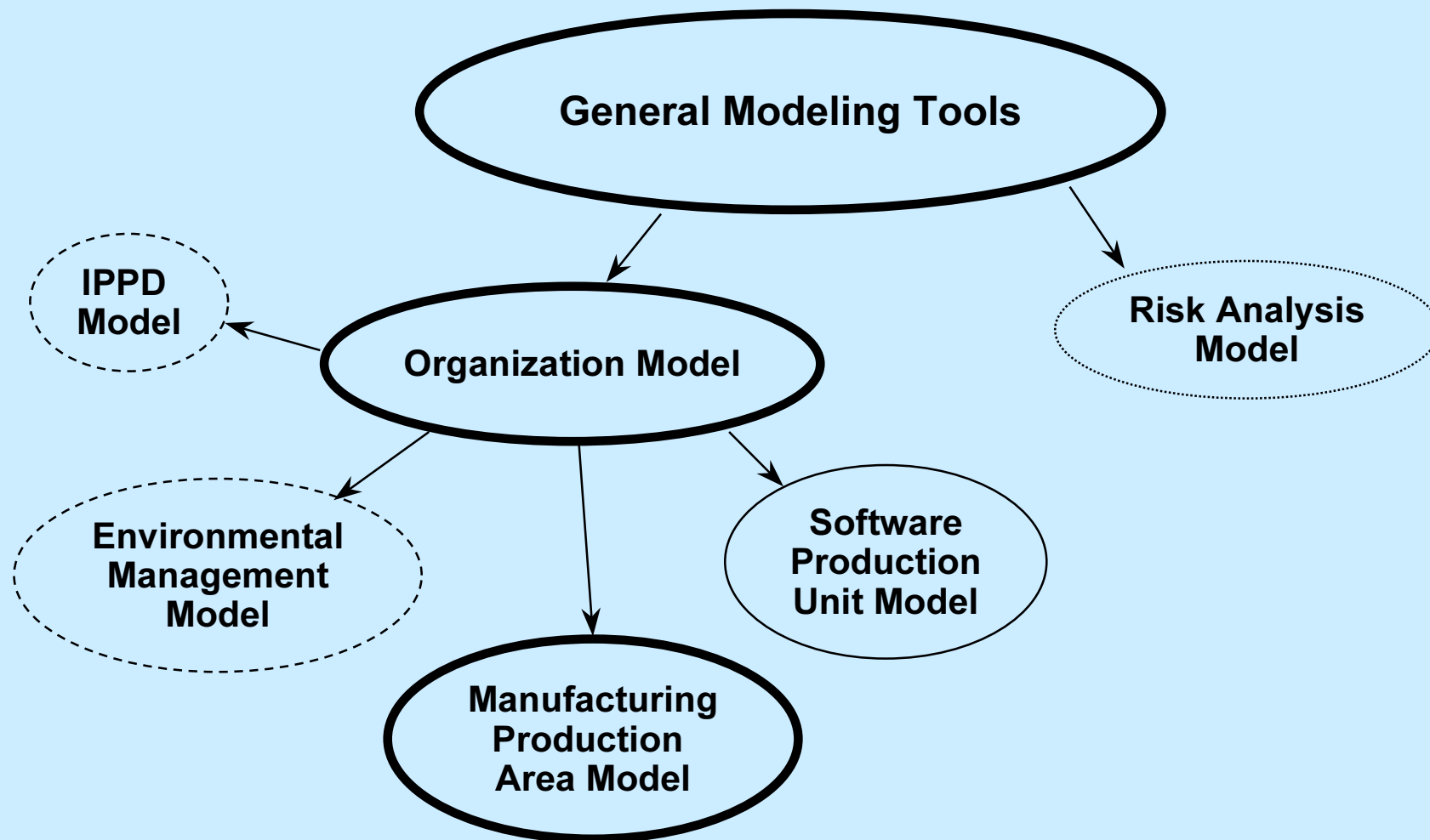


An (Integrative) Organization Theory

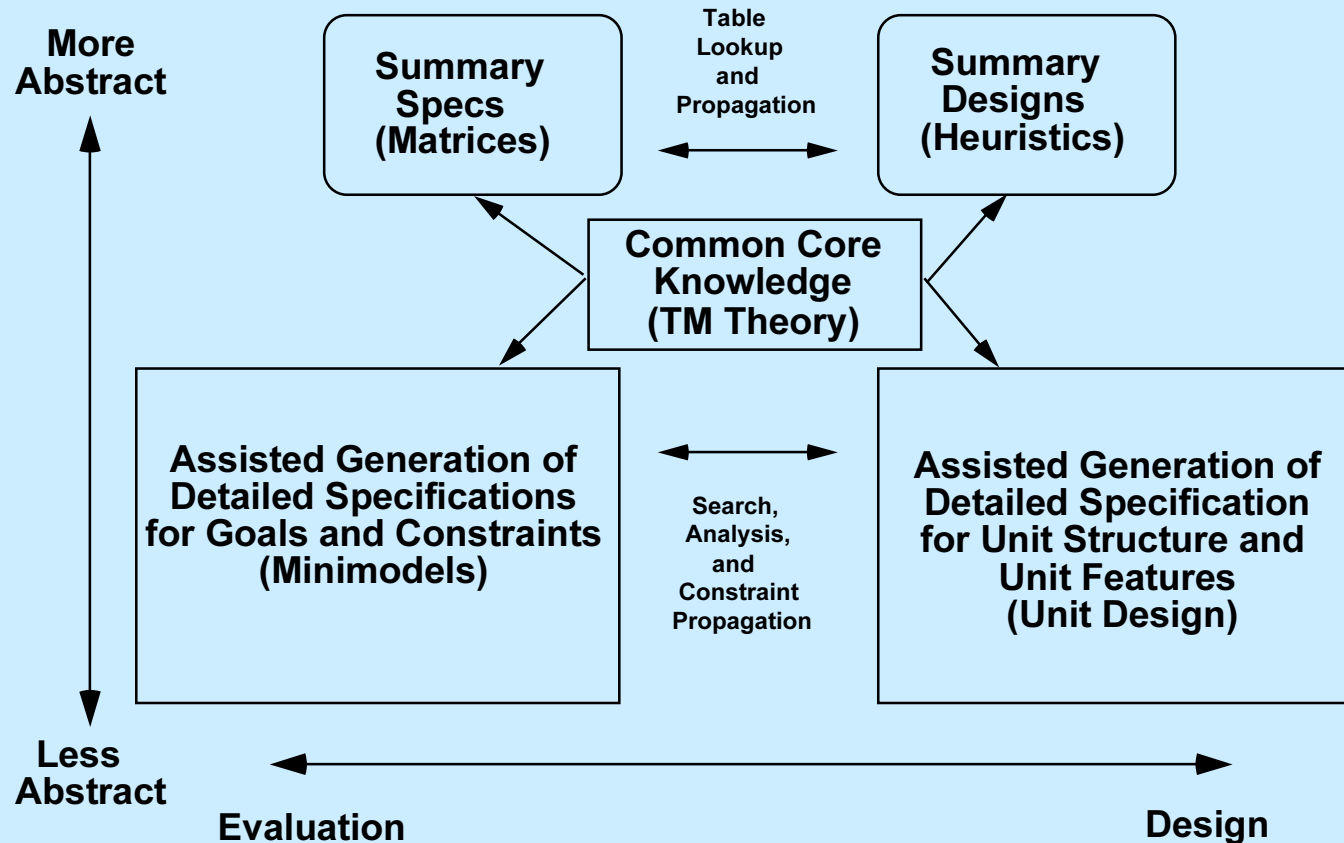
TOP Modeler's Organization Model



ACTION's Modeling Layers



TOP Modeler Views TOP-Integration at Several Abstraction Levels



TOP Modeler

Help Print Close

Histogram

Align
Norms

Align
Skills

Align
Customer Involvement

Align
Activities

Align
Business Objectives

Ideal System

Align
Process Variances

Align
Organization Values

Align
Employee Values

Align
Empowerment Characteristics

Align
General Technology Characteristics

Align
Production Process

Align
Performance Measures and Rewards

Align
Information Resource

Technological Perspective

Organizations as social technologies for solving complex problems, for overcoming “individual” limitations (cognitive, physical, temporal, institutional...), and as efficiency/optimization strategies.

Pursuit Game

Four problem solvers attempt to surround a target.

Each agent performs Moving Target Search.

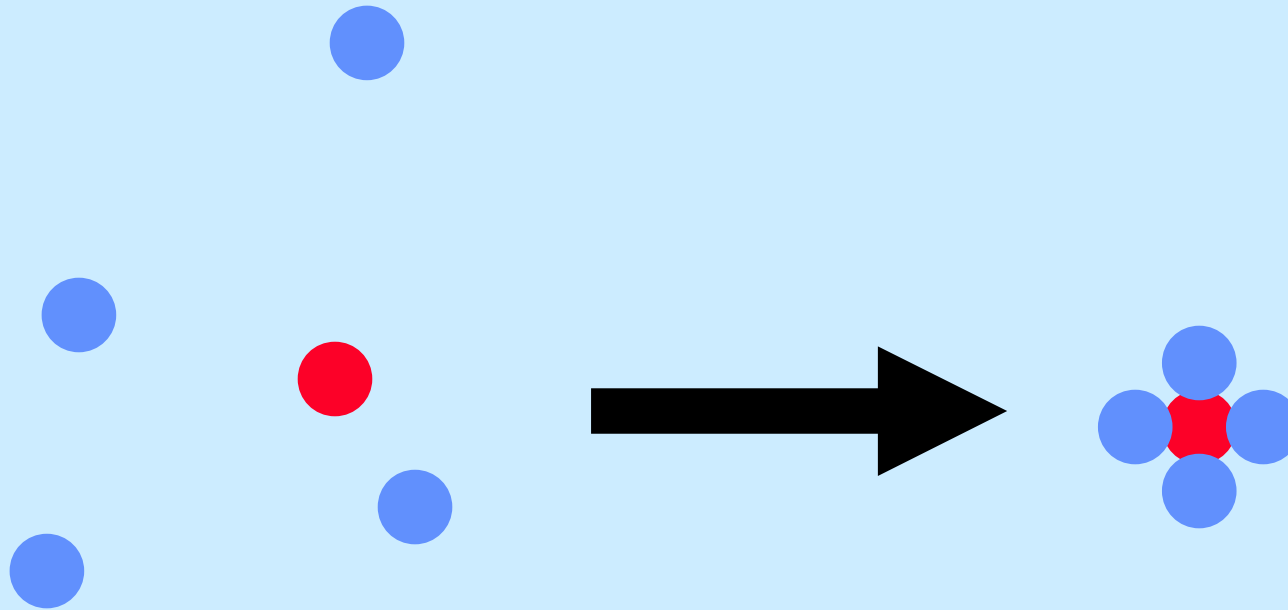


Goal = *Left \wedge Right \wedge Top \wedge Bottom*

Organization = { (*Left, Agent-1*), (*Right, Agent-2*)
(*Top, Agent-3*), (*Bottom, Agent-4*)} }

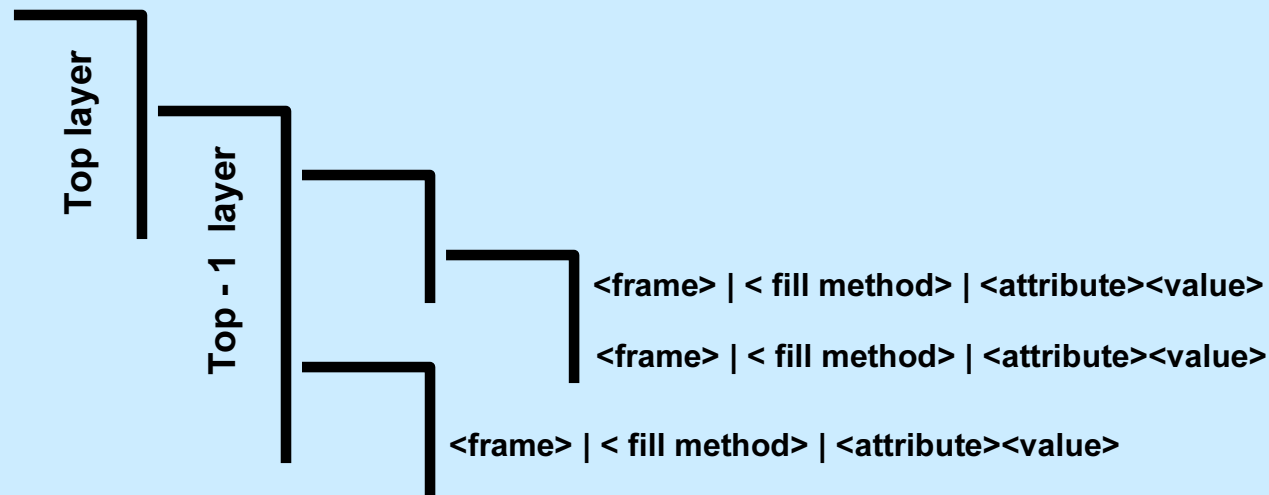
The smallest problem which requires reorganization during the problem solving process.

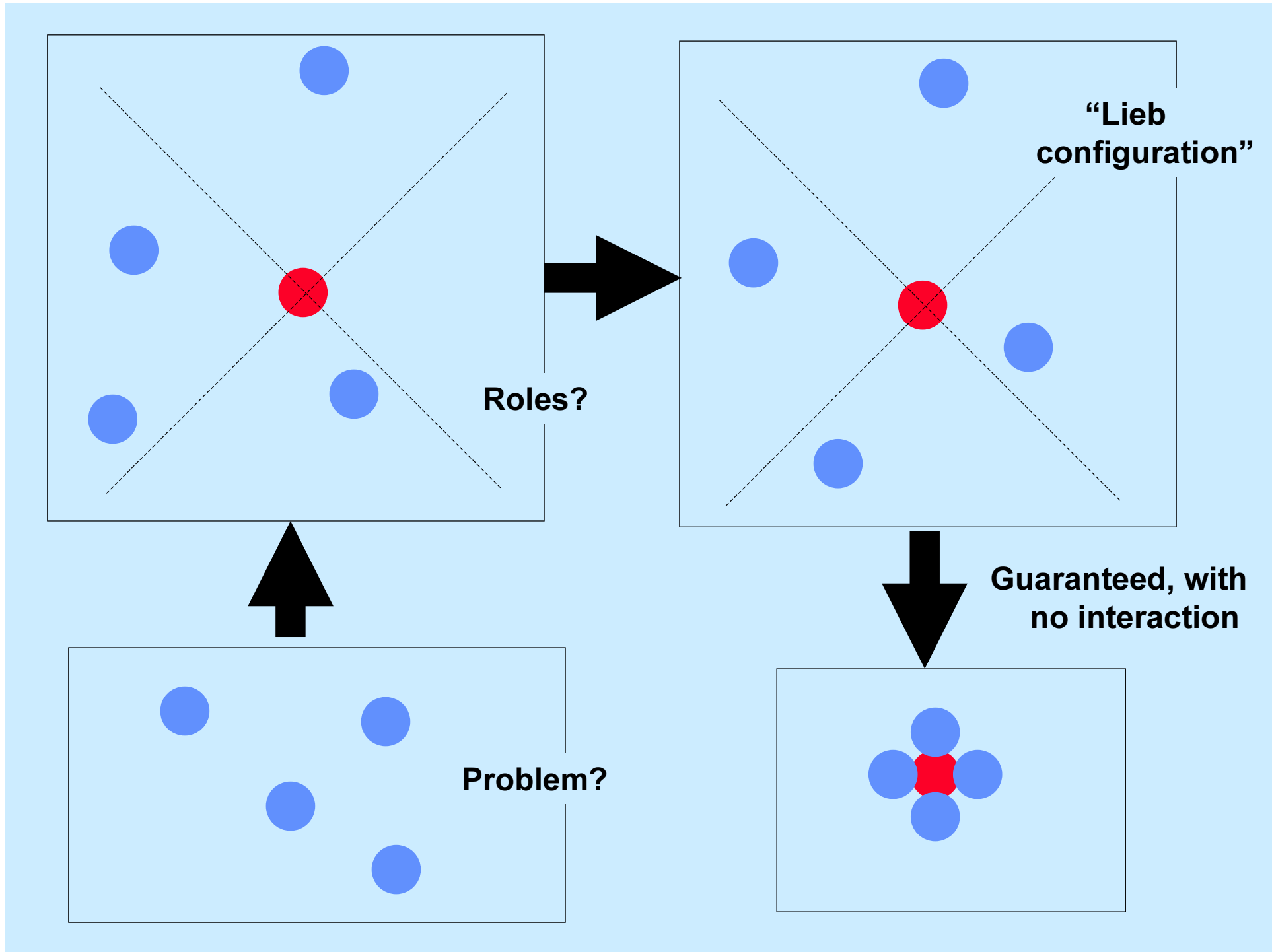
Organizations as Settled and Unsettled Questions ***(Gasser, Rouquette, Hill, and Lieb)***



Basic model of knowledge and action:

- Problem structure is cascaded layers of knowledge
- Problem solving = filling slots in frames that represent cascaded problem structure
- Unfilled slot contains a fill method: “how to settle this question”.
- Situation change causes slots to become unwound/unfilled





Time & Roles in Organization

Basic model of knowledge and action:

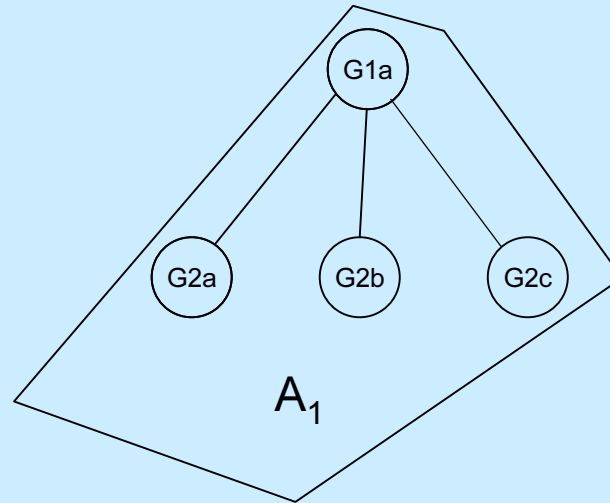
Heuristic decision-making and action under uncertainty

Organization:

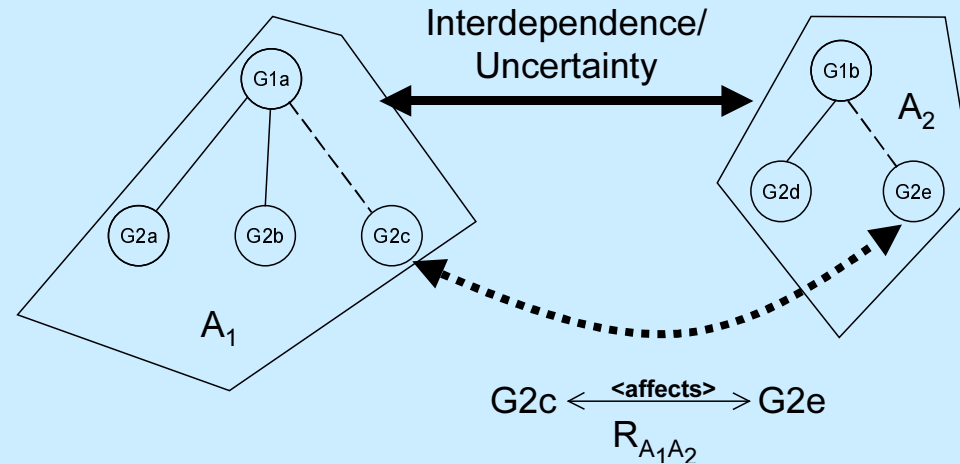
Long-term temporal commitment to classes of control choice in agents (each agent has a “role” that is known by other agents and used to structure their control choices).

“Long-term” = committed to continue over many action/communication cycles, so that organization is i) implicit and ii) based on commitment

Representing Organization as Time & Roles



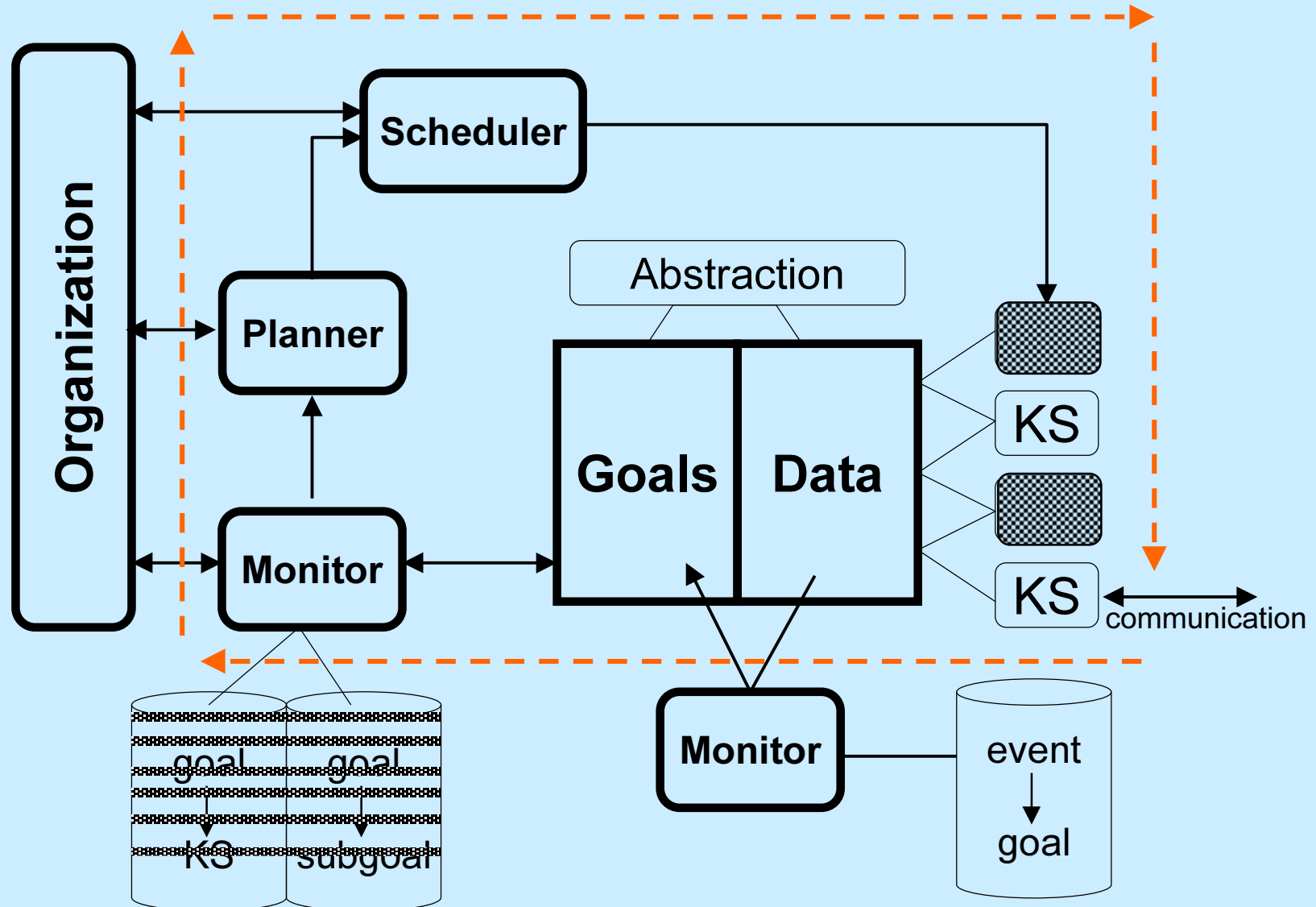
1. Agent A_i has N_{A_i} potential actions (e.g., goals to achieve)
($N_{A_1} = 3$ in this example)
2. Choice in the absence of knowledge is effectively random ($1/ N_{A_i}$)
3. Knowledge could be e.g., refined success probability and/or utility
Success Probability $P_{A_i}(G_j)$, from some distribution $0 \leq P \leq 1$
Utility $U_{A_i}(G_j)$
Expected Utility $E_{A_i}(G_j) = P_{A_i}(G_j) * U_{A_i}(G_j)$
4. Rational Choice is $\max_j[E_{A_i}(G_j)]$



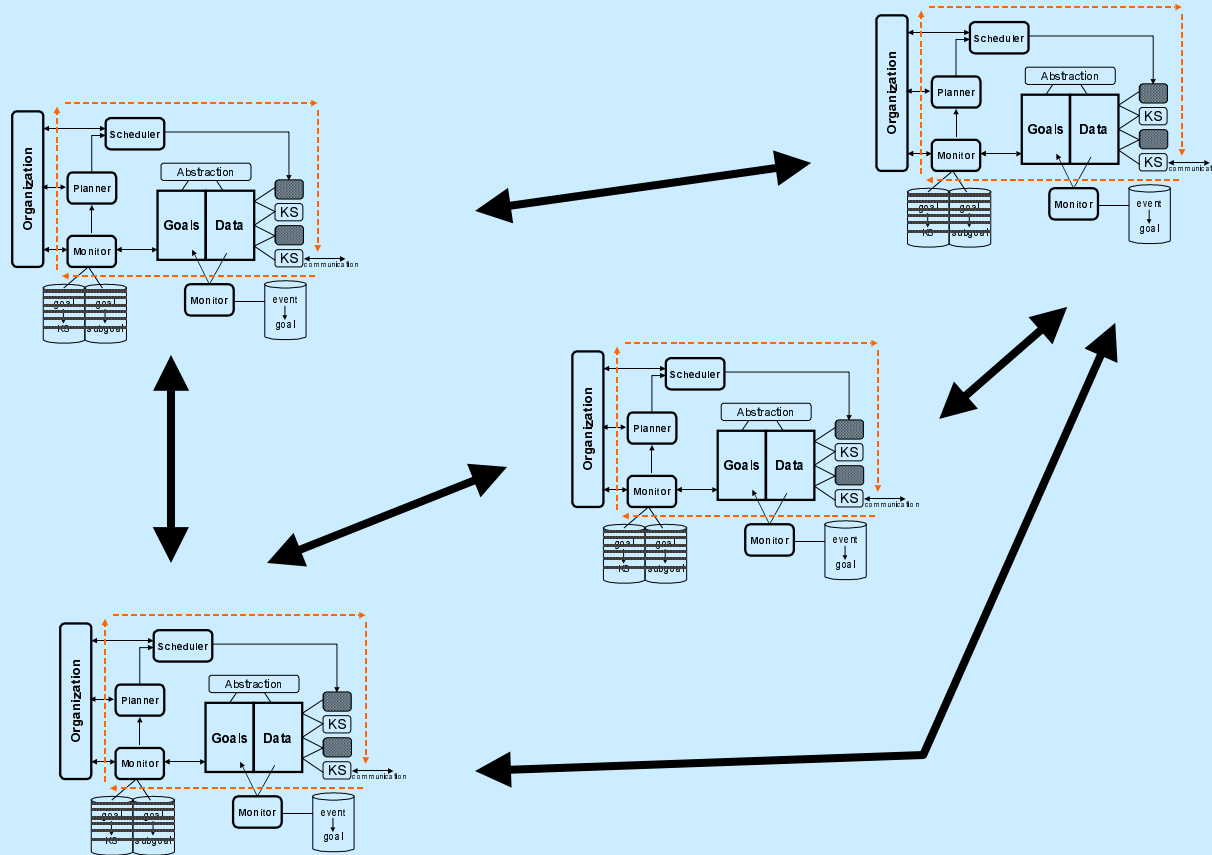
1. In the presence of A_2 and relation $R_{A_1A_2}$ there are still $N_{A_1} * N_{A_2}$ potential *joint* actions. Again, without knowledge this (joint) choice is $1/ [N_{A_1} * N_{A_2}]$. For each agent A_i this choice with (local) knowledge is $\text{Max}(E_{A_i}(G_j))$. Local choice may not be globally good.
2. Moreover, $R_{A_1A_2}$ means that $E(G_{2e}) = P(G_{2e}|G_{2c}) * U(G_{2e})$ and $E(G_{2c}) = P(G_{2c}|G_{2e}) * U(G_{2c})$. Without knowledge of each other, neither agent knows the other's probabilities or utilities. Thus i) each agent A_i can do no better than guessing that A_j 's choice is random, and ii) the expected utility of achieving each goal implicated in $R_{A_1A_2}$ isn't known.
3. ***Organization is the collective knowledge of biases in these probabilities, i.e., structured collective choice.***
(needn't be long-term ala Lesser...)

Implementing Organization as Time & Roles

(Durfee, Lesser and Corkill)



Implementing Organization as Time & Roles



Division of Activity Types...
& Coordination....

....but no adaptation

Organizational Adaptation

Principle: Effective Global Control is based on Global Knowledge

Process (Diagnosis/Repair):

Measure & monitor (global) organizational performance

Detect undesirable organizational performance

Diagnose causes *

Use causal model to refine organizational model *

Implement new organization (e.g., by revising roles[#])

→ “Organization Self-Design”

Note direct dependence on the organization model

Adaptive Organizations

(Ishida, Gasser, Yokoo)

Problem:

How to design an organizational MAS in which agents and organization *mutually construct each other*, and which demonstrates practical utility for optimization.

Theoretical Import:

Computational account of mechanisms for adaptive organization

Computational account of mutual construction process

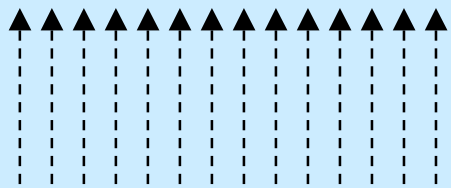
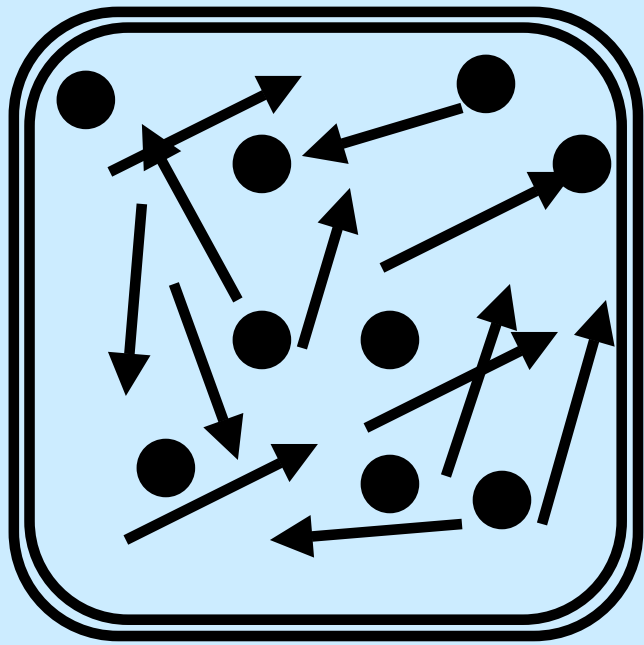
Practical Import:

Dynamic optimization of resource use and knowledge distribution

Progress:

Architecture and simulations completed (1991; 2001); Proof of concept demonstrations; limits explored;

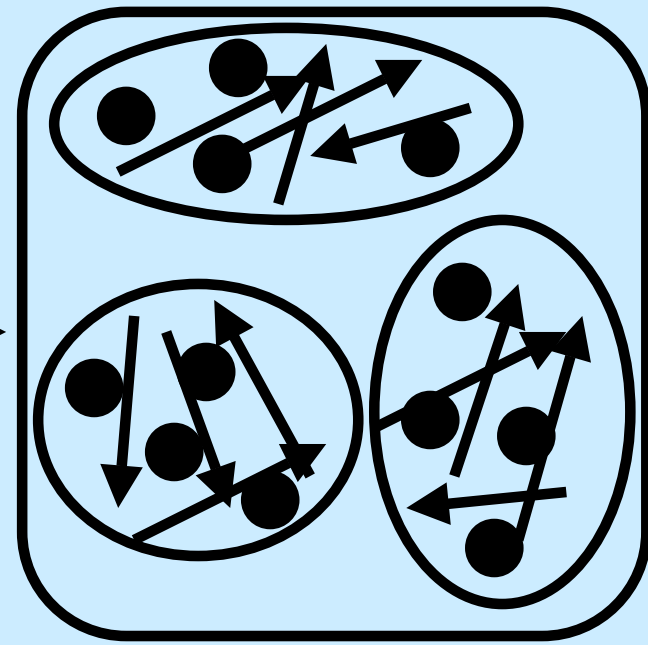
Organizational Adaptability from Emergent Agents (Detailed case)



Environmental demand



Reorganization



**Agents emerge;
performance improves;
implicit organizational
learning**

Organization Self-Design

The study of how multiple agents develop an efficient problem solving organization.

Problem solving organization:

The result of problem decomposition and load balancing

Load Balancing Techniques

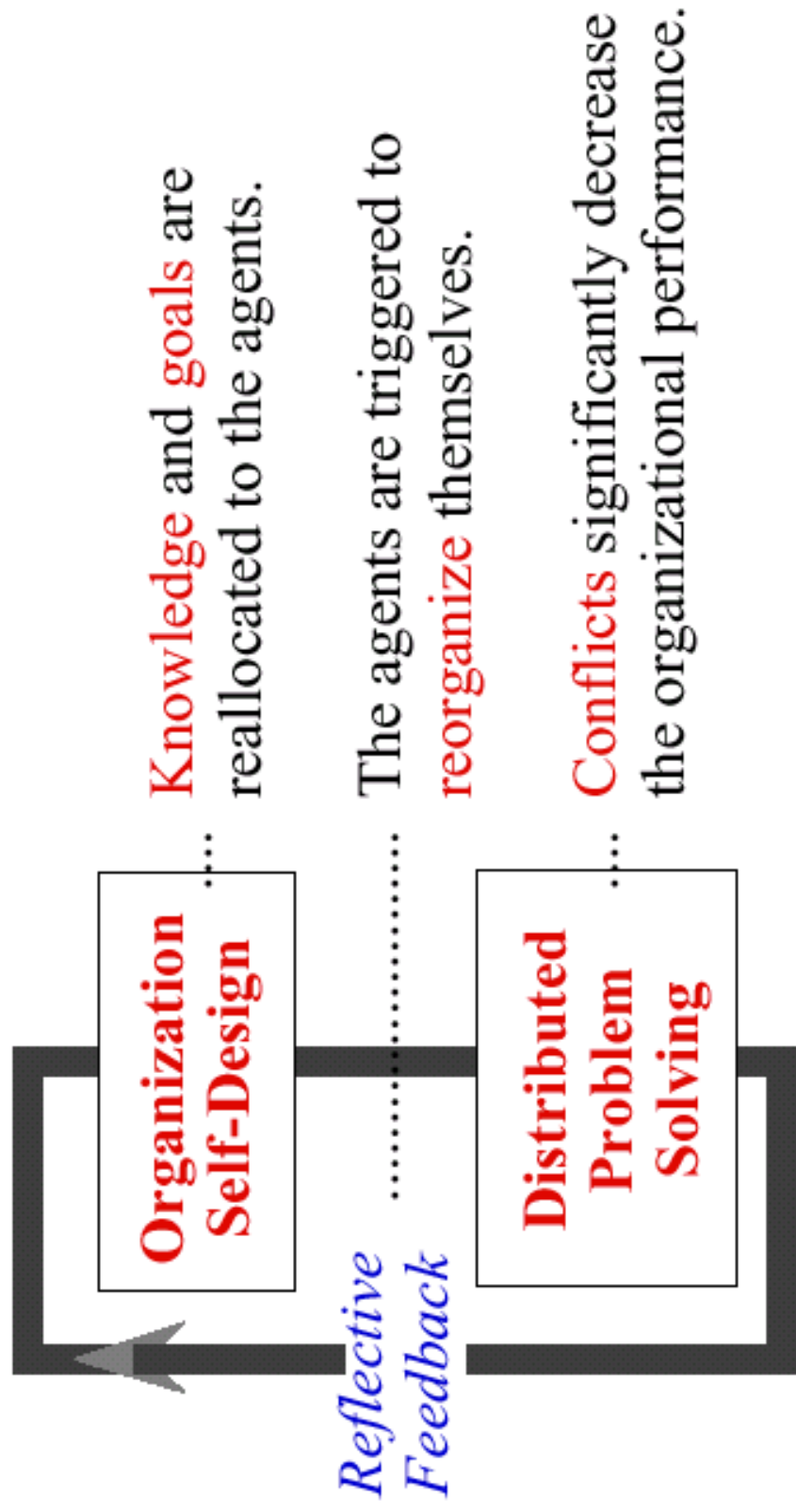
1) Goal Assignment

To distribute multiple subgoals into multiple agents and balance their load.

2) Knowledge Assignment

To distribute problem solving skills by assigning relevant knowledge to multiple agents.

Organizational Problem Solving



Organizational Production System (Overview)

Parallel Production Systems

Multiple rules are fired in parallel,
but are globally synchronized.

Distributed Production Systems

Multiple agents asynchronously fire
multiple rules in parallel.

**Organization
Self-Design**

Continuous reorganization is performed
by the collection of distributed agents.

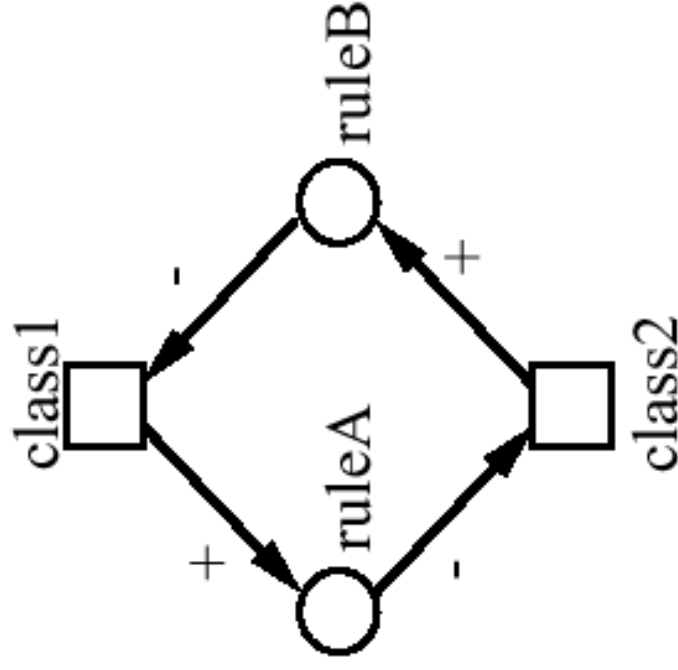
Adaptive Real-Time Production Systems

Interrelationships between Rules

1. Data dependency relationships
2. Interference relationships

(p ruleA
(class1 ...)
-->
(remove class2))

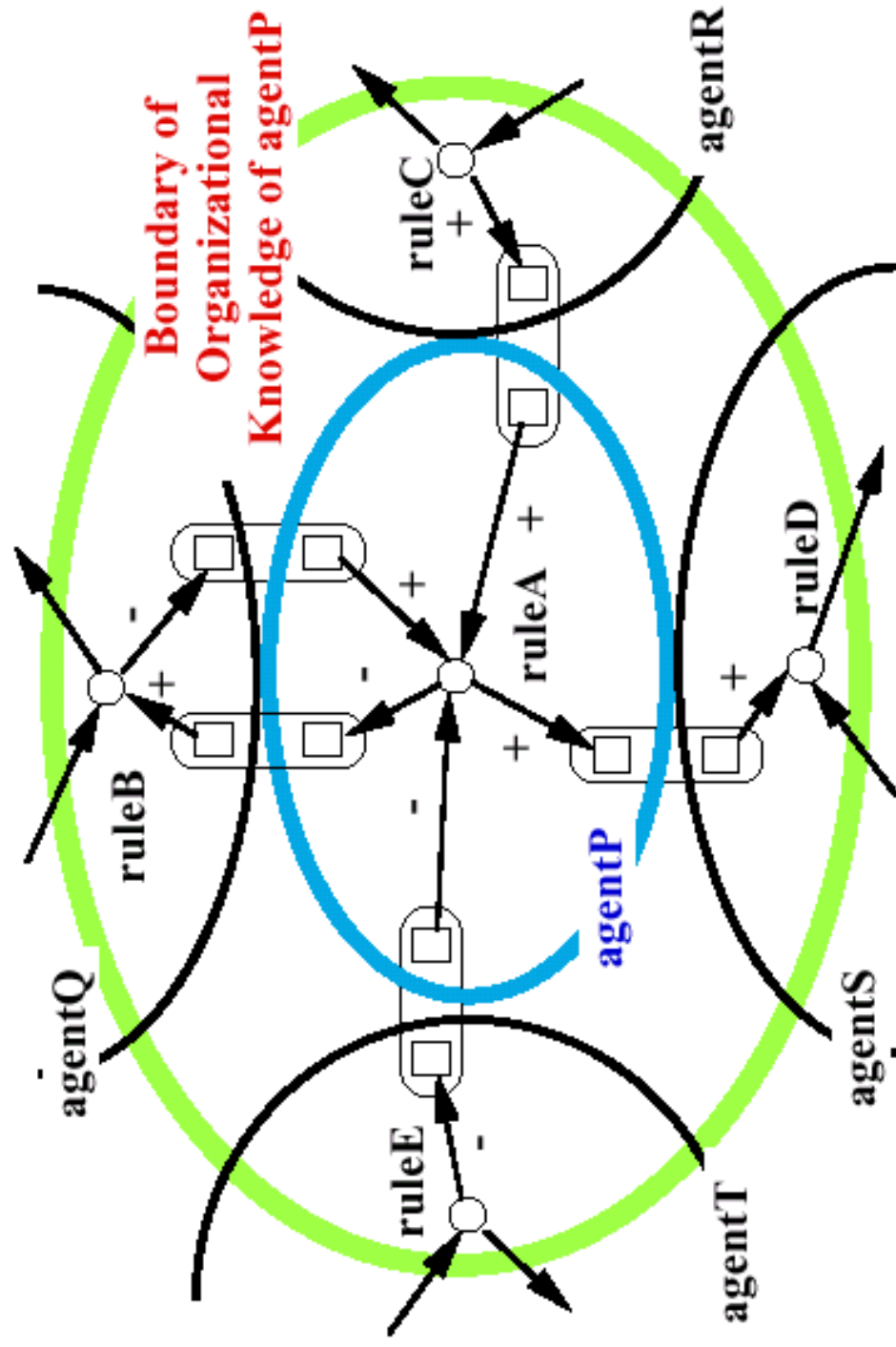
(p ruleB
(class2 ...)
-->
(remove class1))



Production Rule

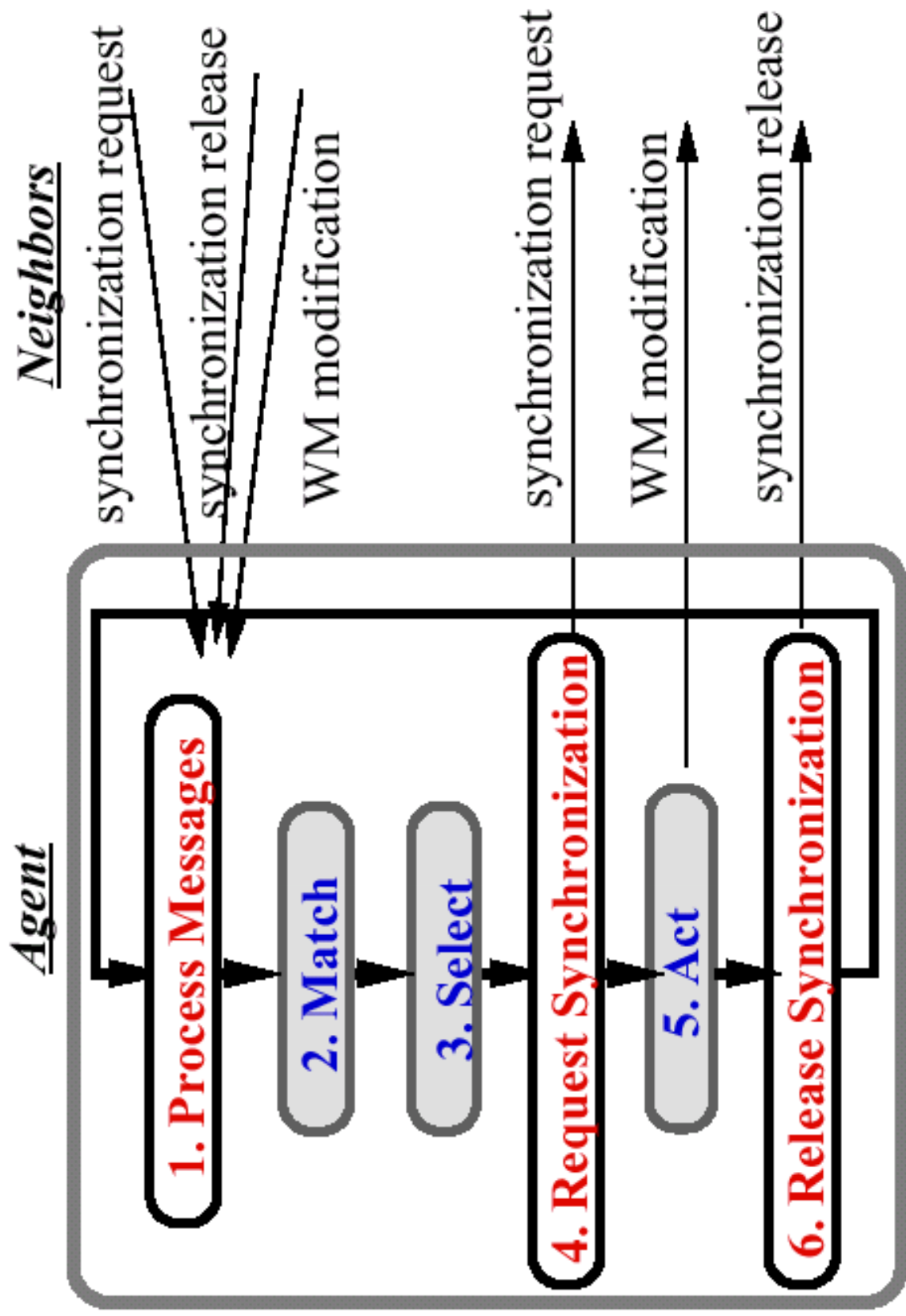
Data-Dependency Graph

Organizational Knowledge

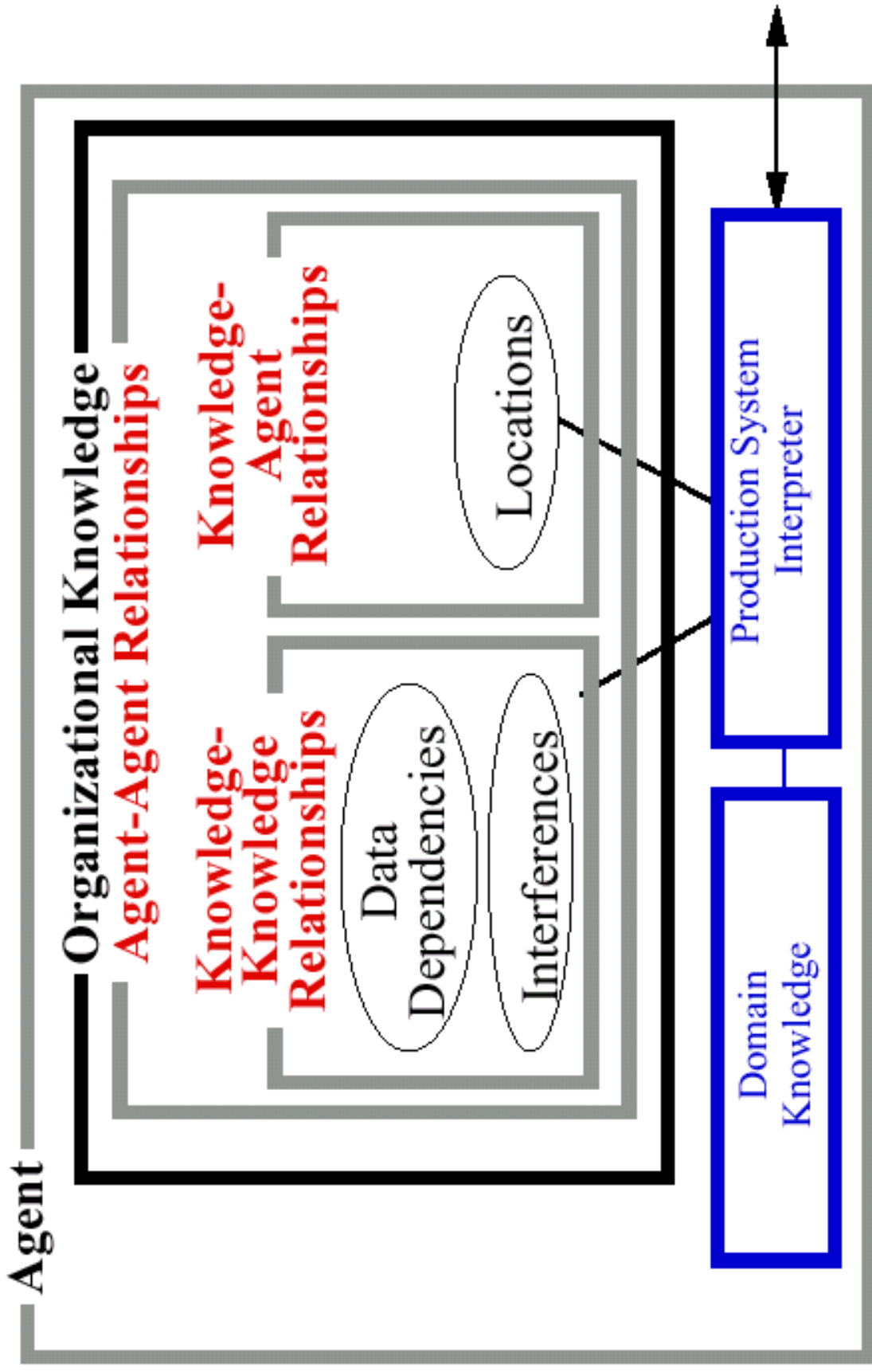


Complete organizational knowledge is not necessary for each agent

Problem Solving Cycle



Distributed Production System Agent



Organizational Production System

Assumption

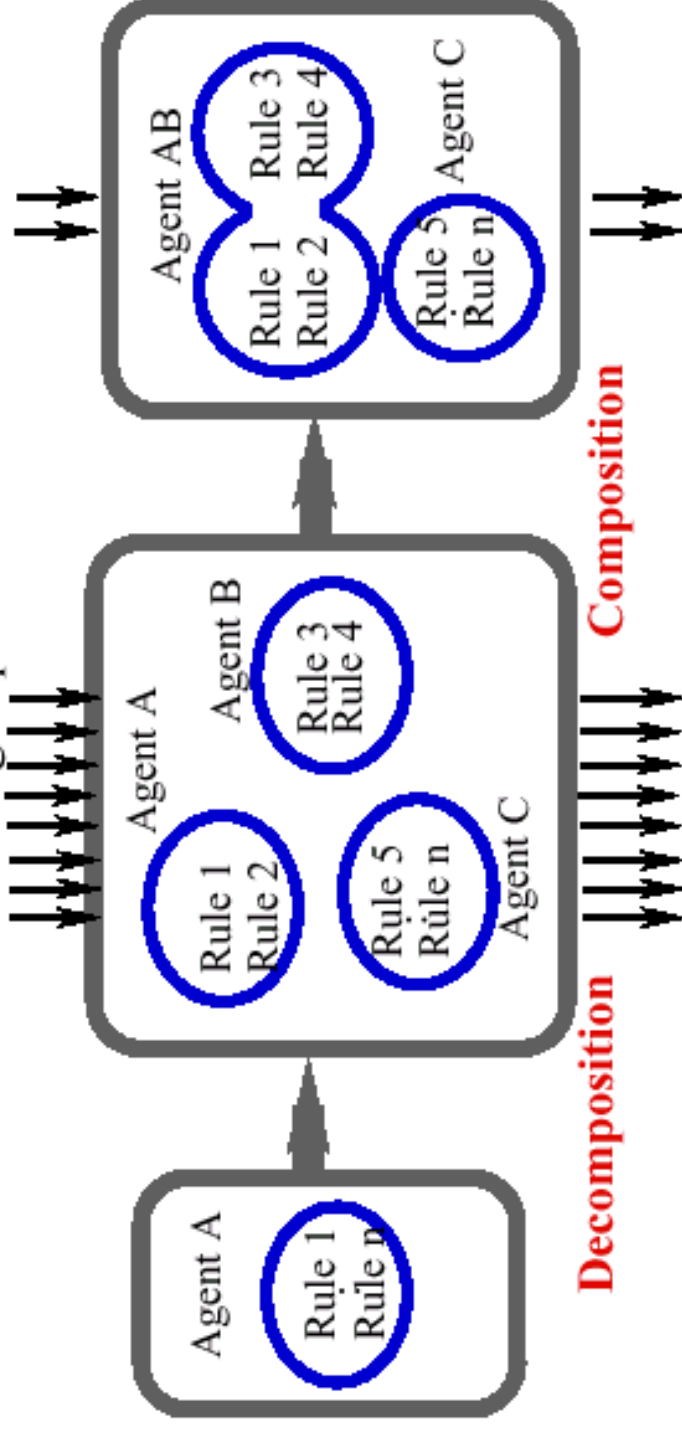
A particular organization shares a collection of parallel processors with other organizations.

To satisfy real-time constraints

To efficiently utilize processor resources

Goals

Problem solving requests arrive at variable rates.



Results are required within a predefined time-limit.

Reorganization Primitives

The behavior of the organization is continuously observed

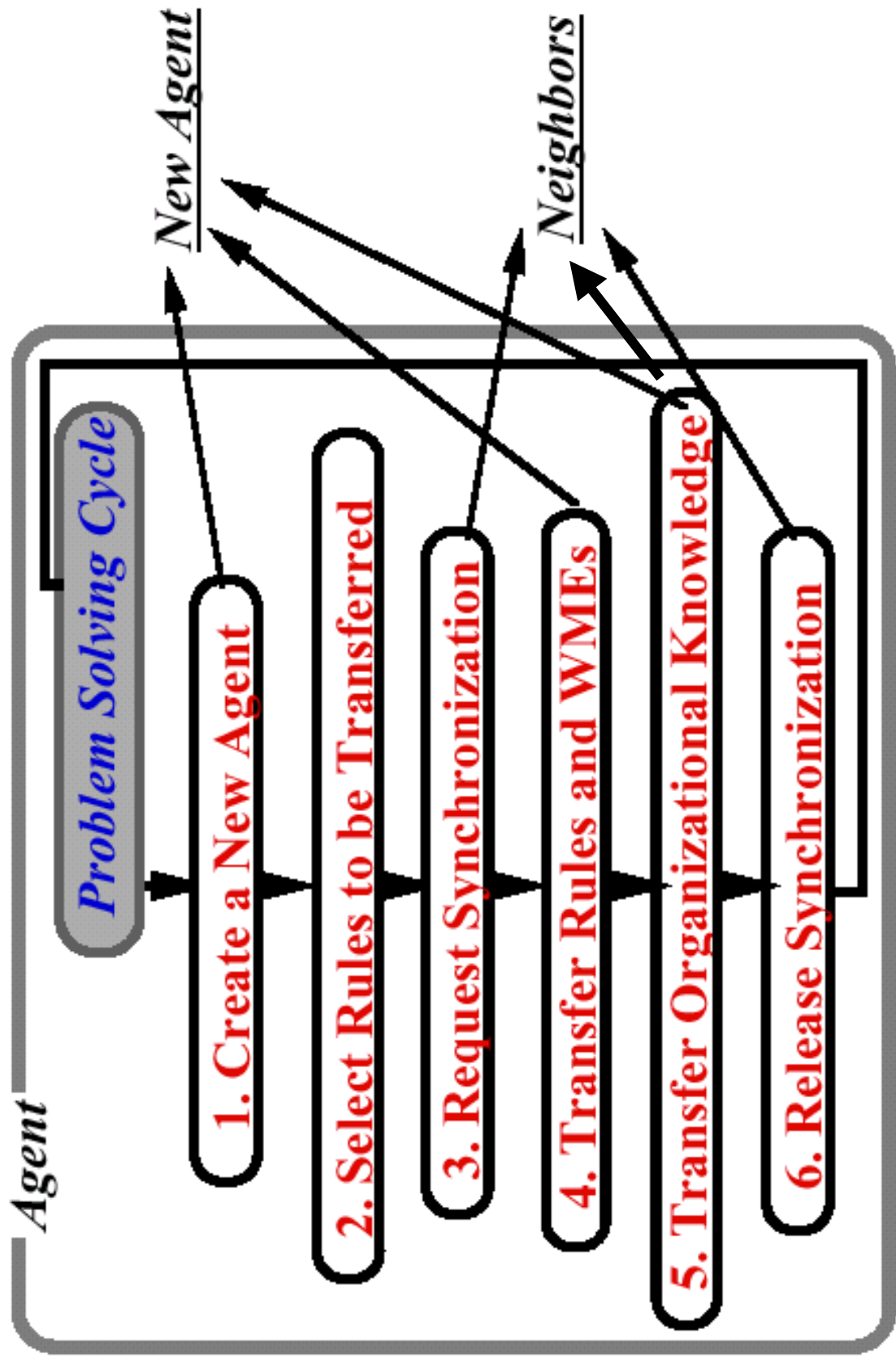
Decomposition

- When:** The organization cannot meet deadlines.
- Effect:** Initiate the dividing of heavily-loaded agents.
- Until:** Parallelism increases, and response-times are shortened.

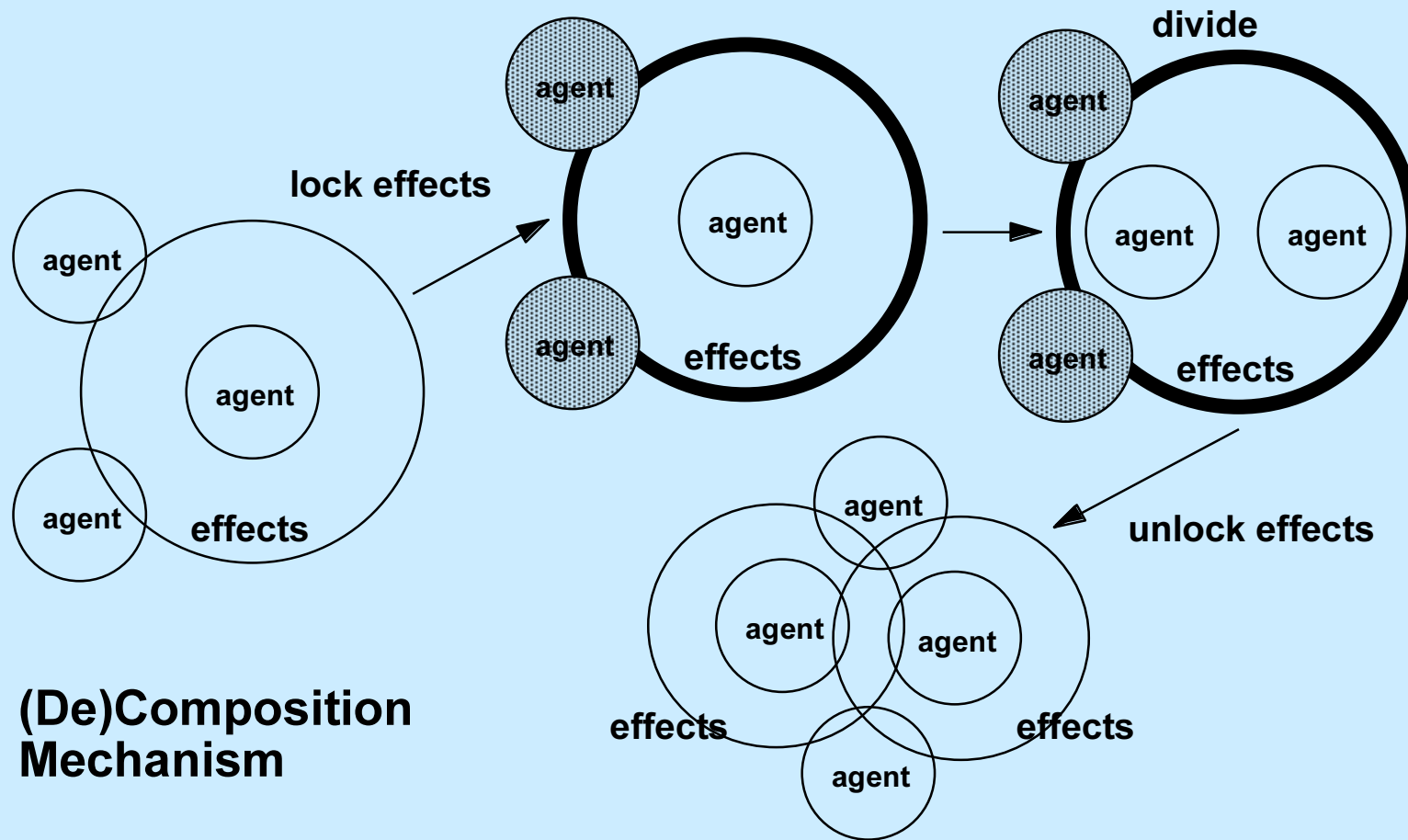
Composition

- When:** The organization-wide load is light.
- Effect:** Initiate the combination of lightly-loaded agents.
- Until:** The organization's load increases.

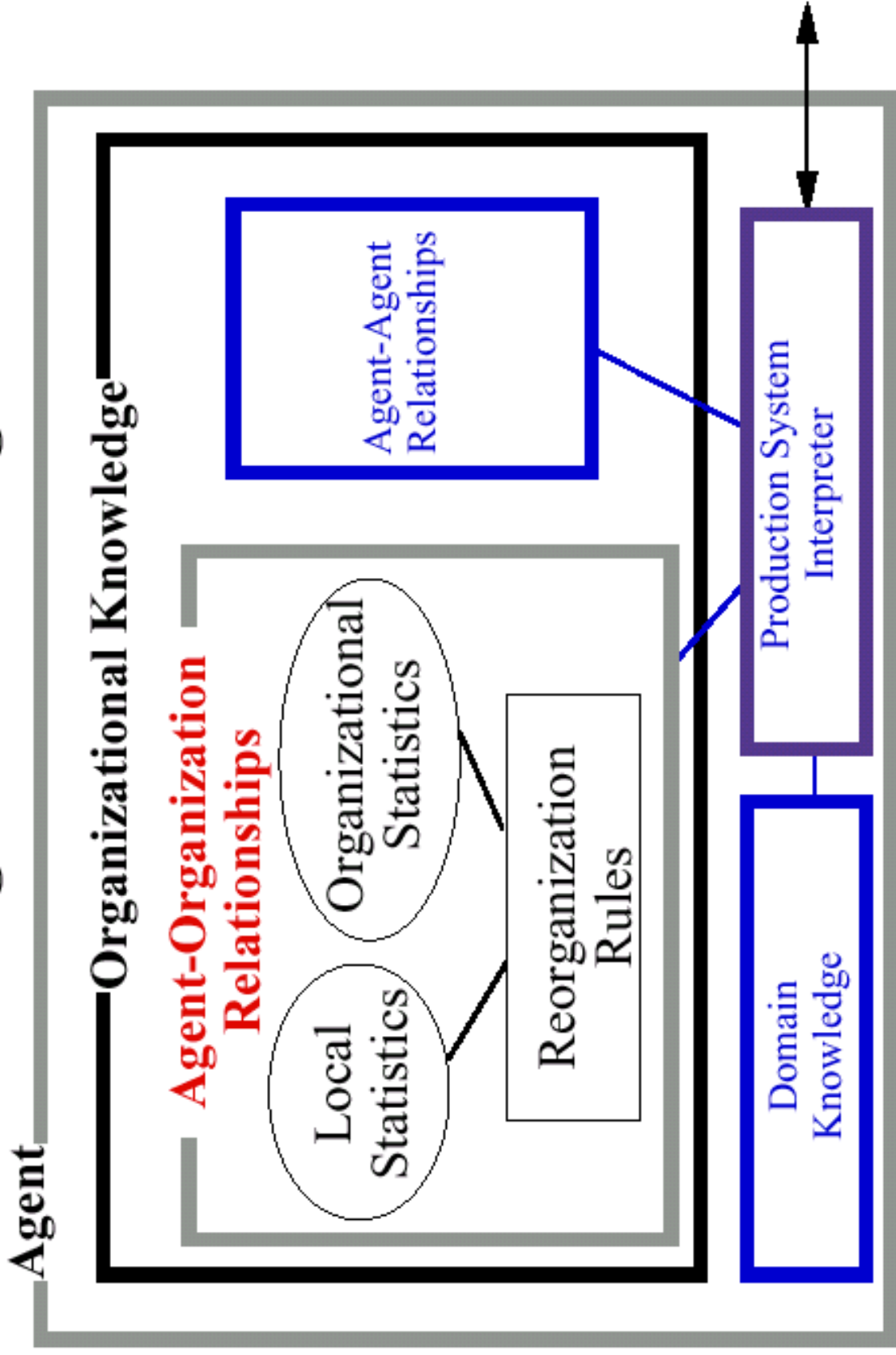
Decomposition Process



Reorganization Process



Organizational Agent



Simulation

Problem

Waltz Labeling Problem: 36 rules, 80 rule firings

Problem Solving

Initial State: One agent with complete knowledge

Request Processing: First-come First-served

Load Estimation: Firing-ratio = Rule firings / Cycles

Reorganization Parameters

Decomposition:

When: Time limit = 20 cycles

Who: Firing-ratio > 80%

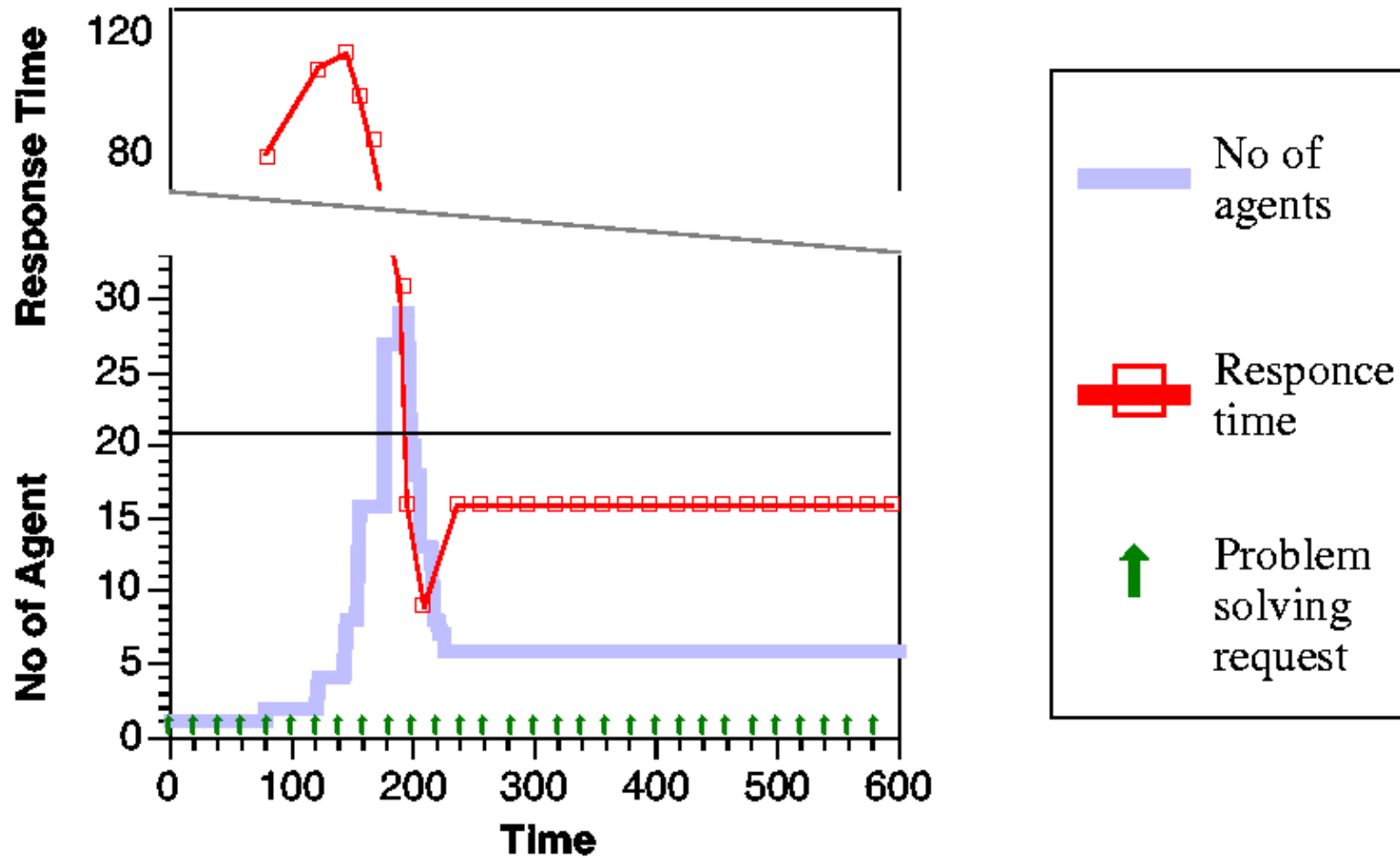
How: Rules are arbitrarily divided

Composition:

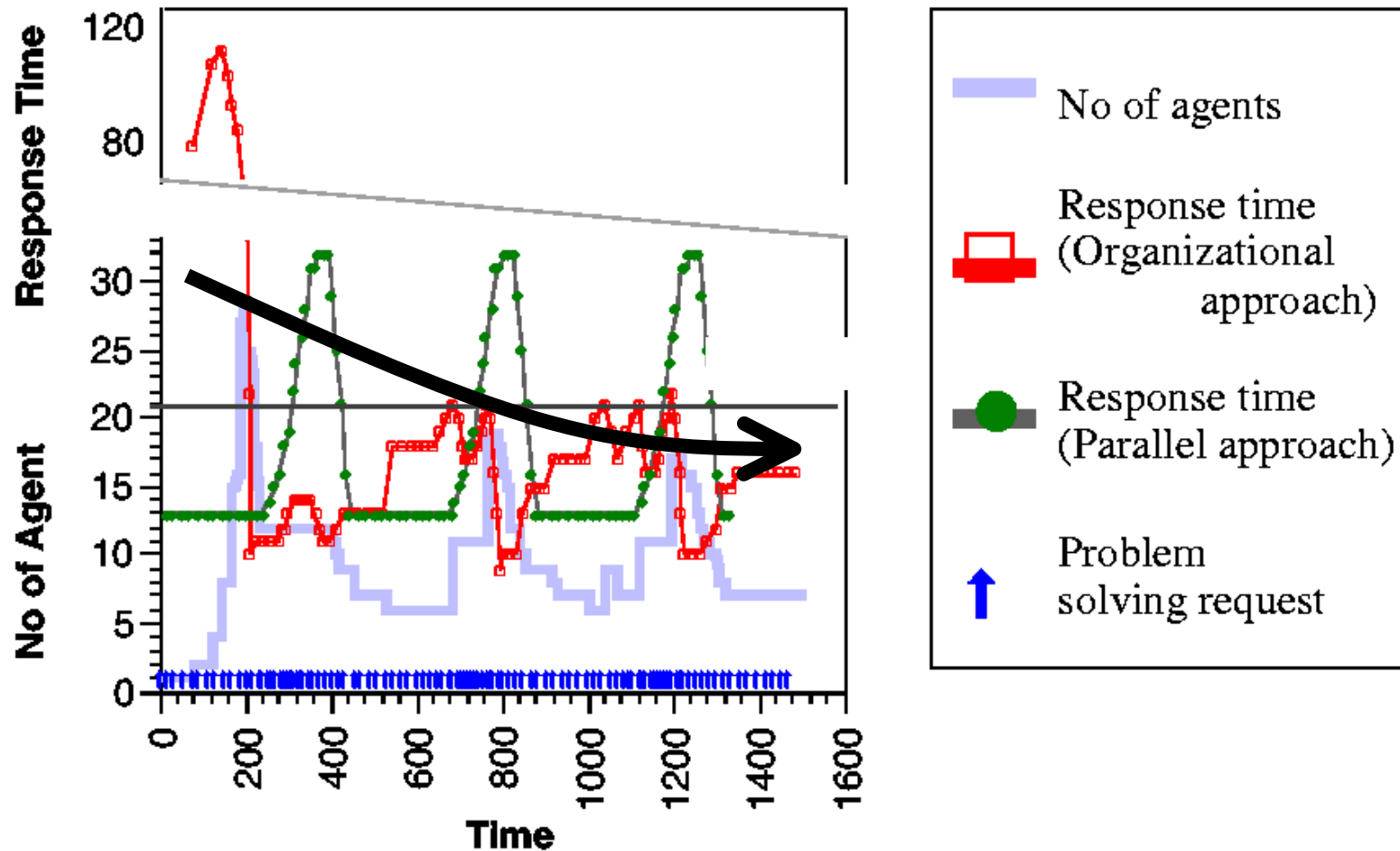
When: Organization-wide firing-ratio < 60%

Who: Firing-ratio < 30%

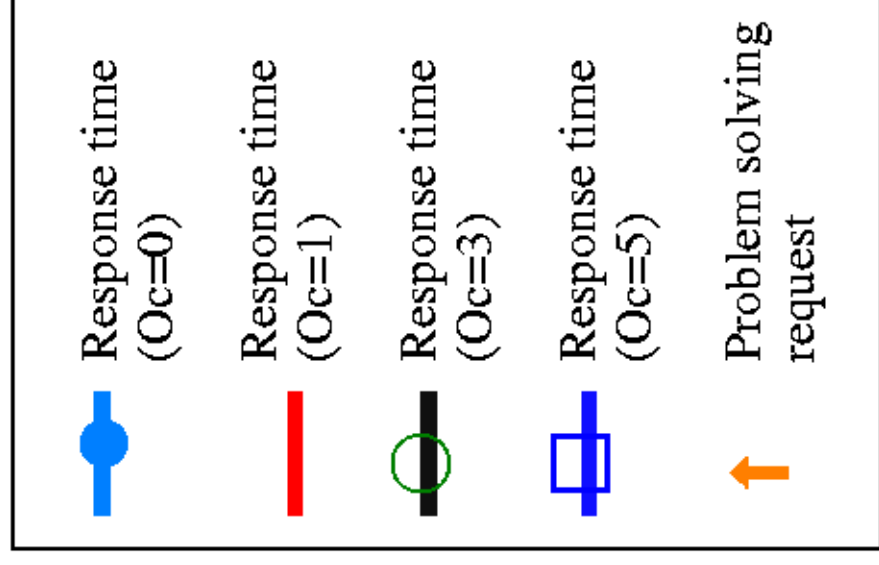
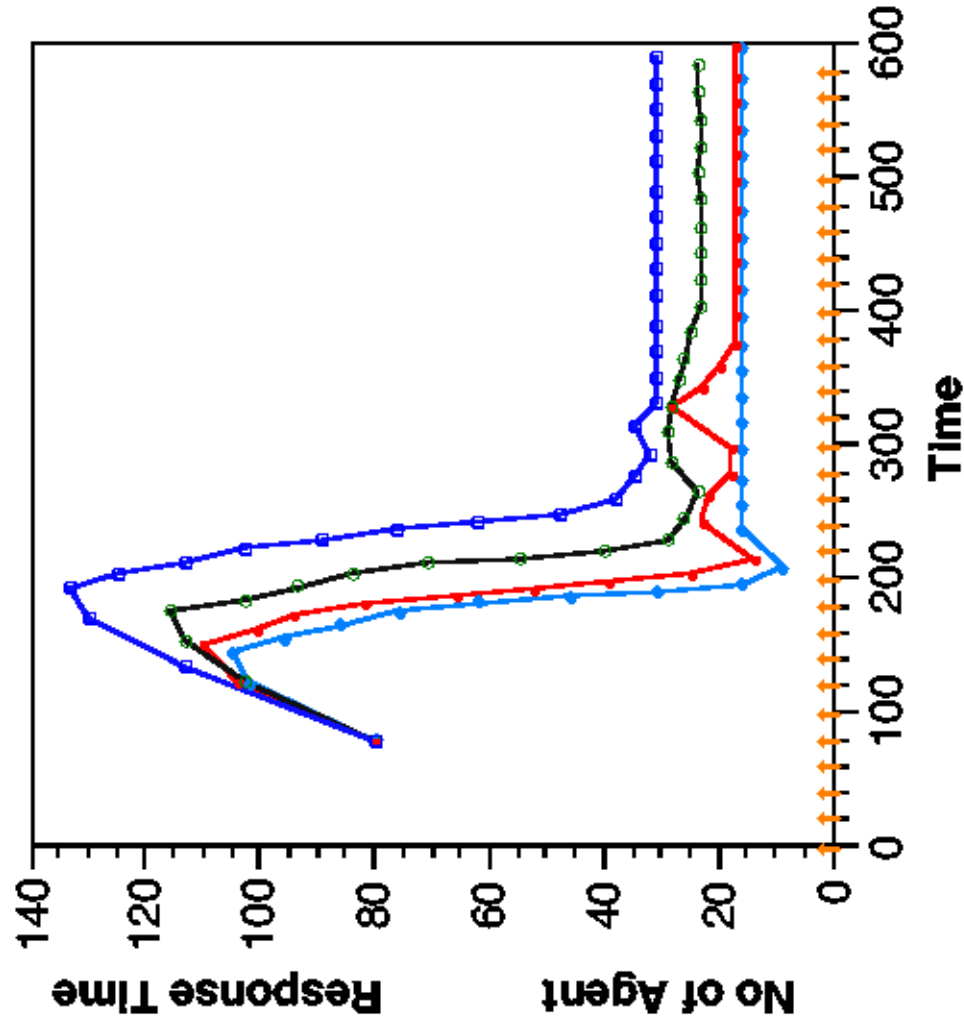
Simulation Results (Constant Intervals)



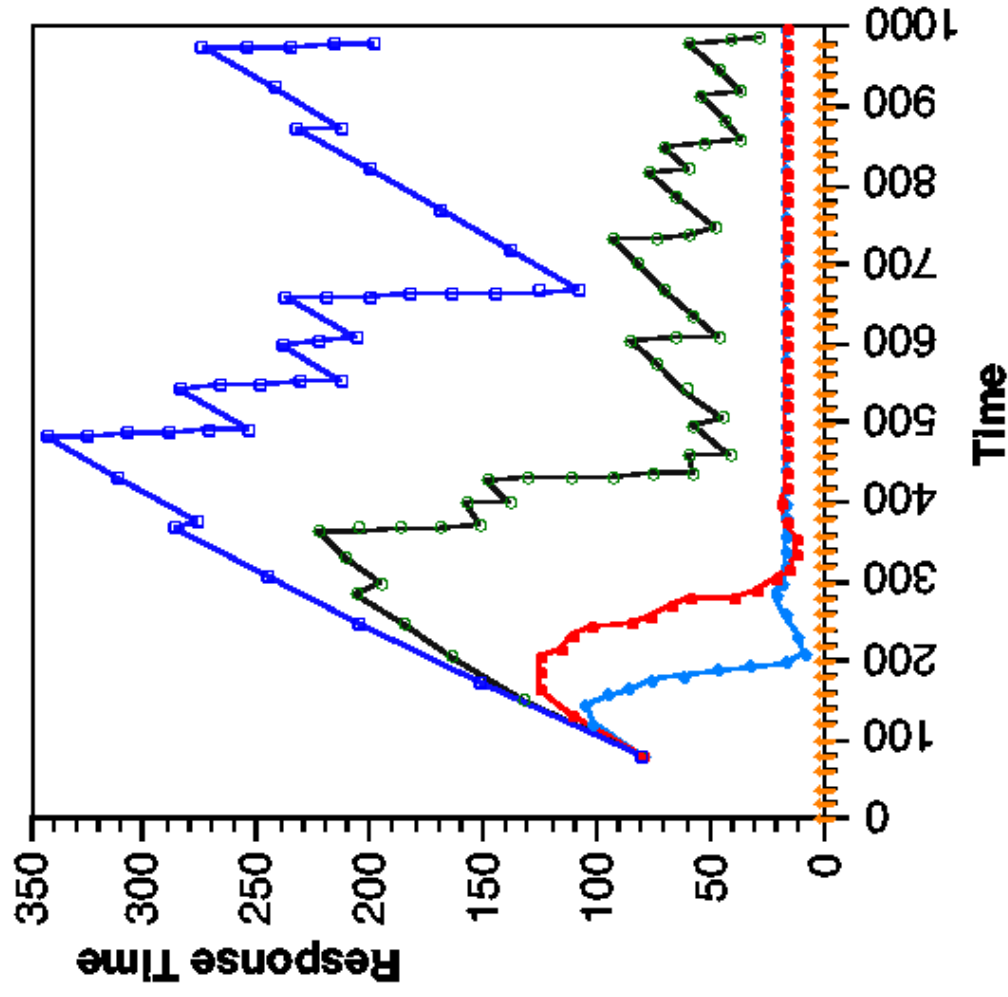
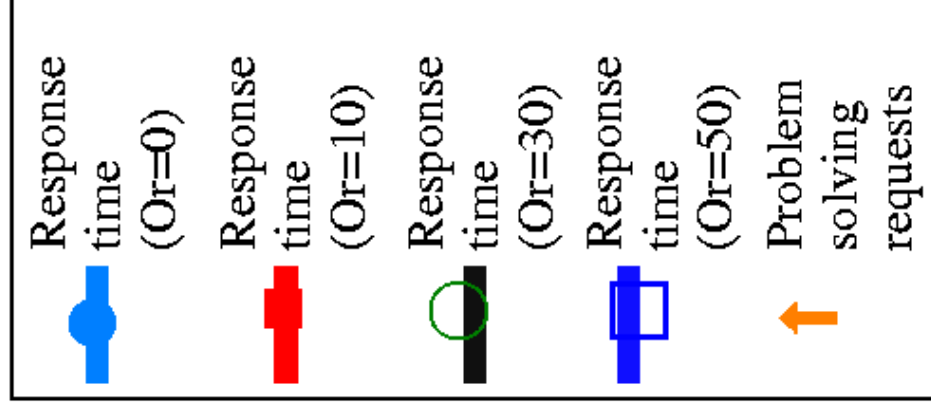
Simulation Results (Dynamic Intervals)



Simulation Results (with Communication Overhead)



Simulation Results (with Reorganization Overhead)



Evaluation Results

Real-Time Problem Solving

The effect of reorganization lags behind the change in problem load.
Time limits must be set shorter than actual deadlines.

Efficient Resource Utilization

Organizational Approach: 9 processors (average)
Conventional Approach: 17 processors (permanent)

Adaptiveness of the Organization

The society of agents can gradually adapt to the situation through repeated reorganization.

Fontana/Buss's Algorithmic Chemistry

Biology moved from a science of types to a science of dynamics in the 19th century

Biological dynamics are exemplified by the “Modern Synthesis”: Darwinian Evolution (replication and selection/fitness) and Mendelian genetics (inheritance). These presuppose the elements they purport to explain: complex structures

Biology needs a *theory of organization*, and one that is not based on replication (since replication presumes a replicant)

Can we have evolutionary dynamics & organization, without replication?

Fontana/Buss's Algorithmic Chemistry

Consider reaction $A + B \Rightarrow A + B + C$

Such a reaction is *non-copying*, i.e. it is not replication

Next, consider autocatalytic cycles:

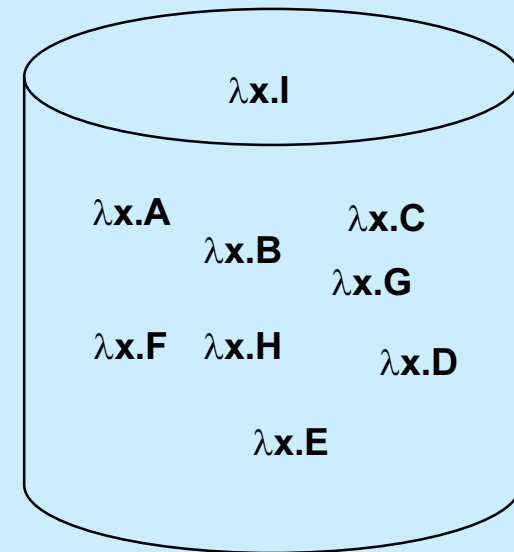


Fontana/Buss's Algorithmic Chemistry

Lambda calculus flow reactor mimics chemistry:

$\lambda x.A$ and $B(B)$

- Seed reactor with lambda expressions
- Randomly pick two expressions I and J
- Apply I to J producing I , J , and K
- Put all three back in the flow reactor
- Randomly remove one expression
- Repeat



Results: With copy operations, general convergence to steady state of identity operations. (Level 0)

Fontana/Buss's Algorithmic Chemistry

Results:

With no copy operations, emergence of sustained autocatalytic cycles, characterized by:

- **Stable kinetics**
- **Algebra of relationships among elements (grammar)**
(Level 1)

Organization is defined as system with stable kinetics and stable algebra of relationships.

Such organizations are

- a) very robust to perturbation, and**
- b) propagatable from small segments (distributed, scalable)**

Fontana/Buss's Algorithmic Chemistry

Results: when two Level 1 organizations are combined,
They coexist and persist
They sometimes develop cross-catalytic reactions or “glue”
The “glue” is not self-sustaining and cannot exist on its own.

Taken as a whole, this approach to organization is

decentralized

scalable

of inherently distributed structure

non-technological in the sense of not being targetable

Note: No locality, hence no local-global segmentation

Conclusion

MAS/DAI is developing new concepts and theories of organization, new ways of studying organizations phenomenologically, and new ways of exploiting organizations as technologies.

Organizational MAS systems have been around for at least twenty years, and computational organization models have existed since at least the early 1960s, so there is a wealth of experience.

Interest in MAS organizations is growing as more researchers recognize the need to move from agent-centric orientations to social and organizational orientations.

End