

**Aligning Coordination Behavior with  
Coordination Needs:  
Congruence in Software  
Development**

James D. Herbsleb  
School of Computer Science  
Carnegie Mellon University

# Overview

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- Coordination requirements and congruence
- In search of a theory: Distributed Constraint Satisfaction
- Initial test of theory: partial confirmation
- Implications
  - For tools
  - For coordination research

# Coordination

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- Coordination is managing dependencies among tasks (Malone & Crowston)
- Coordination is a central concern in software engineering, e.g.,
  - Modularity
  - Architecture
- Coordination is central concern of work collaboration more generally
- Generally assume modularizing the product design modularizes the tasks

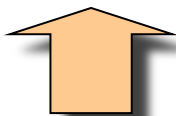
# Measuring Coordination Requirements

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- Dependencies between files
- Number of times the two files were modified in same Modification Request

Files Modified  
Together

	F <sub>4</sub>				F <sub>1</sub>	
F <sub>1</sub>	1	0	1	0	0	0
	0	5	0	3	0	1
	1	0	7	0	0	0
	0	3	0	5	2	0
	0	0	0	2	4	0
F <sub>4</sub>	0	1	0	0	0	1



# Measuring Coordination Requirements

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- Task assignment
- Number of times each developer modified each file for some unit of work

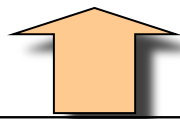
Files Modified  
Together

	F <sub>4</sub>				F <sub>1</sub>	
F <sub>1</sub>	1	0	1	0	0	0
	0	5	0	3	0	1
	1	0	7	0	0	0
	0	3	0	5	2	0
	0	0	0	2	4	0
F <sub>4</sub>	0	1	0	0	0	1

**x**

Developers  
Modified Files

	F <sub>4</sub>				F <sub>1</sub>	
D <sub>1</sub>	1	0	0	1	0	0
	0	1	0	0	0	0
	0	1	0	0	1	0
D <sub>4</sub>	0	0	0	1	1	1



# Measuring Coordination Requirements

- Transpose of task assignment

Files Modified  
Together

	F <sub>4</sub>				F <sub>1</sub>	
F <sub>1</sub>	1	0	1	0	0	0
	0	5	0	3	0	1
	1	0	7	0	0	0
	0	3	0	5	2	0
	0	0	0	2	4	0
F <sub>4</sub>	0	1	0	0	0	1

**X**

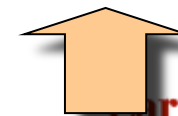
Developers  
Modified Files

	F <sub>4</sub>				F <sub>1</sub>	
D <sub>1</sub>	1	0	0	1	0	0
	0	1	0	0	0	0
	0	1	0	0	1	0
D <sub>4</sub>	0	0	0	1	1	1

**X**

Developers  
Modified Files  
(Transpose)

	D <sub>4</sub>				D <sub>1</sub>	
F <sub>1</sub>	1	0	0	0		
	0	1	1	0		
	0	0	0	0		
	1	0	0	1		
	0	0	1	1		
F <sub>4</sub>	0	0	0	1		

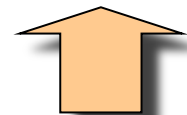


# Measuring Coordination Requirements

- Coordination requirements
- Extent to which two developers worked on interdependent files

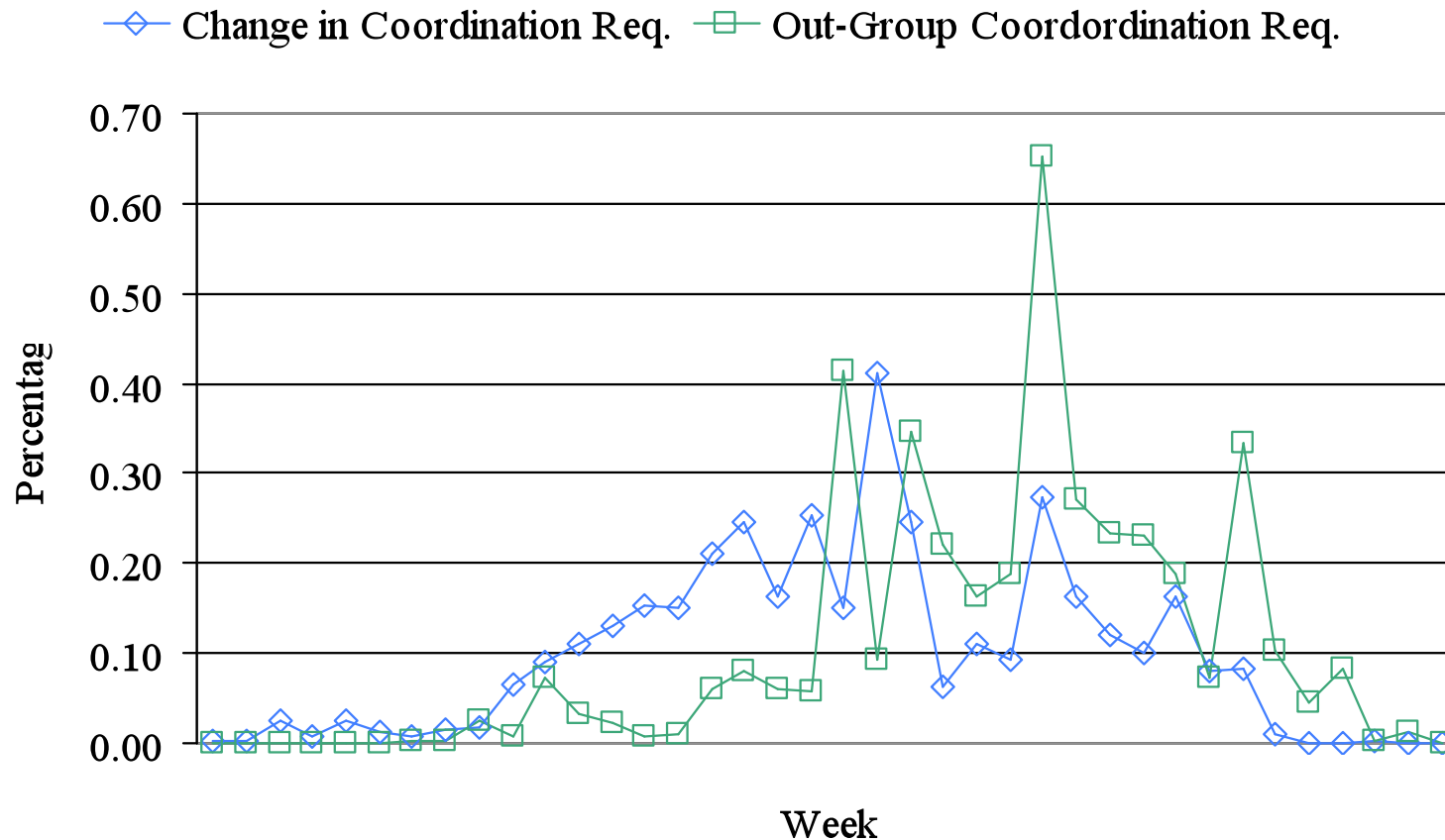
Files Modified Together      Developers Modified Files      Developers Modified Files (Transpose)      Coordination Requirements

$$\begin{array}{c}
 \begin{array}{c} F_4 \\ F_1 \end{array} \begin{array}{|c|c|c|c|c|c|} \hline 1 & 0 & 1 & 0 & 0 & 0 \\ \hline 0 & 5 & 0 & 3 & 0 & 1 \\ \hline 1 & 0 & 7 & 0 & 0 & 0 \\ \hline 0 & 3 & 0 & 5 & 2 & 0 \\ \hline 0 & 0 & 0 & 2 & 4 & 0 \\ \hline F_4 \begin{array}{|c|c|c|c|c|c|} \hline 0 & 1 & 0 & 0 & 0 & 1 \\ \hline \end{array} \\ \hline \end{array} \quad \times \quad \begin{array}{c} F_4 \\ F_1 \end{array} \begin{array}{|c|c|c|c|c|c|} \hline 1 & 0 & 0 & 1 & 0 & 0 \\ \hline 0 & 1 & 0 & 0 & 0 & 0 \\ \hline 0 & 1 & 0 & 0 & 1 & 0 \\ \hline D_4 \begin{array}{|c|c|c|c|c|c|} \hline 0 & 0 & 0 & 1 & 1 & 1 \\ \hline \end{array} \\ \hline \end{array} \quad \times \quad \begin{array}{c} D_4 \\ D_1 \end{array} \begin{array}{|c|c|c|c|} \hline 1 & 0 & 0 & 0 \\ \hline 0 & 1 & 1 & 0 \\ \hline 0 & 0 & 0 & 0 \\ \hline 1 & 0 & 0 & 1 \\ \hline 0 & 0 & 1 & 1 \\ \hline F_4 \begin{array}{|c|c|c|c|} \hline 0 & 0 & 0 & 1 \\ \hline \end{array} \\ \hline \end{array} \quad = \quad \begin{array}{c} D_4 \\ D_1 \end{array} \begin{array}{|c|c|c|c|} \hline 1 & 0 & 0 & 1 \\ \hline 0 & 1 & 0 & 0 \\ \hline 0 & 1 & 1 & 0 \\ \hline D_4 \begin{array}{|c|c|c|c|} \hline 0 & 0 & 0 & 1 \\ \hline \end{array} \\ \hline \end{array}
 \end{array}$$



# Volatility in Coordination Requirements

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# Measuring Congruence

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Coordination  
Requirements  
( $C_R$ )

	$W_4$			$W_1$
$W_1$	1	0	0	1
	0	1	0	0
$W_4$	0	1	1	0
	0	0	0	1



Actual  
Coordination  
( $C_A$ )

	$W_4$	$W_1$		
$W_1$	1	0	0	1
	0	1	0	1
	0	0	1	0
$W_4$	0	0	0	1

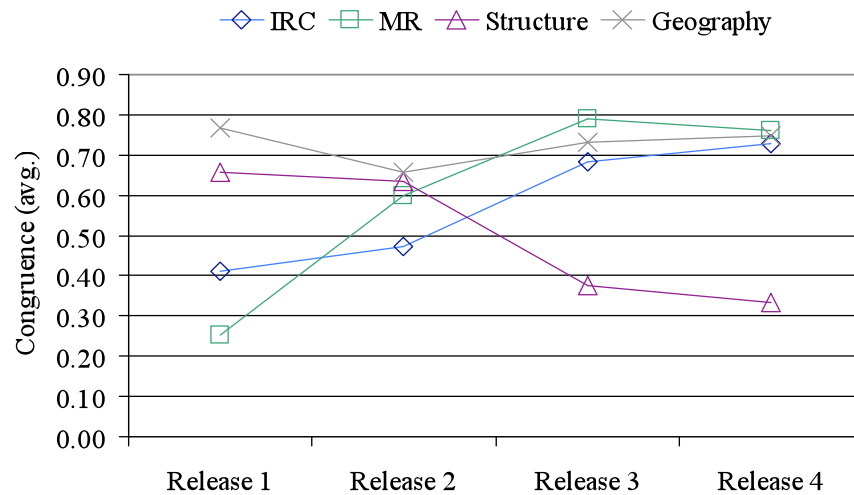
- Team structure
- Geographic location
- Use of chat
- On-line discussion in MR system

# Congruence and Development Speed

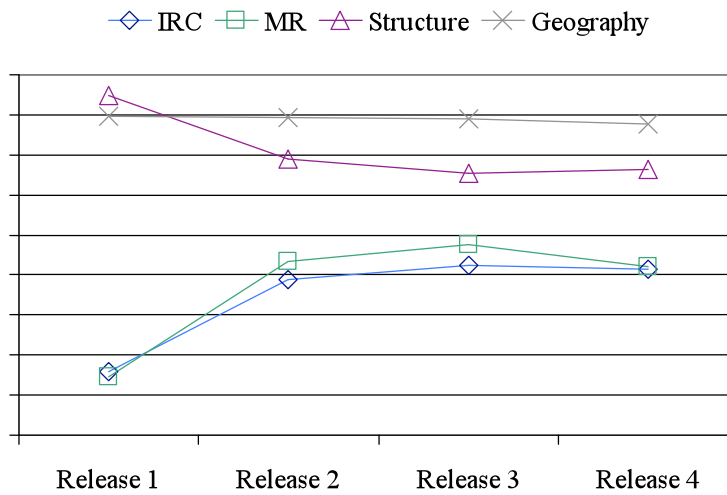
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- Unit of analysis: Modification Request (MR) (N=1983)
- Constructed regression model
  - Congruence measures as predictors
  - Control variables
  - Resolution time for MR as dependent variable
- Time to complete a work item is reduced by each of the types of congruence
  - Team structure congruence
  - Geographic location congruence
  - Chat congruence
  - On-line discussion congruence

# Evolution of Congruence



**Top 18 developers**

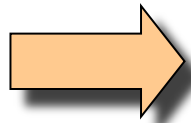


**Other 96 developers**

# Overview

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- Coordination requirements and congruence



In search of a theory: Distributed Constraint Satisfaction

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# Theoretical Views of Coordination

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- Coordination theory (Malone & Crowston)
  - Match coordination problems to mechanisms
  - E.g., resource conflict and scheduling
- Distributed Cognition (Hutchins, Hollan)
  - Computational process distributed over artifacts and people
- Organizational behavior
  - Stylized dependency types, e.g., sequential, pooled
  - Coordination regimens that address each type

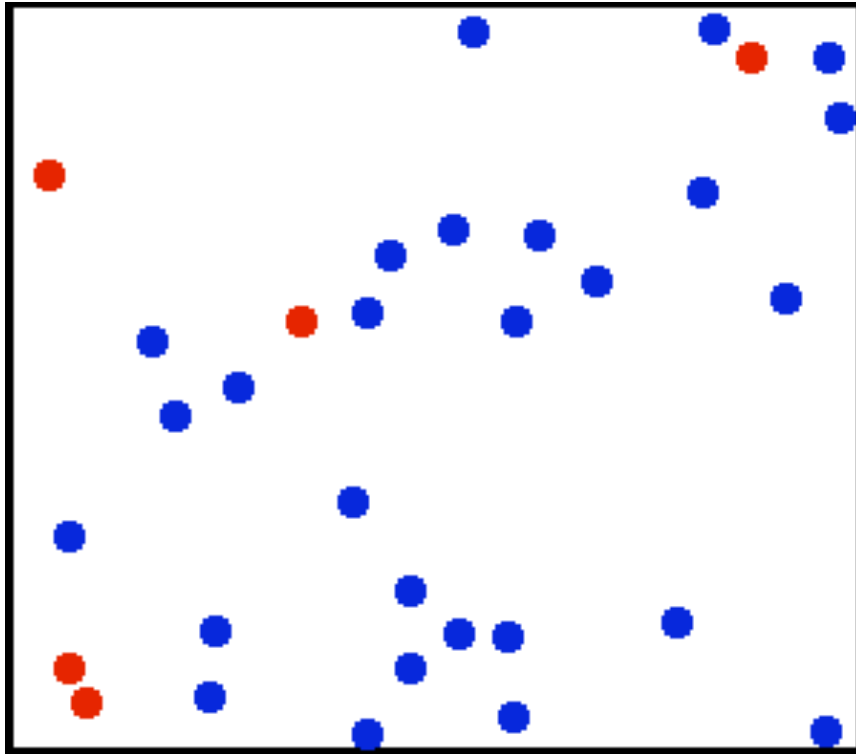
# Need a Different Approach

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- Coordination requirements are generated by rapidly shifting tasks at sub-workflow, micro level
- Not clear that any existing theories apply
- Even if they apply, they do not generate predictions based on micro tasks
- Want to predict observable, macro behavior produced by micro coordination phenomena
- How?

# Predicting Macro from Micro: Kinetic Theory of Gases

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Animated gif: Wikipedia

- A gas consists of molecules in constant random motion
- Gas molecules influence each other only by collision
- All collisions between gas molecules are perfectly elastic
- The volume actually occupied by the molecules of a gas is negligibly small

Tom Stretton

<http://www2.ucdsb.on.ca/tiss/stretton/CHEM1/gasesx.html>

**CarnegieMellon**

School of Computer Science

# Technical Coordination Modeled as CSP

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- Constraint satisfaction problem
  - a project is a large set of mutually-constraining decisions, which are represented as
  - $n$  variables  $x_1, x_2, \dots, x_n$  whose
  - values are taken from finite, discrete domains  $D_1, D_2, \dots, D_n$
  - constraints  $p_k(x_{k1}, x_{k2}, \dots, x_{kn})$  are predicates defined on
  - the Cartesian product  $D_{k1} \times D_{k2} \times \dots \times D_{kj}$ .
- Solving CSP is equivalent to finding an assignment for all variables that satisfy all constraints

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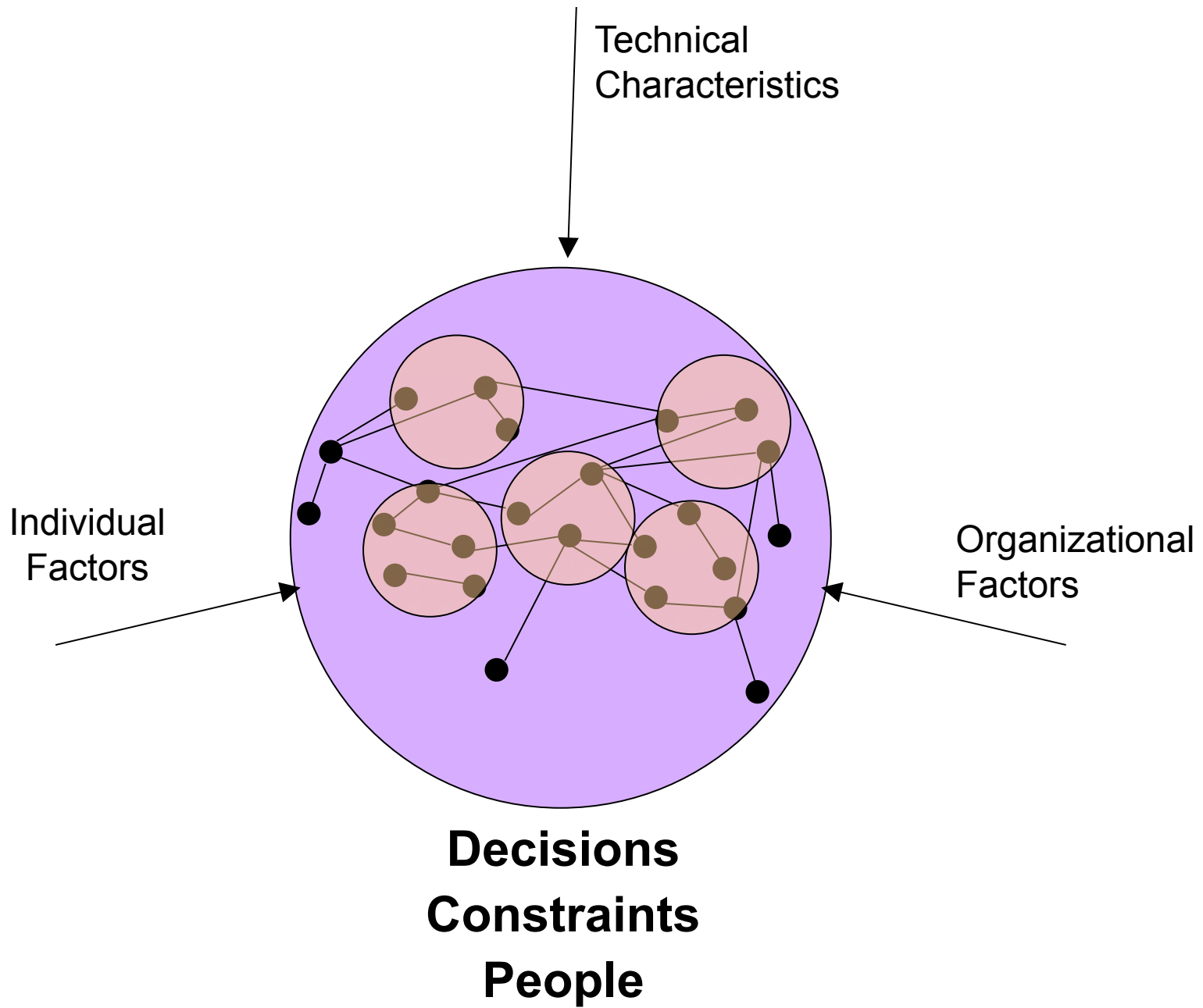
Formulation of CSP and DCSP taken from Yokoo and Ishida, Search Algorithms for Agents, in G. Weiss (Ed.) *Multiagent Systems*, Cambridge, MA: MIT Press, 1999.



# Distributed Constraint Satisfaction

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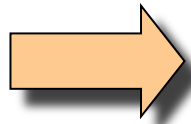
- Each variable  $x_j$  belongs to one agent  $i$
- Represented by relation  $belongs(x_j, i)$
- Agents only know about a subset of the constraints
- Represent this relation as  $known(P_i, k)$ , meaning agent  $k$  knows about constraint  $P_i$
- Agent behavior determines global algorithm
- For humans, global behavior emerges



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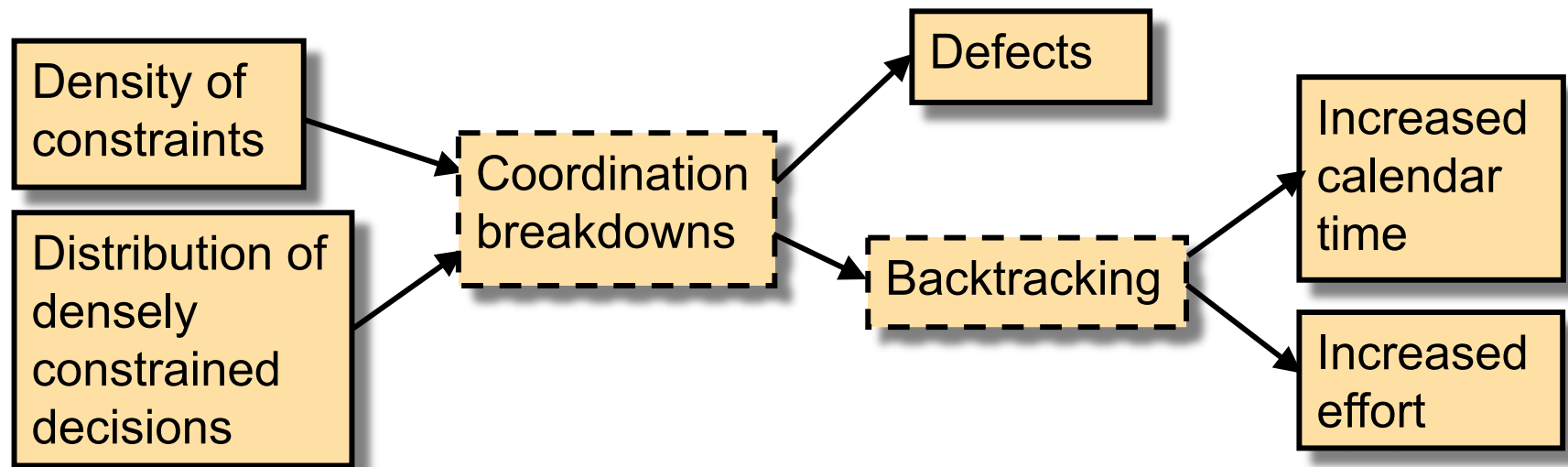


Initial test of theory: partial confirmation

- Implications
  - For tools
  - For coordination research

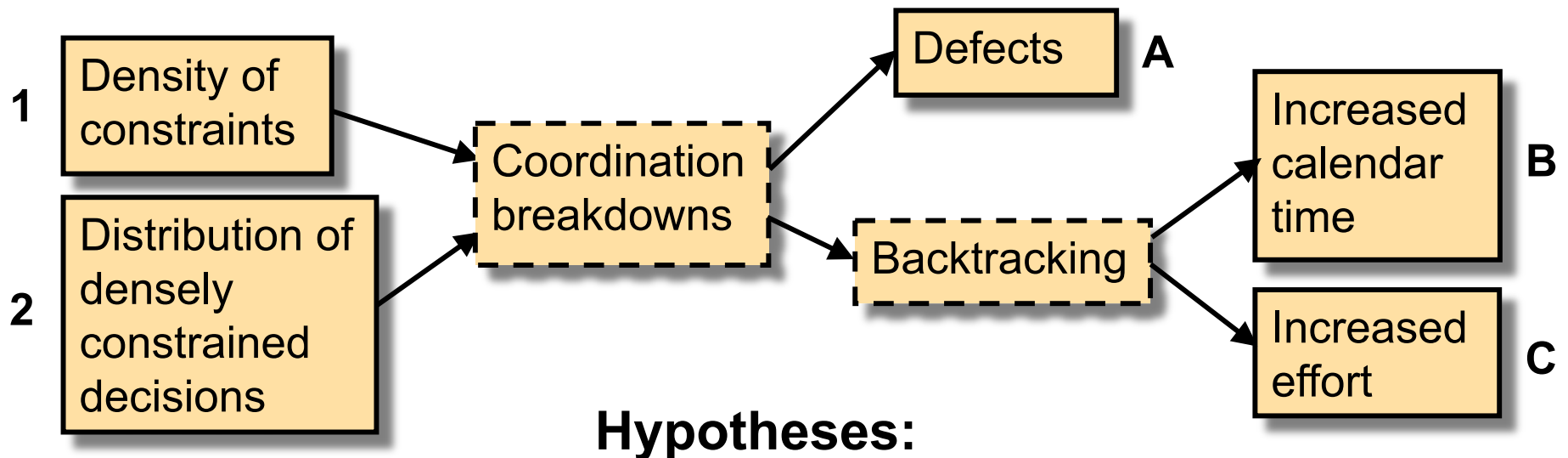
# Micro Causes, Macro Effects

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# Hypotheses

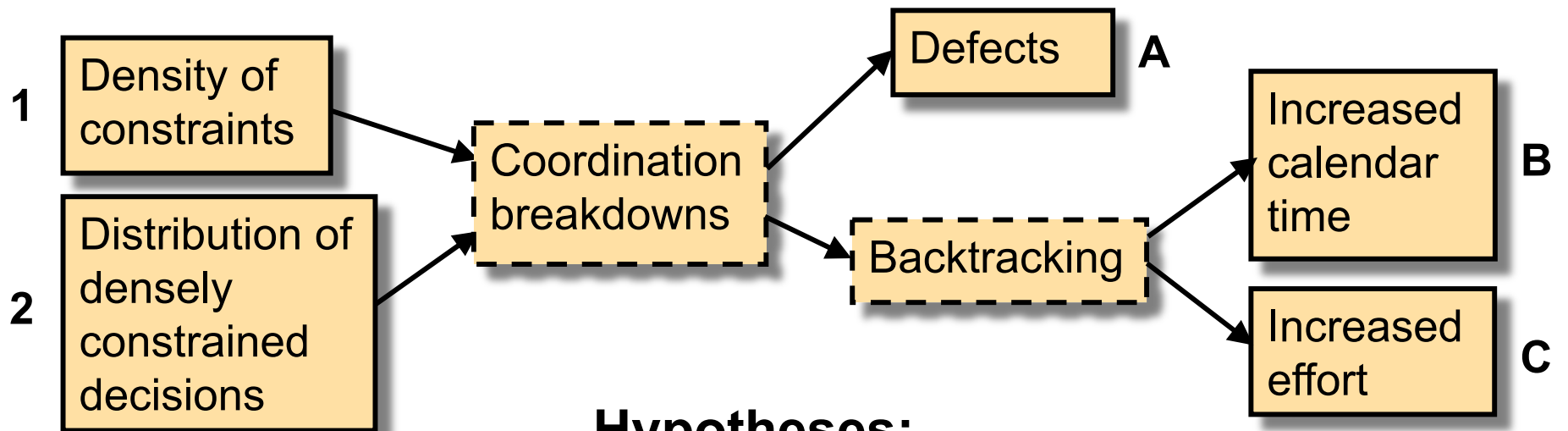
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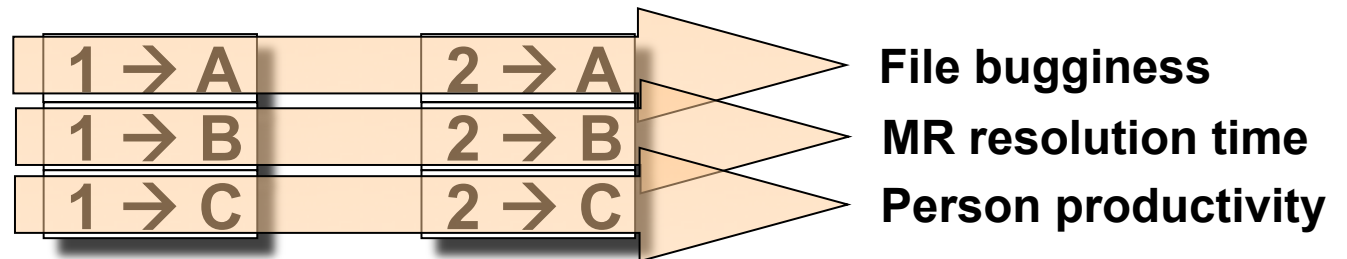
1	→	A
1	→	B
1	→	C

2	→	A
2	→	B
2	→	C

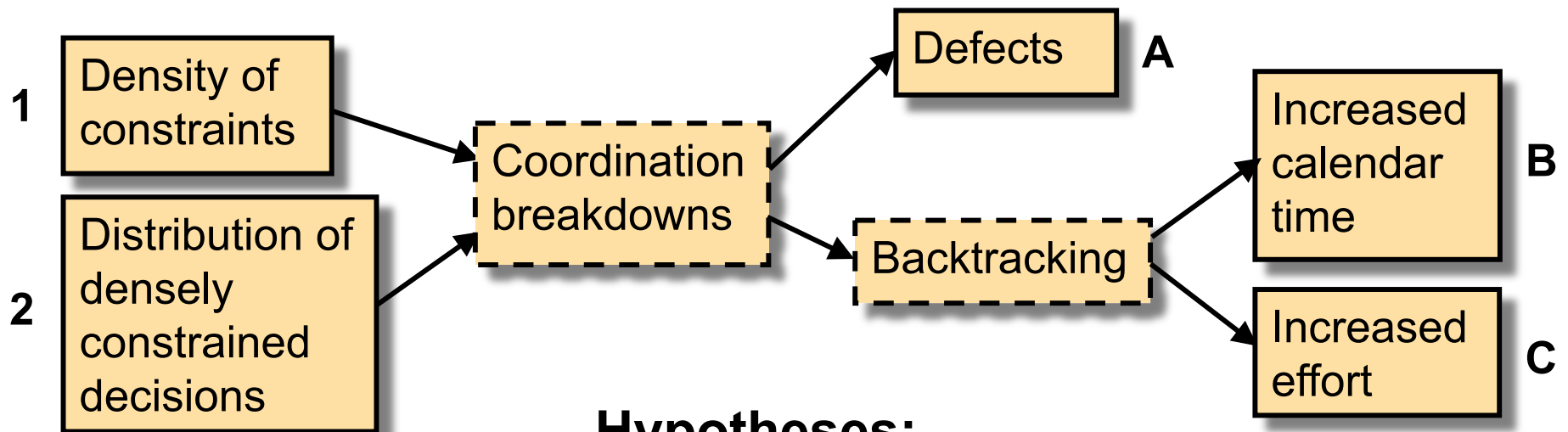
# Regression Models



**Hypotheses:**



# Results



**Hypotheses:**

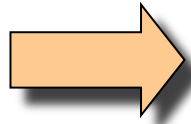
1	→	A
1	→	B
1	→	C

2	→	A
2	→	B
2	→	C

# Overview

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- Coordination requirements and congruence
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- Initial test of theory: partial confirmation



## Implications

- For tools
- For coordination research



# Implications: Tools

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- Just providing self-selected buddy lists is likely not sufficient to support coordination for most people
  - Coordination requirements are too volatile
  - Many people may not know who to select
- Our tools could be doing much more for us in creating and using project data
  - All-encompassing project graph, with all changes to everything, automatic links for pasting, maybe viewing
  - Graph-browsing capabilities to take any node as a start, search across people, artifacts, content history
- Software tools are leading the way here

# Implications: Coordination Research

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- Coordination requirements are
  - Volatile in short term, evolve over long term
- We need theories that
  - Capture the micro nature of coordination
  - Predict macro scale behavior
- Role of constraint visibility/discoverability
  - May explain difference in “bugginess” effects between call and data dependencies
- There is a complex, time-varying relationship between product modularization and task modularization