Scale Changes Everything

Linda Northrop
Director, Product Line Systems Program
Software Engineering Institute

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Software Engineering Institute (SEI)

• Federally Funded Research and Development Center
• Created in 1984
• Sponsored by the U.S. Department of Defense
• Locations in Pittsburgh, PA; Washington, DC; Huntsville, AL; Los Angeles, CA; Frankfurt, Germany; Doha, Qatar
• Operated by Carnegie Mellon University
• Works directly with global commercial and government organizations
Ultra-Large-Scale Systems (ULS)

Scale
Changes
Everything
Trend Toward Increasing Scale-1

- Enormous web service and computing infrastructure
- Supply chain systems
- Software-based engineering systems
Trend Toward Increasing Scale-2

Healthcare Infrastructure
Trend Toward Increasing Scale-3

Homeland Security
Trend Toward Increasing Scale-4

Networked Automobiles
Increasing Scale In Military Systems

Increasingly Complex Systems

- ultra-large, network-centric, real-time, cyber-physical-social systems
  - thousands of platforms, sensors, decision nodes, weapons, and warfighters
  - connected through heterogeneous wired and wireless networks

Goal: Information Dominance

- Transient and enduring resource constraints and failures
- Continuous adaptation
  - changes in mission requirements
  - changes in operating environments
  - changes in force structure
  - perpetual systems’ evolution
  - addition of new systems
- Sustainable - legally, technically, politically
A Reason for Concern

Such systems are going to be larger and more complex than any previously seen

- very serious technical challenges, obvious and undoubtedly to-be-discovered
- many vendors, many technologies, many systems
- evolving doctrine + evolving technology + (or $\Rightarrow$?) ill-defined requirements

*The US Army is concerned that the scale of future systems is beyond our reach.*
The Challenge

“Our soldiers depend on software and will depend more on software in the future.

The Army’s success depends on software and the software industry.

We need better tools to meet future challenges, and neither industry nor government is working on how to do things light-years faster and cheaper.

How can future systems, which are likely to be a billion lines of code, be built reliably if we can’t even get today’s systems right?”

— Asst Sec Army Claude Bolton
August 16, 2005
Ultra-Large-Scale (ULS) Systems Study

Gather leading experts to study:
- characteristics of ULS systems
- challenges and breakthroughs required
- promising research and approaches

Intended outcomes:
- ULS System Research Agenda
- program proposal
- collaborative research network

About the Effort

Funded by the Army (ASA ALT)

Staffing: 9 member SEI team
13 member expert panel

Duration: one year (04/05 -- 05/06)
SEI Team (and Expert Panel)

Gregory Abowd  
Georgia Institute of Technology

Peter Neumann  
SRI International Computer Science Laboratory

Carliss Baldwin  
Harvard Business School

Douglas Schmidt  
Vanderbilt University

Mary Shaw  
Carnegie Mellon University

Bob Balzer  
Teknowledge Corporation

Richard P. Gabriel  
Sun Microsystems

Dan Siewiorek  
Carnegie Mellon University

Gregor Kiczales  
University of British Columbia

Kevin Sullivan  
University of Virginia

Ali Mili  
New Jersey Institute of Technology

John Lehoczky  
Carnegie Mellon University

Jack Whalen  
PARC
The Process

Check egos and private agendas at the door!
Build future systems, which are likely to be a billion lines of code, reliably through incremental improvements in today's software technology.
Instead: A Different Kind of Study

It presents an overall research agenda -- not just for new tools or a new software method or modest improvements in today’s approaches.

It is based on the challenges associated with ultra-large scale.

It focuses on the future.

It involves an interdisciplinary base.

It takes a fresh perspective on the development, deployment, operation, and evolution of software-intensive systems.

Germs of these ideas are present today in small research pockets; these efforts are currently too small to have much impact on next-generation DoD ULS systems.
ULS Systems Research Agenda

Describes

- the characteristics of ULS systems
- the associated challenges
- promising research areas and topics

Is based on a new perspective needed to address the problems associated with ultra-large-scale systems.
Working Inside and Outside the Box

Classical Reductionism

Define Characteristics

Propose Research

Identify Challenges
Working Inside and Outside the Box

Classical Reductionism

Define Characteristics

Propose Research

Identify Challenges

Inspiration

- Micro/Macro Economics
- Complexity Science
- Game Theory
- Distributed Cognition
- Evolutionary Biology
- Statistical Mechanics
- Ethnography
- City Planning

Scale Changes Everything
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The Journey
Ultra-Large Scale

Ultra-large size in terms of

- Lines of code
- Amount of data stored, accessed, manipulated, and refined
- Number of connections and interdependencies
- Number of hardware elements
- Number of computational elements
- Number of system purposes and user perception of these purposes
- Number of routine processes, interactions, and “emergent behaviors”
- Number of (overlapping) policy domains and enforceable mechanisms
- Number of people involved in some way
- ….
What Is an Ultra-Large-Scale (ULS) System?

A ULS System has unprecedented scale in some of these dimensions:

- Lines of code
- Amount of data stored, accessed, manipulated, and refined
- Number of connections and interdependencies
- Number of hardware elements
- Number of computational elements
- Number of system purposes and user perception of these purposes
- Number of routine processes, interactions, and “emergent behaviors”
- Number of (overlapping) policy domains and enforceable mechanisms
- Number of people involved in some way

**ULS systems will be interdependent webs of software-intensive systems, people, policies, cultures, and economics.**

**ULS systems are systems of systems at internet scale.**
Scale Changes Everything

Characteristics of ULS systems arise because of their scale.

- Decentralization
- Inherently conflicting, unknowable, and diverse requirements
- Continuous evolution and deployment
- Heterogeneous, inconsistent, and changing elements
- Erosion of the people/system boundary
- Normal failures
- New paradigms for acquisition and policy

These characteristics may appear in today’s systems and systems of systems, but in ULS systems they dominate.

These characteristics undermine the assumptions that underlie today’s software engineering approaches.
Today’s Approaches

The Engineering Perspective - for large scale software-intensive systems

- largely top-down and plan-driven
- requirements/design/build cycle with standard well-defined processes
- centrally controlled implementation and deployment
- inherent validation and verification

The Agile Perspective - proven for smaller software projects

- fast cycle/frequent delivery/test driven
- simple designs embracing future change and refactoring
- small teams and retrospective to enable team learning
- tacit knowledge

*Today’s approaches are based on perspectives that fundamentally do not cope with the new characteristics arising from ultra-large scale.*

*The mentality of looking backward doesn’t scale.*
A New Perspective is Required

“The older is not always a reliable model for the newer, the smaller for the larger, or the simpler for the more complex…Making something greater than any existing thing necessarily involves going beyond experience.”

Henry Petroski
*Pushing the Limits: New Adventures in Engineering*
Today We Build “Buildings”
“Cities are places of massive information flows, networks, and conduits, and myriad transitory information exchanges.”
Howard Rheinegold: *Smart Mobs*
We Need to Think Ecosystem

Diverse users with complex networked dependencies and intrinsic adaptive behavior

Has:

- Robustness mechanisms: achieving stability in the presence of disruption
- Measures of health: diversity, population trends, other key indicators
We Need to Think Socio-Technical Ecosystems

**Socio-technical ecosystems** include people, organizations, and technologies at all levels with significant and often competing interdependencies.

- There will be competition for resources.
- There will be organizations and participants responsible for setting policies.
- There will be organizations and participants responsible for producing ULS systems.
- There will need to be local and global indicators of health that will trigger necessary changes in policies and in element and system behavior.
Why a New Perspective?

There are fundamental assumptions that underlie today’s software engineering and software development approaches that are undermined by the characteristics of ULS systems.

There are challenges associated with ULS systems that today’s perspectives are very unlikely to be able to address.

For the last forty years, engineering has been the dominant metaphor for software systems creation.

In ULS systems, we now are dealing with not just software but an ecosystem of people, organizations, governance, social interaction, hardware, and software.

Engineering is no longer the dominant metaphor.
## ULS Systems vs Today’s Approaches - 1

<table>
<thead>
<tr>
<th>Characteristics</th>
<th>Today’s assumptions undermined</th>
</tr>
</thead>
<tbody>
<tr>
<td>Decentralized control</td>
<td>All conflicts must be resolved and resolved centrally and uniformly.</td>
</tr>
<tr>
<td>Inherently conflicting, unknowable, and diverse</td>
<td>Requirements can be known in advance and change slowly. Tradeoff decisions will be stable.</td>
</tr>
<tr>
<td>requirements</td>
<td>System improvements are introduced at discrete intervals.</td>
</tr>
<tr>
<td>Continuous evolution and deployment</td>
<td>Effect of a change can be predicted sufficiently well.</td>
</tr>
<tr>
<td>Heterogeneous, inconsistent, and changing elements</td>
<td>Configuration information is accurate and can be tightly controlled.</td>
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<tr>
<td></td>
<td>Components and users are fairly homogeneous.</td>
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</table>
## ULS Systems vs Today’s Approaches - 2

<table>
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<th>Today’s assumptions undermined</th>
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<td>Erosion of the people/system boundary</td>
<td>People are just users of the system.</td>
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<td></td>
<td>Collective behavior of people is not of interest.</td>
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<td>Social interactions are not relevant.</td>
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<tr>
<td>Normal failures</td>
<td>Failures will occur infrequently.</td>
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<td></td>
<td>Defects can be removed.</td>
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<tr>
<td>New paradigms for acquisition and policy</td>
<td>A prime contractor is responsible for system development, operation, and evolution.</td>
</tr>
</tbody>
</table>
Challenges

ULS systems will present challenges in three broad areas:

- Design and evolution
- Orchestration and control
- Monitoring and assessment
Design and Evolution

Specific challenges in ULS system design and evolution stemming directly from the characteristics of ULS systems:

- Economics and industry structure
- Social activity for constructing computational environments
- Legal issues
- Enforcement mechanisms and processes
- Definition of common services supporting the ULS system
- Rules and regulations
- Agility
- Handling of change
- Integration
- User-controlled evolution
- Computer-supported evolution
- Adaptable structure
- Emergent quality
Orchestration and Control

Orchestration and control refers to the set of activities needed to make the elements of a ULS system work together in reasonable harmony to ensure continuous satisfaction of mission objectives.

Orchestration is needed at all levels of ULS systems and challenges us to create new ways for

- Online modification
- Maintenance of quality of service while providing necessary flexibility
- Creation and execution of policies and rules
- Adaptation to users and contexts
- Enabling of user-controlled orchestration
Monitoring and Assessment

The effectiveness of ULS system design, operation, evolution, orchestration, and control has to be evaluated.

There must be an ability to monitor and assess ULS system state, behavior, and overall health and well being.

Challenges include

- Defining indicators
- Understanding why indicators change
- Prioritizing the indicators
- Handling change and imperfect information
- Gauging the human elements
Where Do We Focus Our Research

- Address the predominant characteristics of ULS systems and the three challenge categories.
- Look for breakthroughs not incremental improvement in current approaches.
- Take a more expansive view of software research and include its interactions with associated research in the physical and social sciences.
Inspiration: Open Source and Cooperative Communities
Inspiration: Game Theory

Algorithmic Mechanism Design

- games + microeconomics + computation
- computational markets for any scarce ULS resource?

Institution Design

- learning games + self-reinforced expectations + cultural norms
- better formal models of acquisition in non-prime-dominated landscape?
Inspiration: Networks, Statistical Mechanics, Complexity

Networks Are Everywhere

Recurring “scale free” structure
- internet & yeast protein structures

Analogous dynamics?
- epidemiology, robustness and vulnerability

Unstable Equilibrium

How many changes before a system becomes unstable?

What scale and frequency of disruptions can be expected?
Economics (Finance) As Design Criteria

- Design rules (feature parameterization)
- Module maximizes option value
- ROI inversely proportional to module footprint
- Each module a potential point for competition

(apolgies for abuse of ideas to Carliss Baldwin)
We recommend an interdisciplinary portfolio of seven research areas and suggested topics for breakthrough research needed to meet the challenges associated with ULS systems.

- Is not expressed in terms of today’s “hot” technologies.
- Does not supplant current software research.
- Expands today’s horizons.
6.1 **Human Interaction:** Involves anthropologists, sociologists, and social scientists conducting detailed socio-technical analyses of user interactions in the field, with the goal of understanding how to construct and evolve such socio-technical systems effectively.

- Context-Aware Assistive Computing
- Understanding Users and Their Contexts
- Modeling Users and User Communities
- Fostering Non-Competitive Social Collaboration
- Longevity
6.2 Computational Emergence:
Explores the use of methods and tools based on economics and **game theory** (e.g., **mechanism design**) to ensure globally optimal ULS system behavior by exploiting the strategic self interests of the system’s constituencies; explores **metaheuristics** and **digital evolution** to augment the cognitive limits of human designers.

- Algorithmic Mechanism Design
- Metaheuristics in Software Engineering
- Digital Evolution
6.3 Design: Broadens the traditional technology-centric definition of design to include people and organizations; social, cognitive, and economic considerations; and design structures such as design rules and government policies.

- Design of All Levels
- Design Spaces and Design Rules
- Harnessing Economics to Promote Good Design
- Design Representation and Analysis
- Assimilation
- Determining and Managing Requirements
6.4 Computational Engineering: Focuses on evolving the expressiveness of representations to accommodate the semantic diversity of many languages and focuses on providing automated support for computing the evolving behavior of components and their compositions.

- Expressive Representation Languages
- Scaled-Up Specification, Verification, and Certification
- Computational Engineering for Analysis and Design
Research Areas - 5

6.5 **Adaptive System Infrastructure:** Investigates integrated development environments and runtime platforms that will support the decentralized, “always-on,” nature of ULS systems as well as technologies, methods, and theories that will enable ULS systems to be developed in their deployment environments.

- Decentralized Production Management
- View-Based Evolution
- Evolutionary Configuration and Deployment
- In Situ Control and Adaptation
6.6 Adaptable and Predictable System Quality: Focuses on how to maintain quality in a ULS system in the face of continuous change, ongoing failures, and attacks and how to identify, predict, and control new indicators of system health (akin to the U.S. gross domestic product) that are needed because of the scale of ULS systems.

- Robustness, Adaptation, and Quality Attributes
- Scale and Composition of Quality Attributes
- Understanding People-Centric Quality Attributes
- Enforcing Quality Requirements
- Security, Trust, and Resiliency
- Engineering Management at Ultra-Large Scales
Research Areas - 7

6.7 Policy, Acquisition, and Management: Focuses on transforming acquisition policies and processes to accommodate the rapid and continuous evolution of ULS systems by treating suppliers and supply chains as intrinsic and essential components of a ULS system.

- Policy Definition for ULS Systems
- Fast Acquisition for ULS Systems
- Management of ULS Systems
## Research Areas and Challenges

### Relationship Between Research Areas and Challenges

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Toward a Roadmap for a ULS Systems Research Program

There are many possible approaches to structuring a research program from the ULS Systems Research Agenda. We provide three possible support structures based on:

1. Specific DoD missions and capabilities
2. DoD research funding types required
3. Estimates of the relative starting points of the research

Sponsors with different needs can choose to support different combinations of research.

The envisioned outcome of the proposed research is a spectrum of technologies and methods for developing ULS systems, with national-security, economic, and societal benefits that far extend beyond ULS systems themselves.

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Study Conclusions

There are fundamental gaps in our current understanding of software development at the scale of ULS systems.

These gaps

- present profound impediments to the technically and economically effective achievement of the DoD goal* of deterrence and dominance based on information superiority
- require a broad, fresh perspective and interdisciplinary, breakthrough research

We recommend

- a ULS Systems Research Agenda that includes research areas based on a fresh perspective aimed at challenges arising from increasing scale
- short-term startup program and a long-term, substantive research program for ULS systems

* As stated in the Quadrennial Defense Review (QDR) Report, Feb 2006
ULS Systems Research Study Report

Acknowledgements

Executive Summary

Part I

1. Introduction
2. Characteristics of ULS Systems
3. Challenges
4. Overview of Research Areas
5. Summary and Recommendations

Part 2

6. Detailed Description of Research Areas
   • Glossary

http://www.sei.cmu.edu/uls/
The Start of a Collaborative Research Network

Workshops

Keynotes

Panels

Emerging Research Efforts
What We Learned

There is an unstoppable trend toward increasing scale in many systems important to our society.

Scale changes everything.

New, interdisciplinary perspective and new research in building ultra-large-scale systems is long overdue.

Manifestations of scale and its attendant complexity arise in many disciplines, and can be understood as a phenomenon in its own right.

The ULS Systems research proposal, if funded, will provide a clearing in which new ideas can be explored.
What’s Next

- ULS System Senior Leader Forum
- Initiation of pockets of ULS System Research
- Promulgation of ULS System Ideas
- OOPSLA Panel (today at 3:30pm)
- OOSPLA Workshop (on Thursday)
Thanks To Those Who Made This Report Possible

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Contact Information

Linda Northrop
Director
Product Line Systems Program
Telephone: 412-268-7638
Email: lmn@sei.cmu.edu

U.S. Mail:
Software Engineering Institute
Carnegie Mellon University
Pittsburgh, PA 15213-3890

SEI Fax: 412-268-5758