

**NIST**

**National Institute of Standards and Technology**  
Technology Administration, U.S. Department of Commerce



# *A Program of Work for Understanding Emergent Behavior in Global Grid Systems*

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# Outline

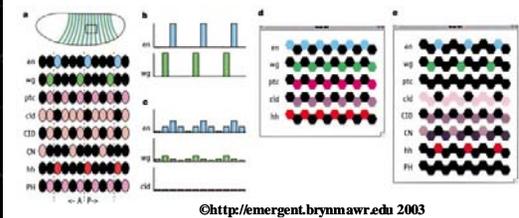
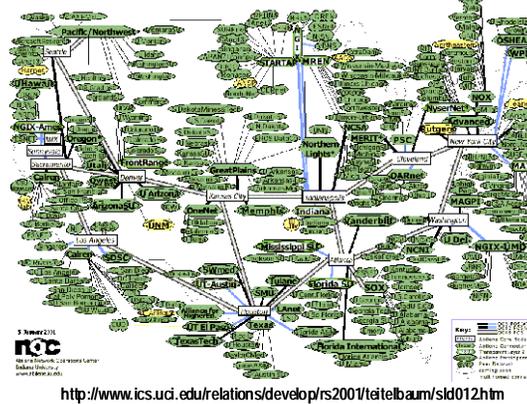
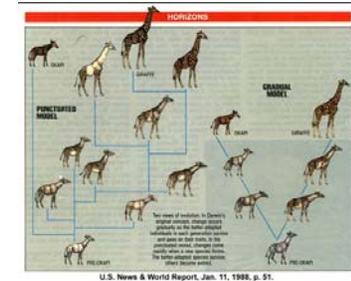
- What are emergent behaviors?
- Why are emergent behaviors likely in global grids?
- Can emergent behaviors be elicited or controlled?
- How are NIST researchers investigating these questions?
- Case study: denial-of-service (DoS) attack on simulated grid

# What are emergent behaviors?

Emergent behaviors are  
**coherent system-wide properties**  
that cannot be deduced directly from  
analyzing behavior of individual components

Emergent behaviors typically arise in  
**dynamic open complex adaptive systems,**  
where system-wide behavior derives from  
self-organizing interactions among myriad components

# Some Dynamic Open Complex Adaptive Systems



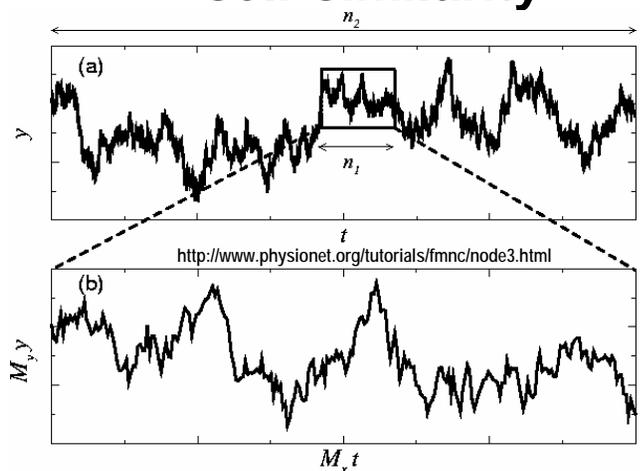
# How might a complex system be detected?

## fractal patterns

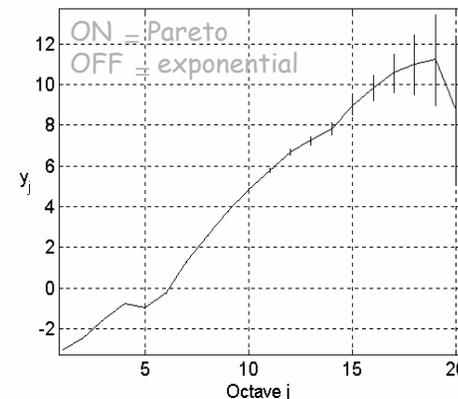


<http://www.mfractals.com/sergaldougower.html>

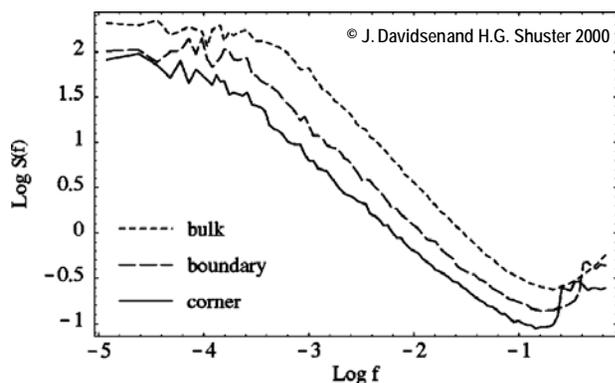
## self-similarity



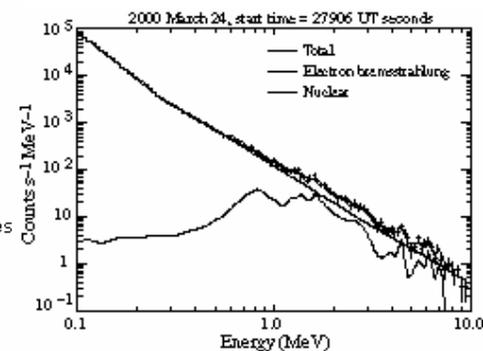
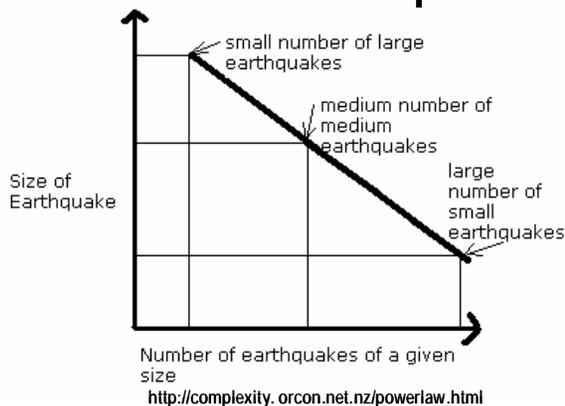
## linear wavelets



## 1/f noise



## power laws



<http://heseweb.nrl.navy.mil/gamma/solarflare/24mar00.htm>

**Other ideas include: decrease in entropy or changes in statistical complexity**

## What characteristics might lead to a complex system?

- **System Scale** – order emerges from many interactions over space and time
- **Communications Locality** – inability to know global state
- **Element Simplicity** – inability to process all possible states
- **Feedback** – elements can sense environment and estimate global state
- **Element Autonomy** – each element can vary its behavior based on feedback

## Why are emergent behaviors likely in global grids?

- **Scale**: large number of clients and services interacting via **indirect coupling arising through use of shared resources**
- **Communications Locality**: clients cannot obtain complete and timely state of all resources – **decisions must be made on partial information**
- **Element Simplicity**: clients possess limited processing power – **decisions must be made with heuristics**
- **Feedback**: clients learn fate of resource requests and **adapt subsequent requests based on updated information**
- **Element Autonomy**: clients decide how to proceed with **no central control or direction**

# Can emergent behaviors be elicited or controlled?

Remains an open research question, for example:

- NASA exploring **emergent programming** to increase adaptability and survivability of future spacecraft (see Kenneth N. Lodding, “Hitchhikers Guide to Biomorphic Software”, *ACM Queue* vol. 2, no. 4)
- MIT exploring **amorphous computing** where systems structure and specialize themselves from a common set of components (<http://www.swiss.csail.mit.edu/projects/amorphous>)
- Radhika Nagpal (Harvard) studying how to engineer and understand **self-organizing systems** (<http://www.eecs.harvard.edu/~rad>)
- Several researchers exploring application of **economic mechanisms**, such as markets, auctions, and present-value calculations, as means to elicit effective behavior in distributed systems

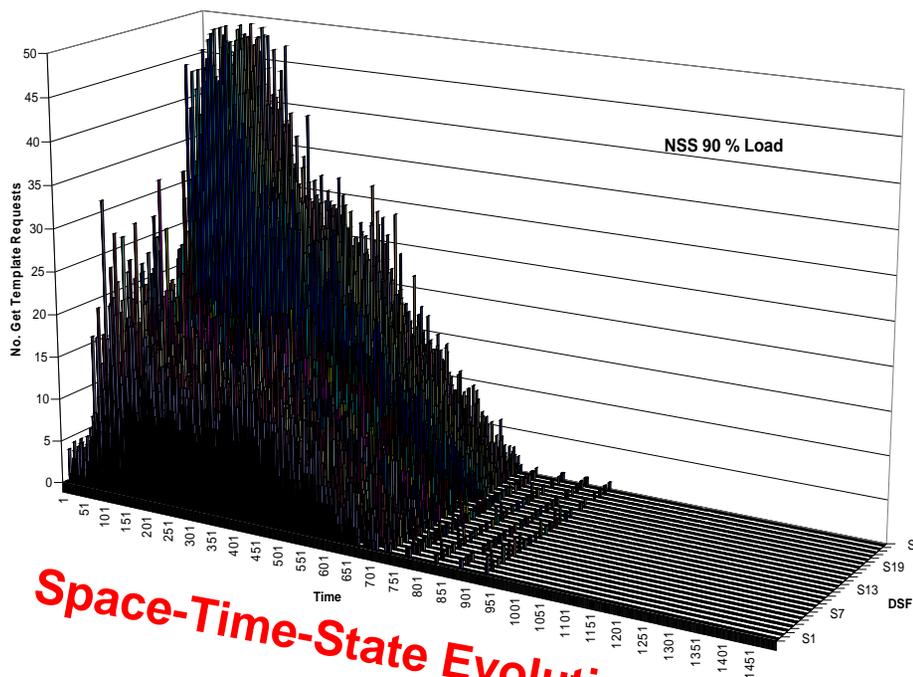
## How are NIST researchers investigating these questions?

### Goals

- Understand self-organizing properties in service-oriented architectures (SOA)
- Investigate mechanisms to shape emergent behavior in SOA
- Improve related consortia specifications w.r.t. robustness, reliability, performance

### Technical Approach

- Apply modeling and analysis techniques from the physical sciences
- Exploit exploratory data analysis and visualization methods
- Investigate control techniques from biology and economics



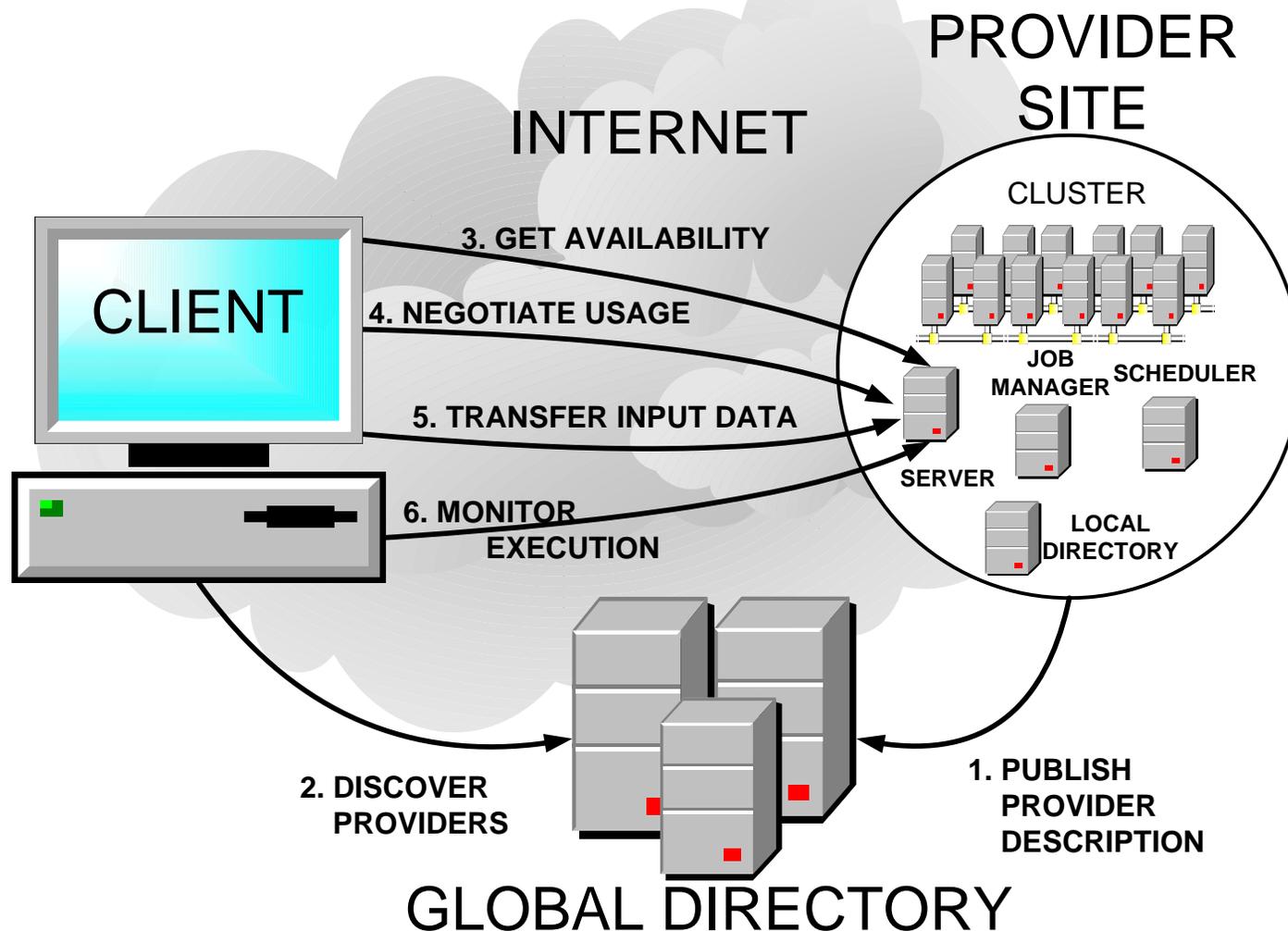
**Space-Time-State Evolution**

March/2006

### Project Phases

- **Micro-model:**  $10^3$  to  $10^4$  elements based on selected industry specs
- **Macro-model:**  $10^4$  to  $10^6$  agent-based model containing selected abstractions validated against micro-model

# Architecture of Global Compute Grid



# Micro-model conception

## Layered Component Architecture

**Network Layer:** sites located in  $(x,y,z)$ -space used to compute distance in hops and simulate transmission delays; TCP-like simulated transport protocol; nodes model CPU delays, buffer & port capacity

**Basic Web Services:** WS- Addressing and Messaging

**WSRF:** WS- Resource Property, Lifetime, Notification, Topics, Service Group

**Grid Services:** MDS v4, WS-Agreement, and DRMAA

## Major Grid Entities

**Service Providers:** negotiate, schedule, execute, and monitor client tasks on vector or cluster computers maintained at a related site

**Clients:** discover providers, rank discoveries by earliest availability, seek agreements, submit & monitor jobs

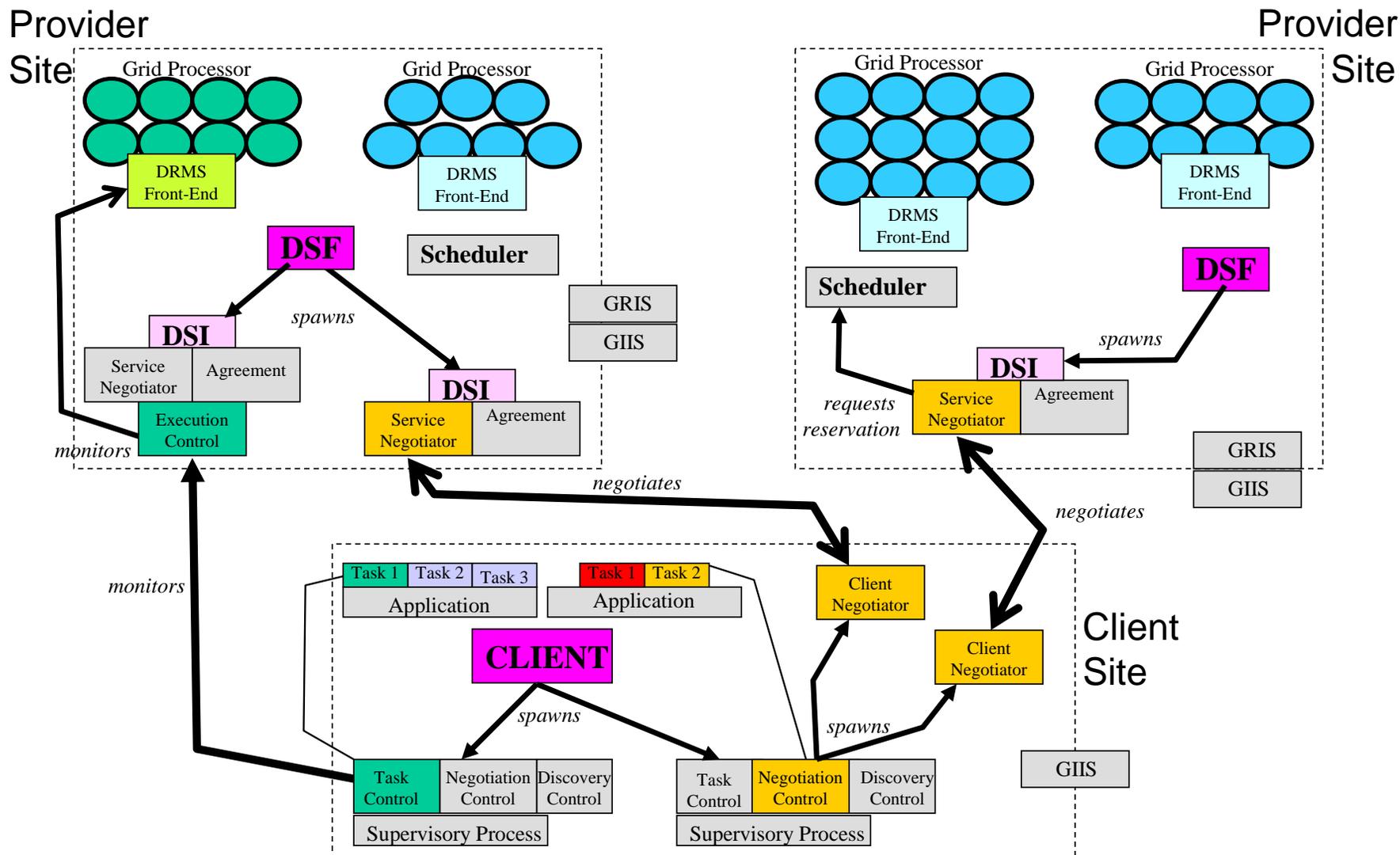
## Client Grid Applications

**Application types:** workflows of  $n$  sequential tasks, each with parallelizable sub-computations – dependent tasks may not start until preceding task completes

**Tasks:** types defined by tuple (required code, task parallelism, compute cycles) and matched to processor component with suitable code and parallelism

**Workload:** represented as a percentage of system capacity – regulated by assignment of applications to clients

# Schematic showing operation of simulated grid



# Case Study: DoS Attack on Simulated Grid

- **Deploy simulated topology:** 200 nodes covering 30 provider sites and 12 clients, where each client uses one of two negotiation strategies
- **Negotiation strategies:** serial reservation requests (SRR) or concurrent reservation requests (CRR)
- **Run baseline:** 50% workload for 200,000 simulated seconds and measure the distribution of job completion times
- **Repeat run:** inject service-provider spoofing with probability 50%, effectively reduces system capacity by half on average
- **Repeat run:** identical spoofing but introduce a strategy to resist spoofing: identify spoofer and do not repeat interactions with them

## Three Questions of Interest

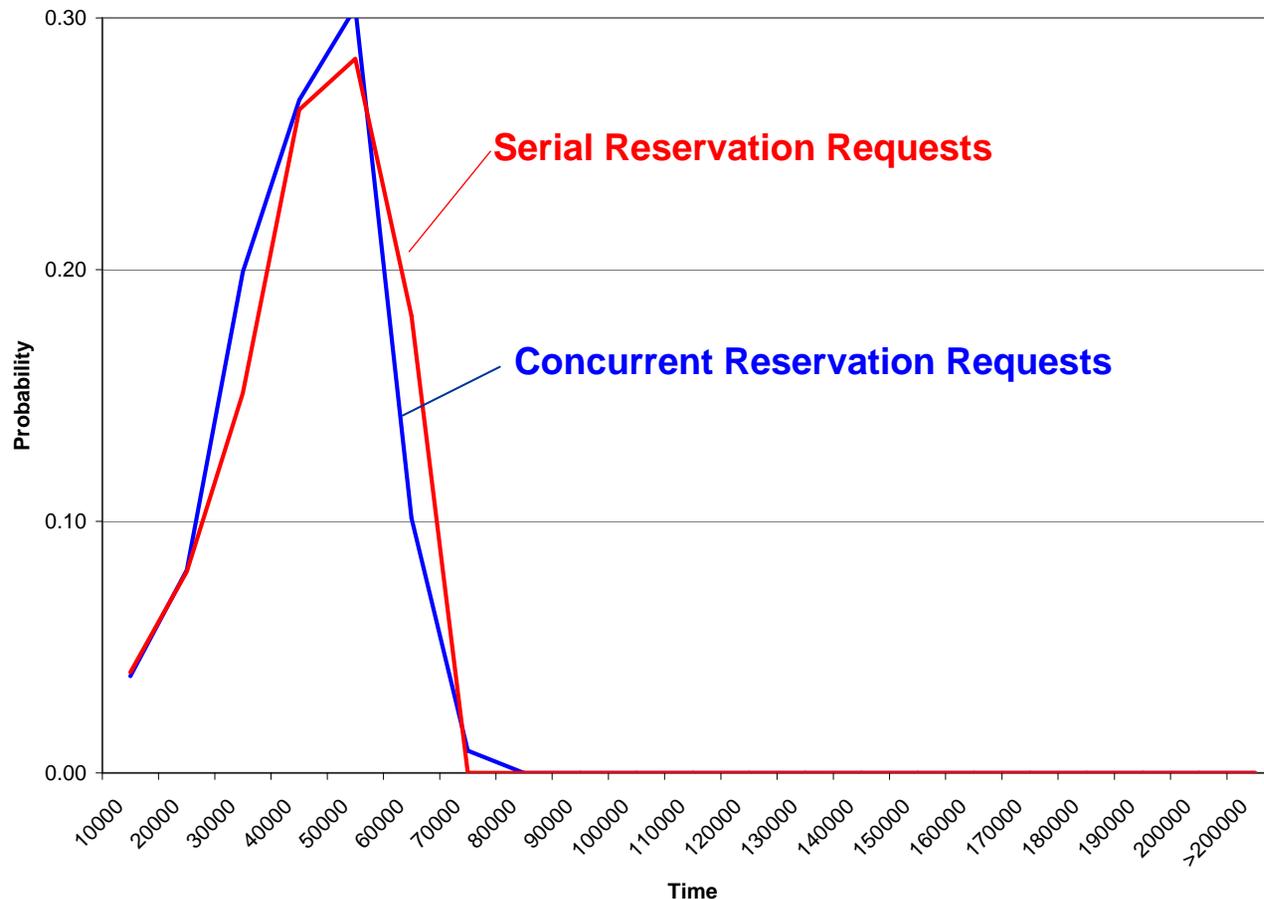
1. Which negotiation strategy is more effective under normal conditions?
2. Does the outcome change under attack?
3. Does the outcome change when resisting attack?

## Bottom Line

1. CRR performs slightly better than SRR under normal conditions
2. CRR performs significantly better than SRR under attack scenario
3. **Surprise:** both CRR and SRR perform worse when resisting attack and the performance of CRR deteriorates more than SRR

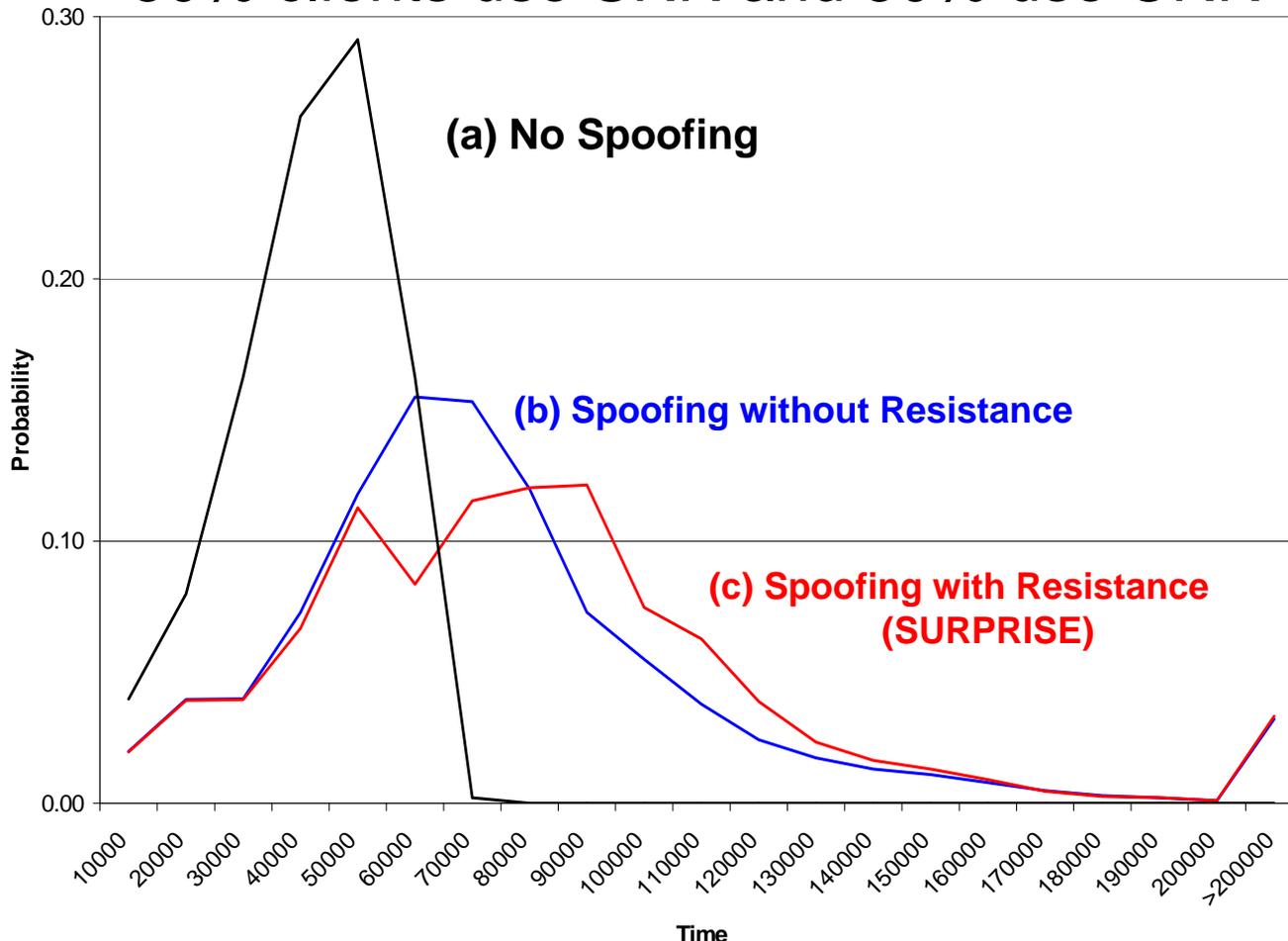
The **surprise** arises because scheduling and execution of jobs in the global grid is an **emergent behavior** arising from a **self-organizing property** of distributed resource-management algorithms

# Serial Reservation Requests (SRR) vs. Concurrent Reservation Requests (CRR) with No Spoofing



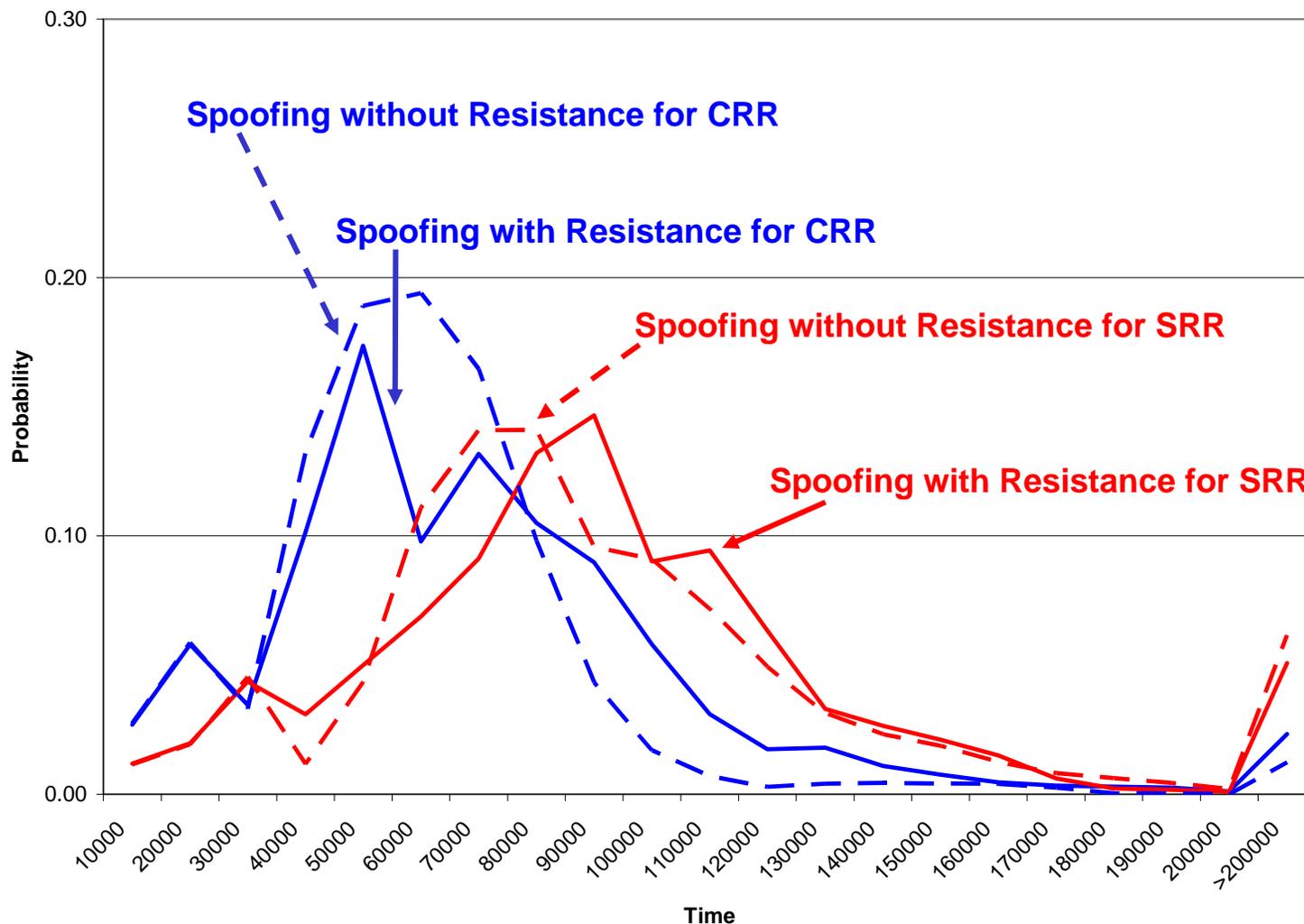
Comparative distribution of application completion times for two negotiation strategies (over 200+ repetitions)

# Performance Degradation caused by Spoofing in Grid where 50% clients use SRR and 50% use CRR

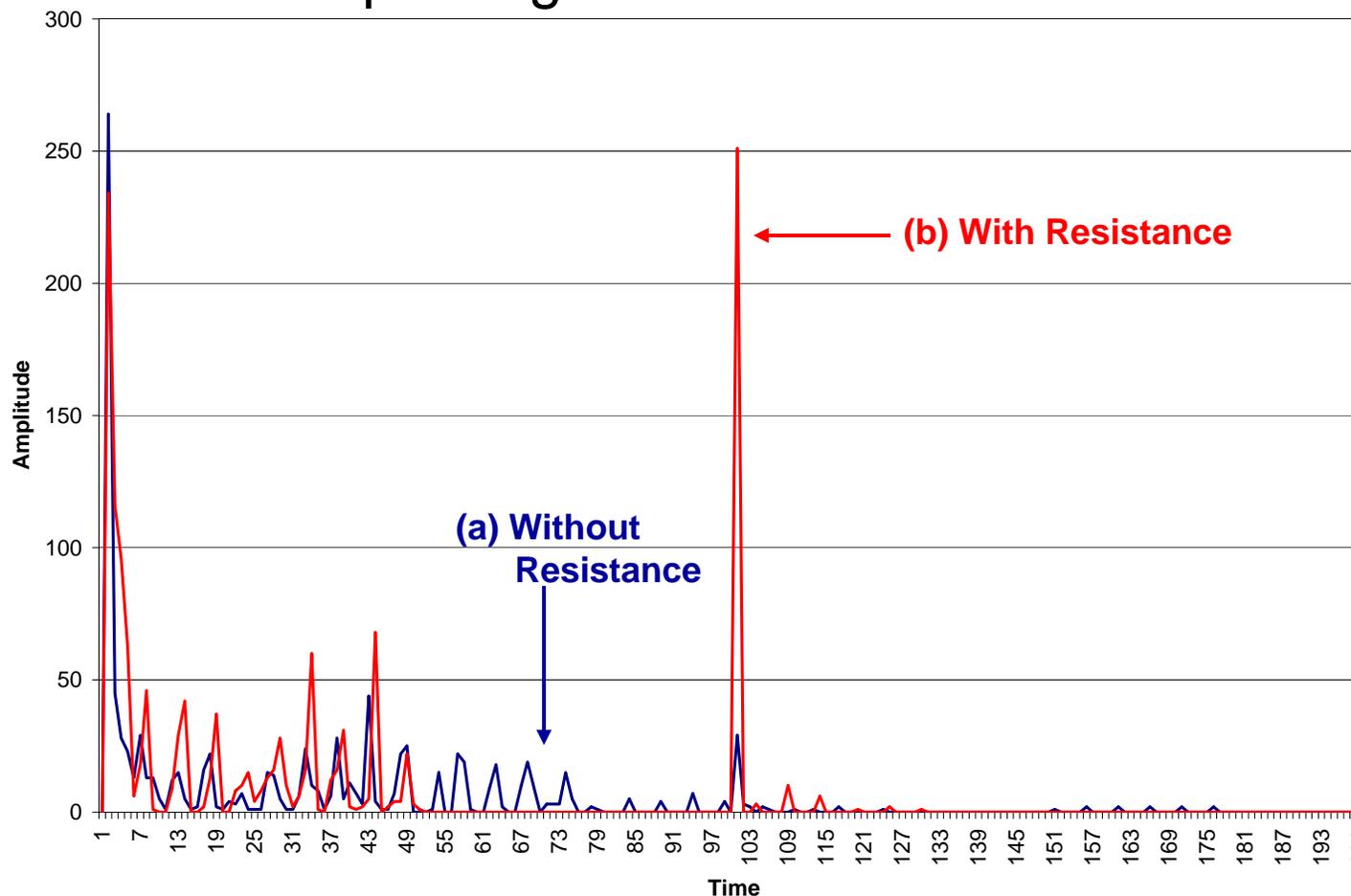


Comparative distribution of application completion times: (a) No Spoofing, (b) Spoofing without Resistance, and (c) Spoofing with Resistance (200+ repetitions)

# Decomposing performance degradation caused by spoofing

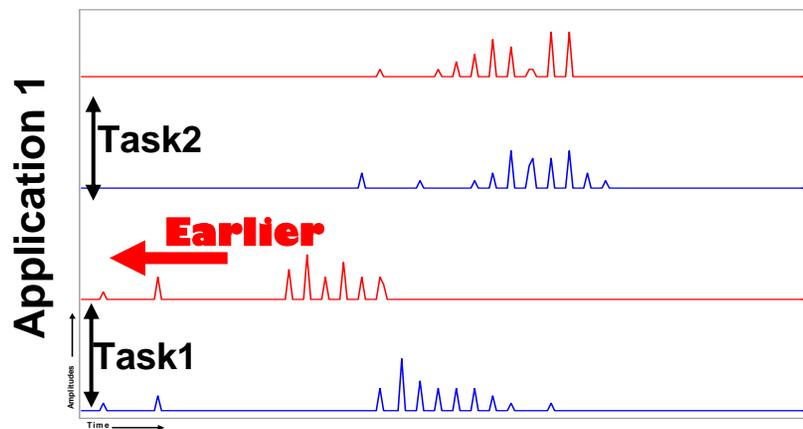


# Aggregate Reservations Created over Time under Spoofing with and without Resistance

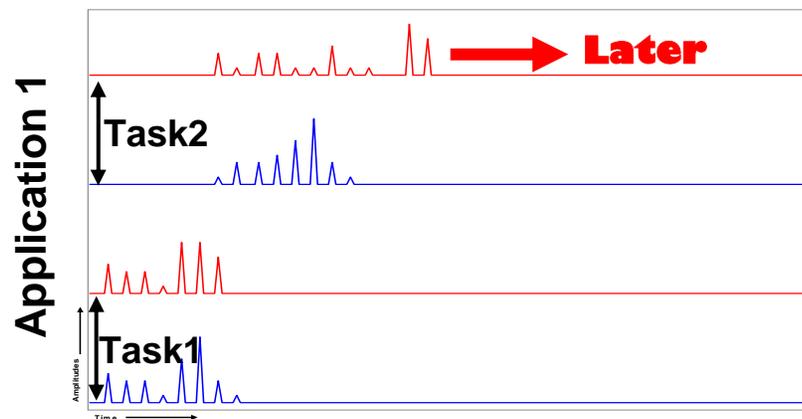


Two Time Series: (a) Reservations Created without Resistance and (b) Reservations Created with Resistance – 50% clients SRR and 50% CRR

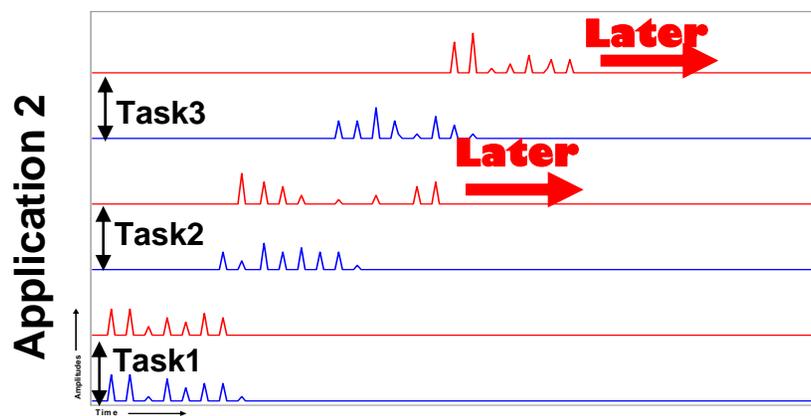
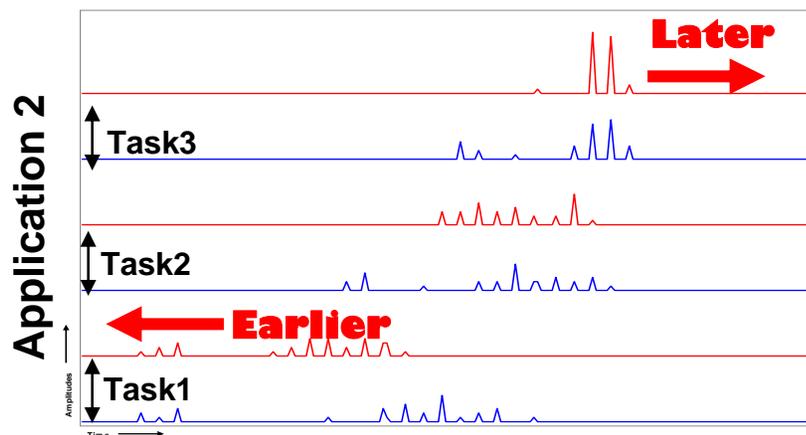
# Time Series for Application/Task Completions: Two Application Types without Resistance (lower blue) vs. with Resistance (upper red)



*Serial Reservation Requests (SRR)*



*Concurrent Reservation Requests (CRR)*



# Conclusions

- **Global Grids** will be dynamic open **complex adaptive systems** with **self-organizing properties** leading to **emergent behaviors**
- **Changes** made to behavior **in individual components** could have **pervasive** and unexpected **effects on global behavior**
- We **need** to develop a **science of complex information systems** in order to predict and control macroscopic behavior