



# Embracing Complexity in System of Systems Analysis and Architecting

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**Cihan H. Dagli**

INCOSE and IIE Fellow

Founder Director Systems Engineering Graduate Program  
Missouri University of Science and Technology

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# Outline

- Systems of Systems Analysis and Architecting
  - Sos as a Complex System
  - Modeling Approach
  - Meta-Architecture Generation
  - Simulation Methodology
- Concluding Remarks

# SoS as Complex Systems

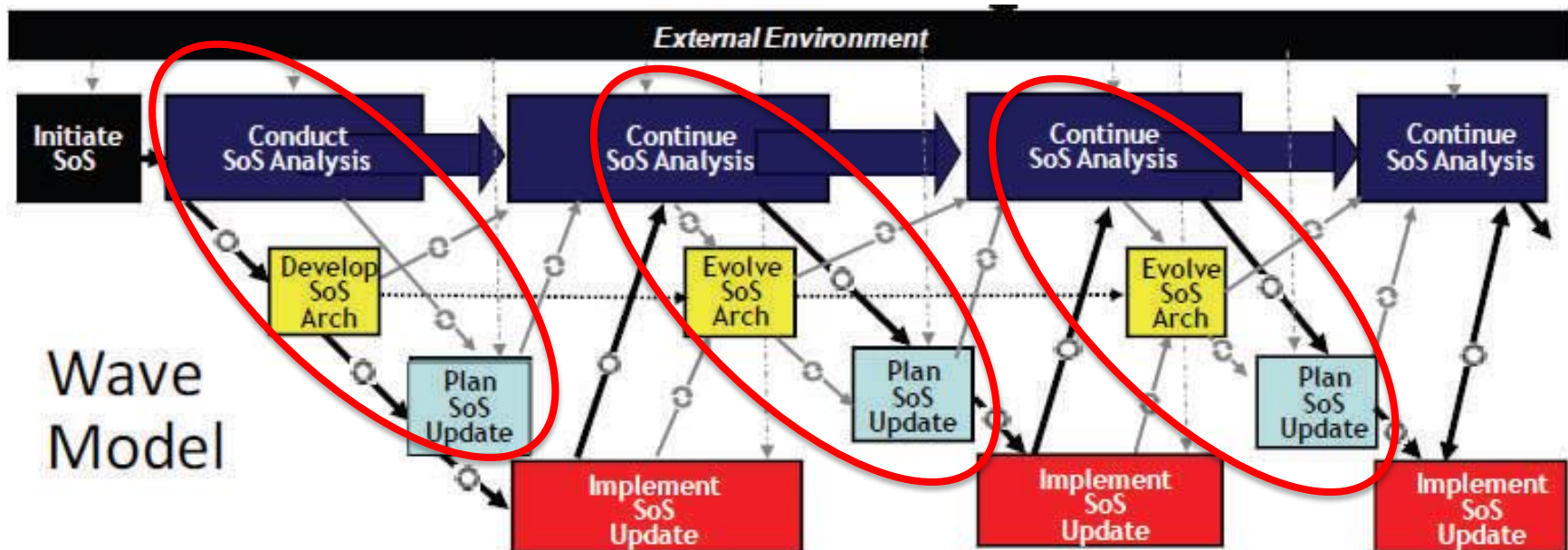
- Motivation for SoS as Complex System
  - Current lack of understanding of system participation choice on the overall SoS capability.
  - Simulation and Modeling techniques for Acknowledged SoS are still in their infancy.
  - Need for Domain Independent SoS Architecture assessment method.
- Objectives for SoS as Complex System
  - To develop a proof of concept ABM tools suite for SoS systems simulation for architecture selection and evolution.
  - To have a structured, repeatable approach for planning and modeling.
  - To study and evaluate the impact of individual system behavior on SoS capability and architecture evolution process.

# Acknowledged SoS: Complex System

- Recognized objectives, a designated manager
  - Allocated resources for the SoS development
- Constituent systems
  - Independent ownership, objectives
  - May be different in any stage of their life cycle
  - Their own development and sustainment approaches
- Participation in the SoS may be desired, but infeasible
  - Changes in the systems are based on collaboration between the SoS and the system.
  - There are no guarantees that individual systems will be able to deliver any part of the capability they are asked to provide to the SoS.

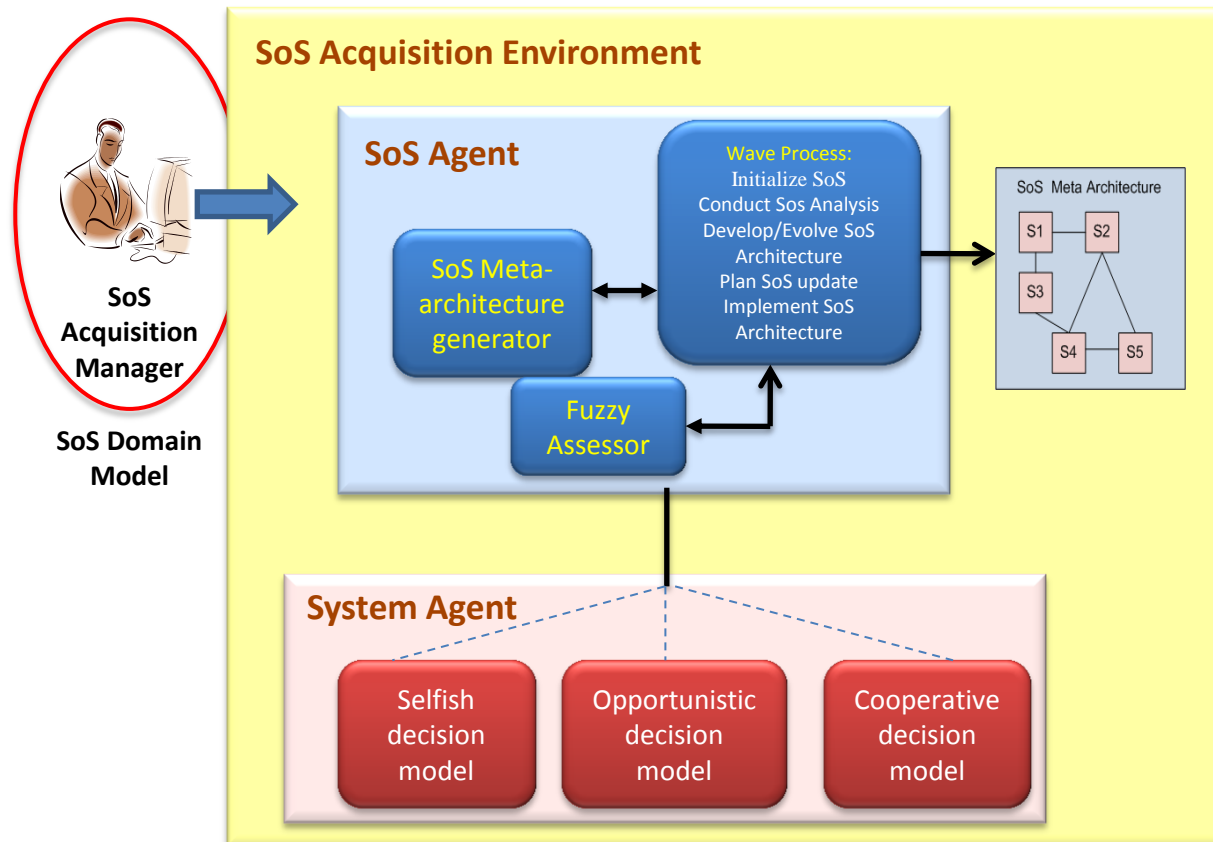
# SoS Acquisition Wave Model

- The evolution of the SoS proceeds in Waves of Analysis and Update





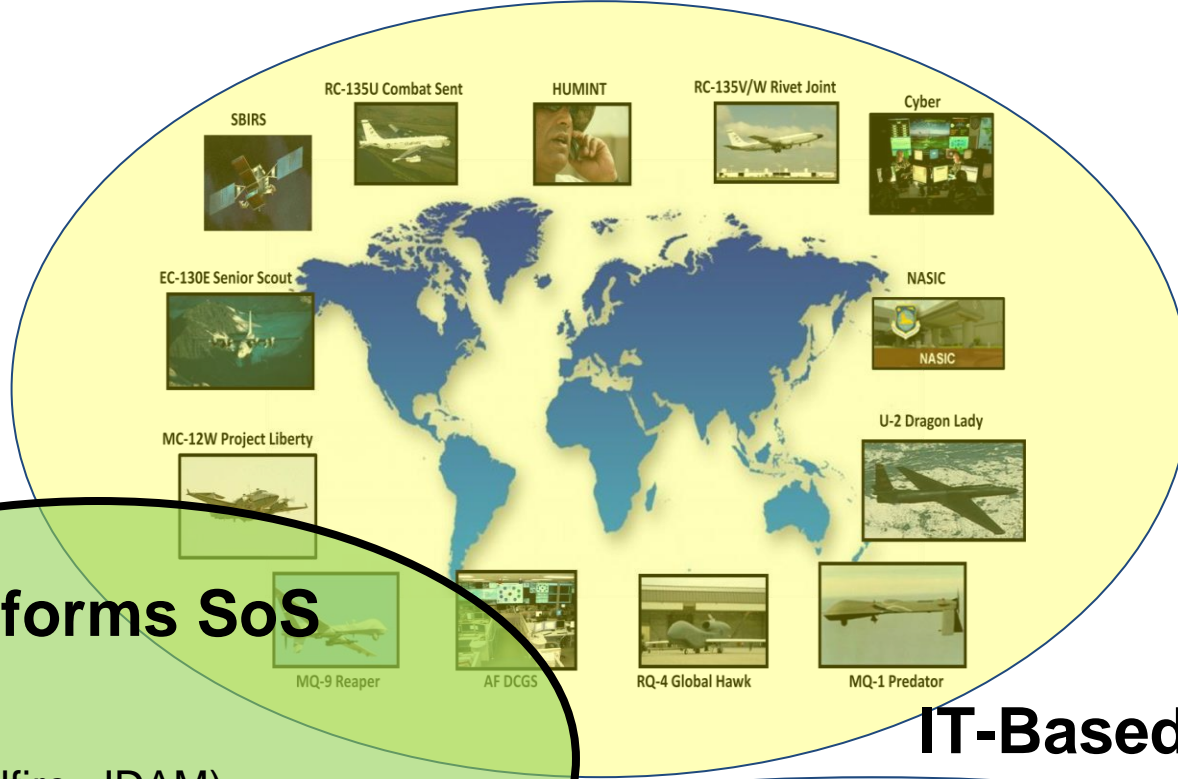
# The Start of an Acknowledged SoS



# Global ISR Mission SoS

- In the Gulf War, Iraqi forces used mobile missile launchers called Transporter Erector Launchers (TELS) to strike at Israel and Coalition forces with ballistic missiles.
- Existing intelligence, surveillance, and reconnaissance (ISR) assets were inadequate to find the TELs during their vulnerable setup and knock down time.
- This offers a prime example of existing systems being inadequate to address a mission, but some relatively low cost, quick changes, and joining together of existing systems might be used to create an SoS capability to achieve the mission.

# Global ISR Mission SoS



## RPA Platforms SoS MQ-1, MQ-9

Weapons (Hellfire, JDAM)  
Payloads (Sensor, Targeting)  
Ground Control Station



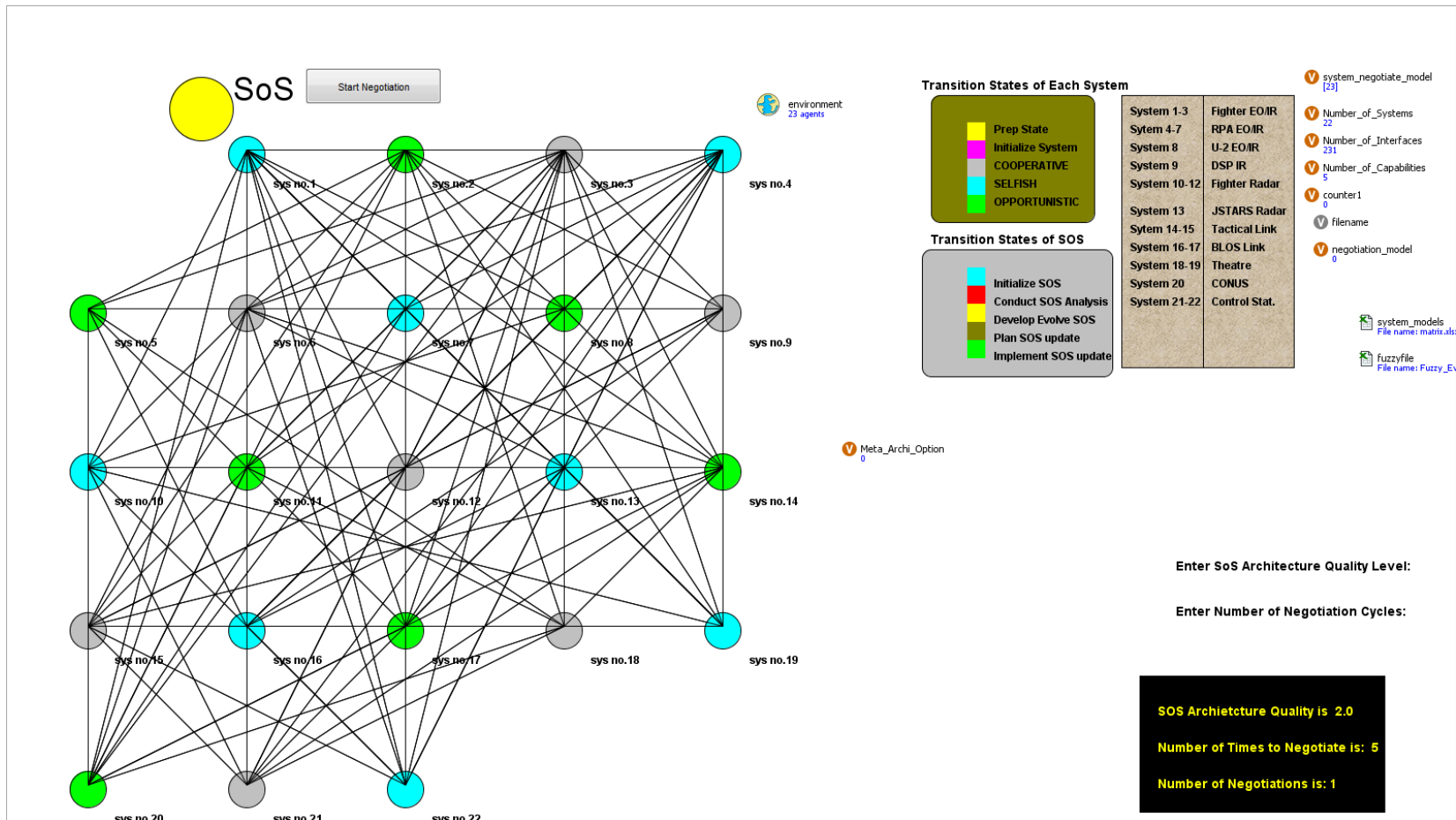
## IT-Based SoS

SATCOM  
Tactical Datalink (Link16)





# Network Representation of SoS



# Modeling SoS as Complex Systems

- The framework is applicable to Acknowledged SoS.
- Each contributing system is a fully functioning, independently funded and managed system with predefined capabilities.
- Wave Model for SoS SE is used to abstract behavioral aspects of the acquisition process
- The SoS achieves its goals by combining existing system capabilities and adding minor new capabilities and interfaces.
- One cycle through the proposal – agreement – negotiation steps is an *epoch* in the wave model.

# Modeling SoS as Complex Systems

The overall mathematical framework of the ABM is described based on 3 main elements of the model:

1. **SoS acquisition environment:** The SoS agent is influenced by the changes in the SoS acquisition environment. Thus the initial environment model  $E_0$  can be represented as a function of these variables:

$$E_0 = f(\textit{National priorities}, \textit{SoS funding}, \textit{threats})$$

2. **SoS agent behavior:** SoS agent is responsible for the overall SoS engineering activity and coordinates with individual system agents to achieve the desired SoS mission capability.

3. **Individual system agent behavior:** Individual systems receive request for connectivity to SoS architecture. The system has the option to cooperate or negotiate with the SoS agent to request more funding, deadline or performance change.

# Modeling SoS as Complex Systems

## SoS Agent

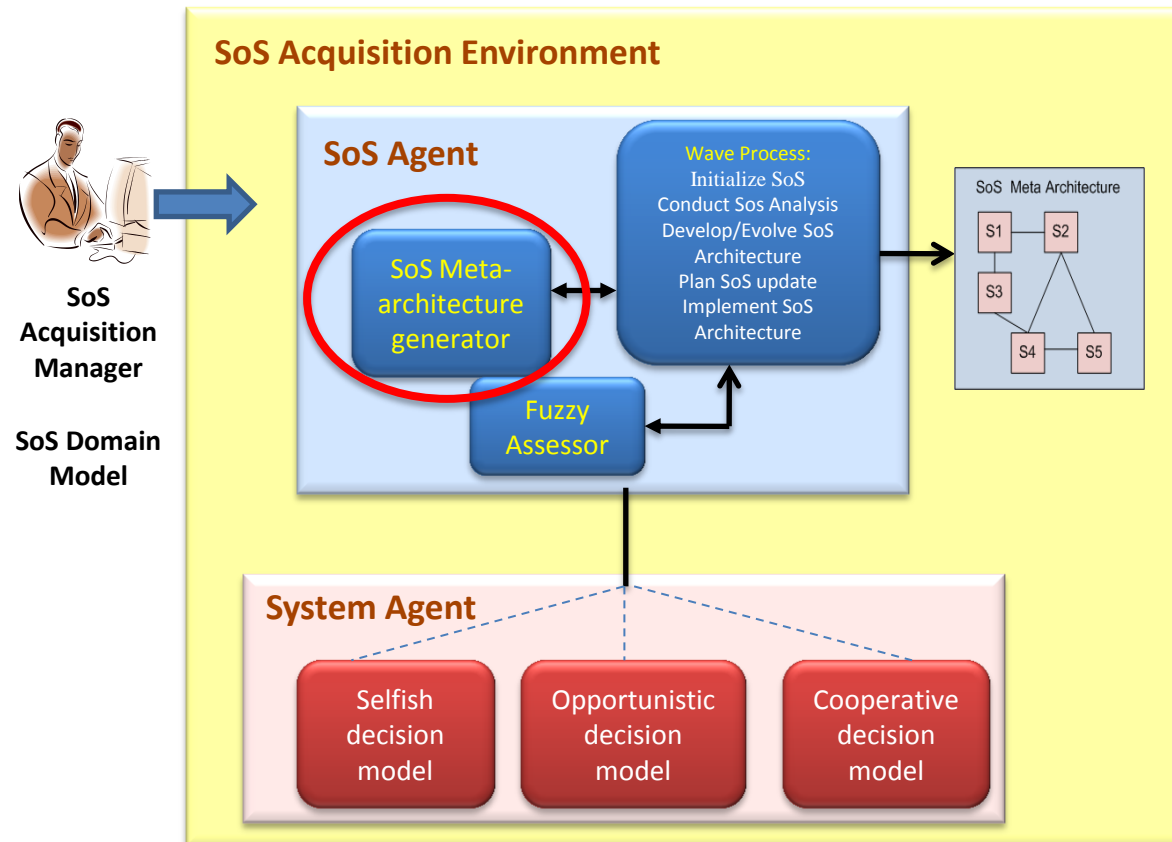
- Starts with an initial SoS architecture.
- Follows the Wave Model for SoS SE.
- Makes request to each system for capabilities defined in the initial architecture.
- Gathers responses from all systems.
- Evaluates SoS architecture quality from agreed system contributions.
- Negotiates with systems to achieve better SoS.

# Modeling SoS as Complex Systems

- **Create a domain specific model**
  - Key Performance Attribute algorithms for evaluating an SoS architecture using a fuzzy inference system (FIS).
  - Feasibility rules prohibit some architectures.
- **Search for SoS Meta-architecture**
  - Genetic Algorithm develops optimized architectures. using the domain specific model.
- **Negotiation with individual systems**
  - Agent Based Model manages individual system negotiation models to produce a “realizable” architecture chromosome through their cooperation.



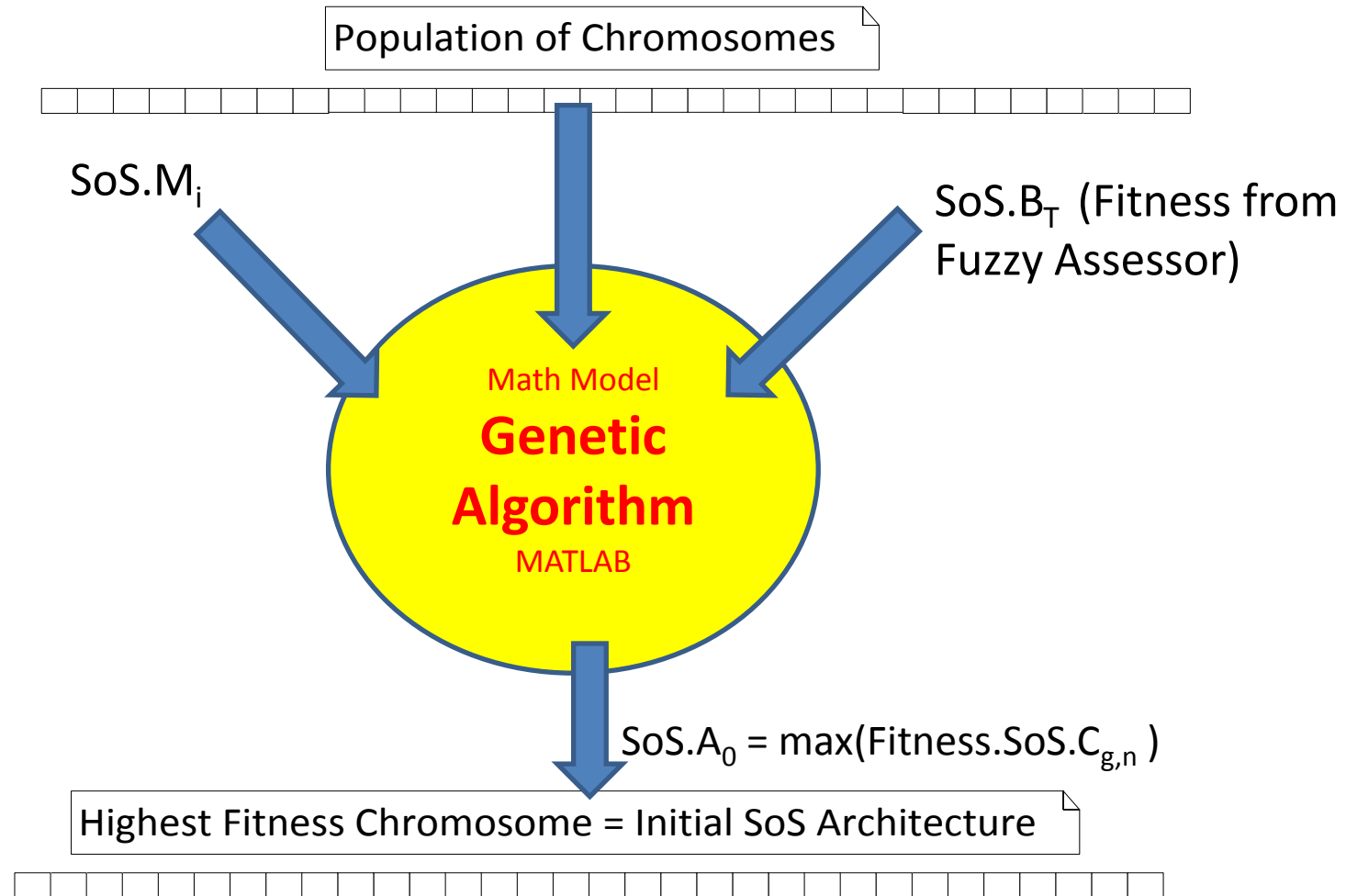
# Searching for SoS Meta-Architecture



# Evolutionary Methodologies For Solving Multi-Objective Functions

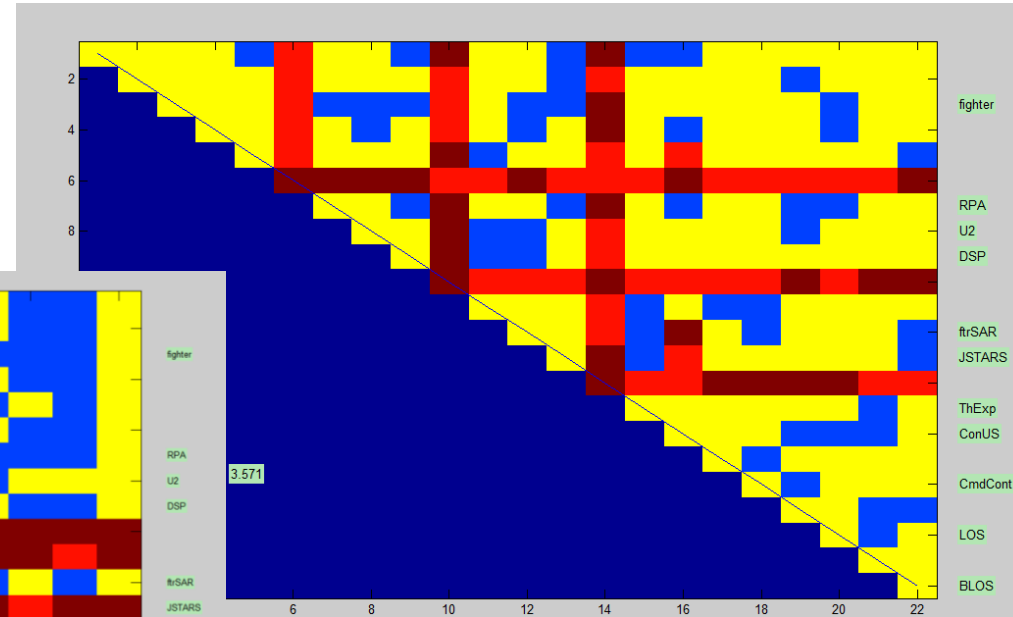
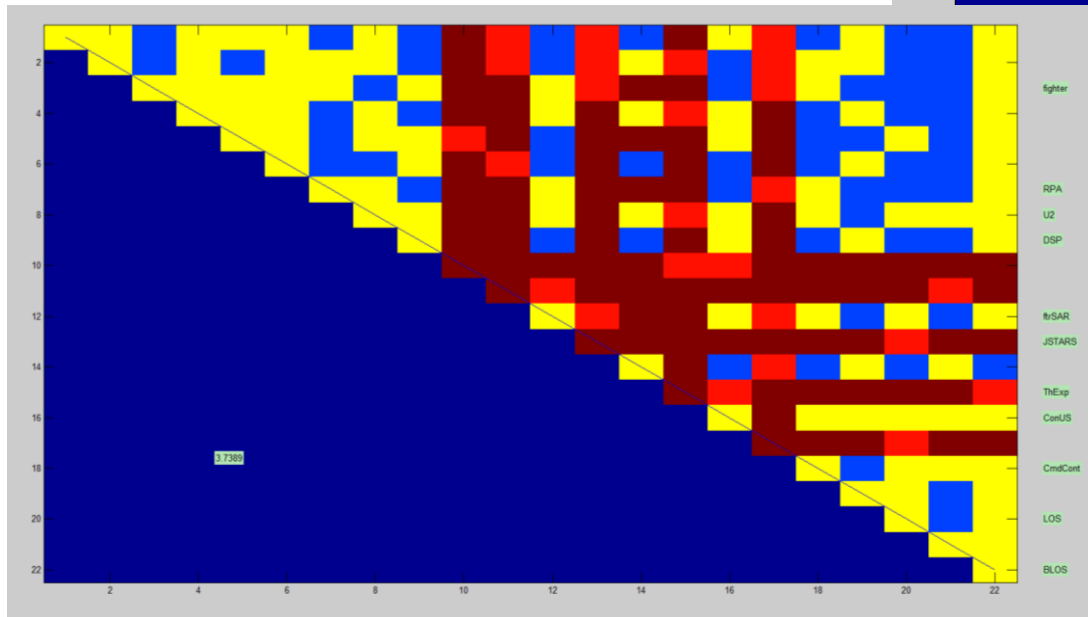
- Genetic Algorithm is used to generate candidates for SoS meta-architecture.
- Genetic algorithms work in an iterative process through many generations.
- A new set of genes is a result of random parent selection, cross over and mutation.
- As a result, the new combinations are efficiently explored based on available knowledge to find a new generation with better fitness. That is, a better objective function value.

# Searching for SoS Meta-Architecture



# Genetic Algorithm Search Operation

Final GA selection; Fitness = 3.7389

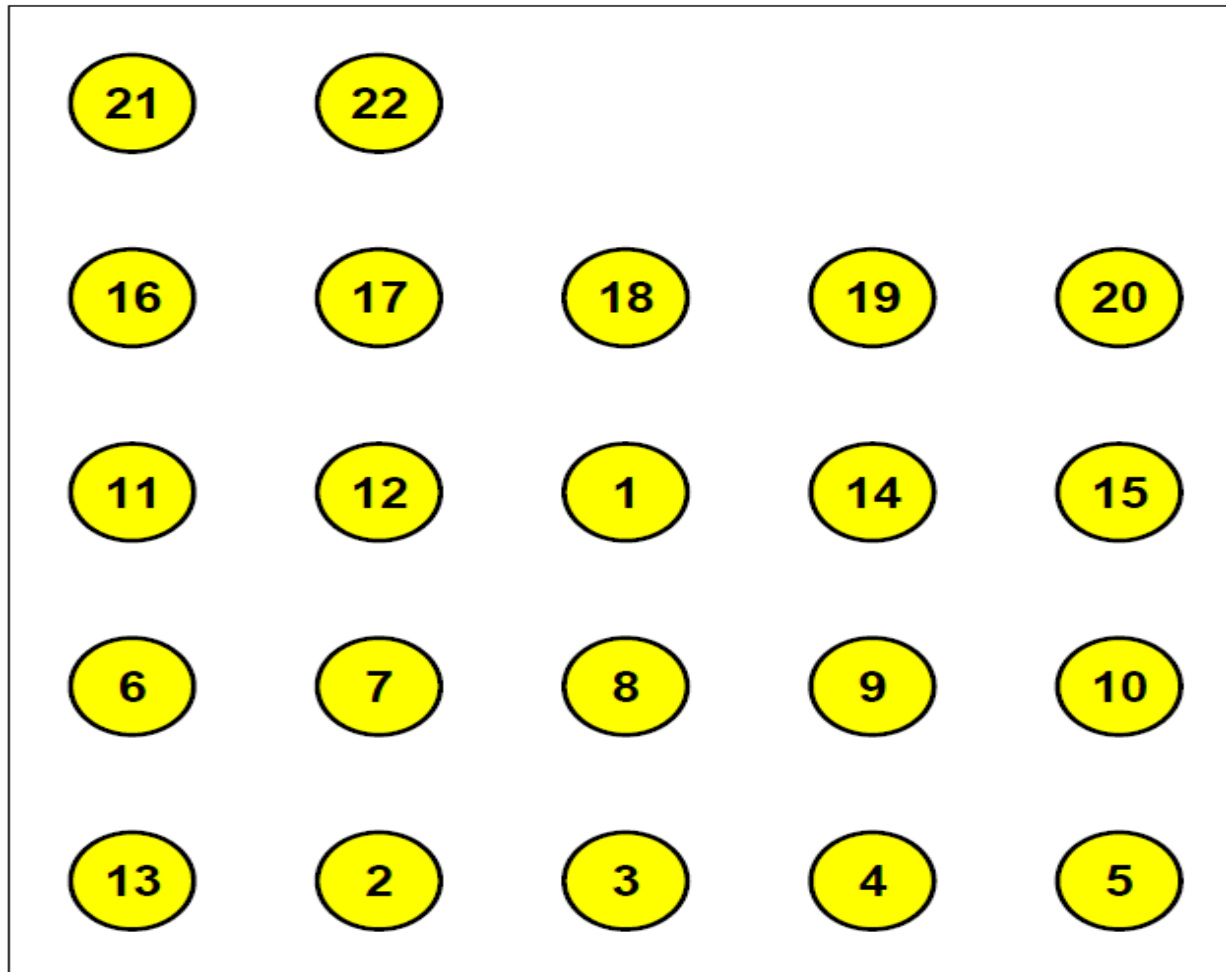


Initial population best chromosome  
Fitness = 3.571 (worst was 1.28)

Systems are on diagonal, interfaces at i-j intersections  
Yellow/green – feasible/used; Blue – feasible/unused  
Red – infeasible/used; Brown – infeasible/unused

# Searching for SoS Meta-Architecture

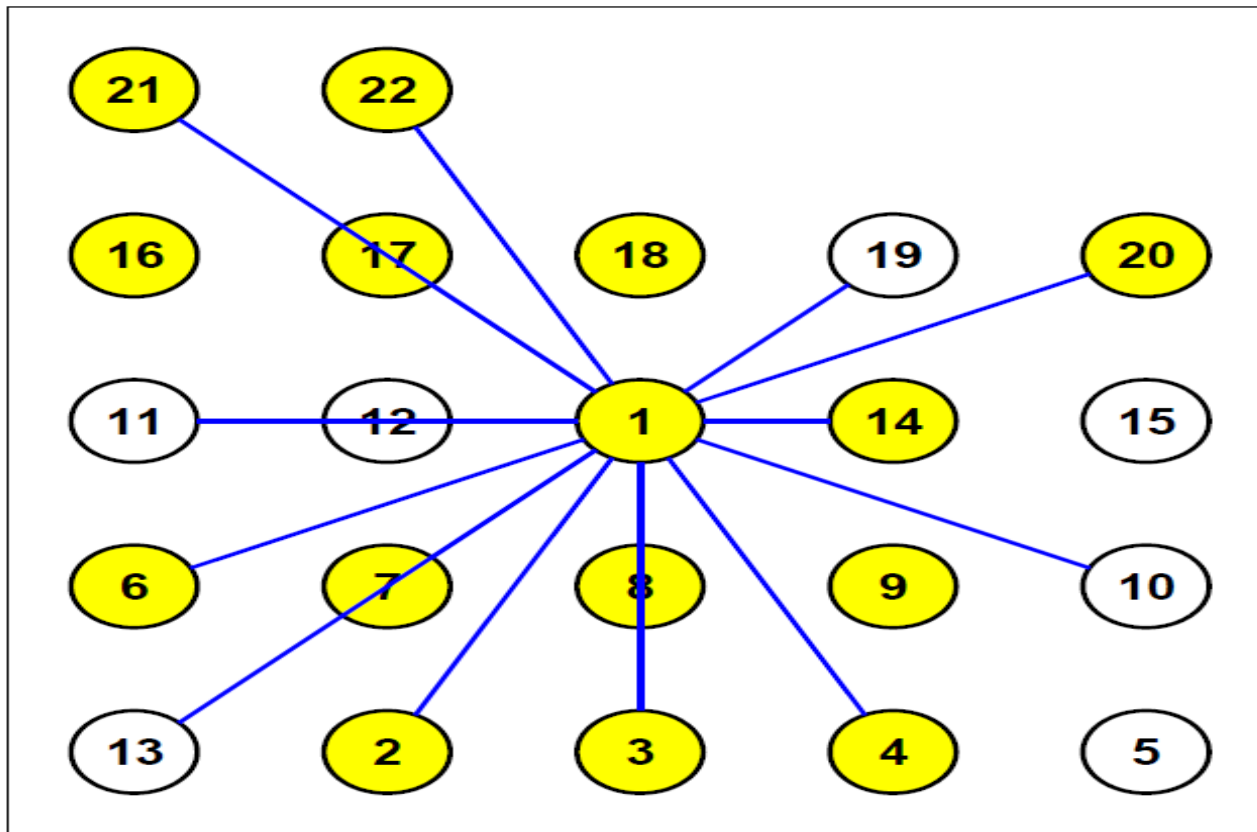
Network and Interfaces of System 1





# Searching for SoS Meta-Architecture

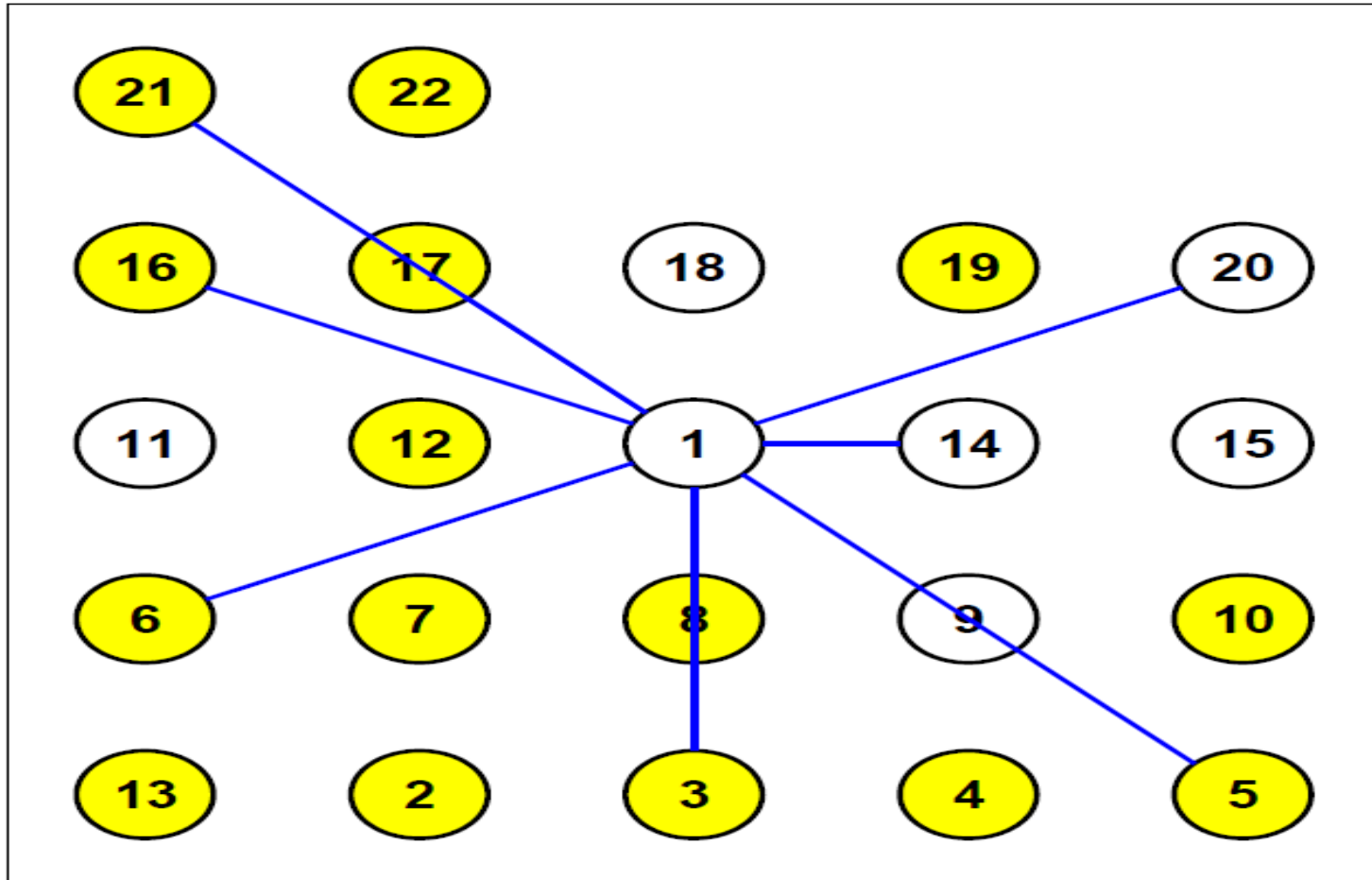
Network and Interfaces of System 1



Good Architecture

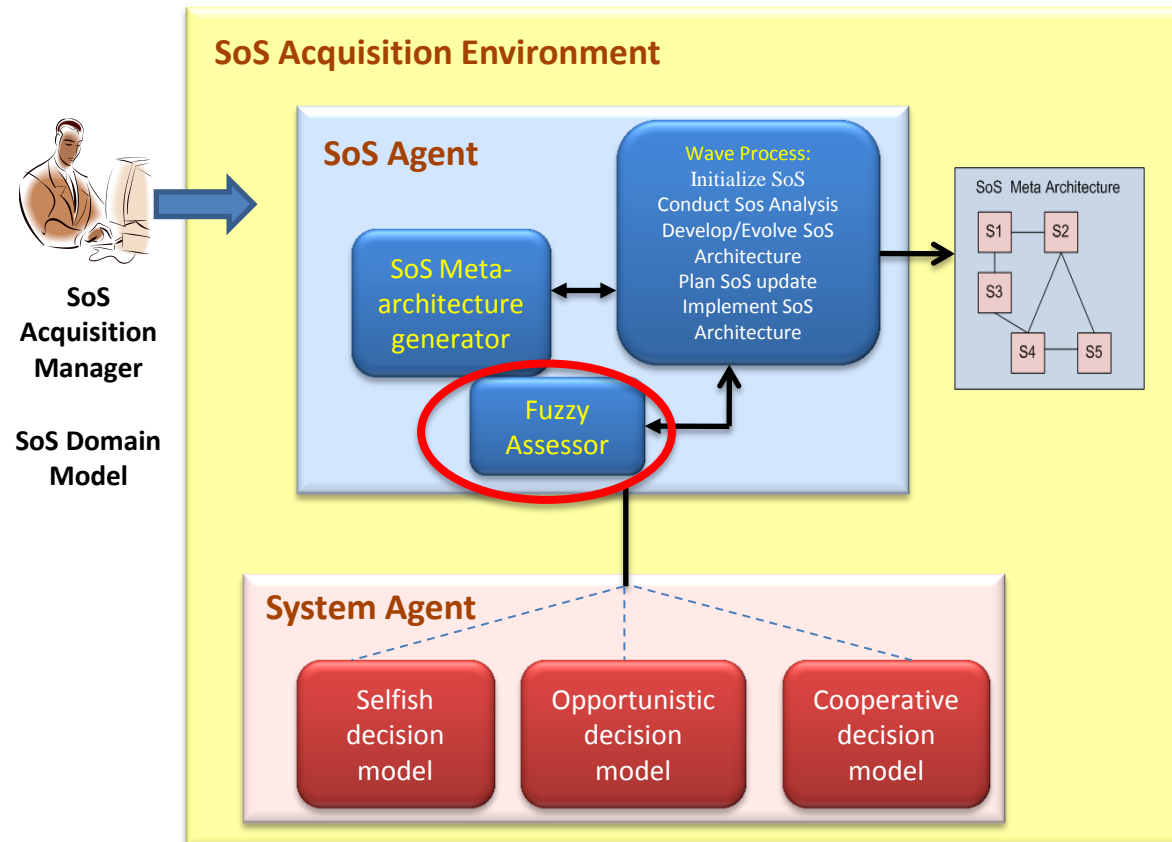
# Searching for SoS Meta-Architecture

Network and Interfaces of System 1

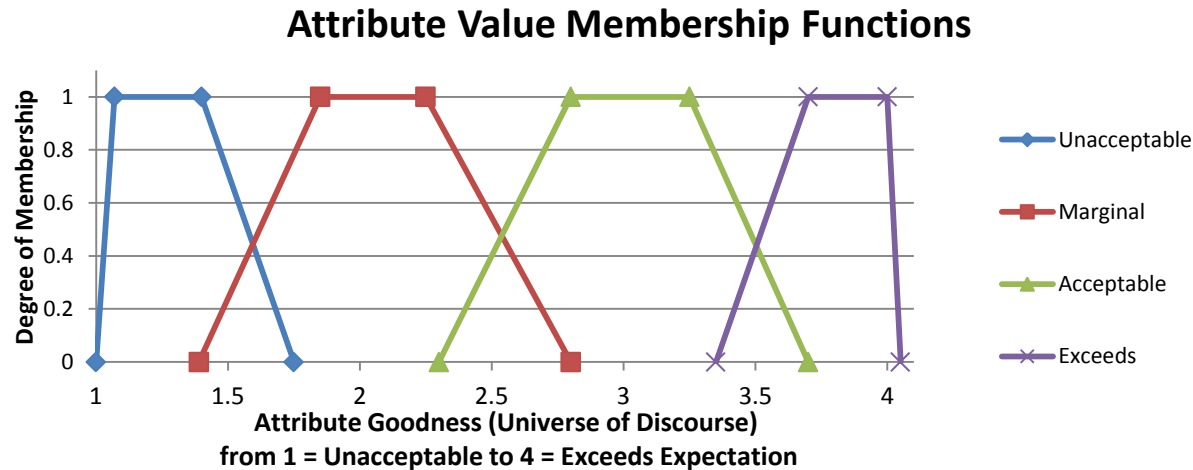


Mediocre Architecture

# Fuzzy Assessor for Meta-Architecture to Calculate the Best SoS Architecture



# Fuzzy Assessment for Multi-Attribute SoS Architectures



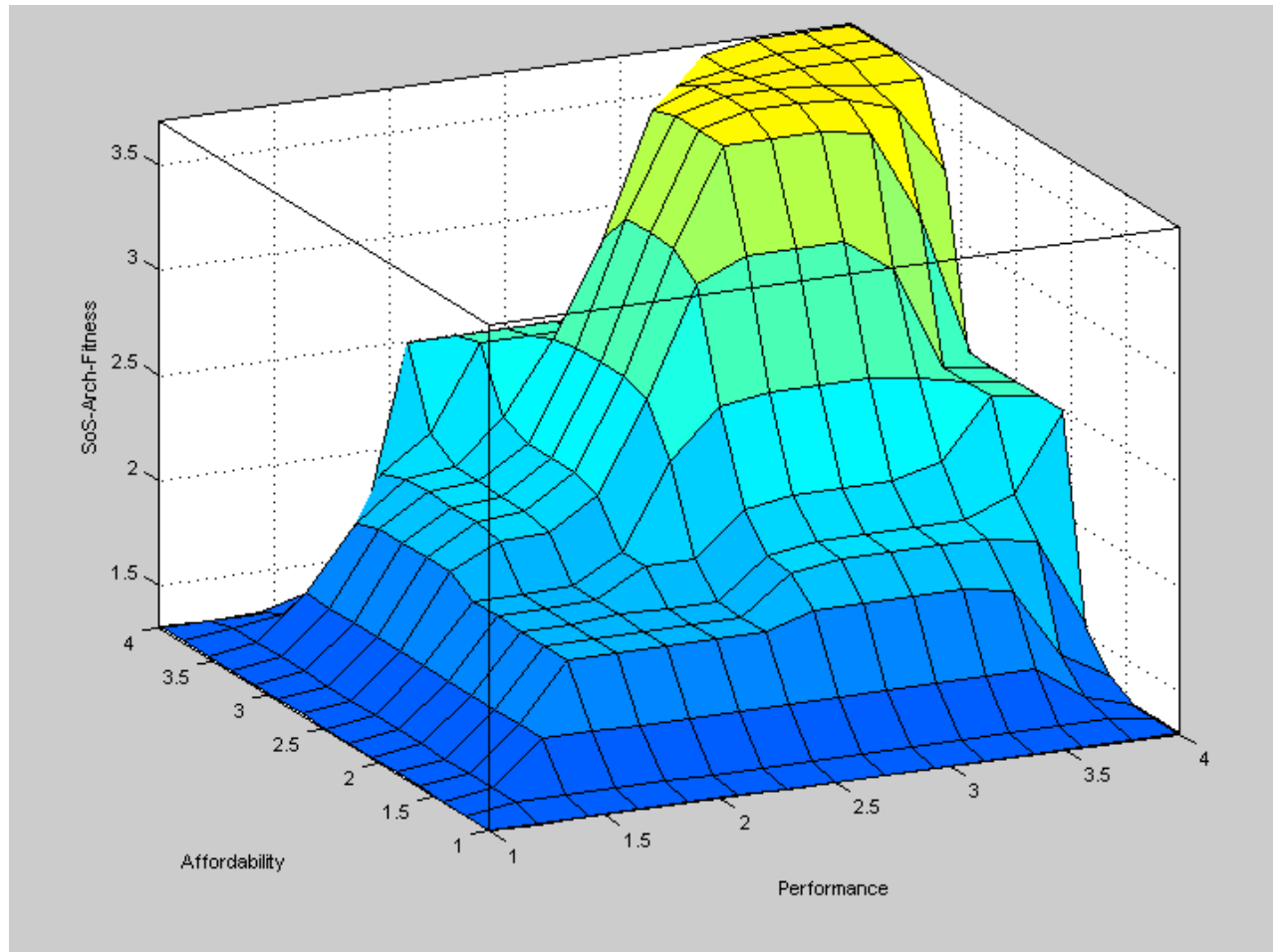
Attribute evaluations themselves are well suited to fuzzy logic approaches because of the difficult nature of boundaries between subjective evaluation ranges. A particular SoS architecture (chromosome) may fall partially into an Acceptable, and partly into a Marginal set.

# Fuzzy Assessor

- The Fuzzy Assessor is used to evaluate the fitness of an architecture chromosome.
- Fitness will be judged by a combination of the attributes of an architecture, such as:
  - Affordability, Performance, Robustness, Flexibility, Scalability...
  - Others, as developed through guided discussions with Stakeholders and Subject Matter Experts (SMEs).
- The attributes will be domain adjusted and selectable, using guidance from SMEs.
- Fuzzy membership functions  $\Phi_k$  (derived from stakeholder views) describe the degrees of goodness in each attribute area.
- Fuzzy rules  $\rho_k$  (also derived from stakeholder views) combine the attributes into an overall fitness measure.

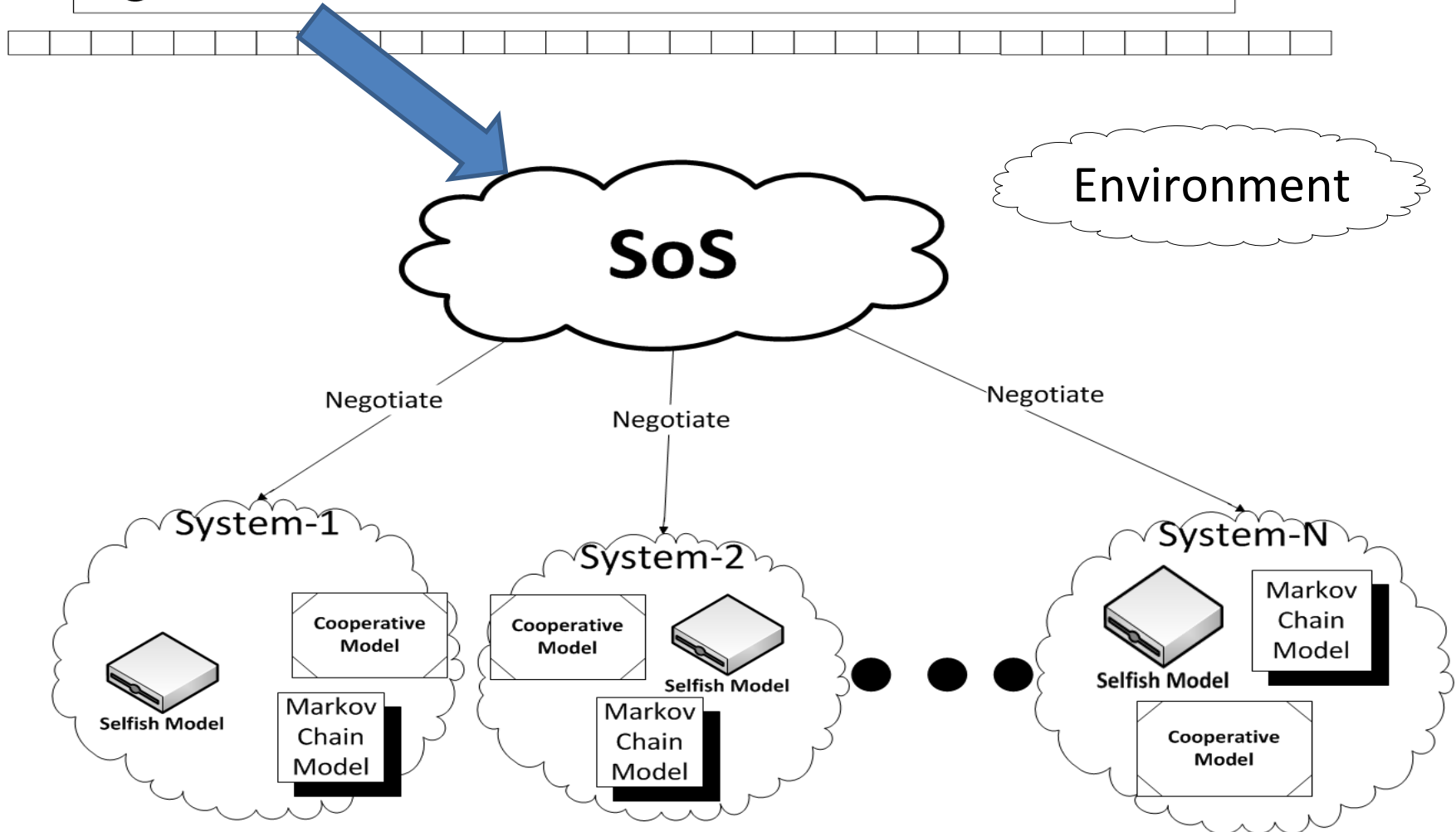


# Fuzzy Inference System Output Surface



# Modeling SoS as Complex Systems

Highest Fitness Chromosome = Initial SoS Architecture



# Modeling SoS as Complex Systems

## Transition States of Each System



## Transition States of SOS



System 1-3	Fighter EO/IR
System 4-7	RPA EO/IR
System 8	U-2 EO/IR
System 9	DSP IR
System 10-12	Fighter Radar
System 13	JSTARS Radar
System 14-15	Tactical Link
System 16-17	BLOS Link
System 18-19	Theatre
System 20	CONUS
System 21-22	Control Stat.

# Negotiating Between SoS and System Providing Capability to SoS

- Rules of Engagement for SoS Agent.
- System Negotiation Models: They are incorporated in the ABM simulation as MATLAB executable called by the environment.
  - Cooperative.
  - Selfish.
  - Opportunistic.

# User-Inputs for Negotiation Models

Enter SoS Architecture Quality Level:



Enter Number of Negotiation Cycles:

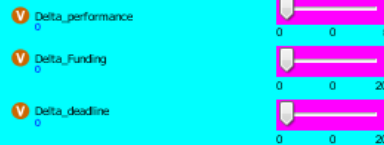


**SOS Archietcture Quality is 2.0**

**Number of Times to Negotiate is: 5**

**Number of Negotiations is: 0**

### Threshold Values for Acceptable Change Performance Deadline and Funding (inclusive +/-)

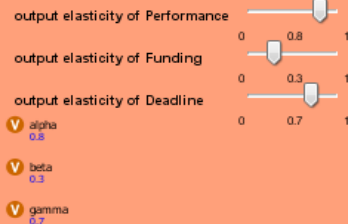


### Meta Architecture Generation options

- Fuzzy-Genetic ...
- Multiobjective O...
- MultiLevel Optim...

### Negotiation Model options

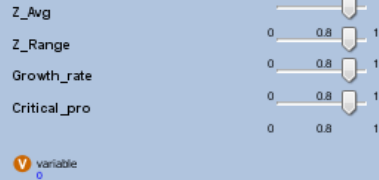
#### Cooperative Negotiation Model parameters



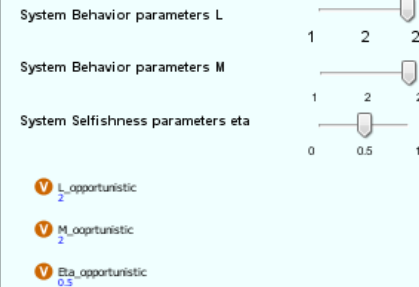
#### Selfish Negotiation Model parameters

To change the characteristics of the system k

Resource per time unit



#### Opportunistic Negotiation Model parameters



# Concluding Remarks

- SoS are systems at the edge of chaos
- SoS can be represented as networks
- It is important to understand emergence in SoS context
- Tools for SoS architecting should provide capabilities to analyze SoS as complex systems with cant properties including
  - Individual systems
  - Interactions
  - Operation
  - Diversity
  - Operational environment
  - Activities

# Concluding Remarks

- SoS acquisition wave model responds nicely with space, time, complexity and self organization attributes of complex systems.
- Mathematical models can be developed in formulating the dynamics of SoS systems.
- Meta-architecture is the driving force in creating the behavior of SoS as in the case in complex systems.
- Rules of engagement incorporated with meta-architecture creates the emergent behavior of SoS.



# Concluding Remarks

- Acknowledged SoS is a point in the spectrum of complex systems.
- Agent Based Architecture model framework can support decision making of the acknowledged SoS manager in negotiating SoS with participating systems
- It is possible to produce a SoS meta-architecture using genetic algorithms with fuzzy logic based inference providing a fitness assessor.
- ABM model and the approach need to be validated with a real life experiment.

# Acknowledgement

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