



ITO Initiatives in Embedded Software

Dr. Shankar Sastry, DARPA/ITO
Control and Dynamical Systems Future Directions
University of Maryland, June 16th, 2000



Outline



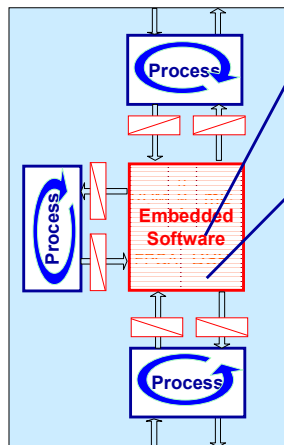
- ◆ **What is the problem?**
- ◆ **How can we solve it?**
 - Software and Physics
 - Embracing Change
 - Dynamic Structures
- ◆ **Summary of ITO Initiatives**



The Technology Challenge



Embedded systems: information systems tightly integrated with physical processes



Problem indicators:

- Integration cost is too high (40-50%)
- Cost of change is high
- Design productivity crisis

Root cause of problems is the emerging new role of embedded information systems:

- exploding integration role
- new functionalities that cannot be implemented otherwise
- expected source of flexibility in systems

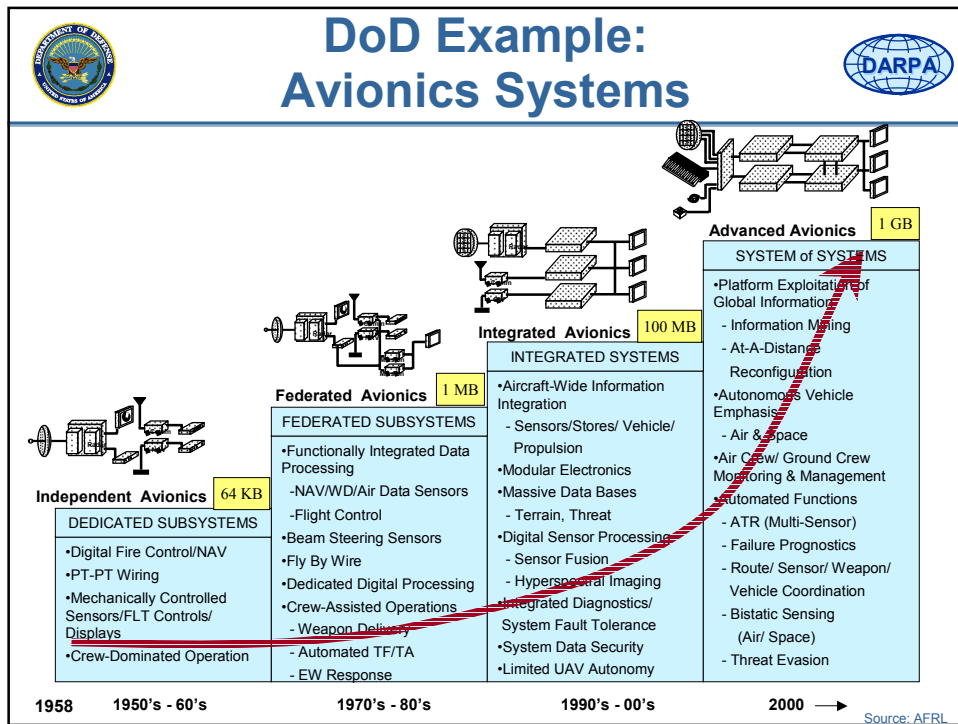
Problem: Lack of Design Technology aligned with the new role



Problem for Whom?



- ◆ **DoD (from avionics to micro-robots)**
 - Essential source of superiority
 - Largest, most complex systems
- ◆ **Automotive (drive-by-wire)**
 - Key competitive element in the future
 - Increasing interest but low risk taking
- ◆ **Consumer Electronics (from mobile phones to TVs)**
 - Problem is generally simpler
 - US industry is strongly challenged
- ◆ **Plant Automation Systems**
 - Limited market, conservative approach





Why Should We Do It?



◆ Themes 1 & 2:

- These problems hurt: cost, schedule, performance
- The trend of IT becoming the universal integrator for systems continues and both unstoppable and necessary.
- We have already started the work, have preliminary results and know what to do.

◆ Theme 3:

- The wave is coming:
 - Tremendous progress in MEMS, photonics and, communication technology - **we need to build systems now!**
 - Identified applications with very high expected ROI (prognostic health management, unmanned vehicle fleets, active materials,...)

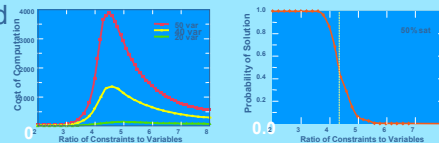


Why Can We Make a Difference?



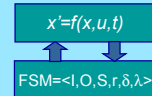
New, critical insights in fundamentals:

Phase transitions have been found in computational requirements for solving fundamental “intractable” problems.



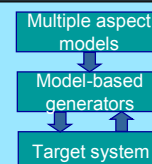
Emerging theory of hybrid systems

provides a new mathematical foundation for the design and verification of embedded systems



- model checking
- compositional synthesis
- simulation

Revolutionary changes in software creation: model-based generators, aspect languages, DSL-s offer new foundation for design automation and adaptation.



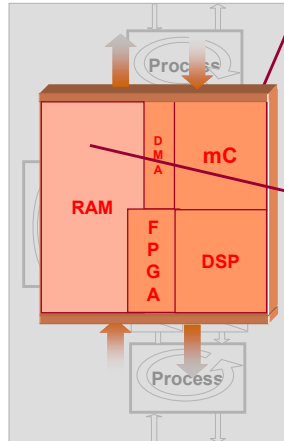
- formal modeling
- verification tools
- automated code synthesis



Theme 1: Software and Physics



Embedded software: defines physical behavior of a complex nonlinear device



Embedded System: a physical process with dynamic, fault, noise, reliability, power, size characteristics

Embedded Software: designed to meet required physical characteristics

Hard Design Problem:

- Both continuous and discrete attributes (a lot)
- Every module has impact on many attributes (throughput, latency, jitter, power dissipation,..)
- Modules contend for shared resources
- Very large-scale, continuous-discrete, multi-attribute, densely-connected optimization problem

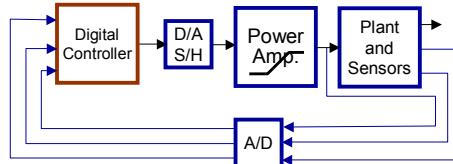
Primary challenge: Cost-cutting physical constraints destroy composability



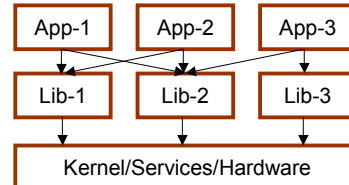
Illustrative Example for the Difficulties



Simple Controller

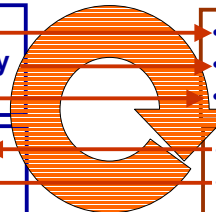


Embedded Software



- control law
- tolerated error, stability
- sampling rate

- limit-cycle oscillation
- loop delay
- noise



- HW/SW architecture
- Data types selection
- Scheduling policy,...

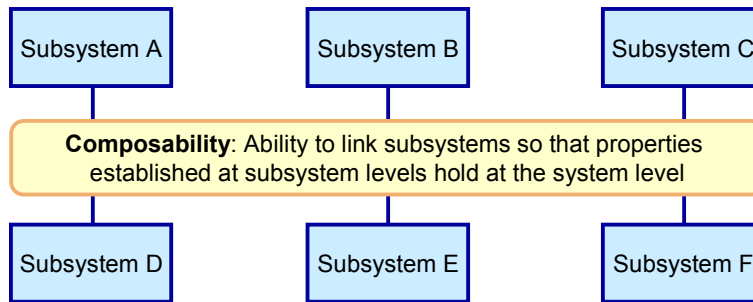
- Numeric accuracy
- Latency
- Jitter



Why Is this a Problem?



We have focused on functional composition...



But cross-cutting physical constraints weaken or destroy composability

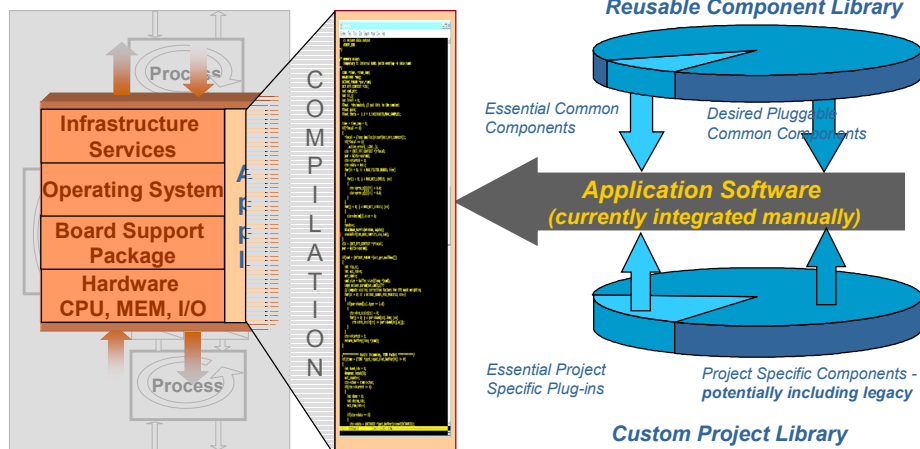
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Current Technology: Functional Composition



*Functional composition does not
addresses physical constraints*



BOLDSTROKE (BOEING)

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Technology Gaps



1. **System/software co-design, co-simulation and analysis environments**
 - a. Composition of design automation tool environments
 - b. Reusable components for design automation tools
2. **New methods for system/code composition**
 - a. Model-based system composition
 - b. Aspect-oriented programming
 - c. Domain-specific languages
3. **Frameworks and middleware to provide higher level programming abstractions**
4. **Hybrid optimization and analysis methods**

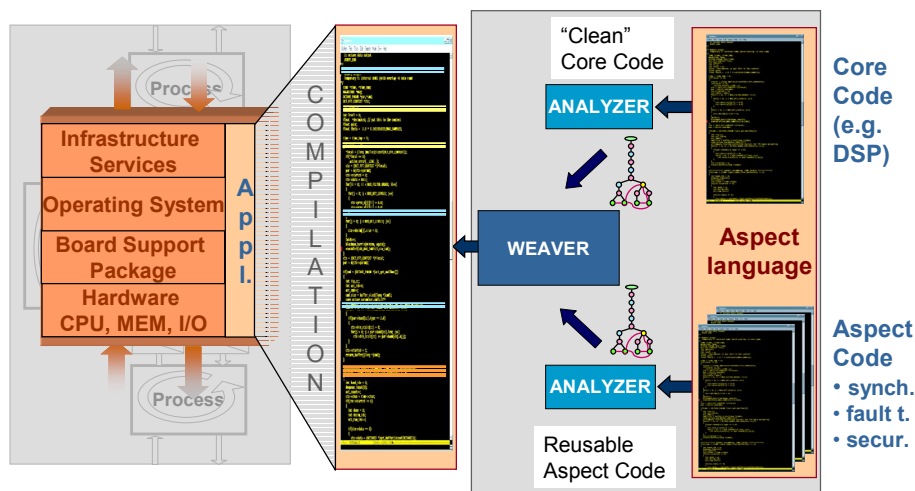
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ITO: Program Composition for Embedded Systems (PCES)



Aspect languages will change programming:



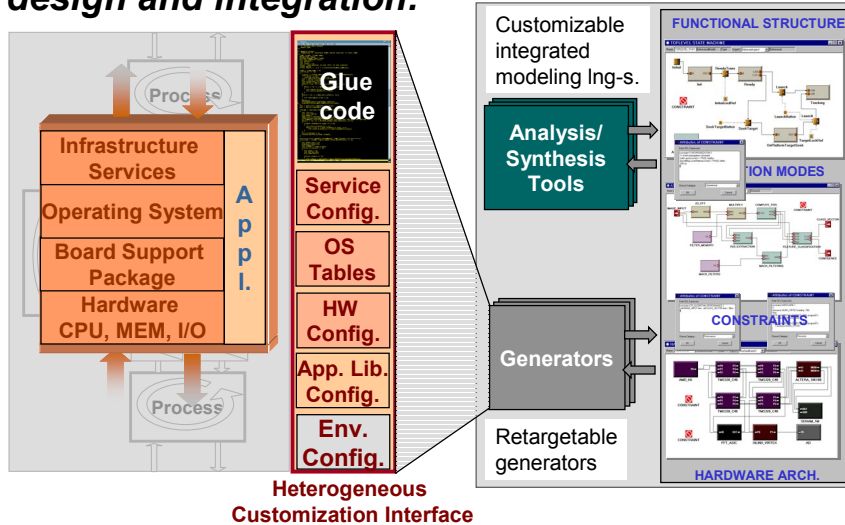
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ITO: Model-Based Integration of Embedded Software (MoBIES)



Model-based integration will change system design and integration:



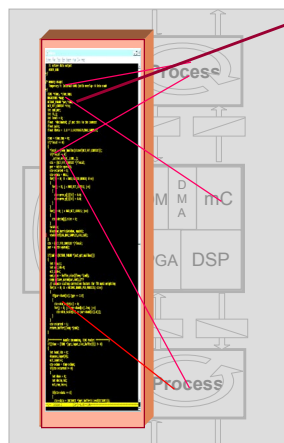
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Theme 2: Embracing Change



Source of change: environment, requirements



Hard Problem: due to its integration role, system-wide constraints accumulate in software:

- process properties - algorithms, speed, data types
 - algorithms, speed, data types - resource needs
 - shared resources - speed, jitter,...
- ..scattered all over the software.

Condition for managing change:

- constraints need to be explicitly represented
- effects of changes need to be propagated by tracking constraints

Flexibility is essentially a
**SYSTEM-WIDE CONSTRAINT
MANAGEMENT PROBLEM**

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Technology Gaps



1. **Adaptive Components for Embedded Systems**
 - a. embedded, active models, constraints, generators
 - b. adaptive, self-monitoring, embedded software
2. **Methods to control flexibility**
 - a. parametric design
 - b. constraint languages
3. **Adaptable composition frameworks and QoS middleware**
4. **Programming Methods to achieve flexibility**
 - a. dynamic languages
 - b. programming through learning

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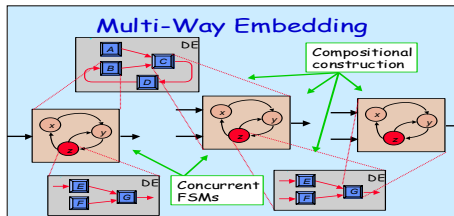
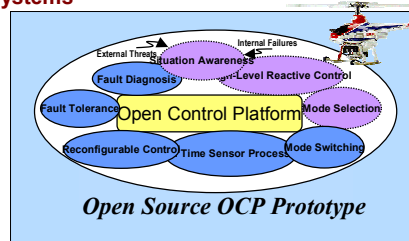


ITO: Software Enabled Control (SEC)



TECHNOLOGY GOALS:

- Control systems that we haven't been able to control before
- Increase automation for extreme maneuvers, tightly coordinated actions
- **Middleware for embedded control systems**



Coordinated Multi-Modal Control:

- **Control middleware (reusable)**
- Open systems, open source
- Reconfigurable hybrid (discrete and continuous) control loops
- Real-time data services for active (predictive) state models

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What are We Doing? Why?



Objectives:

- ◆ Control Systems that we haven't been able to control before
- ◆ Increase automation for extreme maneuvers, improve disturbance rejection
- ◆ Provide reusable middleware for embedded software control

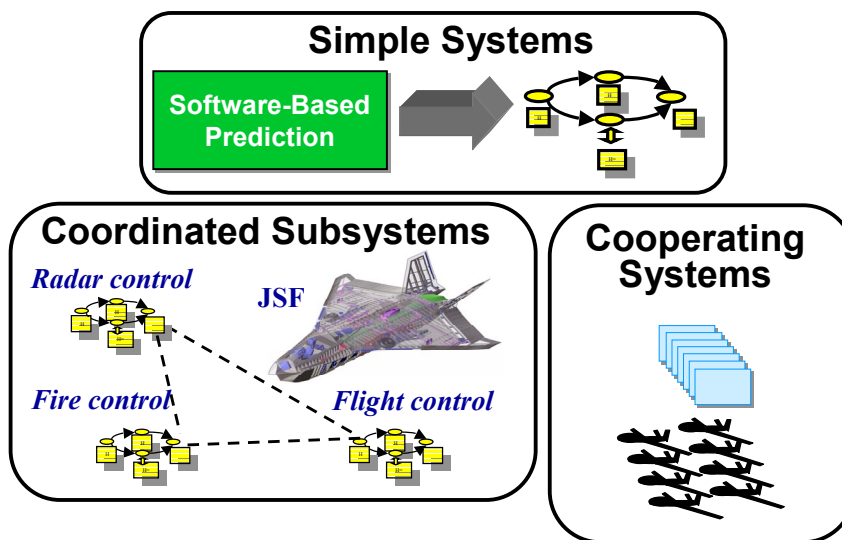
Current Limitations:

- ◆ Conservative, limited in capability
- ◆ Human operators "close the loop" for extreme disturbances, and high performance
- ◆ Old computational assumptions
 - Limited Resources
 - Fixed, static software designs and schedules
 - Loose integration of supervisory and "inner loop" control
 - Limited prediction (continuous only, not discrete)

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Program Objectives



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SEC Program Tasks



◆ Active State Models

On-line adaptive & predictive models (e.g., of system, environment, sensors & actuators) that maximize information to controller

◆ Coordinated Multi-Modal Control

Framework that supports precise coordination of discrete and continuous control in a single system & supports scalable coordination of subsystems and multi-systems

◆ On-Line Control Customization

Framework for adapting controller (parameters, objective function, model configuration, discrete-continuous control structure) for current conditions

◆ Open Control Platform

Open systems support for control systems: reusable middleware that implements core data and process services for reconfigurable, adaptive hybrid controllers

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Active State Models

Maximal information exploitation: adaptive & predictive models



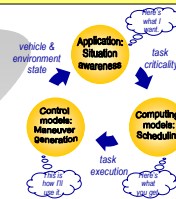
◆ Control elements of the solution:

- Models that combine **on-line information** and **prediction**
- High-fidelity **real-time adaptive** models (e.g., system dynamics, environmental data, sensor/actuator performance)
- Dynamically **aggregated** models of influences on system
- **Coupled** models for managing physical interaction of separate systems
- **Hybrid** models for joint discrete and continuous prediction

◆ Software elements of the solution:

- **On-line support** for acquisition, adaptation, and composition of active models
- Support for on-line data stream & process **configuration**
- **Middleware** for model acquisition, adaptation, presentation, validation, and prediction services

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Active State Models

Representative Topics



- ◆ Nowcast/forecast software technology
- ◆ Wavelet multimodel support for Open Control Platform
- ◆ Active model representation for locality of access
- ◆ Symbolic methods for model reduction, manipulation
 - Hybrid systems for model abstraction
 - Linear parameter varying models
- ◆ On-line sensor/actuator performance modeling & prediction
- ◆ Uncertainty modeling for single, multi-systems

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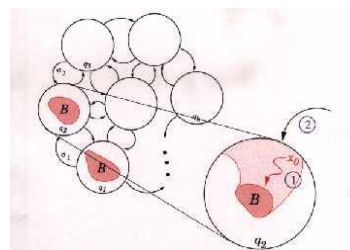
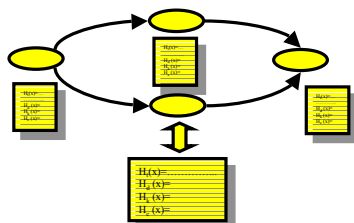
Active State Models

Example: Hybrid and Continuous Prediction



Hybrid prediction:

- Discrete evolution (mode selection and switching logic)
- Continuous evolution (control law)



Procedure:

- start from an unsafe state (in B);
- approximate all states that (1) evolve to unsafe state
- approximate all states that (2) switch to unsafe state
- iterate

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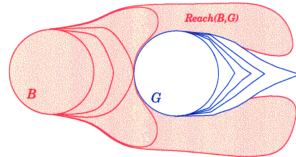


Active State Models

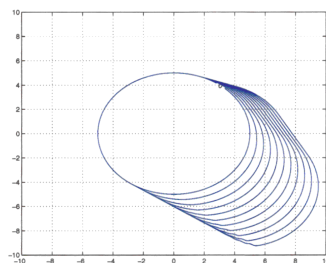
Example: Hybrid and Continuous Prediction



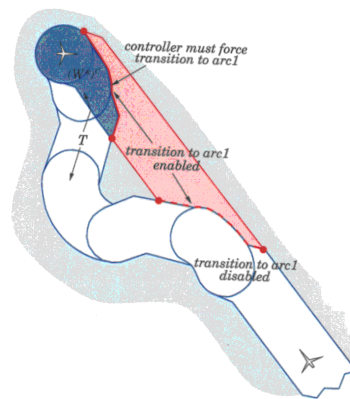
Discrete Approximation



Evolution of Reachable Sets



Constrained Transition



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Coordinated Multi-Modal Control

Scalable single & multi-system control



◆ Control elements of the solution:

- Mathematical foundations for **hybrid discrete + continuous** control (e.g., for safe mode transition), **coordinated** multi-mode control systems
- **Dynamic** control configuration & coordination for cooperating systems
- **Hierarchical** control strategies for **scalable** coordination of **multi-systems**
- Fast methods for checking **coordinated hybrid stability**

◆ Software elements of the solution:

- Systems services, middleware for coordinated hybrid controllers
- Techniques for mapping: hybrid control models to **computational models** (e.g., event-driven, time-triggered), and then to **open system platform** (e.g., threads/schedulable units, periodic or sporadic schedules, hard & soft real time, deadlines & guarantees, QoS)

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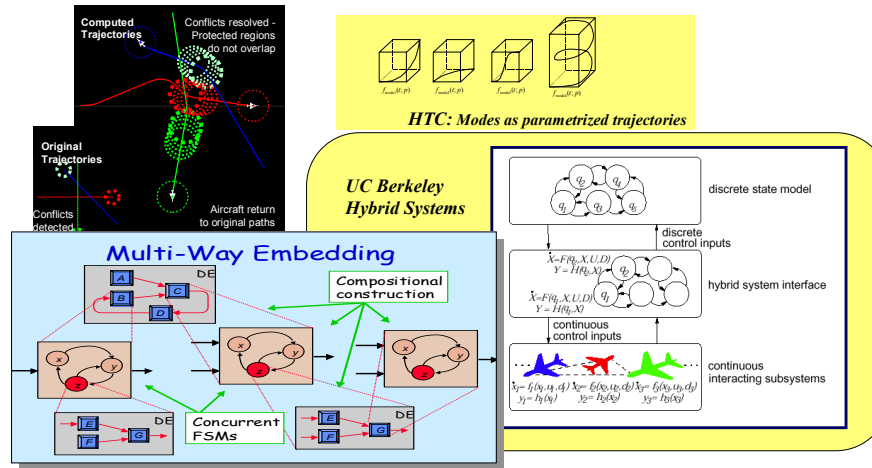
Coordinated Multi-Modal Control

Scalable framework for coordinated control of subsystems, multi-systems



Seedling progress :

- Hierarchical hybrid control concept for coordinated multi-agent, multi-modal control systems
- Coherent framework for discrete and continuous control, local hybrid stability
- Computational model concepts for control implementation



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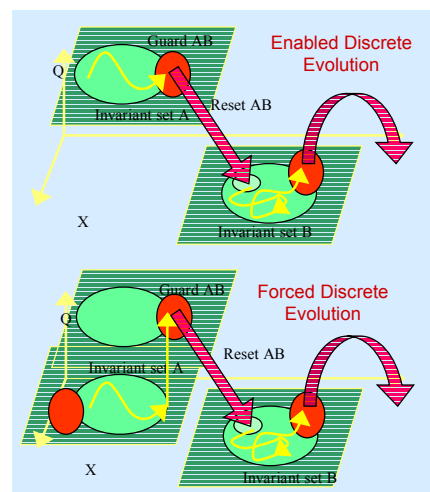
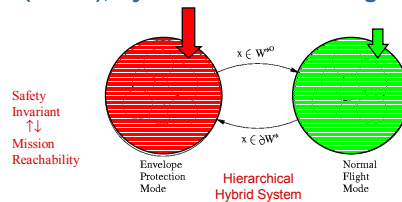


Coordinated Multi-Modal Control

Representative Topics



- ◆ Multi-system hybrid control
- ◆ Optimal hybrid control
- ◆ Interoperable computational models for hybrid control design, software
- ◆ Asynchronous hybrid control
- ◆ Functional reactive programming (timed), hybrid mode switching



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Coordinated Multi-Modal Control

Representative Topics



◆ Failure detection, isolation, and recovery (FDIR)

- Hybrid failure detection, isolation, and recovery
- Multi-system hybrid FDIR
- Validation methods for FDIR

◆ Mode design

- Receptivity for coordination
- Aggressive maneuver design from empirical data
- Modes as parameterized maneuvers

◆ Transition control

- Fuzzy mode transition control

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Example: Coordinated Subsystem Control for STOVL/VSTOL Transition



Propulsion + Aerodynamic Control

Forward Flight



Transition

- High AoA
- Low Airspeed

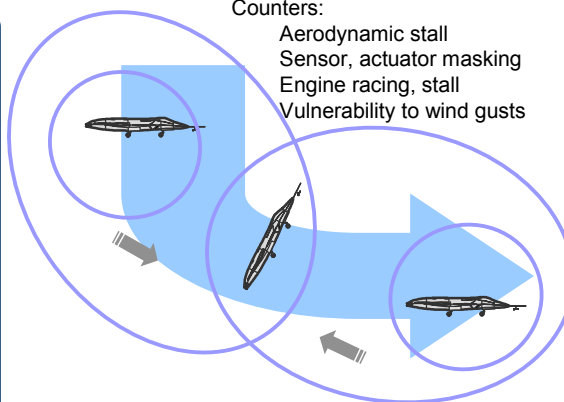


Landing



Counters:

- Aerodynamic stall
- Sensor, actuator masking
- Engine racing, stall
- Vulnerability to wind gusts



SEC Coordinated Multi-Modal Control provides joint predictive mode transition for subsystems; control authority management; coordinated subsystems

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Coordinated Multi-System Control: e.g., Positionable Towed Body



Now:

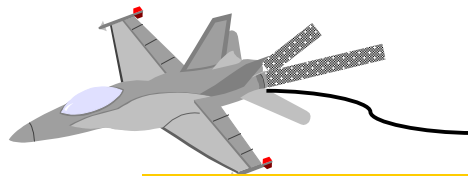
- Predetermined device position over entire flight envelope
- Disturbance is amplified by aircraft airstream, can go unstable

Goal:

- Detected, predict interactions
- Customize control for current flow field, aircraft dynamics, engine plume

Impact:

- Better ECM effectiveness of towed device
- Greater dynamic range (different aircraft designs)



Engagement geometry:

Host aircraft position
Towed body attitude
Doppler velocity
Angular velocity
Towline motion1

SEC provides:

- *Coordinated hybrid predictive transitions, cooperative operation*
- *Active models of joint environment*
- *Adaptation for conditions*

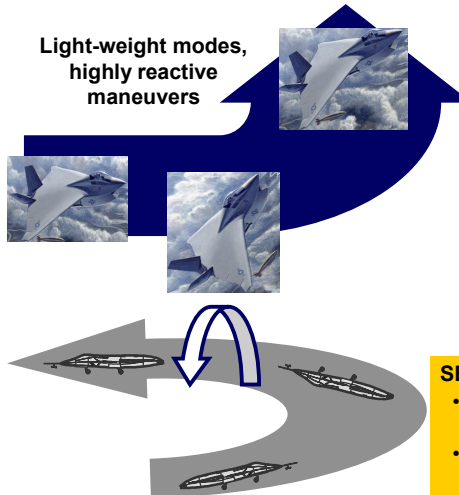
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Mode Design for Highly Evasive UAVs



Light-weight modes,
highly reactive
maneuvers



Now:

- Extreme maneuvers? Pilot closes the loop

Goal:

- Evasive, avoidance maneuvers (cobra, Immelman, jinking...)

Impact:

- Reduced human risk
- Survivable, reusable materiel
- Reconfigurable aerodynamics
- Increased rate of successful UCAV missions
- Increased applicability: SEAD, combat
- Maximized vehicle performance, range

SEC Multi-Modal Control Provides:

- *Adaptable maneuvers & performance criteria*
- *Escape from fixed-frequency loop design straitjacket*
- *Real-time exploitation of information*

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On-line Control Customization

Real-time computational, structural, parametric adaptation



◆ Control elements of the solution:

- **Bounded** control recalculation to preserve safe operational envelope
- **Scalable** computational control (e.g., trajectory morphing, game-theoretic optimization, parameter-varying strategies)
- **Symbolic** computation strategies for adaptive control
- Adaptive **hybrid (discrete+continuous)** control, **hybrid FDIR**

◆ Software elements of the solution:

- On-line support for fast **structural** reconfiguration of **hybrid** controllers
- Software support for **timed & event-based** process services, **symbolic computation**, **process & data** configuration services
- Computational (e.g. **timing**) models for **managing** on-line customization
- **Resource**-constrained adaptation

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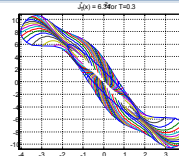
On-Line Control Customization

Control specialization for damage, extreme environments, extreme performance requirements

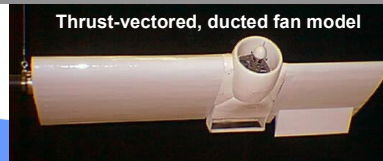


Seedling progress:

Concepts for performance improvement and disturbance rejection: on-line control recalculation, optimization, and trajectory morphing; mutable control software composition strategies



Thrust-vector, ducted fan model



CalTech

Multilevel optimization, blends:

- receding horizon optimal control (mid- & low-level, continuous)
- dynamic programming (high level, discrete state, also receding horizon)

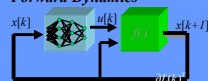
Control Lyapunov Function

characterization for **guaranteed** region of operation

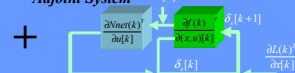
OGI:

- Neural control: extensions to on-line (model-predictive) and receding horizon control (HJB equations + reinforcement learning)
- Control optimization using **composite models**

Forward Dynamics



Adjoint System



Software: **scripting approach for control customization**

formulate a control paradigm

integrate actions of diverse components (models, controllers, sensors, actuators)

Launches controlled events

by a sequence of imperative commands

Defines relations among event streams

equational specifications schedule reactions by demand

Open language format

doesn't depend upon the implementations used for operators



On-Line Control Customization Representative Topics



- ◆ Control recalculation (MPC, CLF, LPV methods)
- ◆ Aggressive maneuver/mode design
- ◆ Protocols for configurable control re-calculation
- ◆ Trajectory optimization, CLF methods
- ◆ LPV control methods for tractable calculation with reduced models
- ◆ Multi-graph methods for FDIR
- ◆ Control scripting for reconfiguring process and data stream architecture

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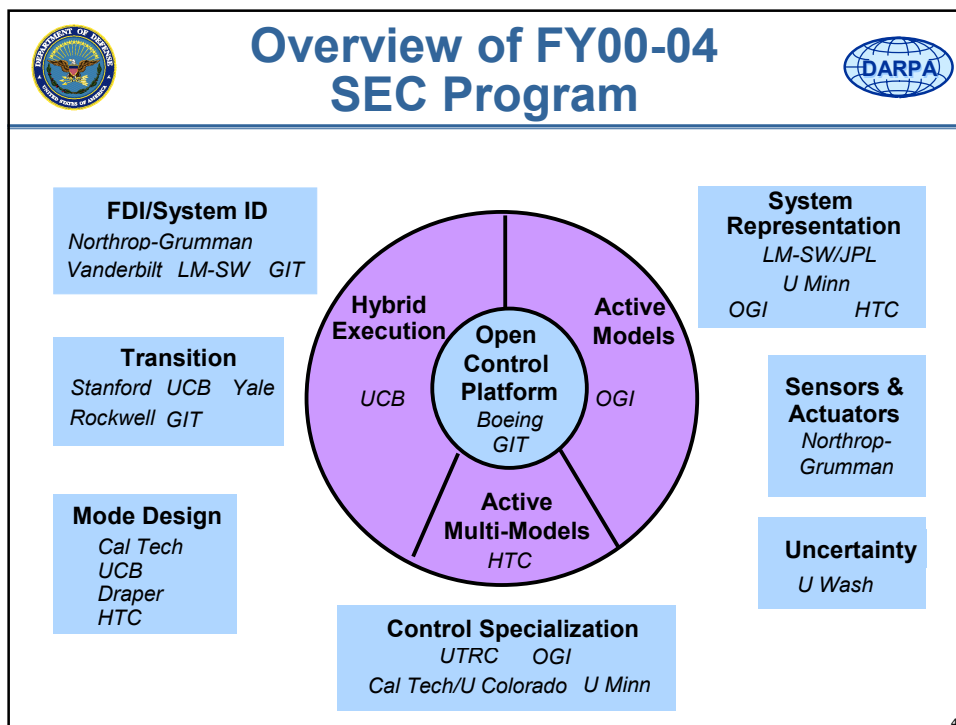
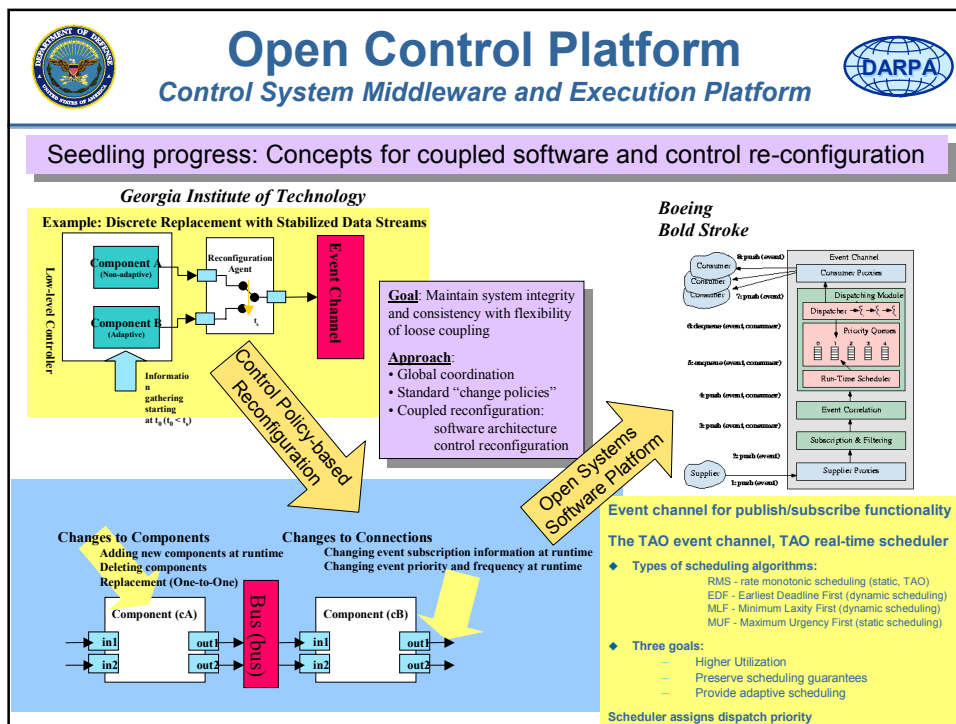
Open Control Platform

Middleware for open, software-enabled control



- ◆ **Control elements of the solution:**
 - Open control architectures
- ◆ **Software elements of the solution:**
 - System software support
 - Dynamic control configuration & scheduling
 - Distributed control coordination services
 - Real-time data and process services
 - Porting services
 - QoS resource management
 - Middleware framework for hybrid & adaptive control
 - SEC open source control platform implementation
 - SEC technology integration, demonstration, transition

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Relevant DARPA Efforts: *Software and Physics*



Technology Recommendations:

1. System/software co-design, co-simulation and analysis environments
2. Optimization methods and tools for
*Very-large Scale,
Densely-Connected,
Multiple-Attribute,
Continuous & Discrete Problems*
3. Frameworks and middleware to provide higher level programming abstractions
4. Programming technology
5. Model-based code generation

SEC Mapping & Emphasis:

1. Mid: hybrid system design environment (extending)
2. High: hybrid discrete and continuous; composition and analysis; modeled uncertainty, system coupling
3. High: Open Control Platform middleware encapsulates: control switching and scheduling, data & prediction, on-line specialization
4. Low: apply functional reactive programming languages for control switching
5. Low-Mid: map hybrid system computational models to open systems platform

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Relevant DARPA Efforts: *Embracing Change*



Technology Recommendations:

1. Adaptive Components for Embedded Systems
 - embedded, active models, constraints, constraint management
 - adaptive, self-monitoring, embedded software
2. Adaptable composition frameworks and QoS middleware
3. Methods to achieve flexibility
 - aspect oriented programming
 - domain specific languages
 - dynamic languages
4. Methods to control flexibility
 - parametric design
 - constraint languages

SEC Mapping & Emphasis:

1. High: Active state models, on-line control redesign, constraint management
2. Mid: Layered above real-time QoS middleware; open control platform middleware
3. Low: Functional reactive programming, control-specific reconfiguration
4. Mid: Control-specific solutions for resource & authority management services

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Relevant DARPA Efforts: *Networked Embedded Systems*



Technology Recommendations:

1. Develop methods for predicting global properties from local component descriptions without assuming static structure.
2. Develop monitoring, controlling, diagnosis techniques for large, variable structure, hybrid systems.
3. Develop technology to replace, enhance or extend material, mechanical and biological properties via computation.
4. Explore biologically inspired distributed control and adaptation methods for networked embedded systems.

SEC Mapping & Emphasis:

1. Mid: Active State Models, hybrid prediction for reconfigurable, distributed hybrid systems
2. High: SEC primary focus
3. TBD: Apparent potential for applying hybrid systems
4. None: Not precluded

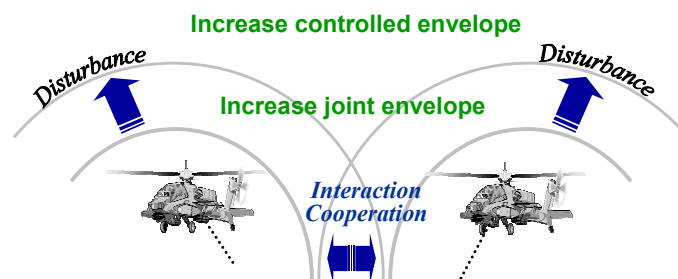
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Experiment *Cooperative airlift*



- ◆ **Baseline:** Improved stability maintenance, performance in operation of single vehicle (e.g., university lab VTOL Rotorcraft)
- ◆ **Challenge:** Cooperative operation of systems with coupled dynamics (e.g. joint airlift, simple lift mode coordination)
- ◆ **Goal:** Increase the envelope of operation for cooperative (including physically coupled) system control



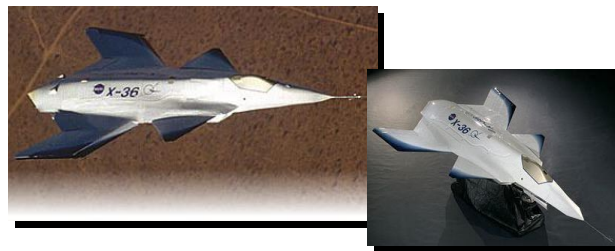
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Demonstration X-36



- ◆ **Baseline:** better regulation of flight, better takeoff and landing control, for remotely-piloted, unstable vehicles
- ◆ **Challenge:** Automate highly-reactive, extreme maneuver & evasion regimes, coordinated for adversarial encounters
- ◆ **Goal:** Enable high- and extreme-performance autonomous tactical maneuvers in order to enhance survivability, capability of autonomous weapons systems



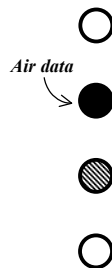
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Example: Military Space Vehicle



Sensors



Actuators



- Fully operable
- ▨ Degraded
- Inoperable

Now

- Re-entry problems (similar to shuttle)
- Lacks control in transition region

Goal:

- Permit maneuvers in upper atmosphere

Impact:

- Protect vehicle upon re-entry into threat environment
- State model supports prediction during dead reckoning

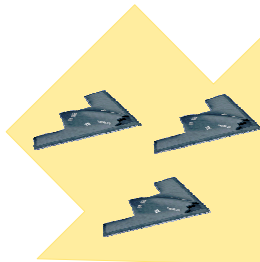
SEC On-Line Control Customization will provide:

- **Flexible use of available sensors and control authority**
- **Time-triggered & predictive mode transitions**

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Example: UAV Swarms



Now

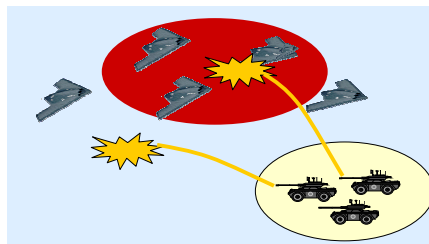
- One remote pilot per vehicle
- Static flight group configurations

Goal:

- Dynamic swarm structure
- Joint response to damage, failure

Impact:

- Configurable mission systems
- Reduced multi-system operational effort
- Survivable UAV swarms



SEC On-Line Control Customization provides:

- *Dynamically reconfigurable cooperative groups*
- *Joint FDIR for coordinated reconfiguration after failure and damage*

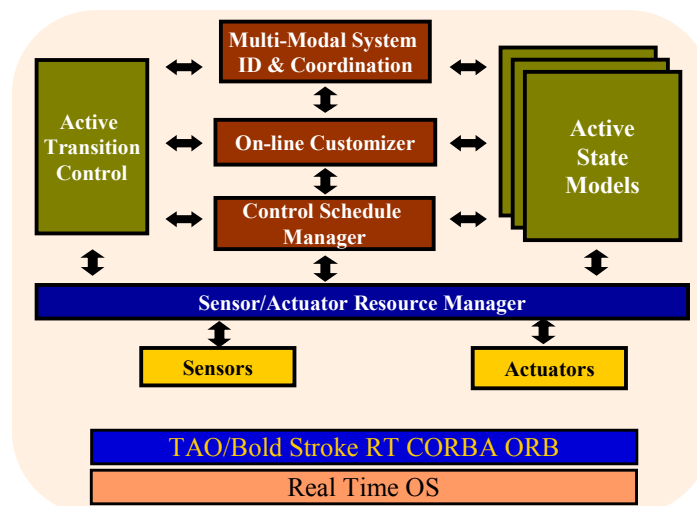
47



Task: Open Control Platform



Control
Middleware



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Open Control Platform Challenges



- ◆ Provide control middleware and tool support for building commodity controllers.
- ◆ Provide parametric, structural framework necessary to support SEC active state model, hybrid/coordinated, and adaptive multi-modal control technologies.
- ◆ Provide flexible experimental platform for SEC control research and demonstration.

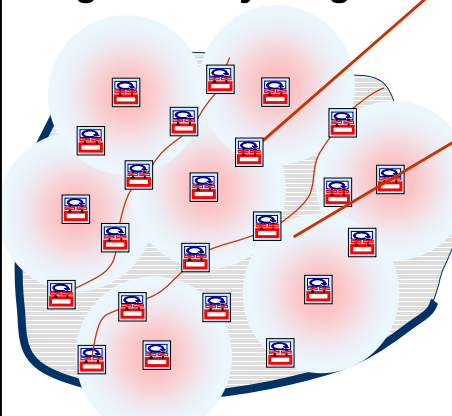
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Theme 3: Dealing With Dynamic Structures



Networked embedded systems will change again everything:



LARGE number of tightly integrated, spatially and temporally distributed physical/information system components with reconfigurable interconnection.

Hard Problems:

- Design culture changes: from analysis and synthesis of static structures to dynamic structures
- Notion of correctness changes: from “getting it right” to “keeping it right
- Richness of interactions changes: from stable data oriented to dynamic hybrid interactions

Essentially a **dynamic aggregation** problem

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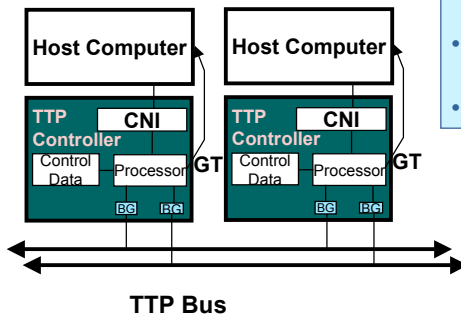


Time-Triggered Architecture

Designed for:

- Automotive, drive-by-wire apps.
- Distributed architecture
- Safety critical, hard real-time

- Time division multiple access protocol
- Synchronous
- Fault Tolerant Global Time
- Distributed redundancy management
- Composability for jitter, faults, reliability
- Low-cost implementation



Limitations:

- Static Scheduling
- Overhead cost
- No support for event-driven op.

Same concept as Safebus (in 777 avionics) - but the money is in cars -

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Metamorphosis of a Machine



Embedding:

- MEMS-based sensing, actuation:
- redundancy
- mass production:

~ 100,000 actuators and sensors

Distribution:

- modularity:
- redundancy:

1,000 computational nodes

Coordination:

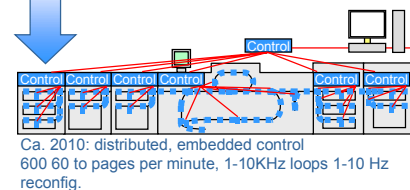
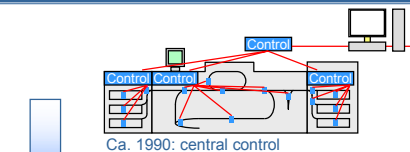
- plug-and-play:
- reconfigurability:
- upgradeability:

Capabilities:

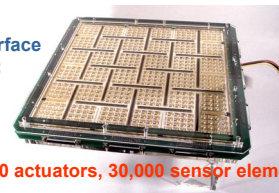
high degree of control over physics, adaptation self-diagnosis, repair economies of scale

high degree of flexibility, "macro" adaptation "fail-safe" robustness, graceful degradation, resource optimization

100s of configurations and 1000s functions rapid deployment, mass customization low maintenance, extended life




Active surface transport:




500 actuators, 30,000 sensor elements

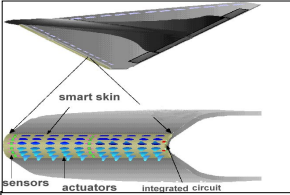
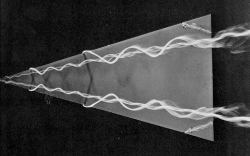
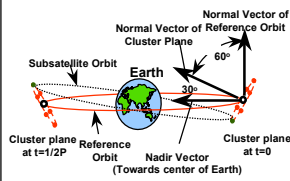
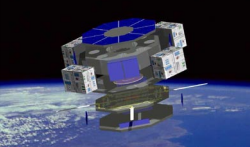
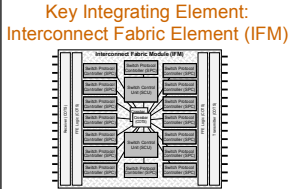
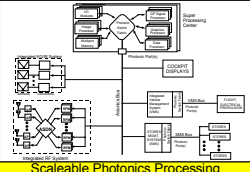
Reconfigurability, redundancy, and local control promise improved time-to-market, robustness, and in-field customization.

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Networked Embedded Systems: Examples




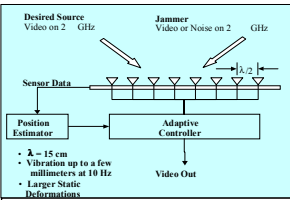
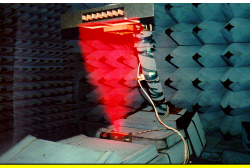
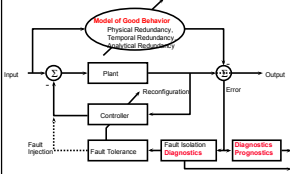
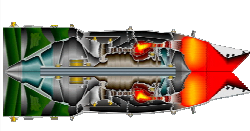
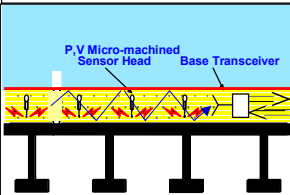
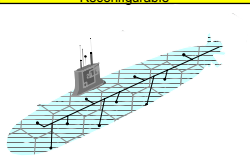
 <p style="text-align: center;">sensors actuators integrated circuit</p>	 <p style="text-align: center;">Vortex Control Using Distributed MEMS Actuators</p>	<p>MEMS Actuators for Vortex Control (UCLA, CalTech)</p> <ul style="list-style-type: none"> • Number of nodes: 10^4 • Loop frequency: 1 KHz • Coordination frequency: 10Hz • Geometric size: 30m
 <p style="text-align: center;">Subsatellite Orbit Reference Orbit Cluster plane at $t=1/2P$ Nadir Vector (Towards center of Earth) Normal Vector of Reference Orbit Cluster Plane Cluster plane at $t=0$</p>	 <p style="text-align: center;">Information processing replaces mechanical structure</p>	<p>Pico Satellite Constellations (Aerospace Corporation)</p> <ul style="list-style-type: none"> • Number of nodes: $10^2 - 10^3$ • Loop frequency: 1-2 KHz • Coordination frequency: 1Hz • Geometric size: 1-1000km
<p style="text-align: center;">Key Integrating Element: Interconnect Fabric Element (IFE)</p> 	 <p style="text-align: center;">Scaleable Photonics Processing Unified Network</p>	<p>Unified Processing Network For Avionics</p> <ul style="list-style-type: none"> • Processing nodes: $> 3 \times 10^3$ • Link Bandwidth: 2GHz • Aggregate Bandwidth: $> 10^{12}$ • Industry Standard Protocol

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Networked Embedded Systems: Examples



 <p style="text-align: center;">Desired Source Video on 2 GHz Jammer Video or Noise on 2 GHz Sensor Data Position Estimator Adaptive Controller Video Out • $\lambda = 15$ cm • Vibration up to a few millimeters at 10 Hz • Larger Static Deformations</p>	 <p style="text-align: center;">Sensors enable electronic deformation compensation</p>	<p>On-orbit Space-Based Phased Array Antennas (Boeing)</p> <ul style="list-style-type: none"> • Number of nodes: 10^3 • Loop frequency: 1-5Hz • Coordination frequency: 1 Hz • Geometric size: 6m x 22m
 <p style="text-align: center;">Model of Good Behavior Physical Redundancy Temporal Redundancy Functional Redundancy Input Plant Controller Reconfiguration Error Output Fault Injection Fault Tolerance Fault Isolation Diagnostics</p>	 <p style="text-align: center;">Smart Engine: Interactive, Aware and Reconfigurable</p>	<p>Smart Engine (UTRC)</p> <ul style="list-style-type: none"> • Number of nodes: 10^2 • Loop frequency: 2-5KHz • Coordination frequency: 50-100Hz • Geometric size: 5m
 <p style="text-align: center;">P,V Micro-machined Sensor Head Base Transceiver</p>	 <p style="text-align: center;">Information processing replaces mechanical structure</p>	<p>Noiseless Sonar (NRL)</p> <ul style="list-style-type: none"> • Number of nodes: 3×10^4 • Loop frequency: 30KHz • Coordination frequency: 1Hz • Geometric size: 300'

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Mobile Autonomous Robot Software (MARS)



OBJECTIVE:

Develop the missing, (learning-based) Software Technologies **required for dependable, sensory driven, autonomy**



GOALS:

Synthesize the desirable capabilities of both **deliberative (symbol-mediated)** and **reactive (sensor mediated)** control by combining explicit, embedded programming technologies with machine learning strategies to enable mobile autonomous robots to have the capacity to function in **realistic, unpredictable environments**.

Develop domain specific, embedded software composition methodologies to enhance our capacity to create complex **embedded software for autonomous systems**.

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Key Program Idea



Source of Competency

Soft Computing



Robot Shaping



Imitative Learning



■ Pre-programmed (innate)

■ Learning-based (acquired)

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Soft Computing (USC)

- **Approach:**
 - Incorporate a fuzzy-neural capability whereby a fuzzy controller ensures the robot meets some predefined performance criteria, while the neural network produces additional tuning data until that criteria is met
 - Standard library of atomic “basis behaviors” containing both numeric and symbolic state information and dynamically linked into behavior networks
- **Hypothesis:**
 - Behavior Nets can be automatically generated through learning mechanisms
 - Online learning based on Reinforcement Learning in which the perception system is continually comparing observed behaviors to the internal representations



Robot Shaping (GaTech)

- ◆ **Approach:**
 - Reasoning in Finite State Automata (FSA) for plan generation through the use of “wizards” to guide high-level deliberative planning
 - Probabilistic situation recognition and indexing into behavior sets for opportunistic planning and reaction
 - Case-Based Reasoning: situation-dependent behavioral gains and assemblage switching at the reactive level of execution
- ◆ **Hypothesis:**
 - Q-learning methods can enable behavior assemblage selection at a level above gain adjustment
 - Specialized reinforcement learning methods (“learning momentum”) can be used to adjust behavior gains at run time



The New Embedded Software Problem



- ◆ **Work in Themes 1 & 2 change the way we construct embedded software**
 - Address current embedded software problem
- ◆ **Networking embedded systems changes the playing field again**
- ◆ **Old, closed system approach is incapable of addressing this problem**
- ◆ **Radical new approaches/technologies are needed for this new problem space**

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Technology Gaps



1. Methods for predicting global properties from local component descriptions **without assuming static structure.**
2. Monitoring, controlling and diagnosing of **large, variable structure, hybrid systems.**
3. Dynamic, **adaptable composition frameworks** and middleware
4. **Controlling of physical, chemical and biological properties** via embedded information systems.

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Conclusion



- ◆ The Embedded Software Initiative is DARPA's response to the exploding integration role of information technology across military platforms.
- ◆ Existing and planned programs establish a new re-integration of physical and information sciences. This will make a huge difference in our ability to:
 - design software for achieving physical behavior,
 - make software the media absorbing change in physical systems,
 - build, integrate physical systems dynamically from spatially and temporally distributed components.
- ◆ To do this means changing culture. DARPA's focused investment is critical to catalyze and accelerate this process.

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