



Bio-Inspired Intelligent Sensing Materials for Fly-by-Feel Autonomous Vehicle

MURI Team

Participating Institutions:

Stanford University, University of California at Los Angeles, New York Institute of Technology, University of Colorado at Boulder, Johns Hopkins University, and University of British Columbia, Canada



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Report Documentation Page

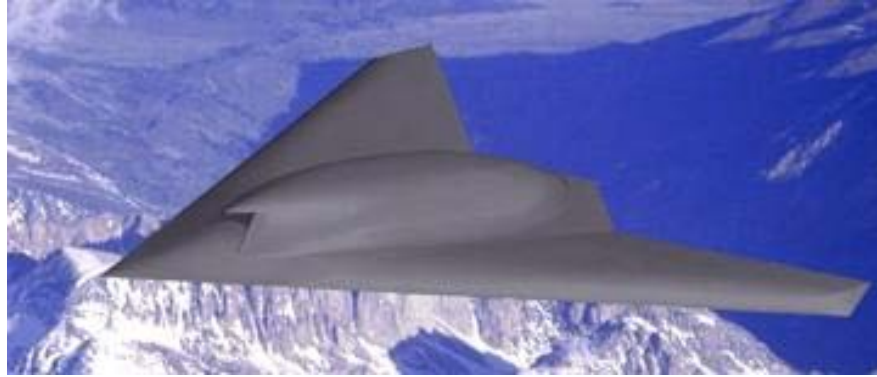
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Advantages of UAV



- **Lower Cost in Manufacturing**
- **Reduced Cost in Maintenance and Operation**
- **Energy Saving for Smaller Size**
- **Minimal Human Risk**

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Aircraft Landing in stormy weather



F-15 safely landed with one wing



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Fly-By-Feel Autonomous Flight



Sensing

Recognition

State Awareness

Decision

Autonomous Mode

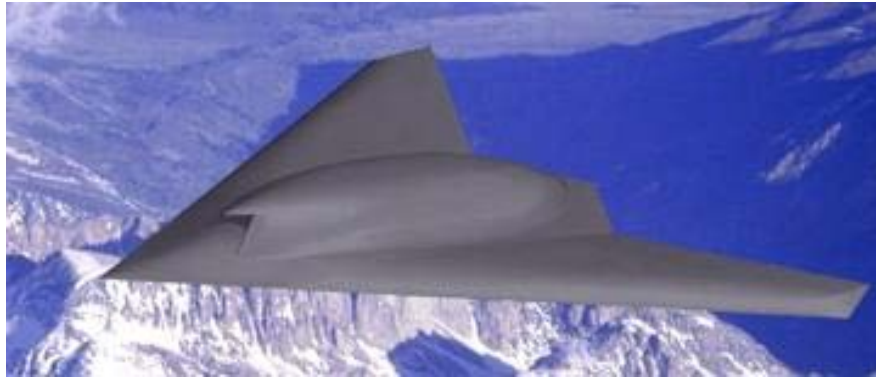
Essential Steps

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Fly-by-Feel Autonomous Flight



But the system must be:

- Minimal or no Weight Increase
- Low Cost in Manufacturing
- Robust in System Integration
- Easy for Installation
- Friendly in Implementation

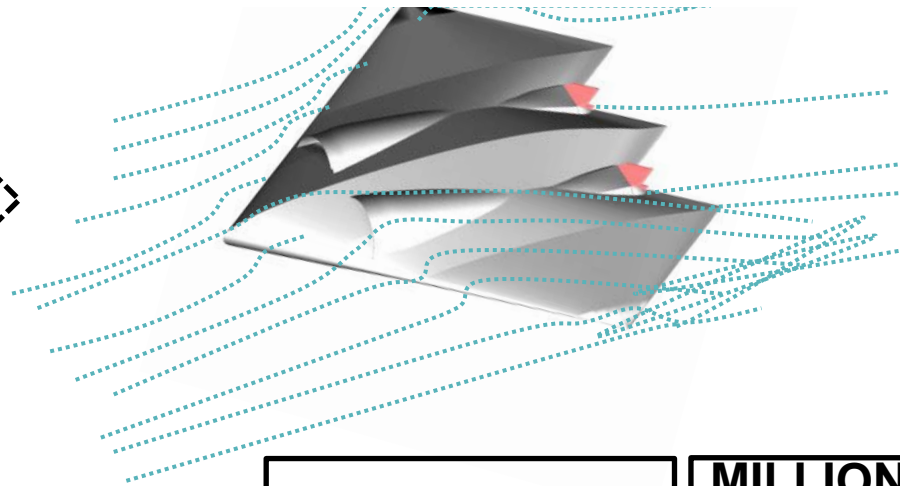
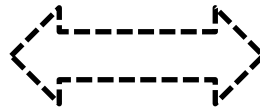
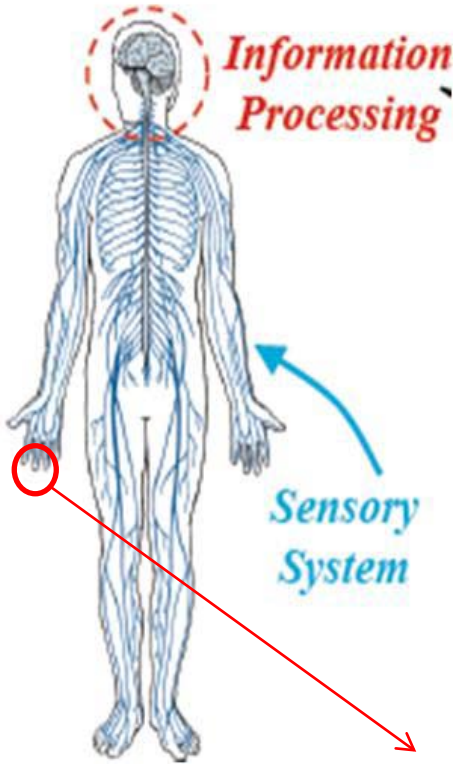
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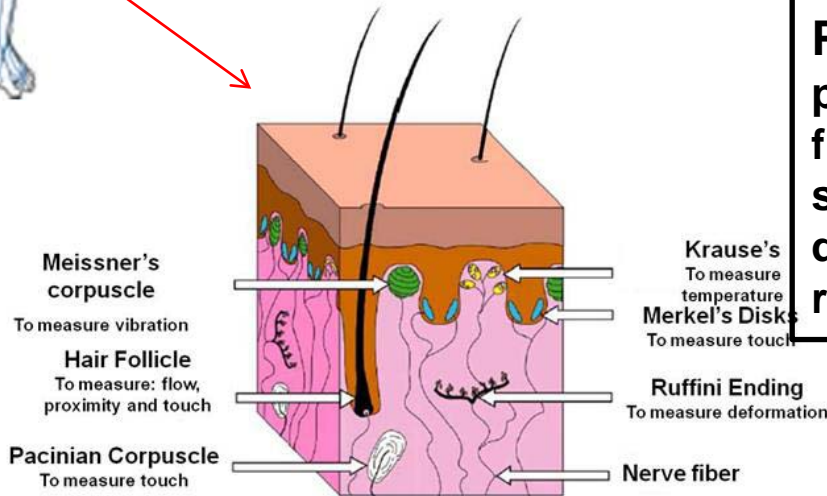
Bio-inspired Smart Materials/Structures

Fly-by-Feel Autonomous Vehicle



Massively Parallel data processing, filtering, self-learning, diagnostics, and real-time decision

MILLIONS of nano/micro-sensors, electronics, processing units etc. over a large area



Bio-inspired Sensory Network

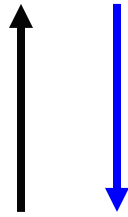




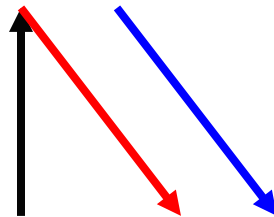
What is an Intelligent Material

Signals

Brain
Somatosensory
cortex

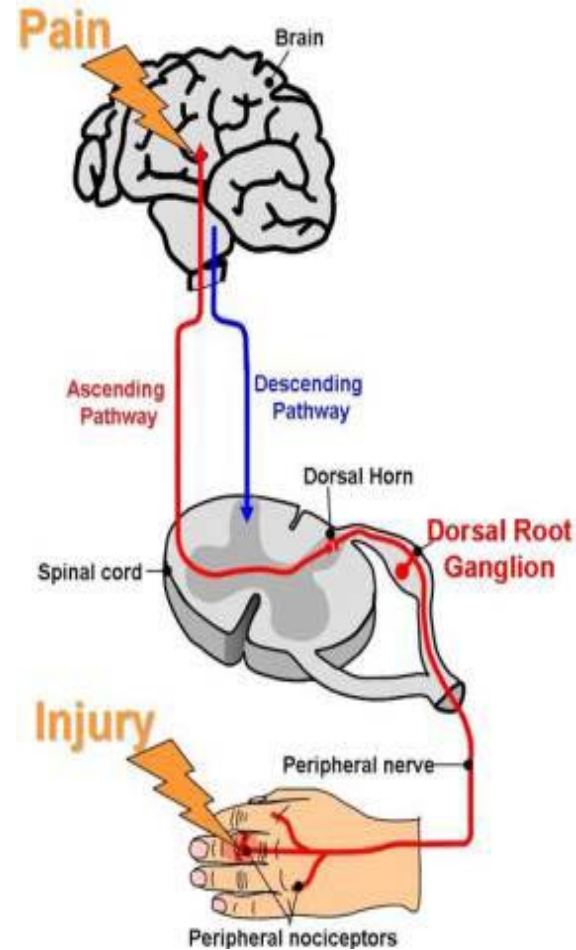


Spinal Cord



Nerve
receptors

Materials



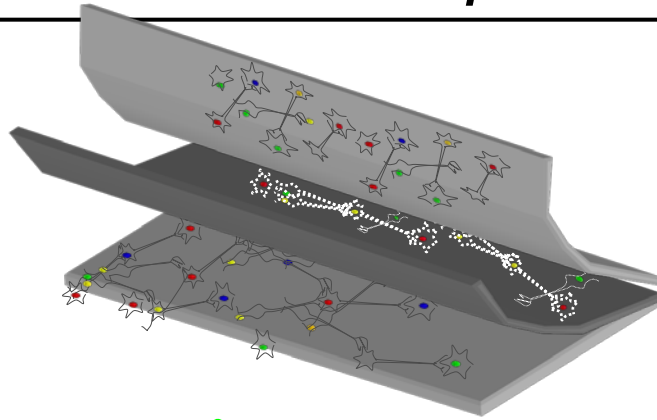
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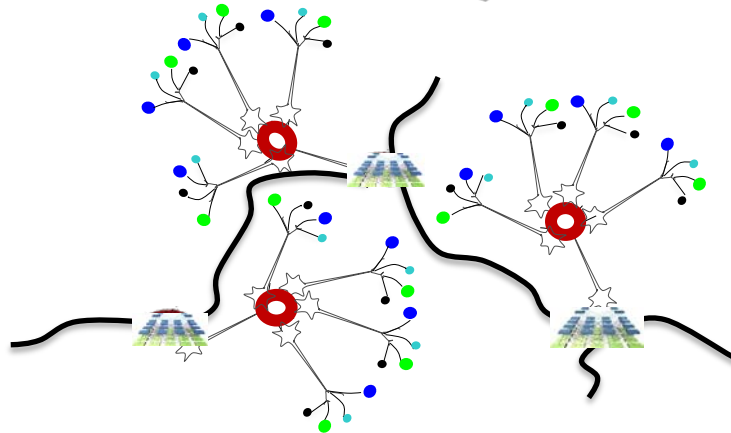


Materials Development

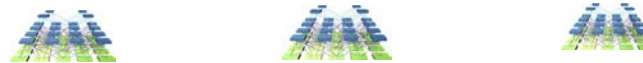
Multifunctional Materials



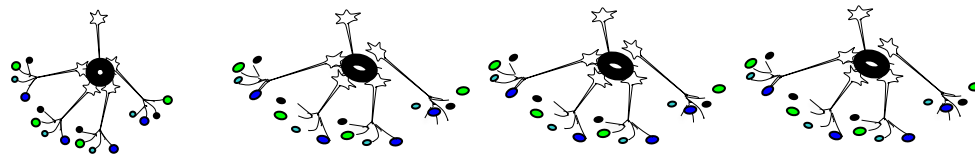
Networks



Processors/Neuron circuits



Multi-functional Sensors



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Sensor Processing Development

STAGE 3
Autonomous decision

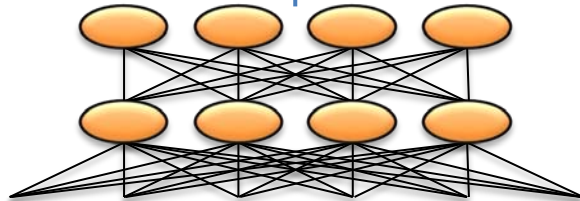
STAGE 2
State Quantification

STAGE 1
State Classification

Prognosis, Decision Planning and Control

Structural Damage Diagnosis
(Type, location, extent)

Flow Field Distribution
(temperature, pressure, strain etc.)



Load ↑ Temp. ↑ Damage ↑ Pressure ↑ Air-flow ↑

Signal processing + machine learning algorithms

Multi-functional Sensors



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Research Team

Stanford	Fu-Kuo Chang (PI) – Aero/Astro Boris Murmann – EE Shan Xiang Wang – EE Andrew Ng – CS
UCLA	Yong Chen – ME Greg Carman – ME
NYIT	Rahmat Shoureshi – ME
UC Boulder	Robert McLeod – ECEE
UBC	Frank Ko – ME Peyman Servati – ECEE
JHU	Somnath Ghosh – ME





Major Tasks

- **Bio-inspired Sensor Network**
 - Stretchable sensor network to accommodate large arrays of sensors and electronics over a large area.
- **Micro/Nano Sensors for State Sensing**
 - Multi-physic multi-scale sensors with an ease of network integration.
- **Neuron Circuits and Interface Electronics**
 - Bio-inspired neuron circuits with appropriate electronics to interface with various sensors.
- **Modeling, Design, and Prognostics**
 - Multi-physic and multi-scale modeling of multifunctional materials with distributed sensing capabilities for design and validation.
- **Diagnostics and State Awareness**
 - Embedded intelligent software, Algorithms, tools, and processes to determine the state of the materials in real time.
- **Integration**
 - An effort to develop a prototype of “intelligent sensing material.”



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Bio-inspired Sensory Network

Chang, Peumans/Wang – Stanford

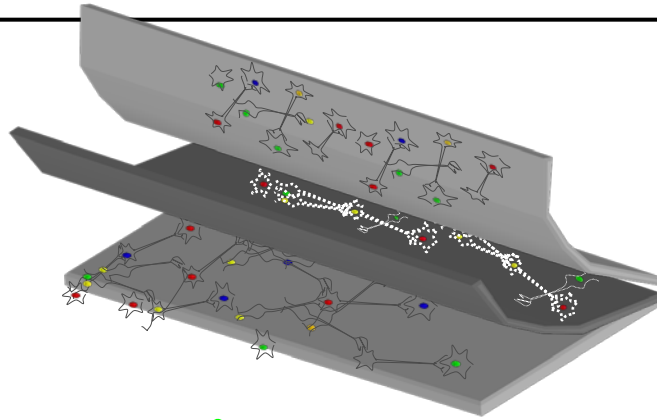
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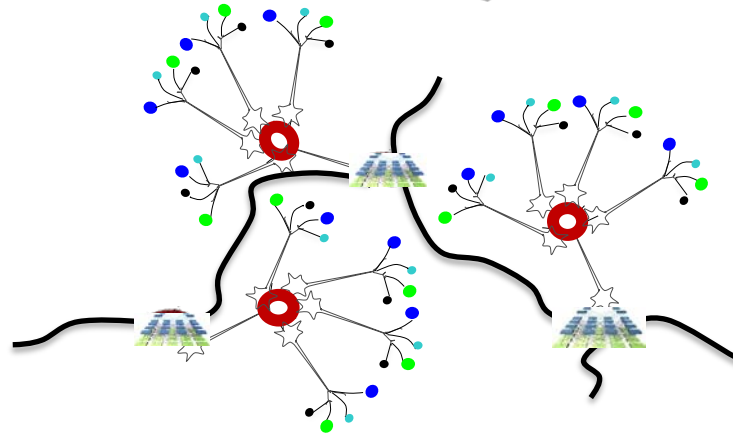


Robust and Low Cost Materials Development

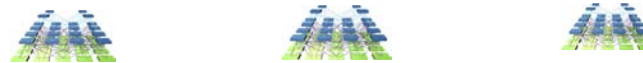
Multifunctional Materials



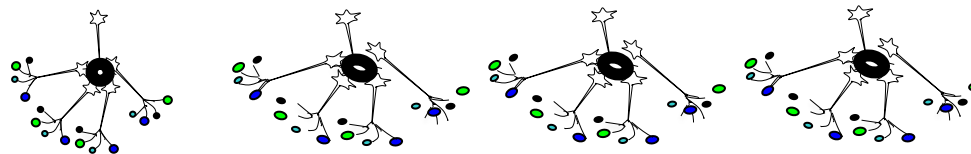
Networks



Processors/Neuron circuits



Multi-functional Sensors

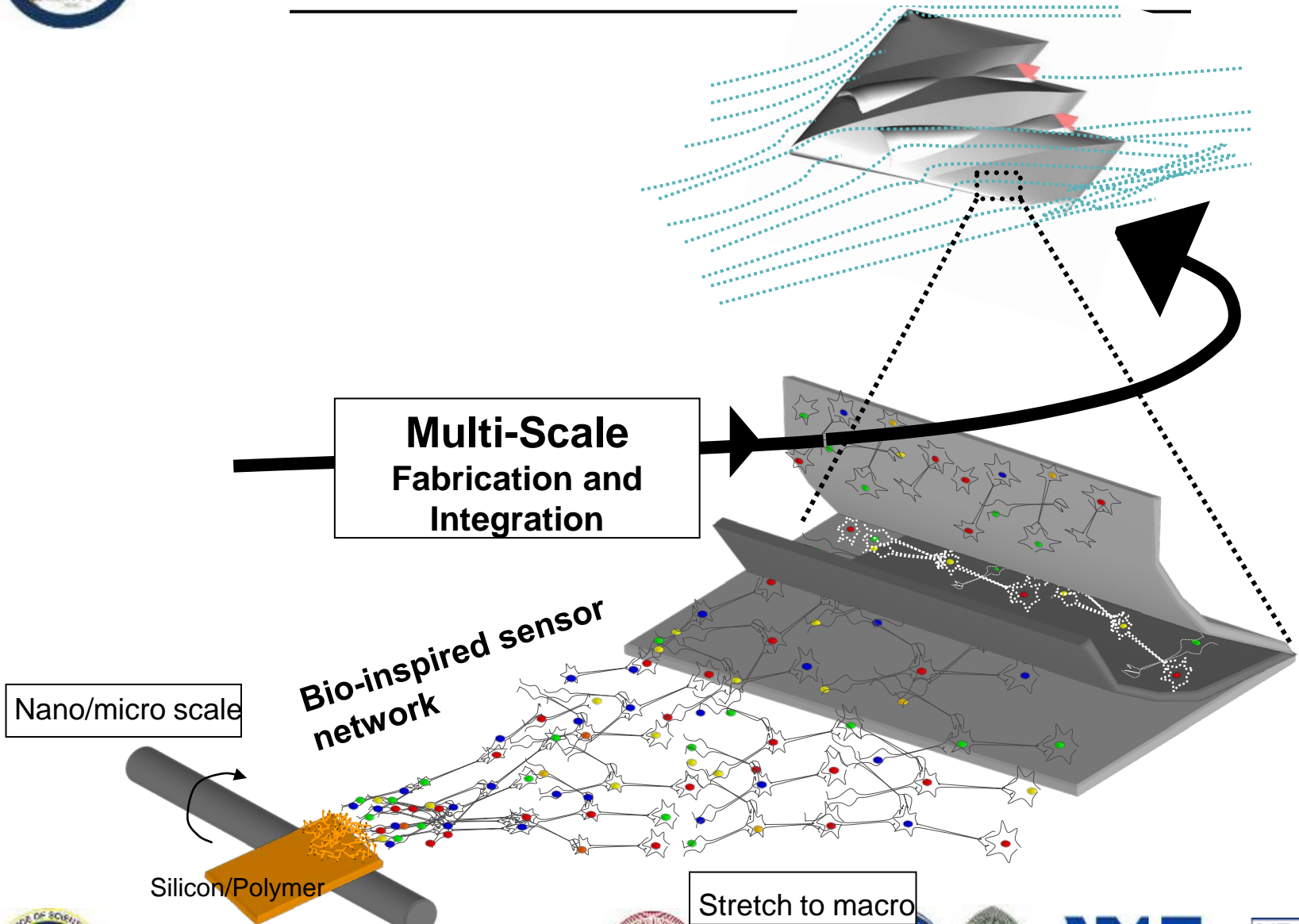


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Micro Fabrication for Macro Application



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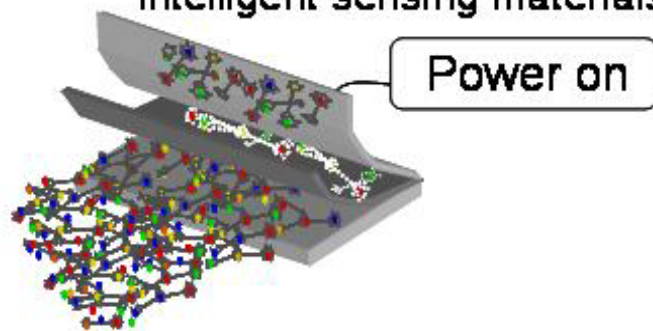


MACRO-SCALE (ULTRA-LARGE AREAS)

Fly-by-Feel Autonomous Vehicle

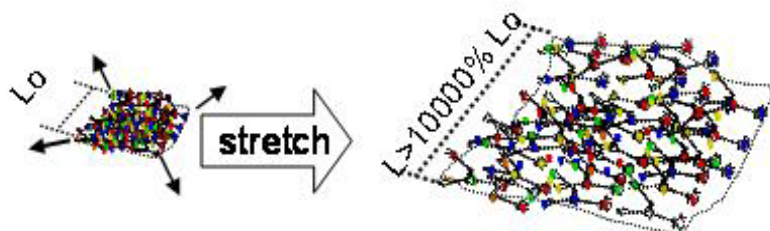


Intelligent sensing materials



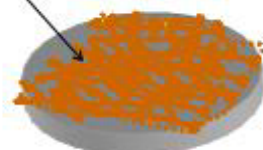
Step 5: Training and Learning

Step 4: integration and Functionalization



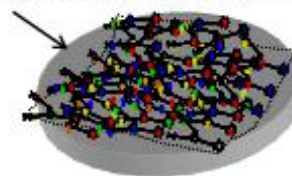
Step 3: Network Stretch and Expansion

Making network



CMOS Process

Adding sensors/electronics



CMOS/MEMS Process

Step 1: Stretchable Network Design

Step 2: Nano/Microsensors and Electronics

NANO-MICROSCALE DESIGN AND FABRICATION (CMOS PROCESSES)

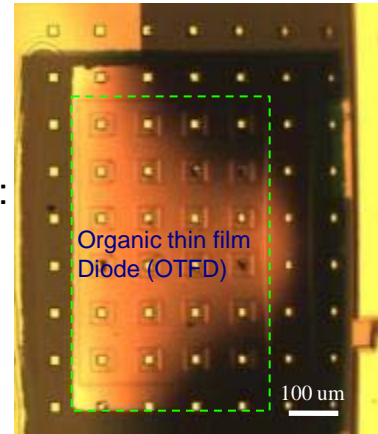
From NANO to MACRO



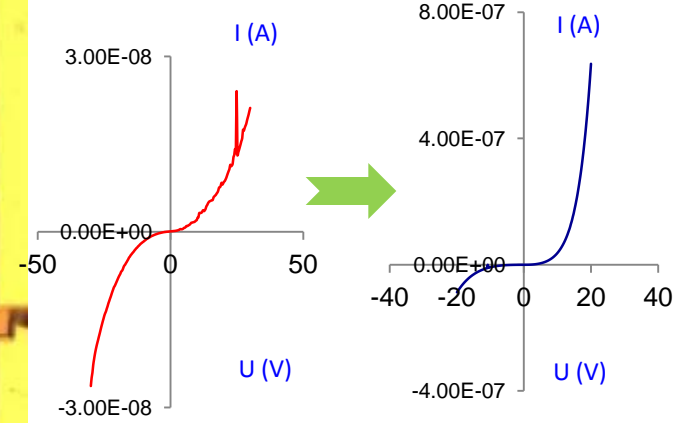
OTFD Sensors for Stretchable Network

Integration of Organic Thin Film Diodes (OTFDS)

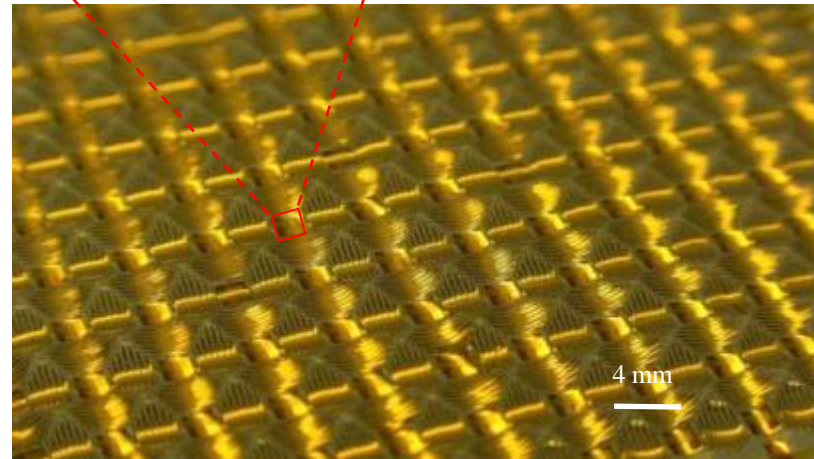
- Packaged OTFDS in the network
 - Improved diode performance
 - Protect OTFDS in harsh environment:
 - High temperature(350°C),
 - Solvents, acids
- To measure temperature



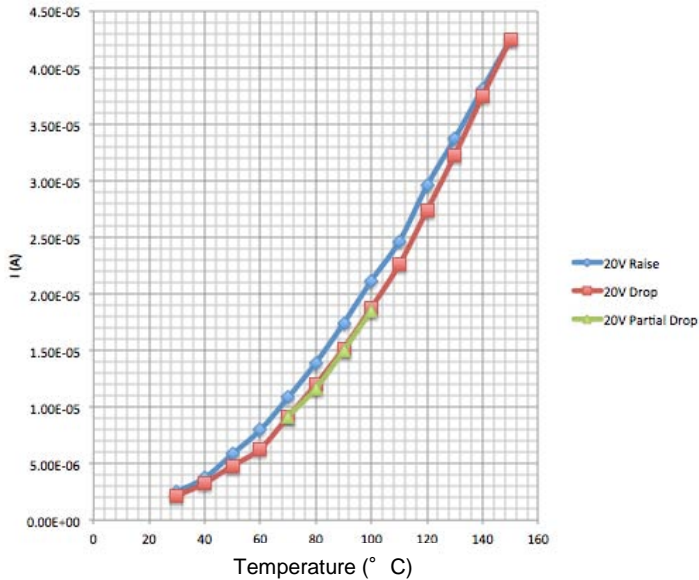
Organic thin film diode I-V curves (Improved diode performance)



Network node Degraded I-V (2011) Improved I-V (2012)



An OTFD based temperature sensor network



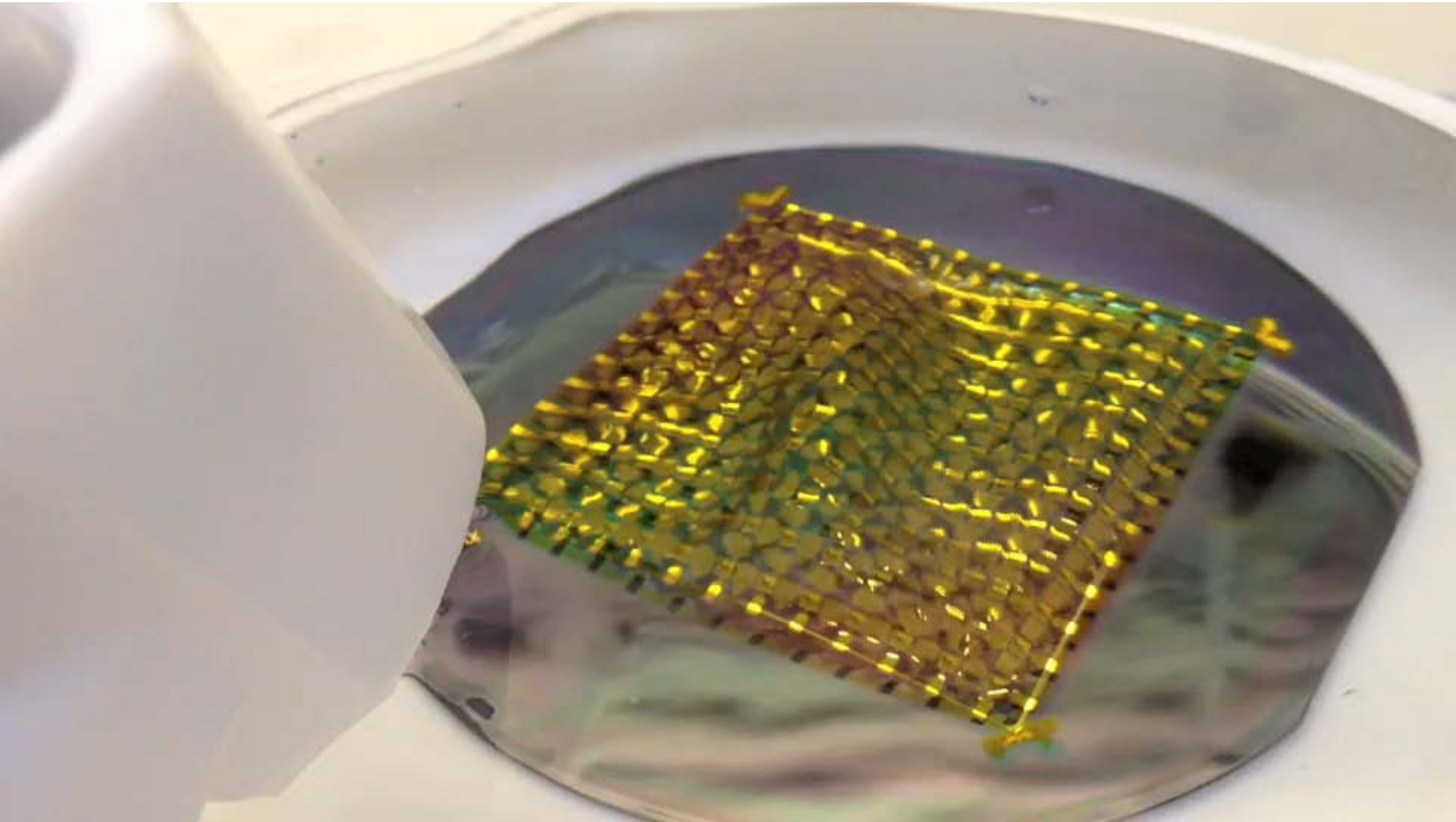
Temperature measurement (I-T) of an OTFD

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Video: 169 nodes network after release

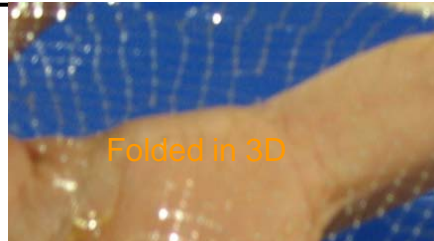


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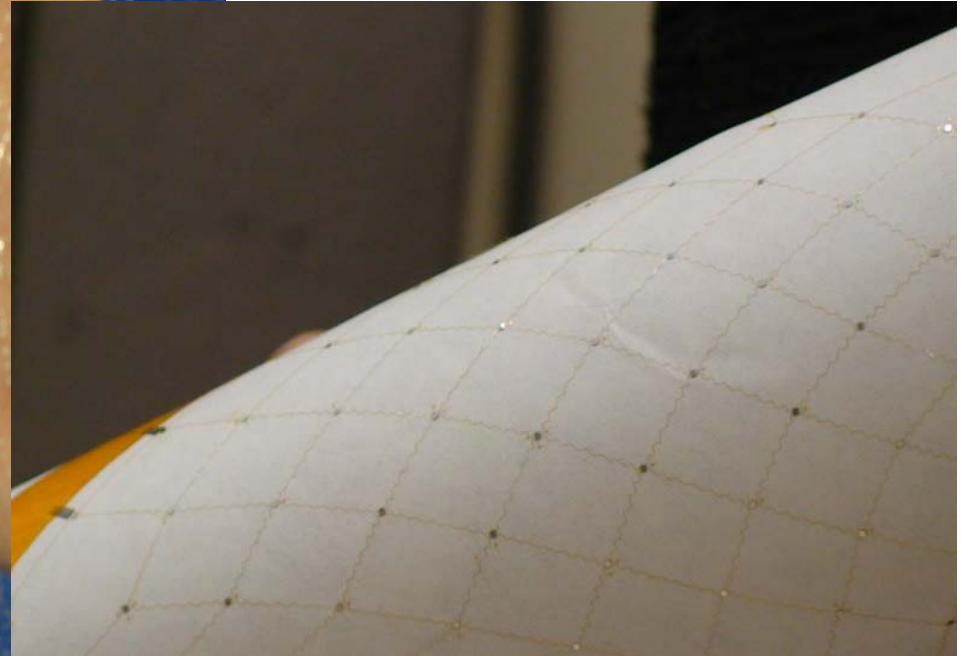
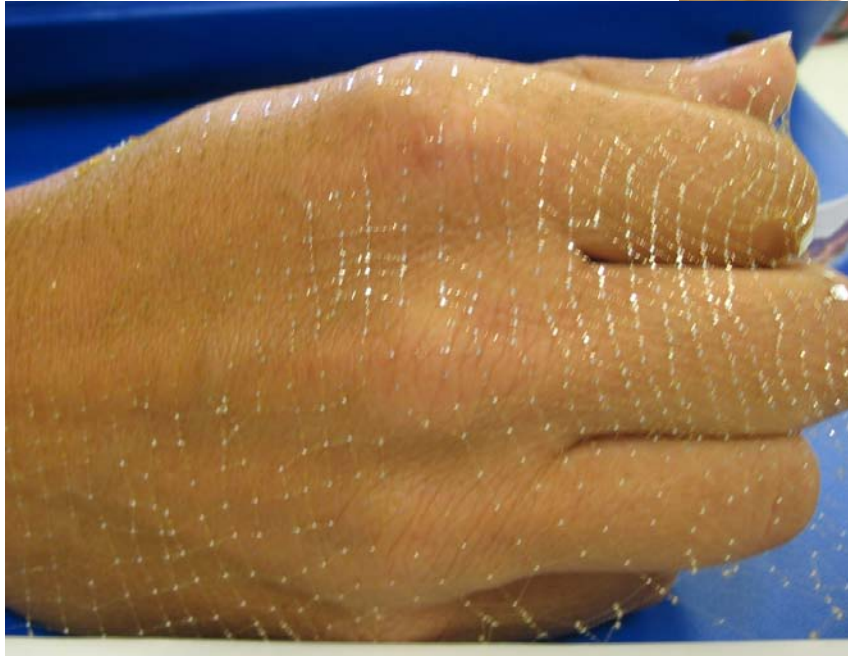




Coating 3D bodies



Expanded network



G.Lanzara, J. Feng and F.K.Chang, Smart Materials and Structures, 19, 045013, 2010

G.Lanzara et al, Advanced Materials, 2010



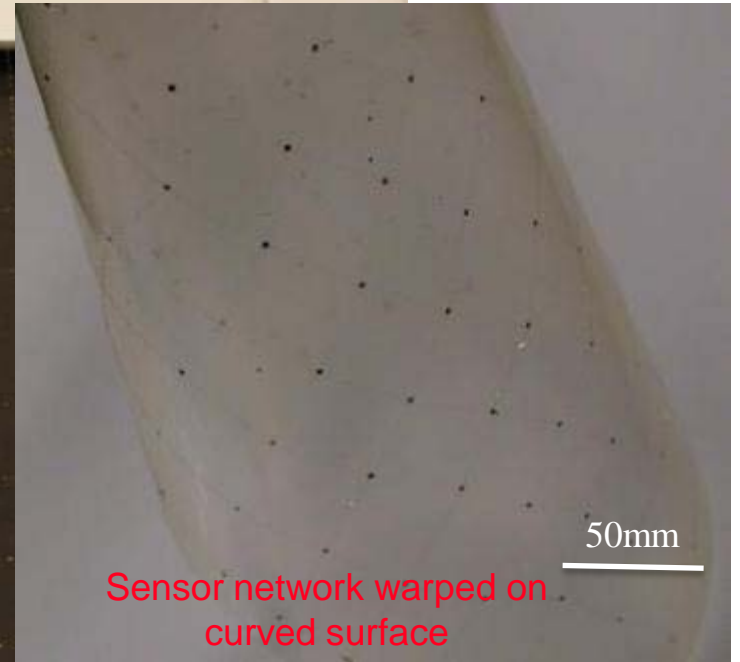
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Fully Stretched Sensory Network

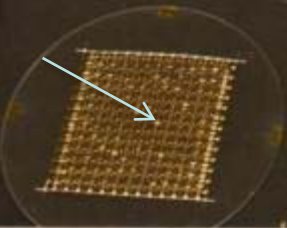
Network after full stretch



Sensor network warped on curved surface

50mm

Network before stretch



50mm

Area increased by 10,000%
Single wire resistance unchanged during/after full stretch (400 Ω)



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Multi-physic and Multi-scale Sensors

Chang, Wang – Stanford

McLeod – UC Boulder

Carman – UCLA

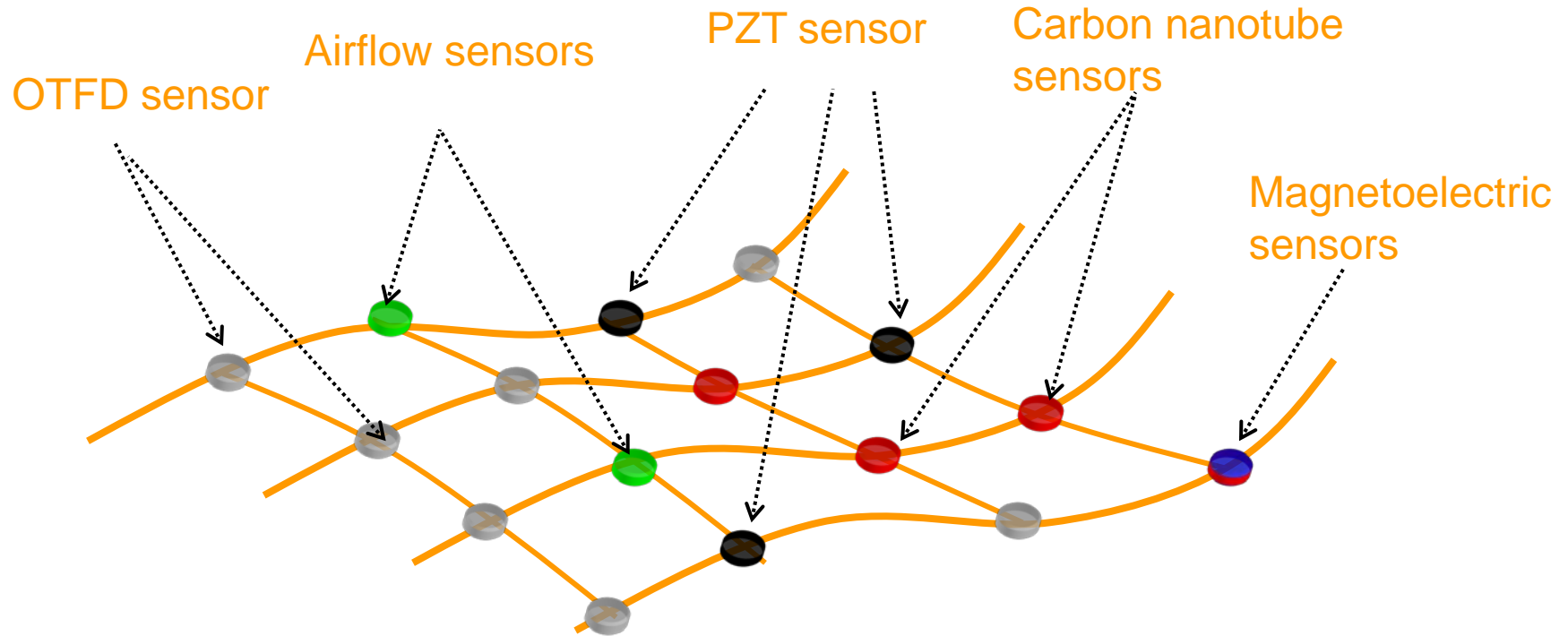
Servati, Ko – UBC

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Network Functionalization

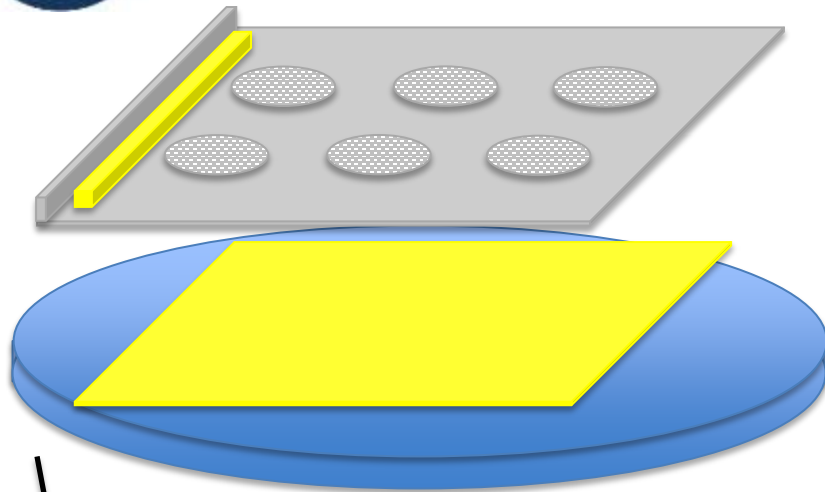


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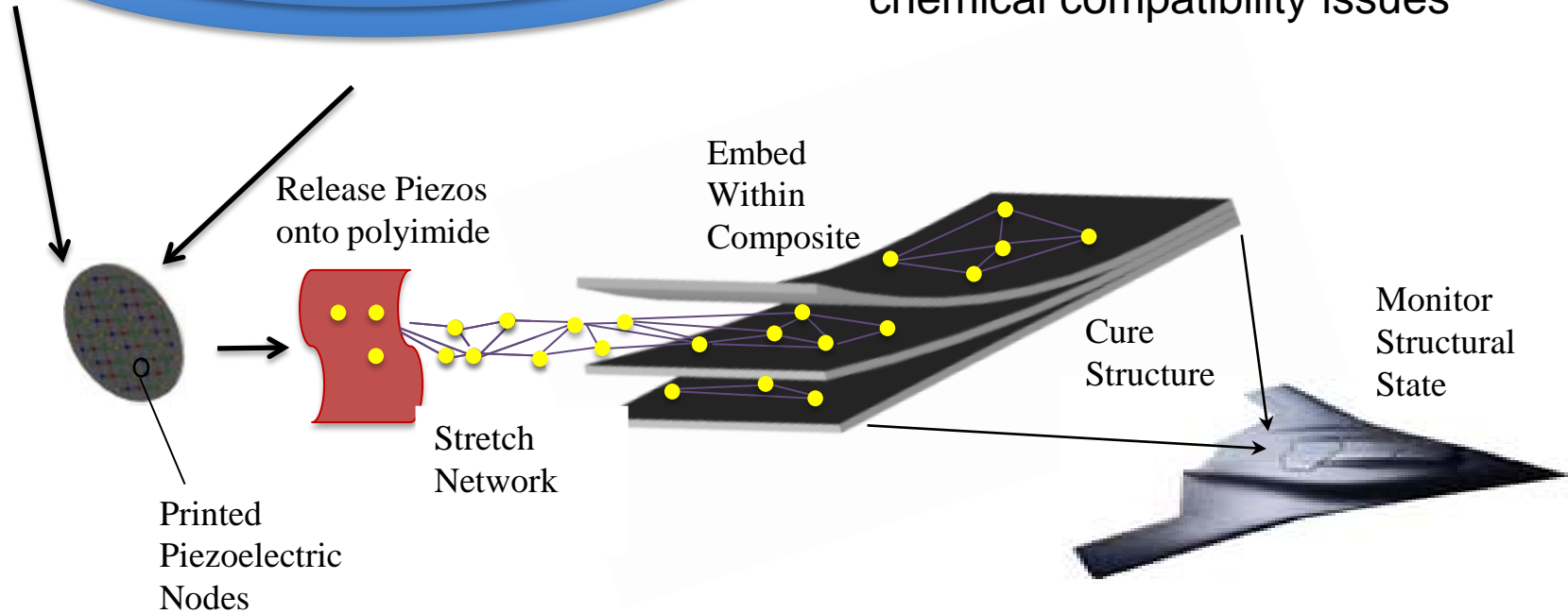
PZT Actuators/Sensors for Stretchable Network



Create piezoelectric sensing systems on the stretchable network

Method: Integrate thick film ceramics into C-MOS processing

Challenges: Temperature & chemical compatibility issues



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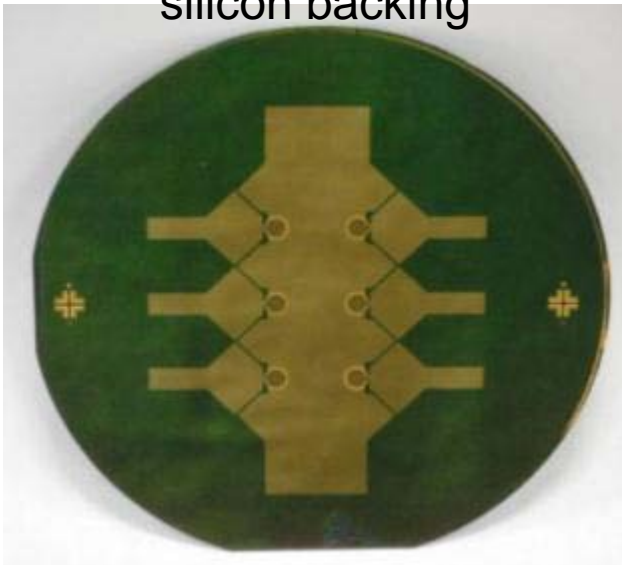




Recent Accomplishments

- Screen printed piezo-ceramics integrated into C-Mos type processing & released onto a polyimide film with electrodes.

Thick film piezos on a silicon backing



Piezors released onto a polyimide film



Piezors



- Innovations
 - New method to transfer piezos from a fabrication substrate to an organic substrate

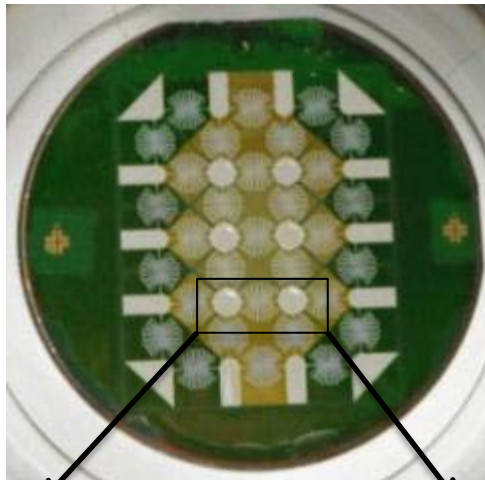
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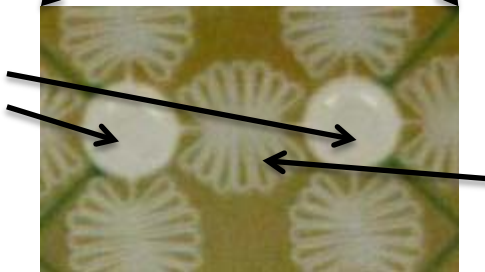


Ongoing Work

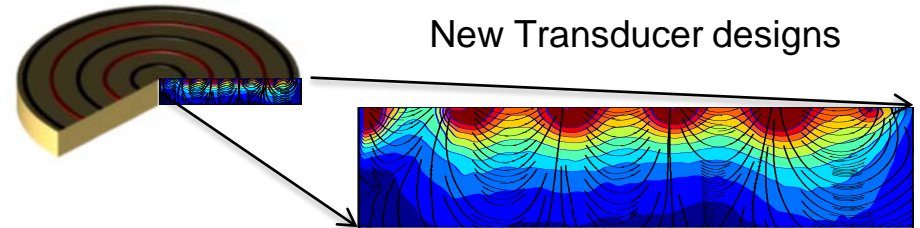
- Create a stretchable network from the screen printed piezos released onto an organic backing
- Characterization of materials
- New transducer designs



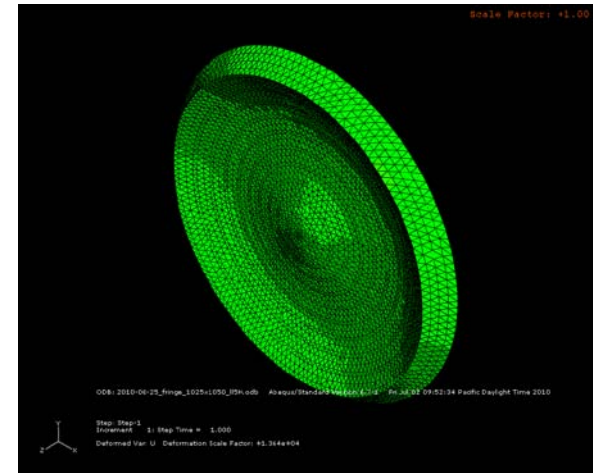
Piezos on a polyimide film



Stretchable wire pattern



New Transducer designs



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Air Flow Sensor Configuration

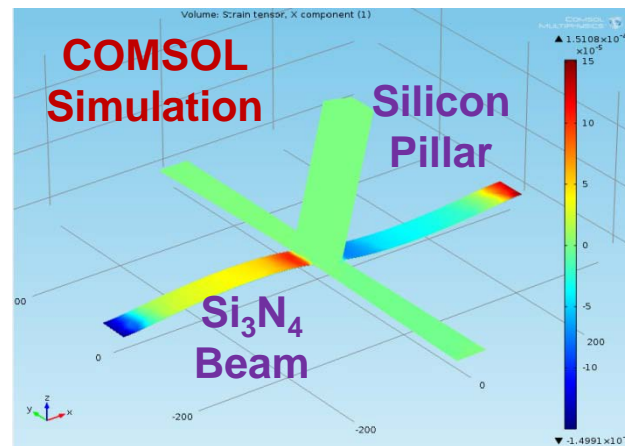
(Yue Guo, Prof. Shan X. Wang)

- **Aim:** Obtain the real-time air flow profile (velocity + direction) surrounding the entire airplane

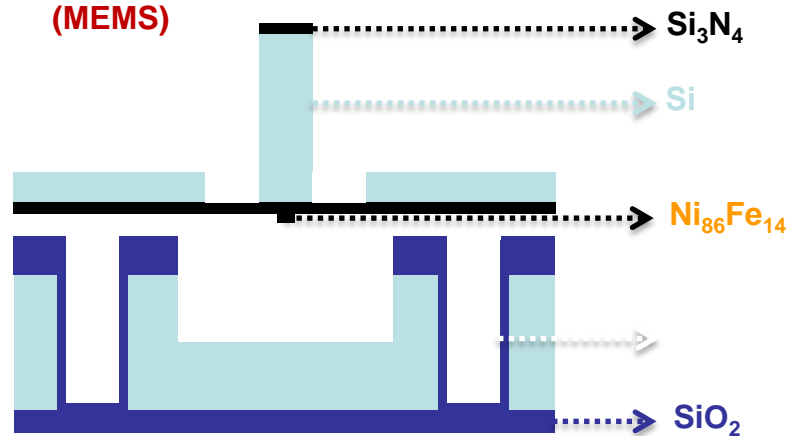


1. Air Flow hits the pillar
2. Deflection in the beam
3. Strain in the sensing elements
4. **Inverse Magnetostrictive Effect**
Stress \rightarrow Magnetization rotation
 \rightarrow Resistivity change, $\Delta R/R$
Or **Piezoresistive Effect**
5. Voltage change from $\Delta R/R$

Pillar	Values	Beam	Values
Length	50 μm	Length	350 μm
Width	50 μm	Width	52 μm
Height	250 μm	Thickness	1 μm



Cross-section View (MEMS)



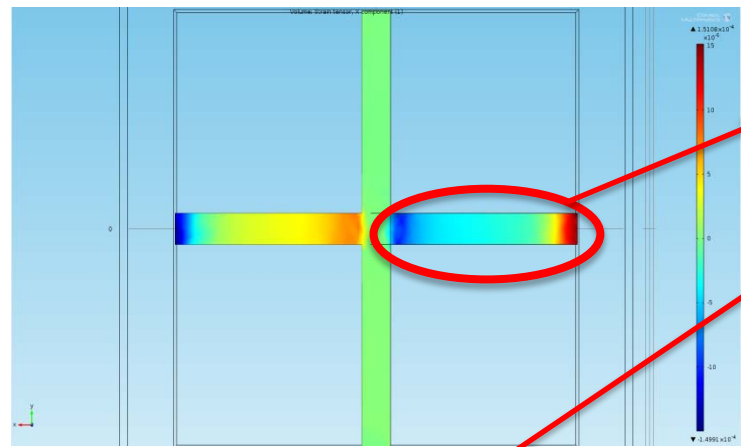
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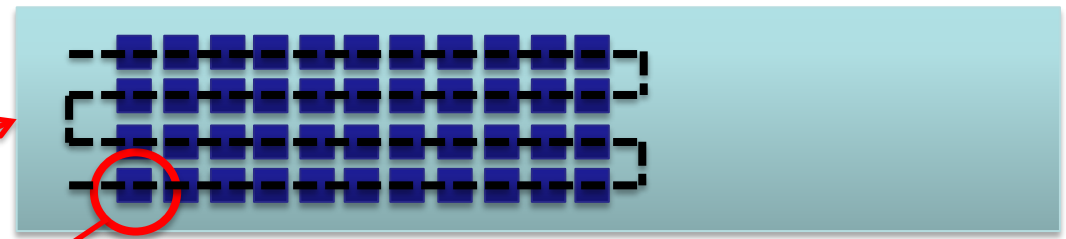


Magneto-resistance (MR) Air Flow Sensor

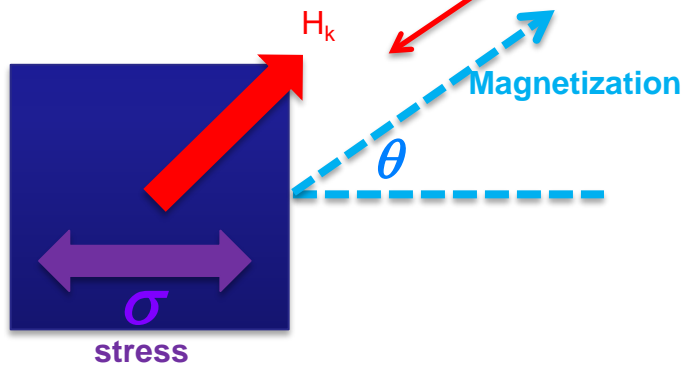
Bottom View of Beams



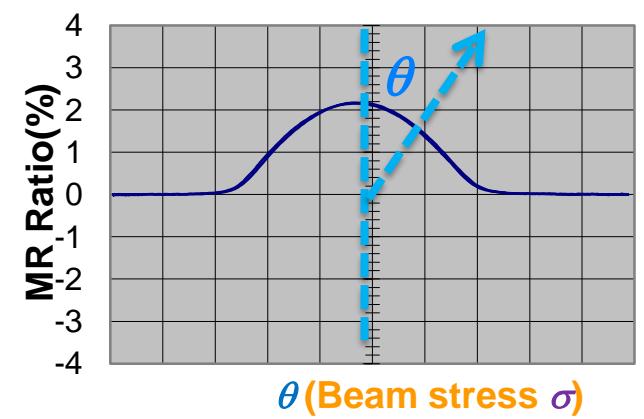
Ni₈₆Fe₁₄ Sensing Elements



- 4 x 10 array in series for larger output signal
- Square shape for avoiding demagnetizing field



MR signal is related to beam stress and thus air flow velocity.



$$H_k \sin\left(\theta - \frac{\pi}{4}\right) \cos\left(\theta - \frac{\pi}{4}\right) + \frac{3\lambda_s \sigma}{\mu_0 M_s} \sin \theta \cos \theta = 0$$



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Design Comparison

Sensing Elements	L_{sensor}	W_{sensor}	t_{sensor}
Magneto-resistance	4um x10	4um x4	25nm
Piezo-resistance	50um	25um	40nm

Strain 1e-5	Magneto-resistance	Piezo-resistance
Power	1 mW	1 mW
Resistivity	15e-8 ohm·m (Ni ₈₄ Fe ₁₆)	2e-5 ohm·m (PolySi)
Resistance	240 ohm	1000 hm
Voltage & Current	0.5 V, 2 mA	1 V, 1 mA
Current Density	2e10 A/m ²	1e9 A/m ²
Resistance Change	0.11 % (AMR), 0.44 % (GMR)	0.029 %
Voltage Change	0.55 mV (AMR), 2.2 mV (GMR)	0.29 mV
Johnson Noise	2 nV/√Hz	4 nV/√Hz

Anisotropic magnetoresistive (AMR) and giant magnetoresistive (GMR) air flow sensors with 1 mW power consumption are feasible and outperform similar piezoresistive air flow sensors.

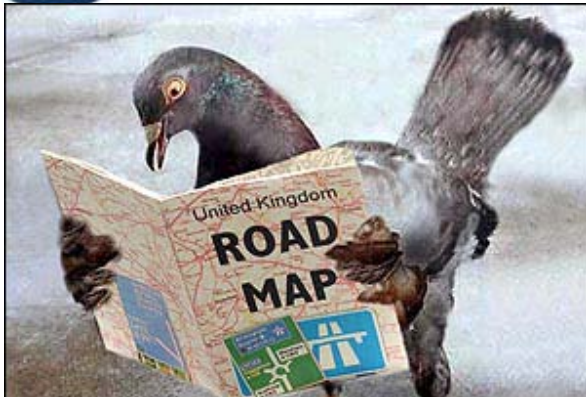


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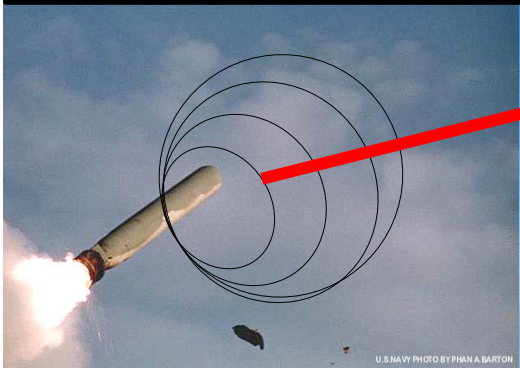




Magnetolectric Sensors for Detecting Magnetic Field (Carman's Group)

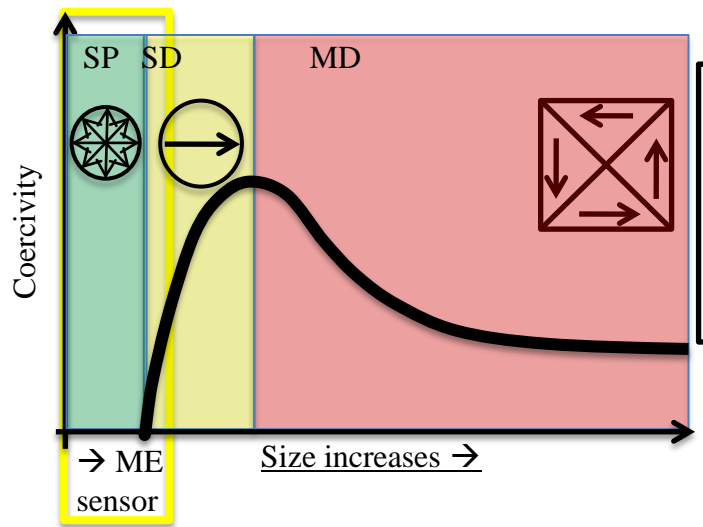


Detecting incoming threats using magnetic perturbation



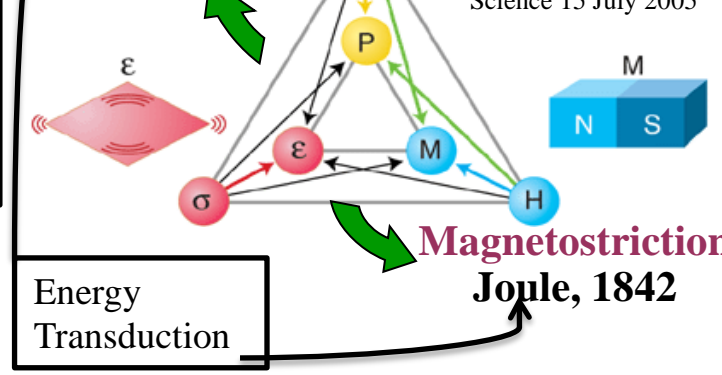
Beak and/or visual cortex contains superparamagnetic particles to track/see magnetic flux lines

<http://www.usswisconsin.org/>



Develop sensitive magnetometer using biological inspiration & phenomena present only at nanoscale

Piezoelectricity
Curie, 1880



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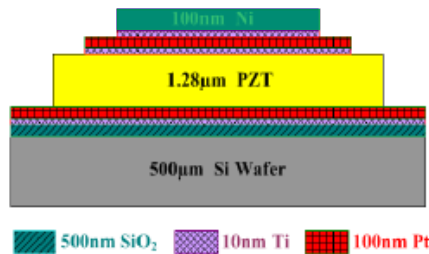




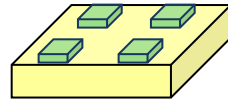
Method of Approach

Nanoscale Magnetolectric Materials for Detecting Magnetic Fields

2001 – Giant magnetolectric in <u>bulk</u> composite (Ryu)	> 1000 papers
2004 – Magnetolectric in <u>thin film</u>	> 50
2007 – Magnetolectric in <u>SD</u> (UCB and UCLA)	> 5
2011 – Magnetolectric in <u>SP</u> (UCLA)	~ 0



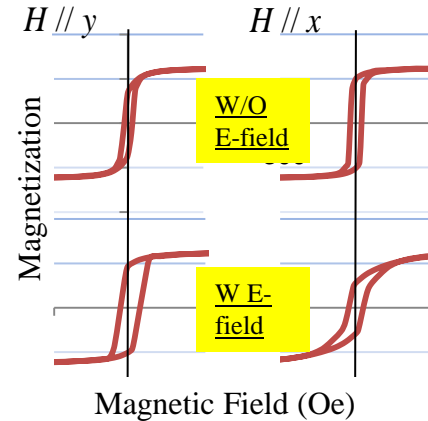
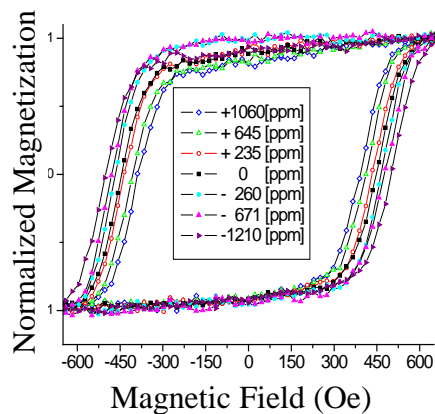
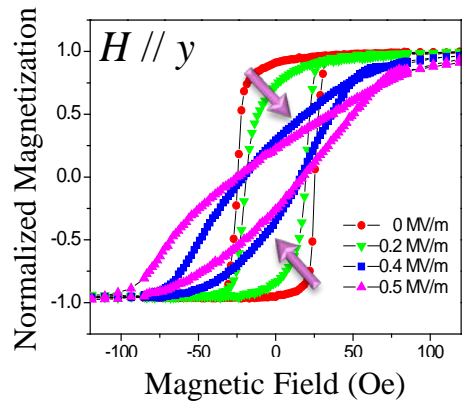
Thin film



Single domain



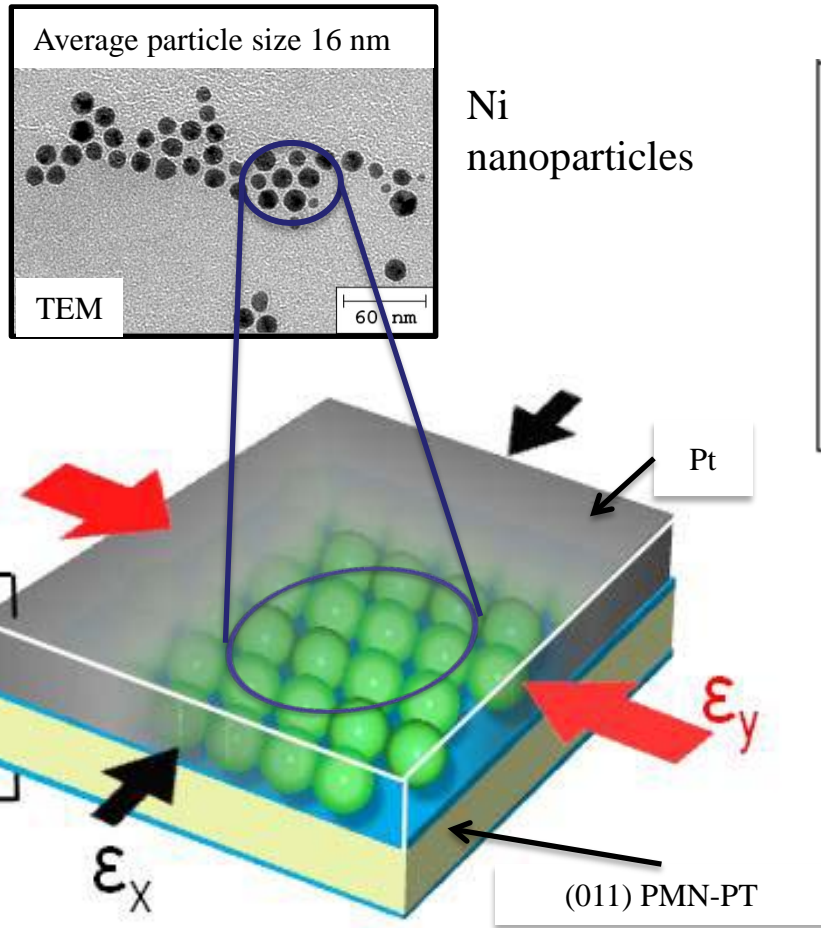
Superparamagnetic





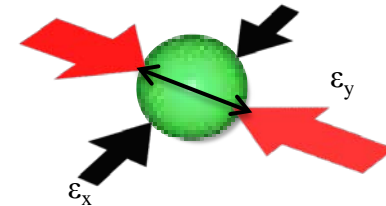
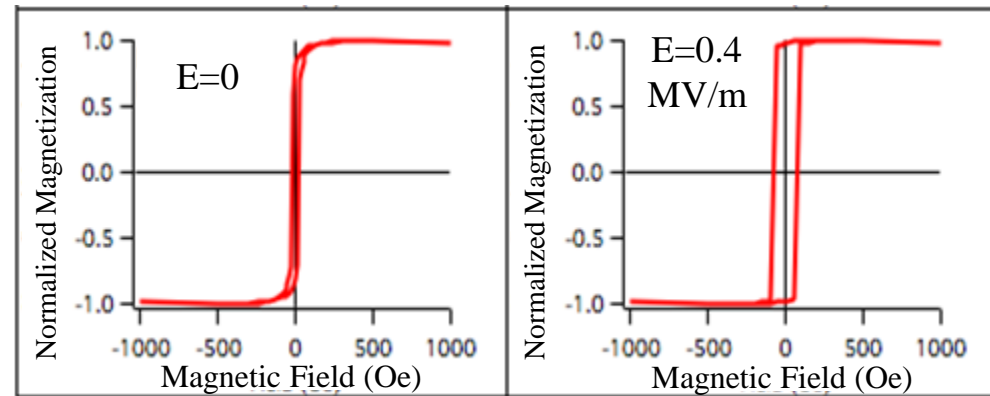
Method of Approach

Magnetolectric Control of Superparamagnetism



Superparamagnetic

Single Domain



- Magnetolectric composite induces strain in Ni nanoparticles
- $E=0$ produces superparamagnetic behavior
- $E=0.4$ MV/m produces single domain structure

Magnetolectric composite

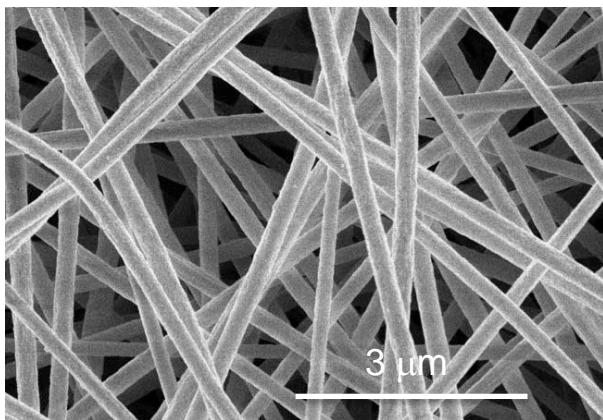
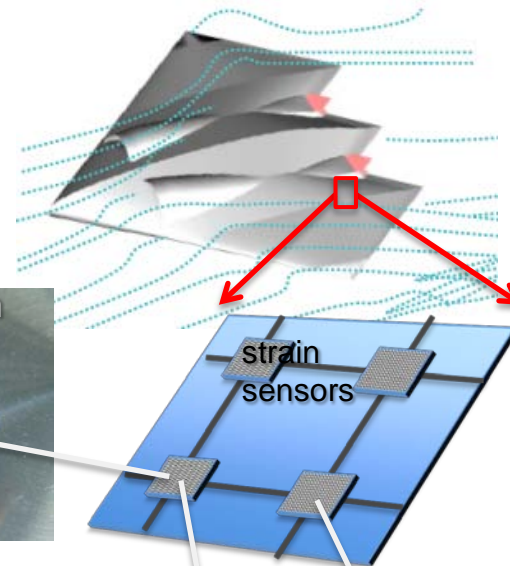
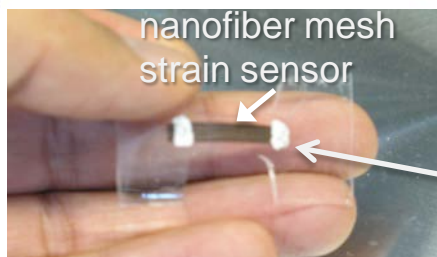
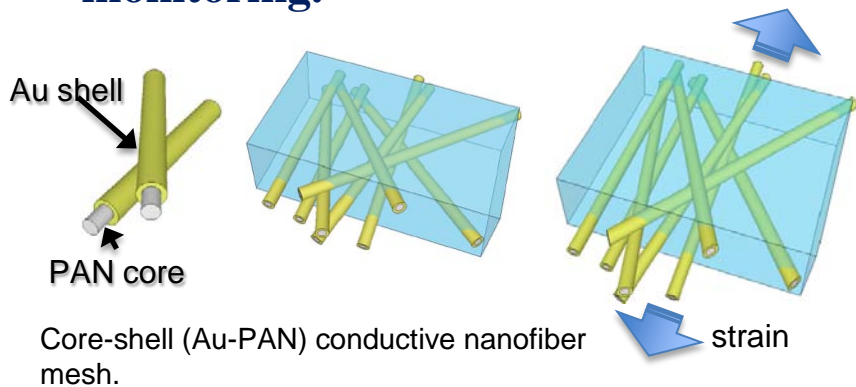
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Bio-inspired Sensory Network



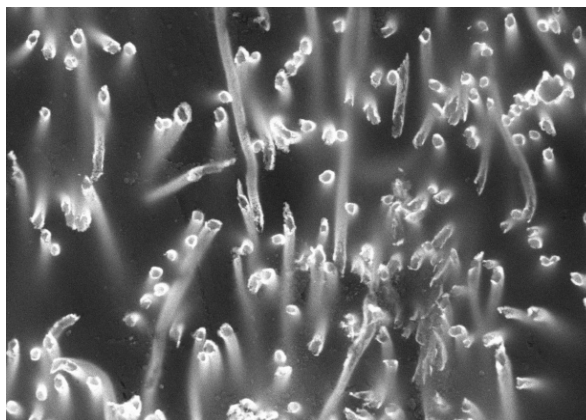


Nano-Strain Sensors (Servati & Ko's Group)

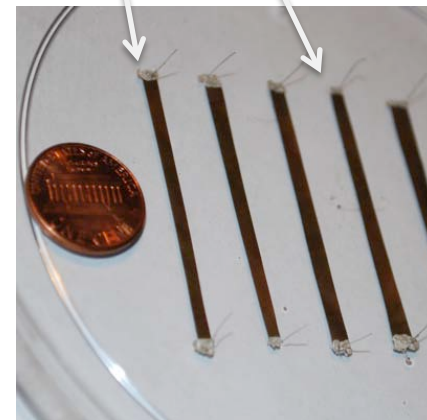
- Strain sensors based on electrospun nanofibers.
- Core-shell nanofibers for ultra-sensitive strain monitoring.



SEM photomicrograph of core-shell (Au-PAN) conductive nanofiber mesh.



Cross section of core-shell (Au-PAN) nanofiber mesh in PDMS.



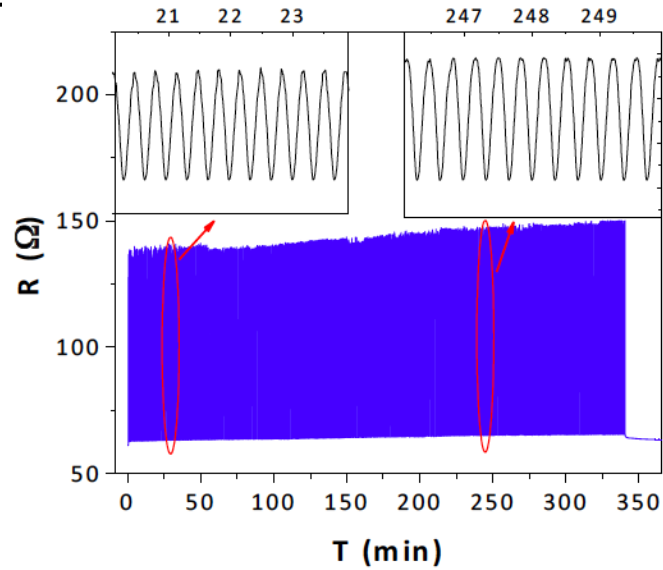
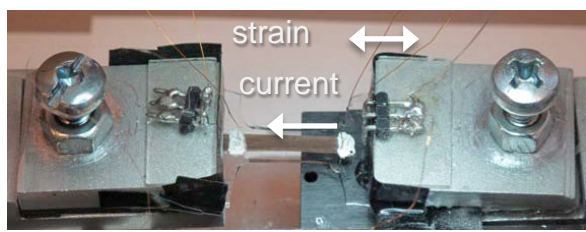
Several parallel nanofiber strain sensors embedded in PDMS.



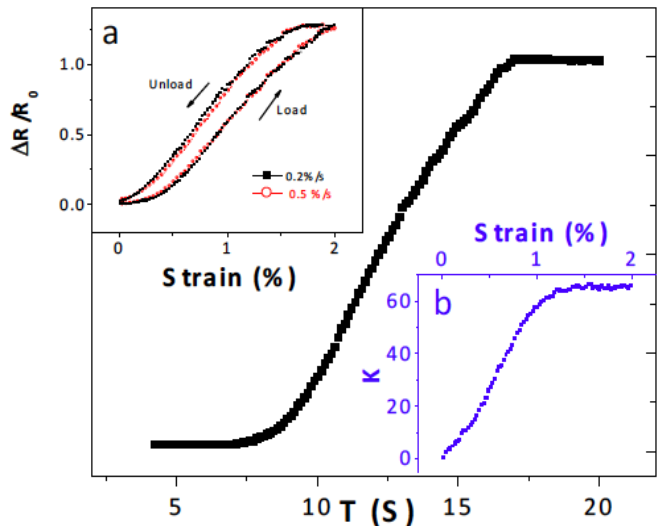
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Accomplishments: Stable, High-Sensitivity Response for Planar Strain and Vibrational Monitoring

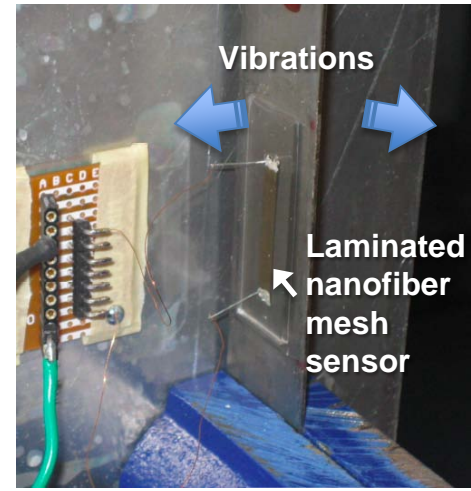
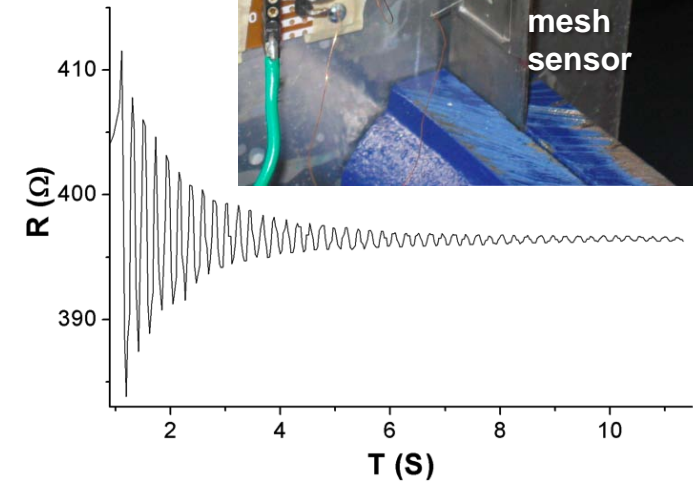


Stable change in resistance over 1000 repeated stretching and unloading of the sensor.



Change in resistance and gauge factor K under uniaxial tensile strain.

Measured changes in resistance due to vibrations of a rigid metallic blade, showing both **tensile** and **compressive** strain sensing response.

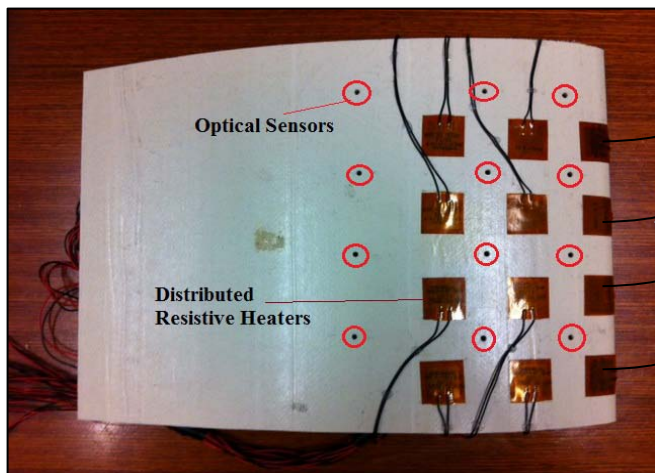


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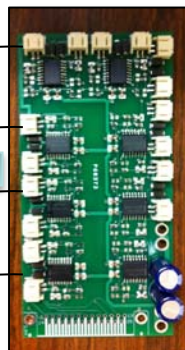


Data flow and CU program overview

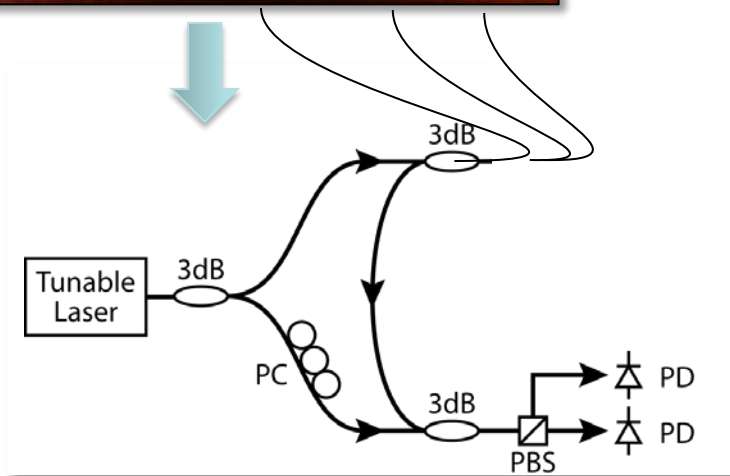
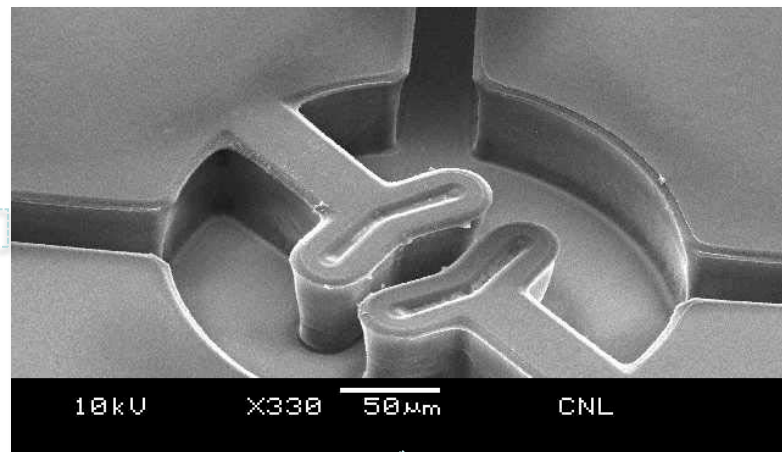
Wing with sensors and actuators



Amplifiers



Living neural network



Multi-channel sensor interrogation



Precision signal processing



Precision interrogation results

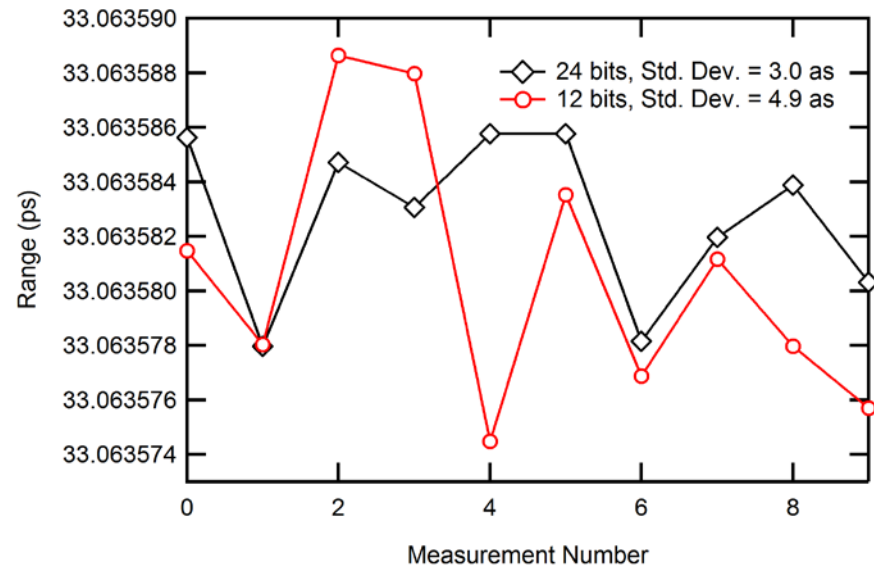
Multiple (100's)
sensor precision
ranging supported
by single network.

Peak Selection and Measurements

	Amplitude	Mean	Std. Dev.	Ref. Peak	Range (ps)	Mean	Std. Dev.
Peak # 0 Location 3.4792 Pickup Peak0 Lock	15952.2292	15941.1658	8.6323	None	3471.8773	3471.8781	0.00093601
Peak # 1 Location 3.5123 Pickup Cursor 1 Lock	15239.2095	15235.7026	6.5677	0	33.064	33.064	0.00000507
Peak # 0 Location 0.0000 Pickup Peak0 Lock	0	0	0.0000	None	0	0	0.00000000
Peak # 0 Location 0.0000 Pickup Peak0 Lock	0	0	0.0000	None	0	0	0.00000000

Higher bit-depth DAQ

- New noise floor = 3.0 attoseconds
- Range uncertainty = ± 1.29 Angstroms in silicon





Neuron Circuits and Interface Electronics

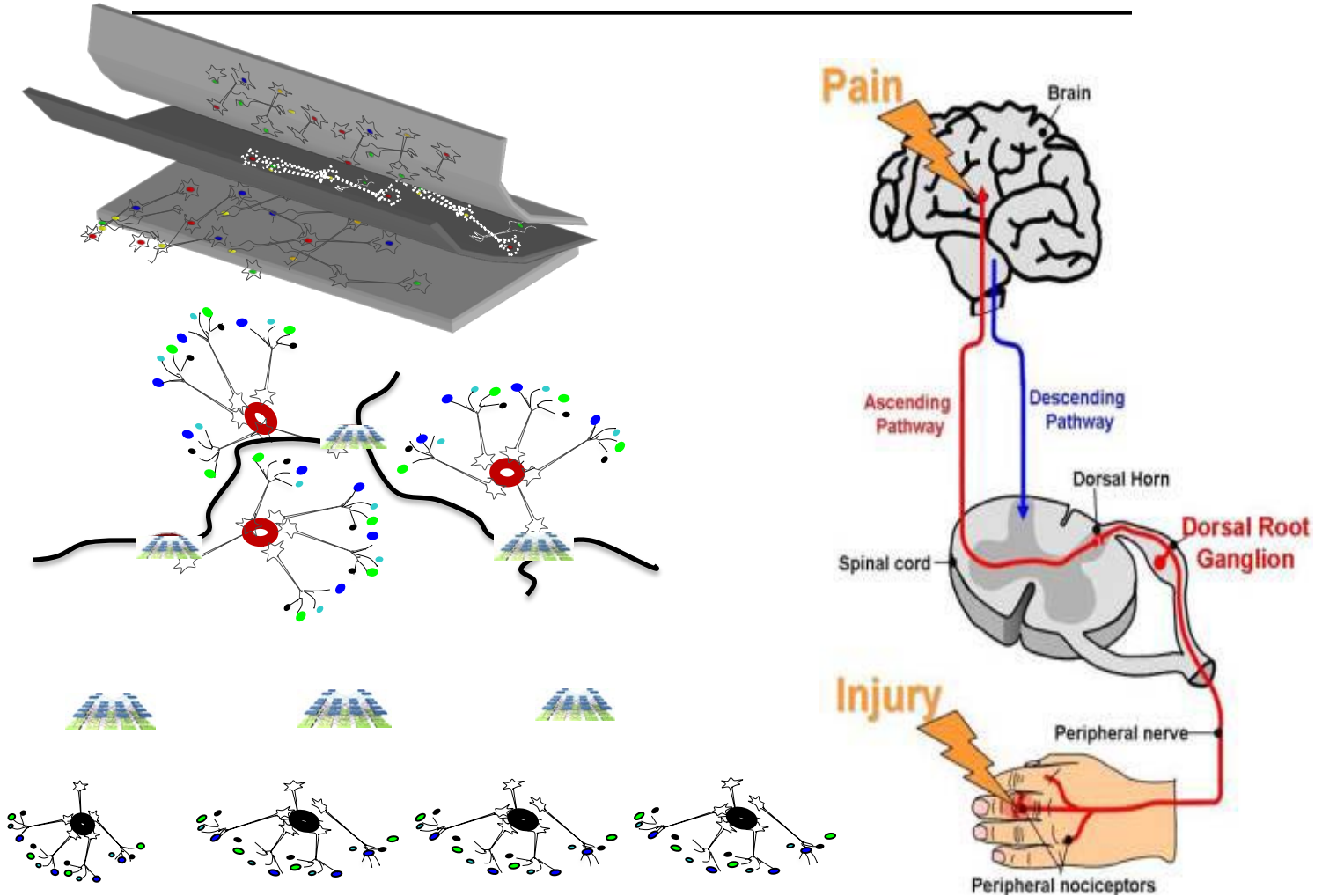
Chen – UCLA
Murmann – Stanford

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Material Development for Reasoning

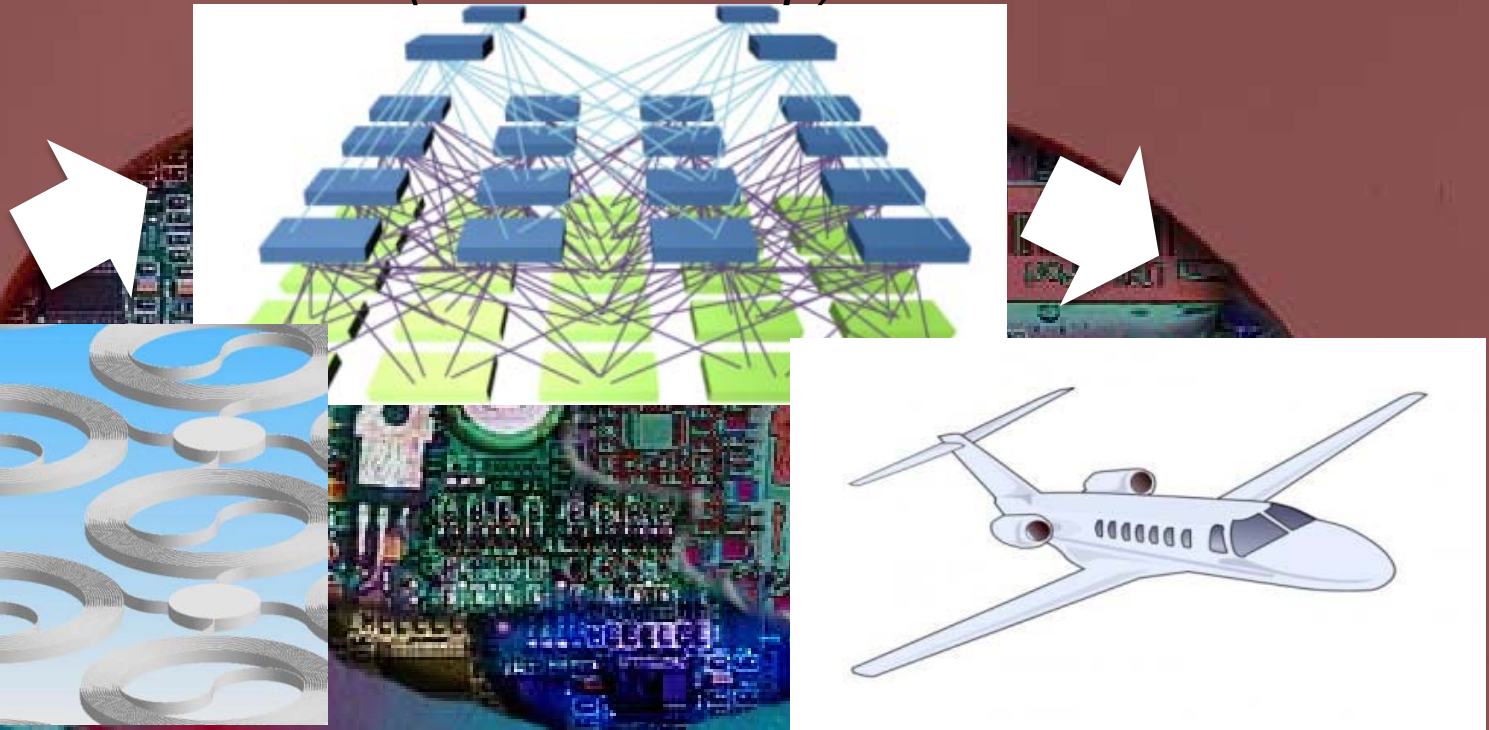


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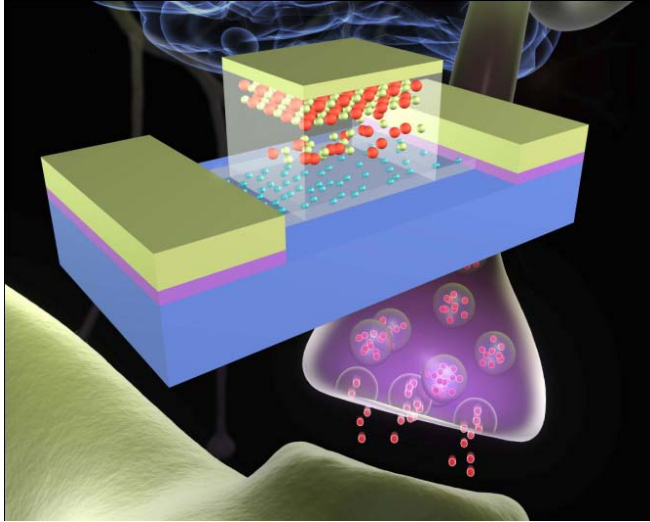
Neuron Circuits for Stretchable Network (Chen's Group)



In this project, we plan to develop electronic neuron circuits based on carbon nanotube/polymer composites, and integrate the neuron circuits with sensing networks that can (1) promptly process a large amount of signals in parallel to recognize exogenous threats accurately and effectively, (2) implement real-time learning autonomously, and (3) provide dynamic prognosis for appropriate response for UAV.

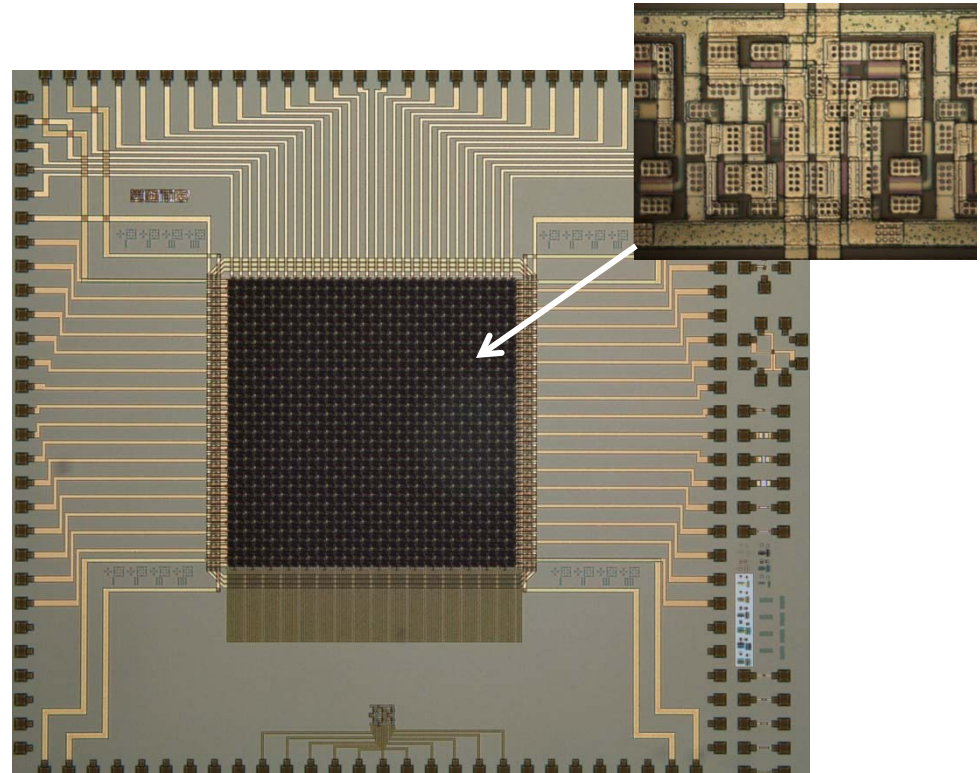


Synaptic Transistor & Large-scale Neuron Circuit



A synaptic transistor has been developed by integrating CNT and polymer materials to emulate biological synapse with spike signal processing, learning, and memory functions.

An image of a large scale neuron circuit by integrating 8192 synaptic transistors with Si MOS circuits with the functions of signal parallel processing, real-time pattern recognition, adaptive learning.

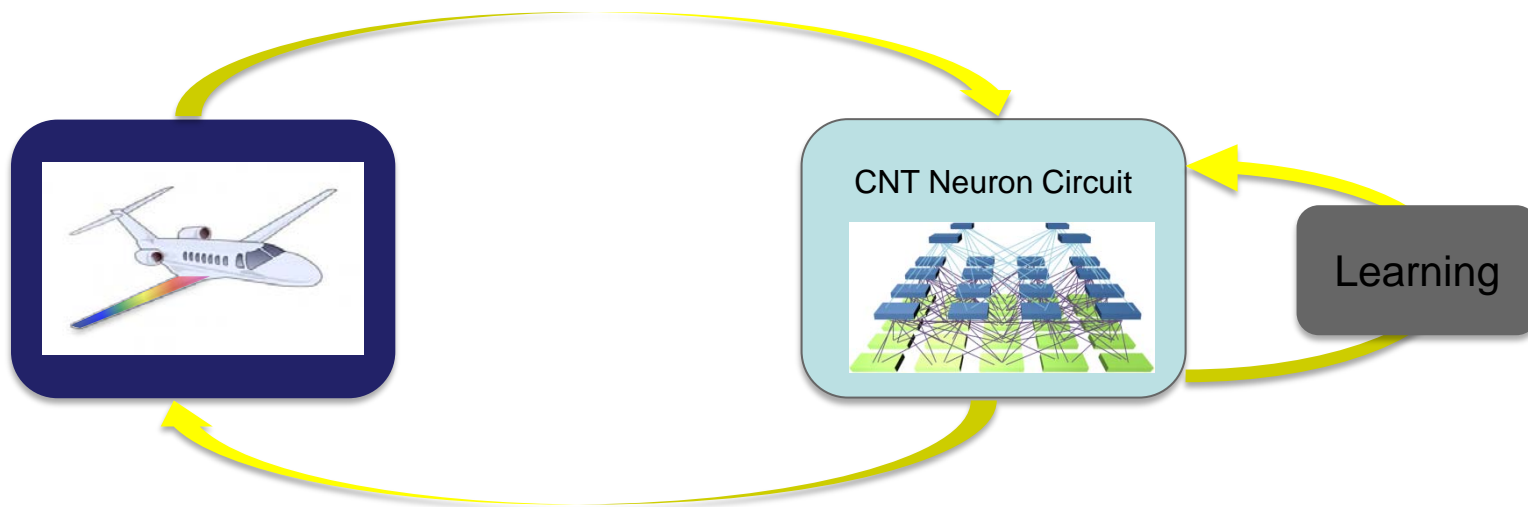


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Dynamic Interaction between Neuron Circuit & System



- ❖ Neurologically inspired theoretical models and architectures has been directly integrated and applied to establish the circuit architecture.
- ❖ The circuits have been integrated with the temperature sensing network developed at Prof. Chang's group at Stanford University.
- ❖ We will demonstrate (1) promptly process a large amount of signals in parallel to recognize exogenous threats accurately and effectively, (2) implement real-time learning autonomously, and (3) provide dynamic prognosis for appropriate response for UAV.



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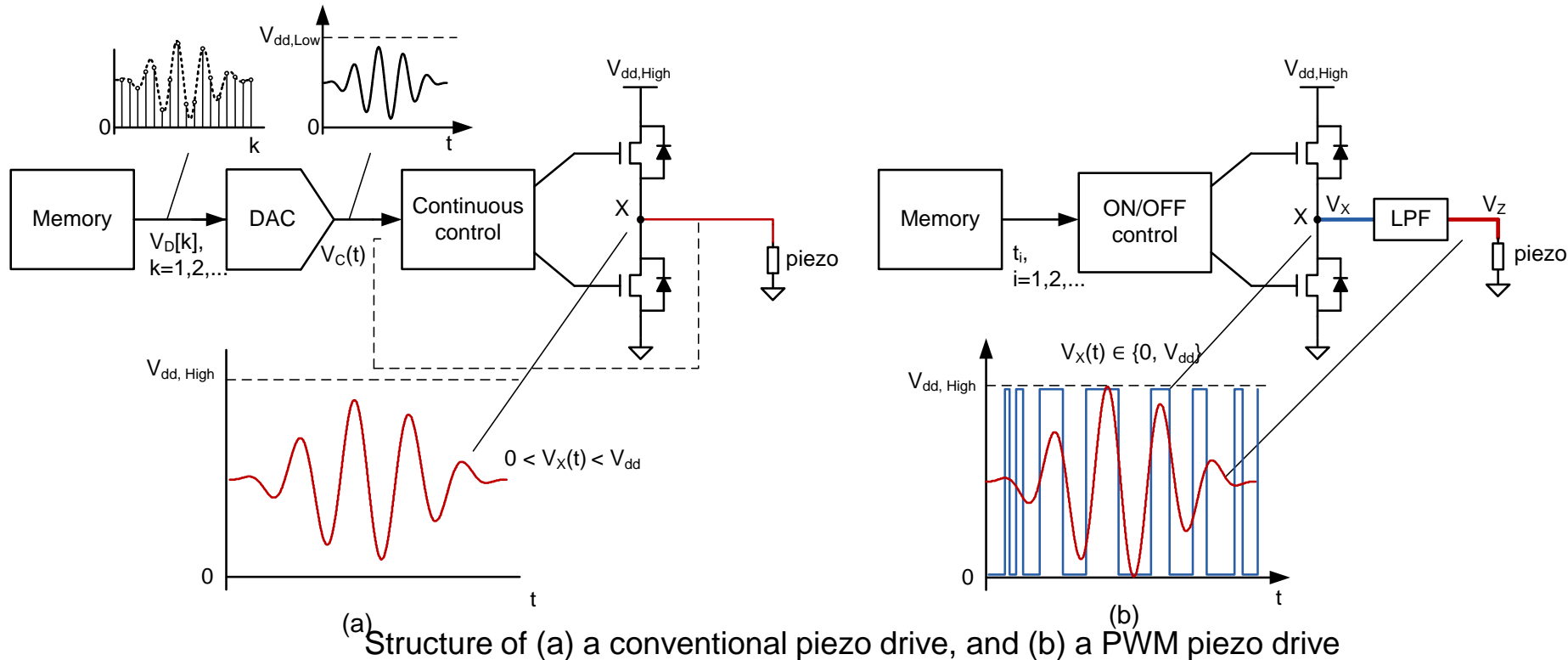




Interface Circuits for PZT Actuators (Murmann's Group)

Densely Integrated Interface Circuits for State Sensing Network

- Using Pulse-Width-Modulation (PWM) to generate the excitation waveform
 - Render the waveform by a series of precisely timed binary pulses
 - High power efficiency: (a) is bounded by 78%; (b) is bounded by 100%





Chip layout (to be taped out on 8/19)

Multiphase clock generator

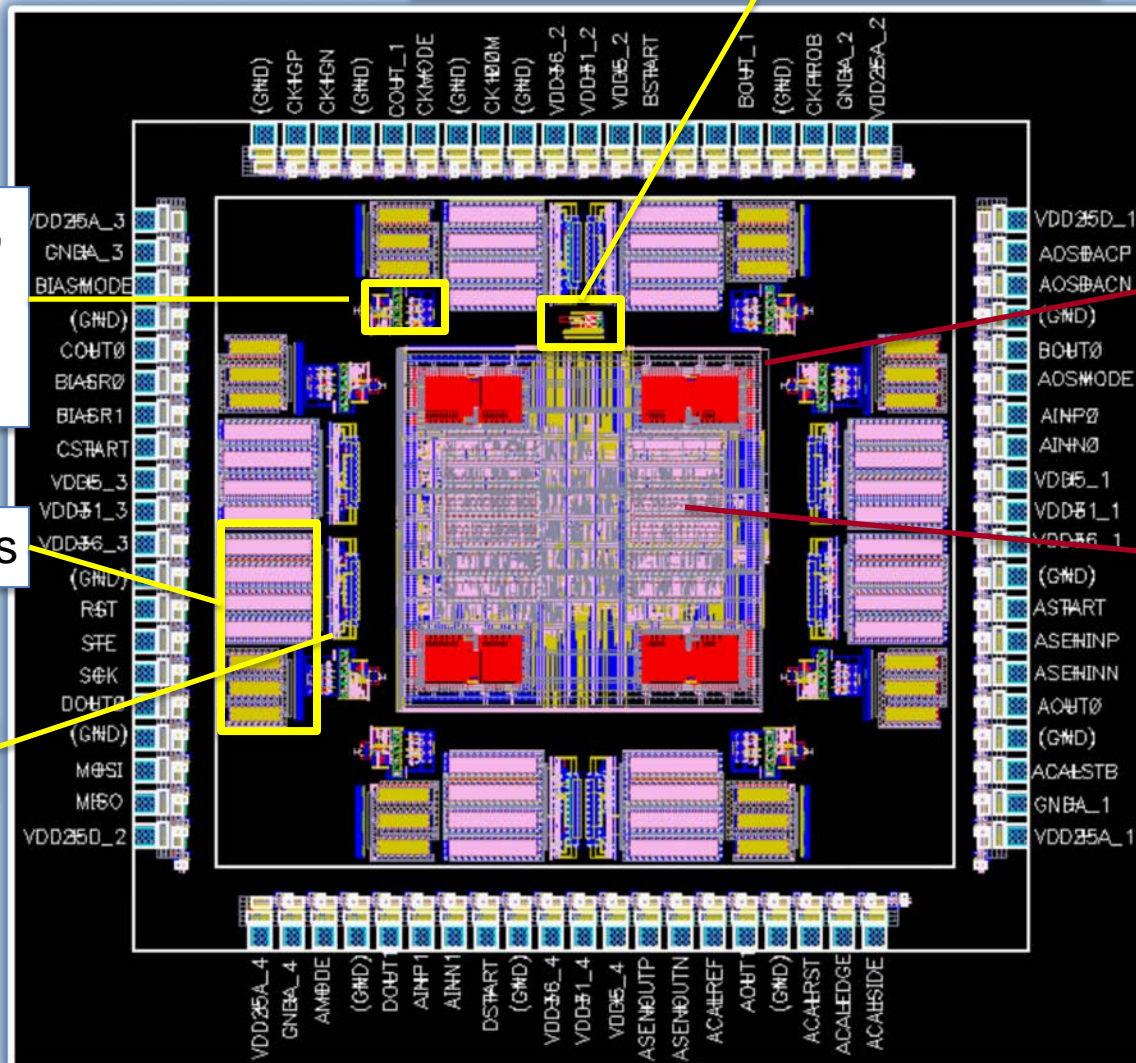
Gm-C integrator,
Latch, & OS
calibration DAC

Power transistors

Gate driver

SRAM(PWM
time table)

digital control
~40,000 logic
gates

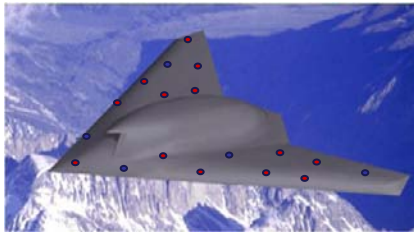




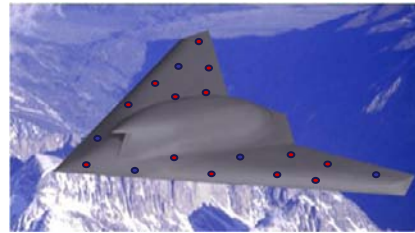
Potential Way

Baseline Generation

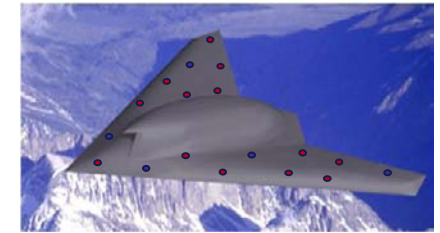
Generate large database of sensor responses for different structural states during training



Record sensor responses at state ' S_1 '



Record sensor responses at state ' S_2 '



Record sensor responses at state ' S_N '

- ***Enormous amount of effort & time consumption***
- ***Next to impossible to span entire range of environmental conditions and structural states***



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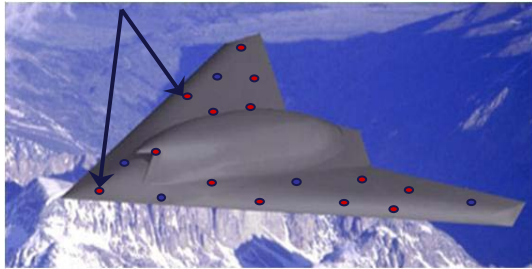
The Proposed Approach

**Data Driven
Techniques**



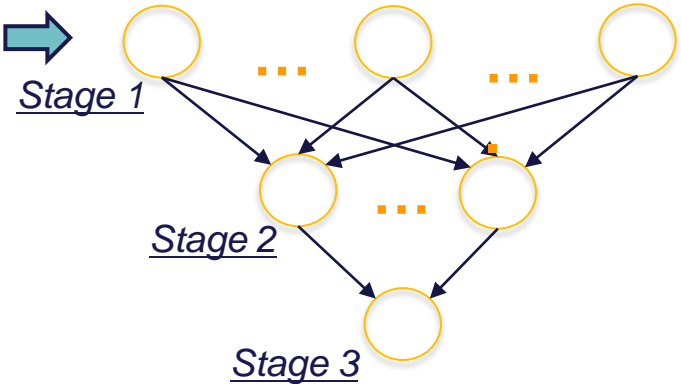
**Physics based
Strategies**

Distributed Actuator/Sensors



**Sensor signals
on-the-fly**

**Unsupervised learning
(Neural-net Architecture)**



**Physics based
compensation models**

Supervised Learning

State Estimation

Structural
changes

Damage
types

Others ...

**Autonomous
Guidance units**

**Decision
Management**

**AFOSR-MURI
Bio-inspired Sensory Network**





Modeling and Prognostics for Design and Validation

Ghosh – Johns Hopkins University
Chang – Stanford



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Mechanical and Electromagnetic Coupling Modeling

Methods of Approach

Coupled Simulation

Multi-time Scaling

To develop an coupled multi-scale, multi-physics computational model and code for analysis of electromagnetic devices, e.g. sensors, antenna leading to design

Large Deformation Dynamic Response

Nonlinear hyper-elastic material

$$\underline{\underline{S}} = \lambda \cdot \text{tr}(\underline{\underline{E}}) + 2\mu \cdot \underline{\underline{E}}$$

Finite deformation problem

$$\int_{\Omega_o} (\delta \underline{\underline{u}}^T \rho_o \ddot{\underline{\underline{u}}}) dV + \int_{\Omega_o} (\delta \underline{\underline{F}}^T \cdot \underline{\underline{P}}) dV - \int_{\Omega_o} (\delta \underline{\underline{u}}^T \rho_o \underline{\underline{b}}) dV$$

$$= \int_{\partial\Omega_o} \delta \underline{\underline{u}}^T \underline{\underline{t}}_o dS$$

Solve for

$\dot{\underline{\underline{u}}}$ & $\underline{\underline{u}}$

$\underline{\underline{S}}$: 2ndPiola-Kirchhoff Stress Tensor
 $\underline{\underline{E}}$: Lagrangian Green Strain Tensor
 $\underline{\underline{u}}$: Displacement
 λ, μ : Lamé Constants

Transient Electromagnetic Field

Maxwell equations in total Lagrangian

$$\nabla \times (\underline{\underline{H}}(\underline{\underline{X}}, t)) = \frac{\partial \underline{\underline{D}}(\underline{\underline{X}}, t)}{\partial t} + \underline{\underline{J}}(\underline{\underline{X}}, t)$$

Scalar and vector potential in reference configuration

$$\underline{\underline{B}} = \nabla \times \underline{\underline{A}} \quad \underline{\underline{E}} = -\nabla \phi - \dot{\underline{\underline{A}}}$$

$$\underline{\underline{H}}(\underline{\underline{X}}, t) = \left[\begin{array}{l} \left(\varepsilon_o J \left\{ -\nabla \Phi - \dot{\underline{\underline{A}}} - (\underline{\underline{F}}^{-1} \cdot \dot{\underline{\underline{u}}}) \times (\nabla \times \underline{\underline{A}}) \right\} \cdot \underline{\underline{C}}^{-1} \right) \times (\underline{\underline{F}}^{-1} \cdot \dot{\underline{\underline{u}}}) \\ + \frac{1}{\mu_o J} \{ (\nabla \times \underline{\underline{A}}) \cdot \underline{\underline{C}} \} \end{array} \right]$$

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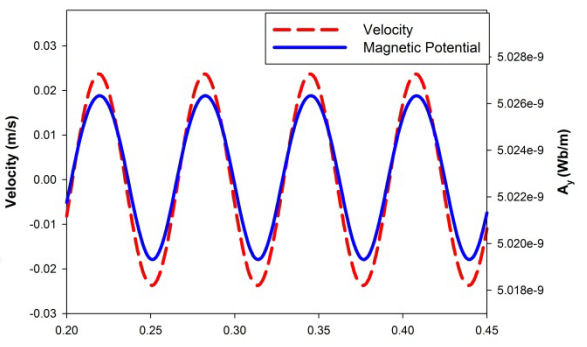
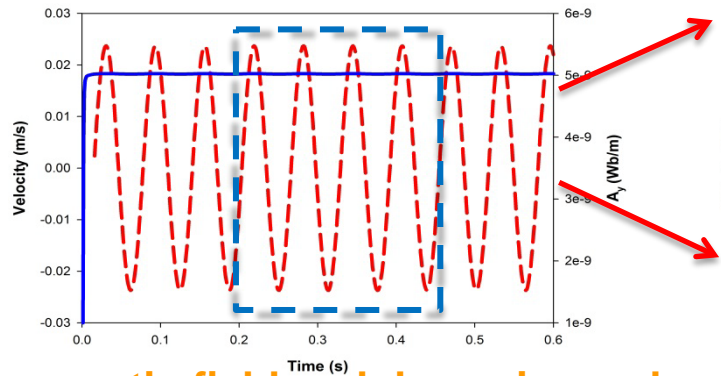
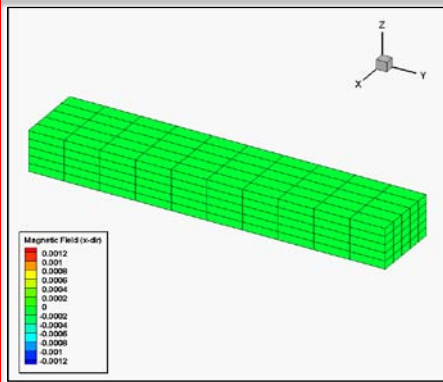


Coupling of Mechanical and Electromagnetic Field

Methods of Approach

Coupled Simulation

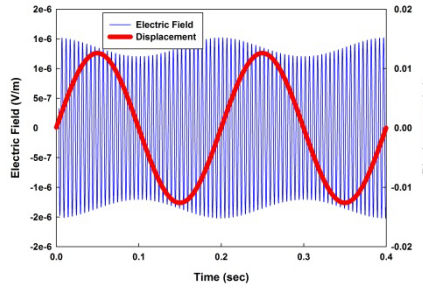
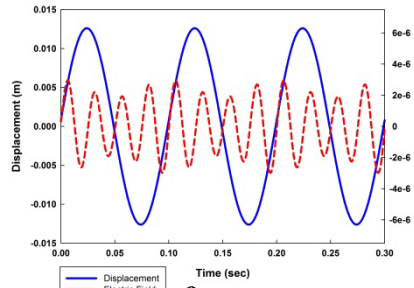
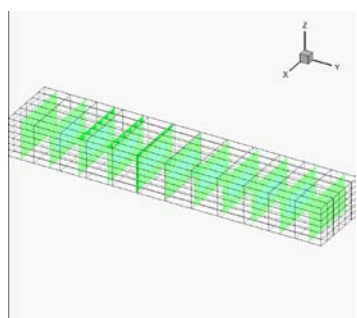
Multi-time Scaling



Coupled static electromagnetic field and dynamic mechanical field

1. Electromagnetic field is affected by the mechanical field
2. The magnetic potential is evolving by the velocity field other than the displacement field

Coupled transient electromagnetic field and dynamic field



$$\frac{f_{em}}{f_{me}} = 4$$

$$\frac{f_{em}}{f_{me}} = 40$$

Electric Field

1. Electromagnetic field is evolving with the mechanical field
2. Frequency difference brings in significant computational expense





Multi-physics Spectral Element Method (Chang's Group)

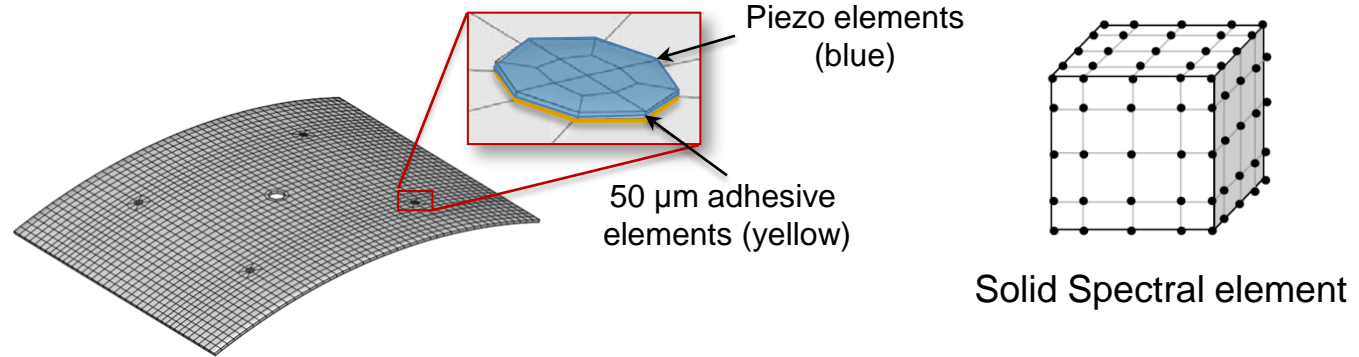
Efficient multi-physics computation tool for modeling ultrasonic waves

Equations of Motion

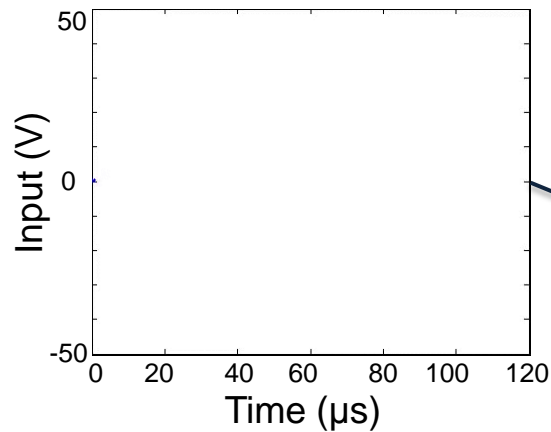
$$\sigma_{ij,j} + f_i = \rho \ddot{u}_i$$

Gauss's Law for Electricity

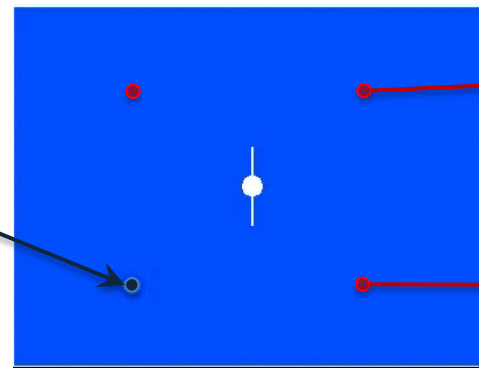
$$D_{i,i} = 0$$



Voltage Input to Piezo Actuator

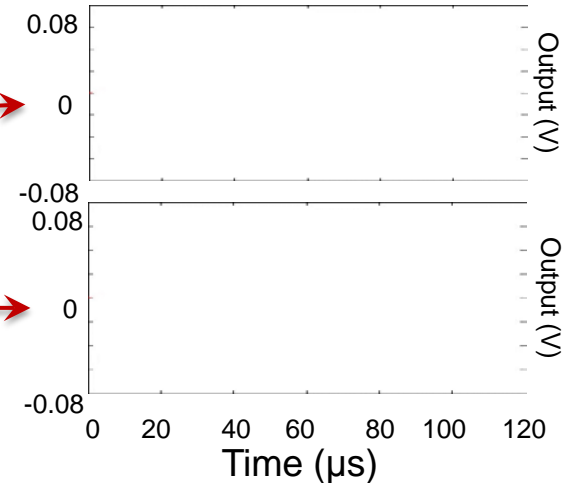


Induced Ultrasonic Stress Waves and wave-crack interaction



Aluminum plate with 20 mm cracks

Voltage Output at Piezo Sensor



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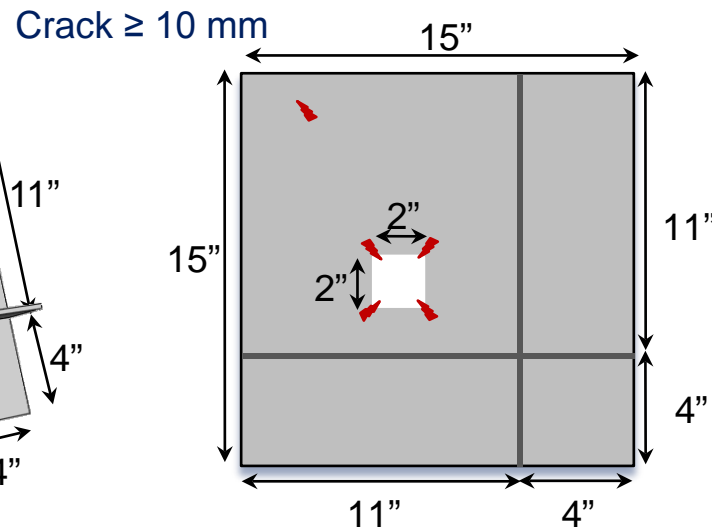
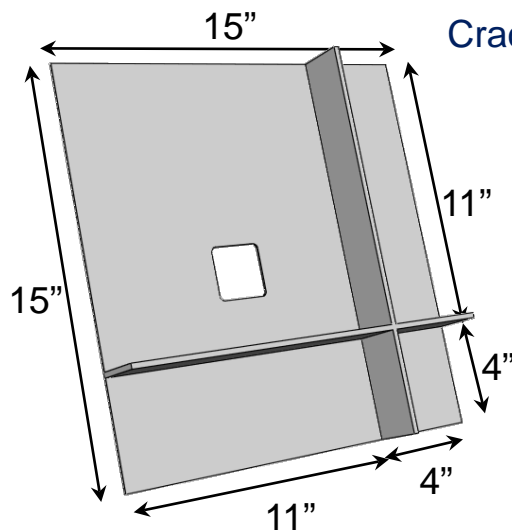
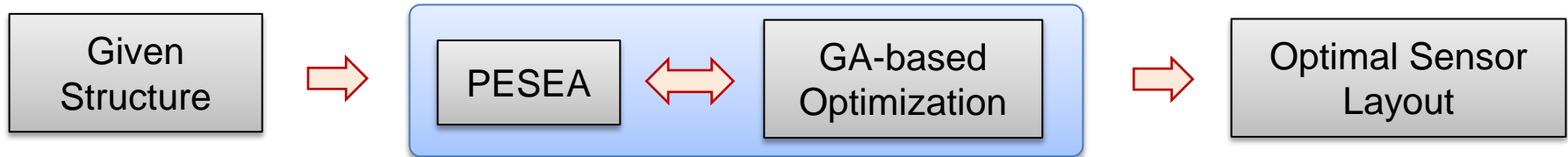




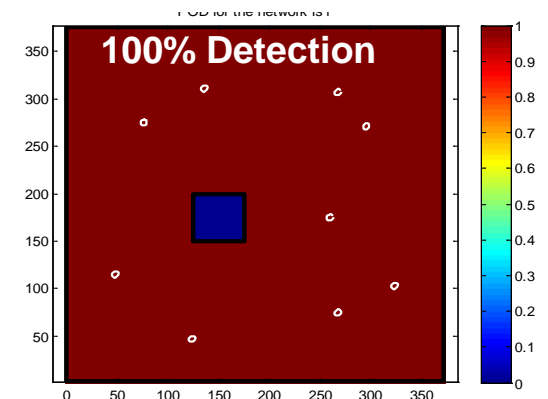
Design of Piezoelectric Sensor Network

- PESEA : accurate simulations for a complex structure
- Genetic algorithm: 100% damage detectability with minimum number of Piezo actuators and sensors

Integration of PESEA and GA-based Optimization



Detection and Localization





Diagnostics and State Awareness

Chang, Ng – Stanford
Shoureshi – NYIT



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Sensor Data Processing

STAGE 3
Autonomous decision

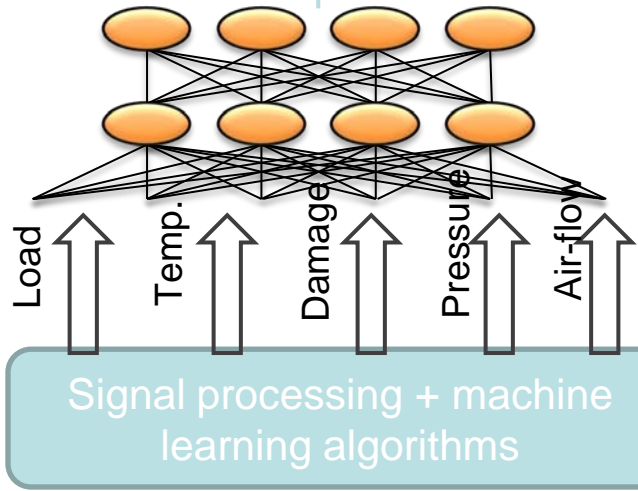
Prognosis, Decision Planning
and Control

STAGE 2
State Quantification

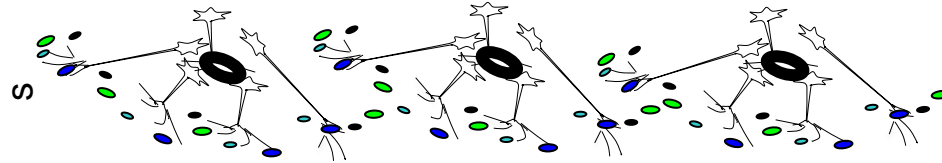
Structural Damage
Diagnosis
(Type, location, extent)

Flow Field
Distribution
(temperature,
pressure, strain etc.)

STAGE 1
State Classification



Low-level
preceptor



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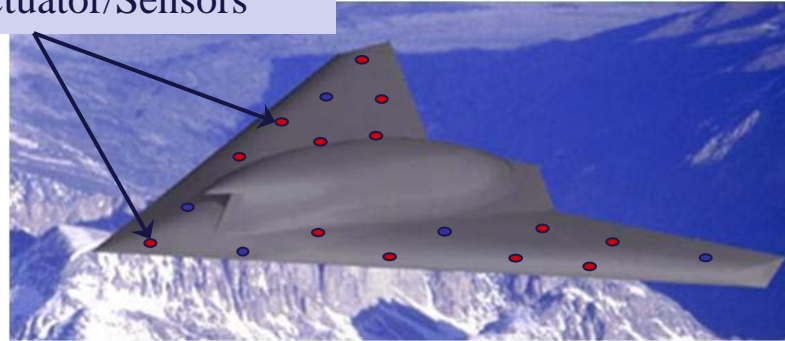




Motivation

Sensor Data Interpretation in Real-time

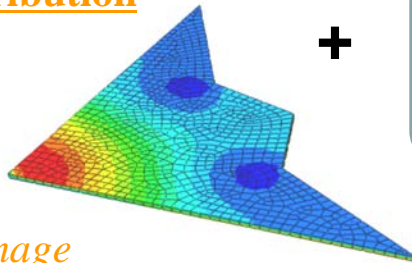
Distributed Actuator/Sensors



Sensor Response: $S_i = f(\Delta\text{load}, \Delta\text{temp.}, \text{localized damage}, \Delta\text{BCs}, \Delta\text{sensor state} \dots)$

State field distribution

- Temperature
- Pressure
- Air-flow
- Strain
- Structural damage



+

Environmental Effects
Ambient temperature,
humidity, moisture.....

=

**Corrupted
Sensor Data**



How to accurately assess the structural state information from a network of multi-functional sensors?

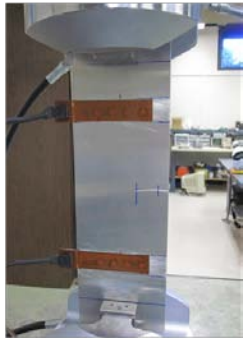
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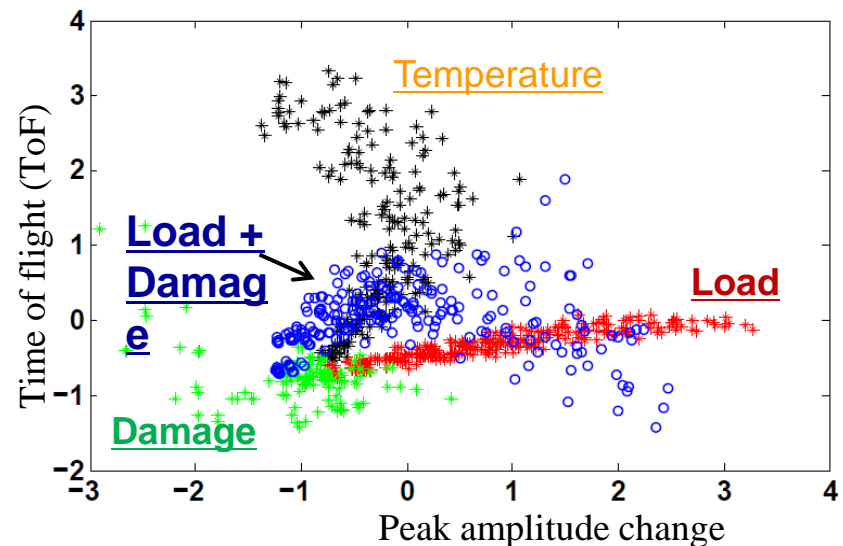
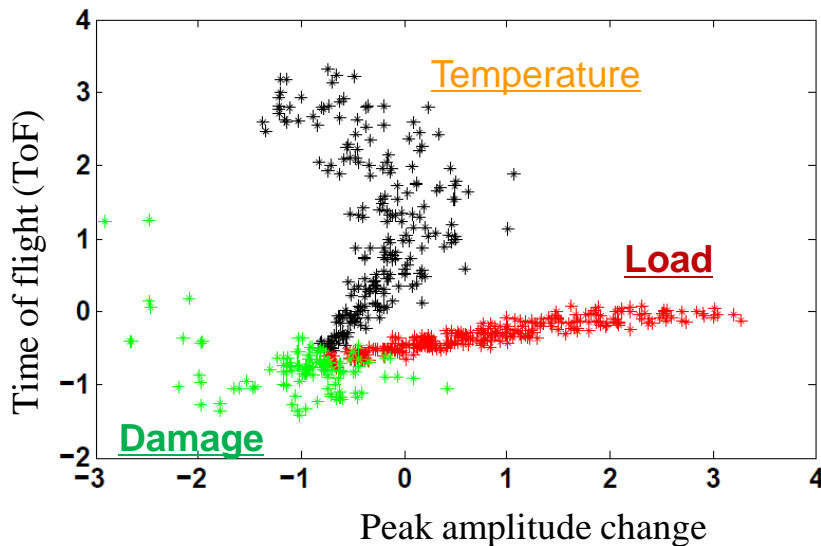
State Classification: Designed features

Table: Sensor signal measurements under simulated environmental conditions

Number of Samples	Temperature Range	Load Range	Simulated Damage
4 coupons	30°C - 95°C	0kips – 5kips	0.25" - 1.5" Notch at the edge
4 sensing paths per actuator; Paths per measurement = 16; # of measurements = 1136			



Feature Space Representation

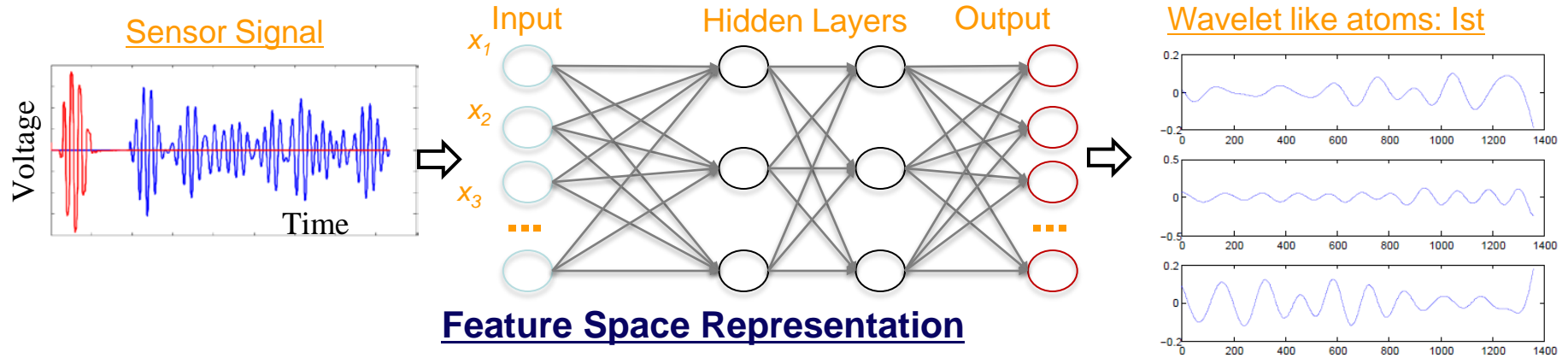


Difficult to identify true state under combined action of load and damage;
State Classification Accuracy (logistic regression) < 30%

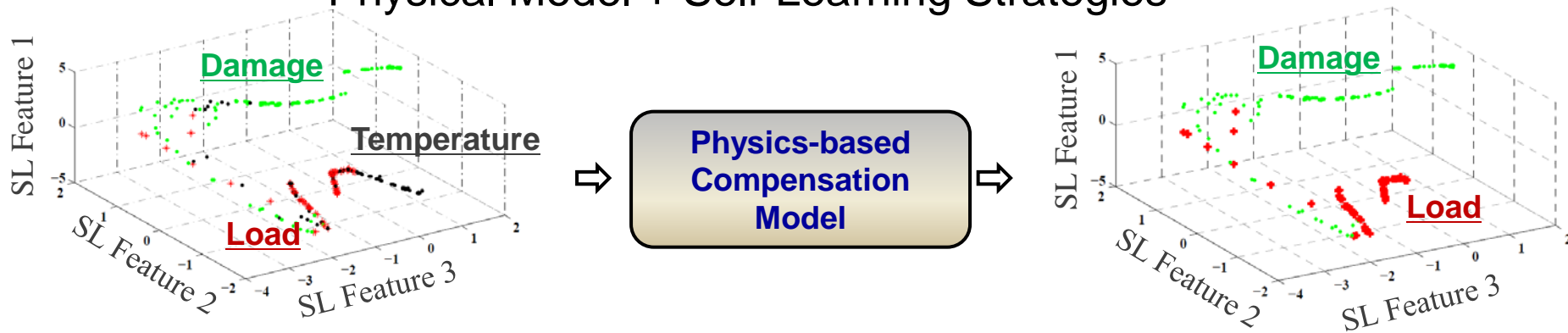


State Classification: Self-Learned Features

Unsupervised Features Learning: Neural-net based 'Sparse Auto-Encoders'



Physical Model + Self-Learning Strategies



Self-learned features outperform the self-designed features for state classification

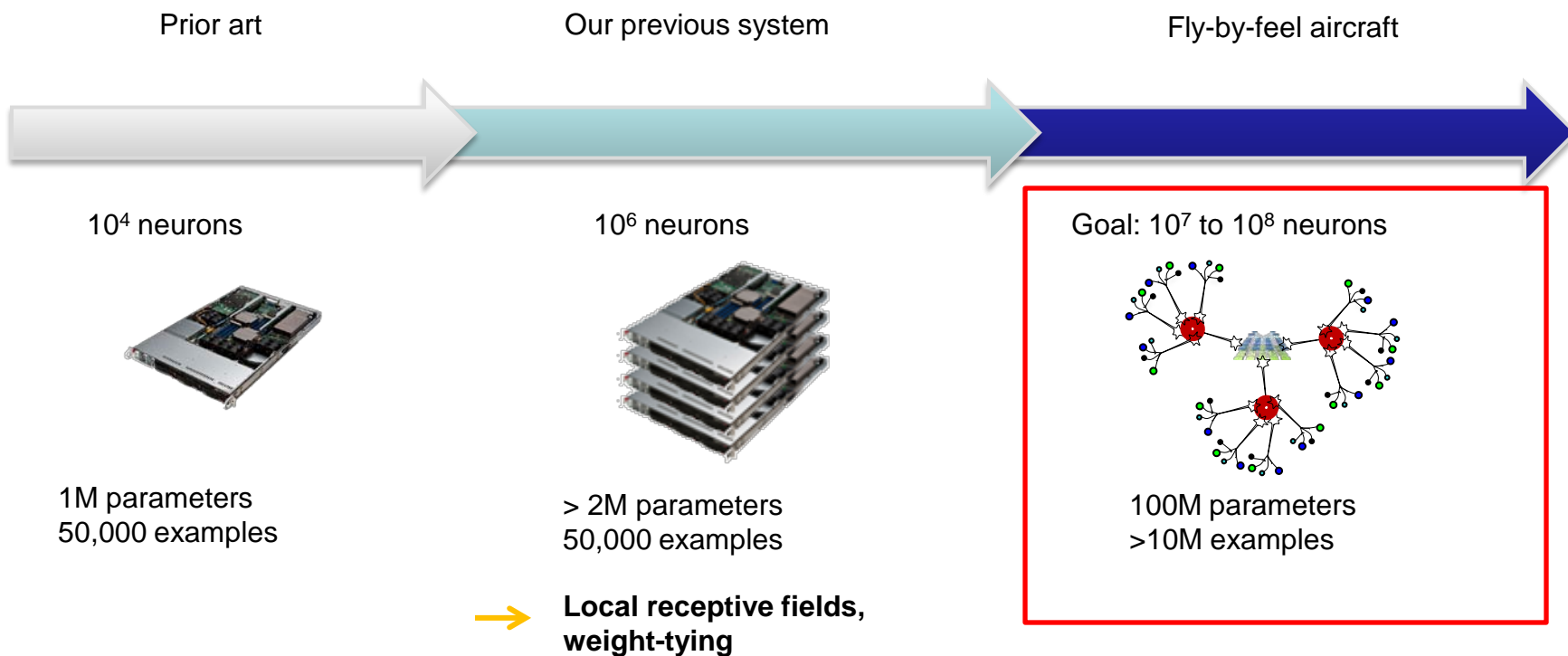
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Scaling Feature Learning

- Current system scales better; but still some distance to go for a full-scale application.



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Approach

- Fold prior MURI work into extremely large-scale system:
 - Scalable K-means learning **66M parameters**
 - Online training **57M examples.**
 - Locally connected neurons.
 - ***New invariant-feature learning approach.***



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Proof-of-concept

- Applied to unlabeled image data.
66M parameters, 57M data points.
(1000x more data than standard benchmarks.)

1.4 million images.

57 million patches.

Single neuron selects complex patterns like



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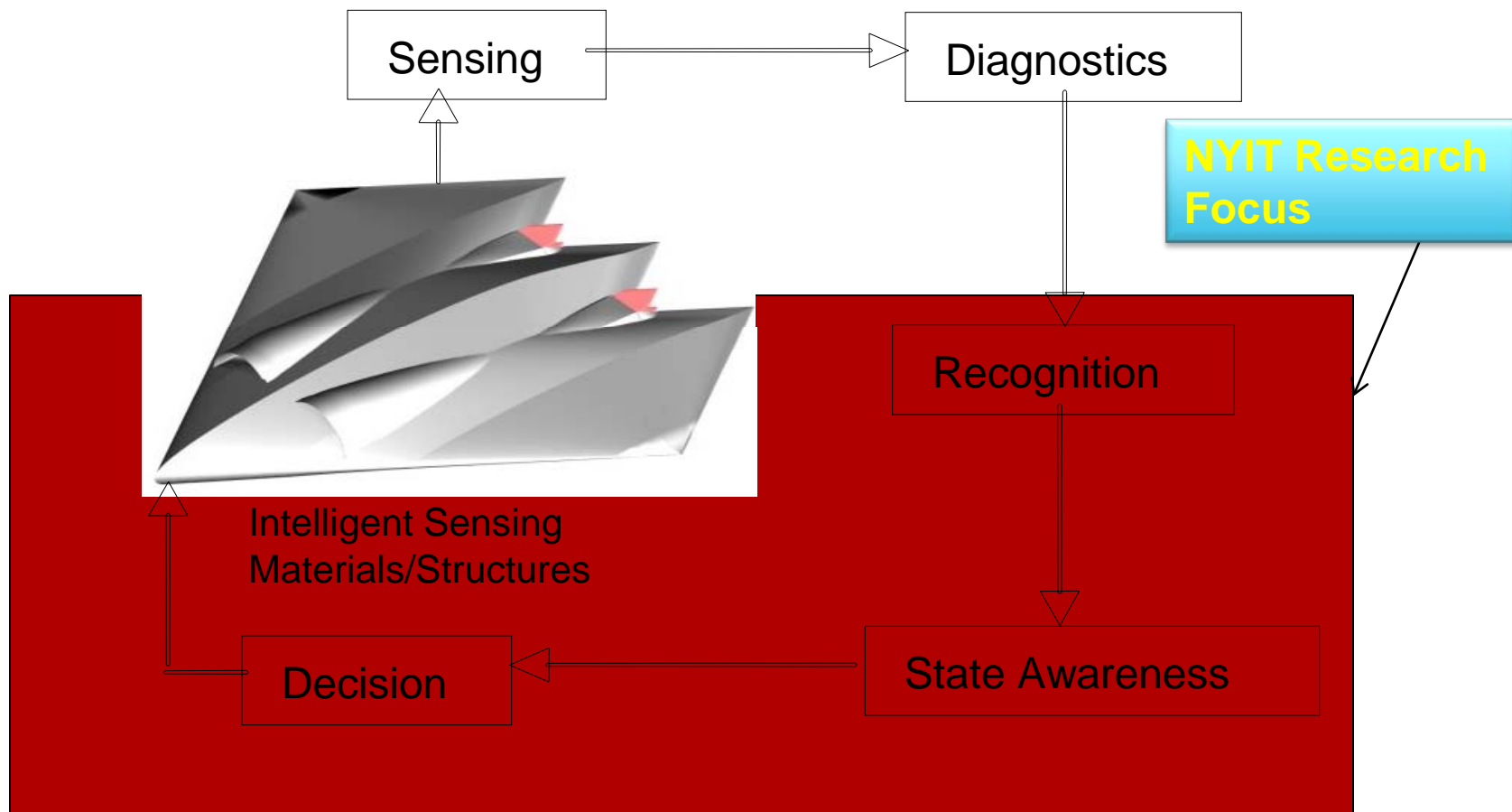


OF TECHNOLOGY





From Sensing to Decision Making (Shoureshi's Group)



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Bio-inspired Sensory Network





Goals

- To develop an analytical technique for observability and controllability of large-scale, dynamic systems
- To develop a bio-inspired data/information architecture for feature-based global diagnostics of a large-scale system
- To develop a bio-inspired, feature-based re-configurable control system to maintain vehicle functionality in the presence of system failures
- Design a testbed to assess MURI team research results



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Controller and Diagnostics Testbed



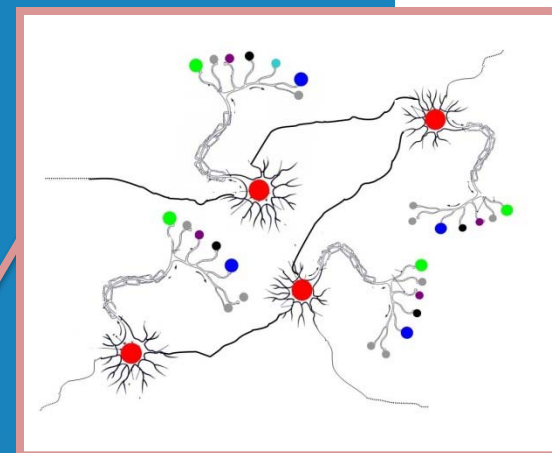
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Prototype I

COMPOSITE PANEL
integrated with: multifunctional sensor network



State Sensing:
Stresses, Strains, Temp, Pressure,
Loads, Damage/Failure, Remote Threats, etc.

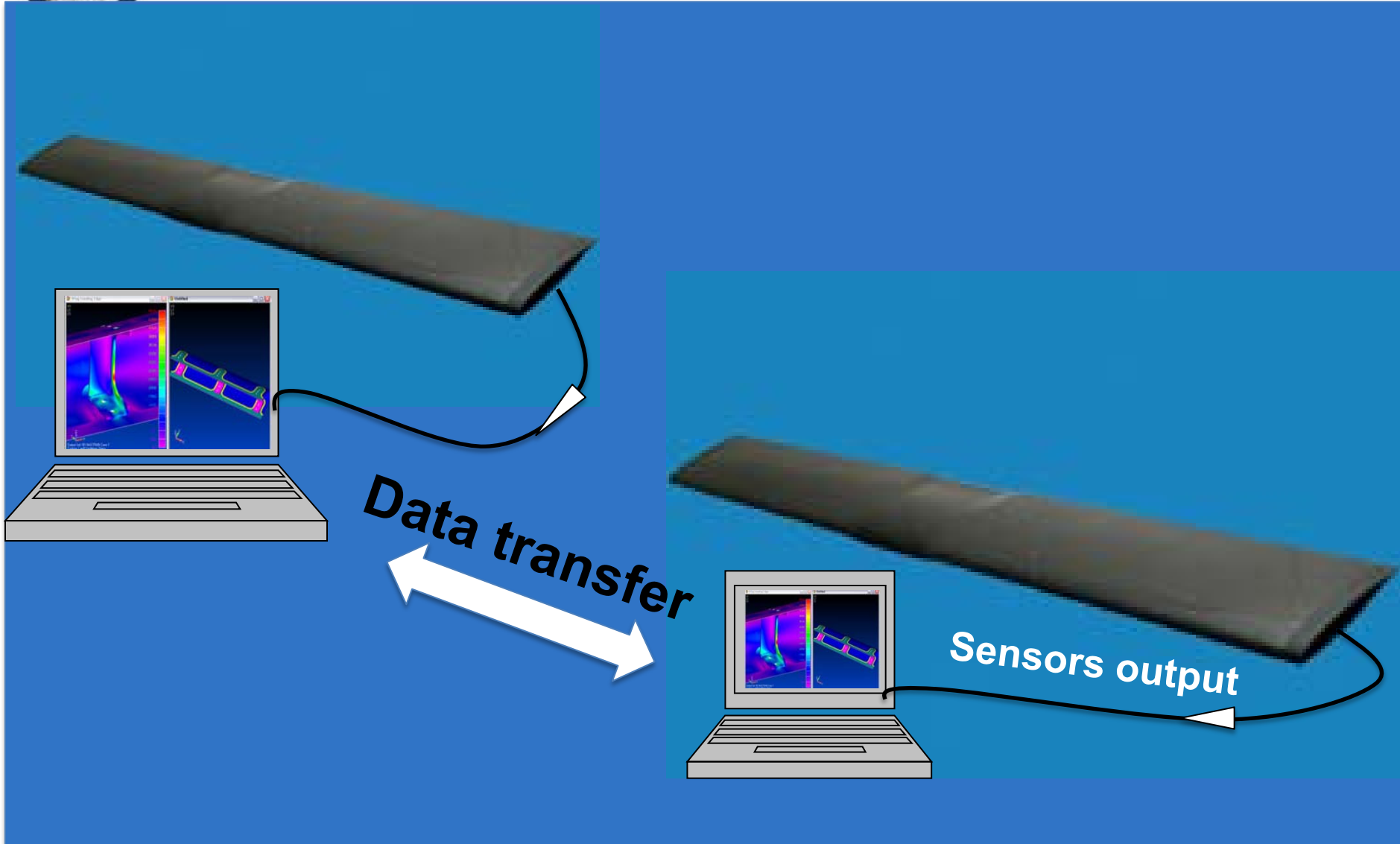


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Prototype II: Learning without Training

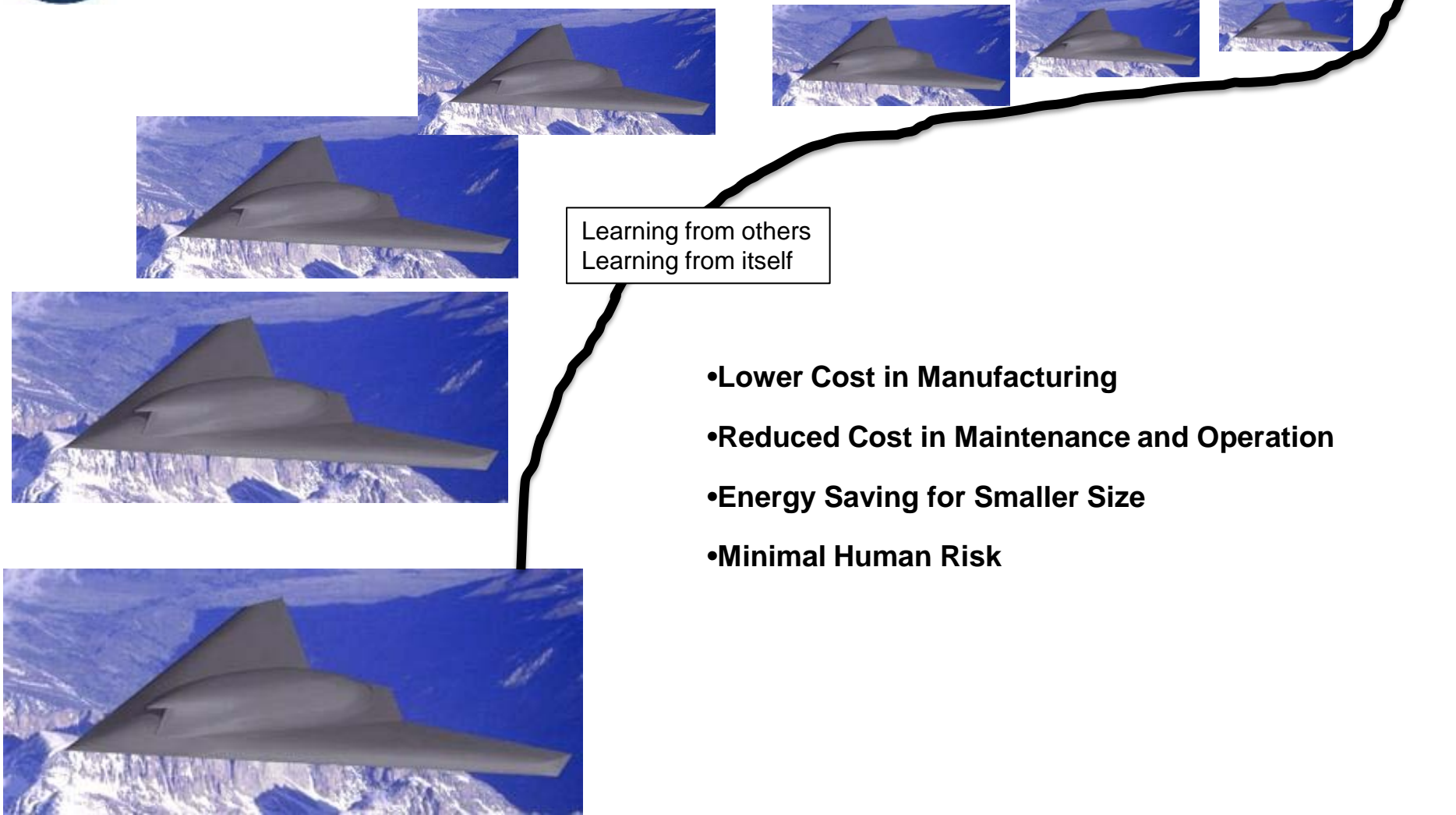


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Fly-By-Feel UAV



Learning from others
Learning from itself

- Lower Cost in Manufacturing
- Reduced Cost in Maintenance and Operation
- Energy Saving for Smaller Size
- Minimal Human Risk



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Traditional design of structures is divided into a few disciplines



Resulting in

→overdesigned structures

→heavy airplanes

→time consuming inspections

→inappropriate maintenance

schedules



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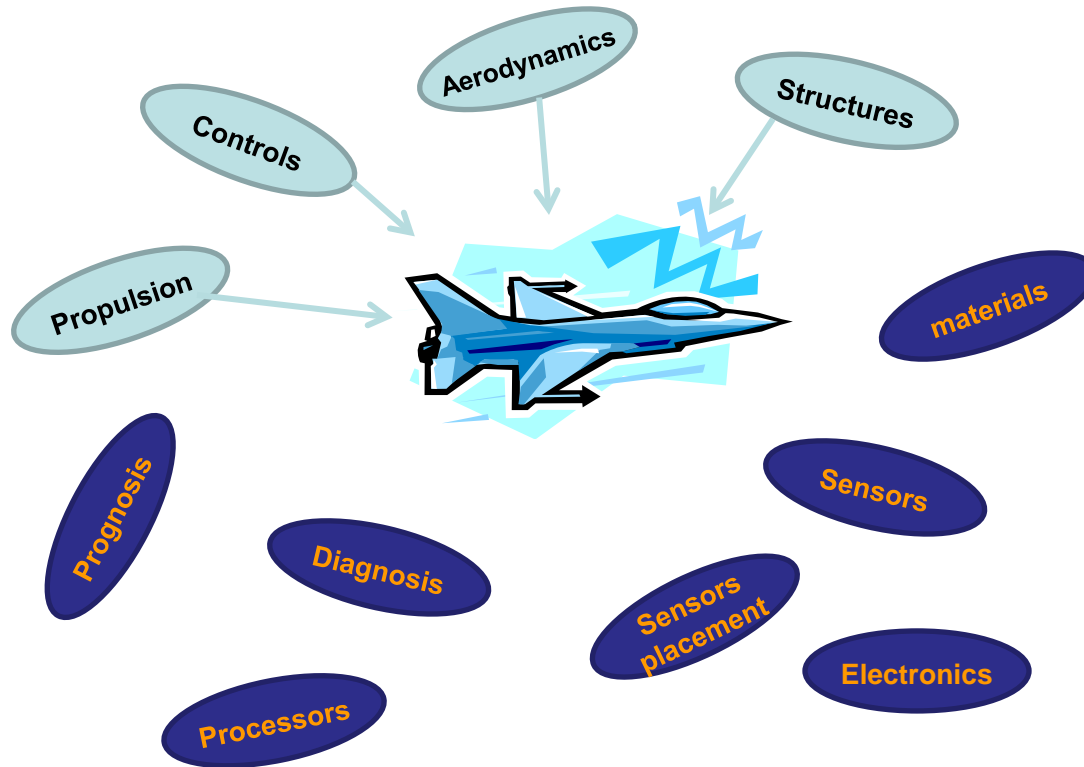


→catastrophes





Technologies developed during MURI



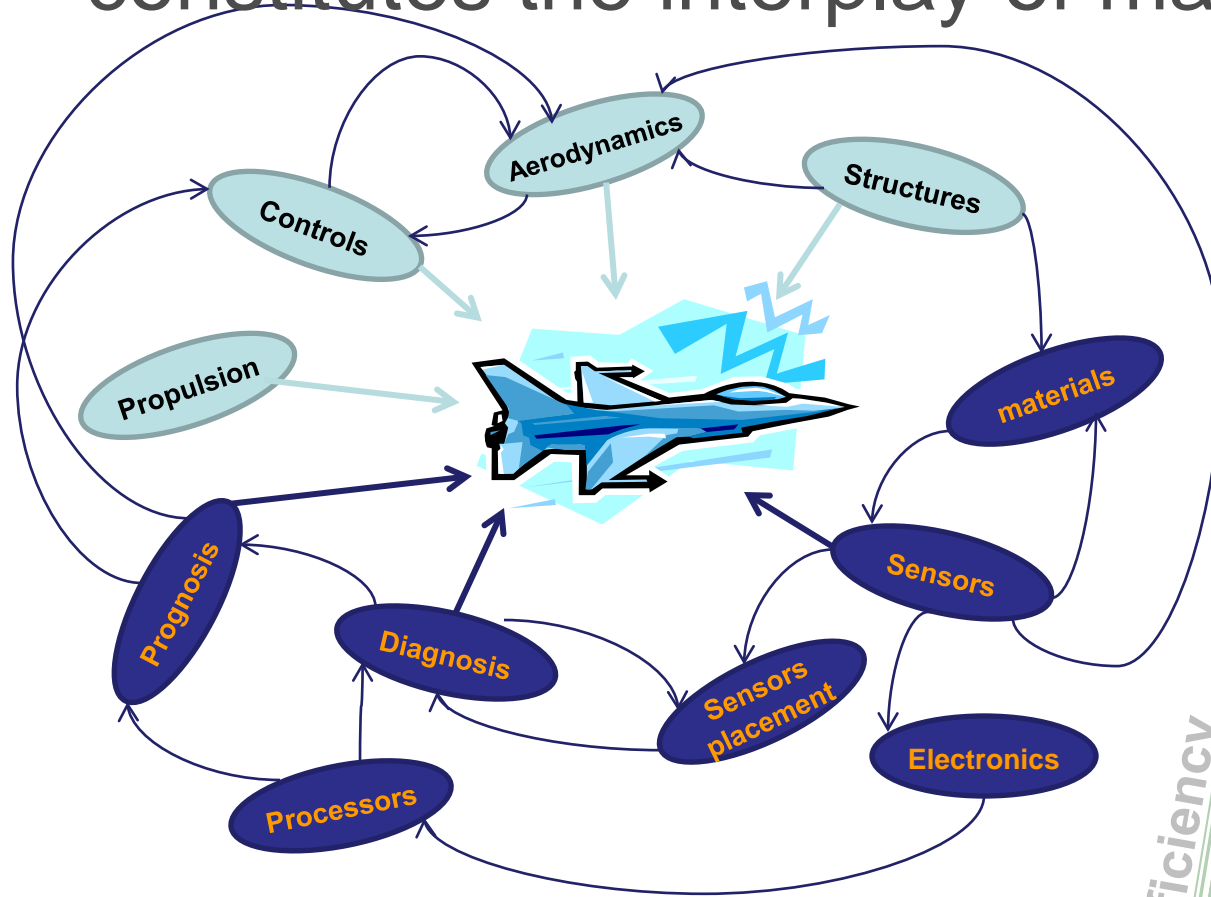
Requires *re-thinking* the traditional design strategies

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Intelligent design constitutes the interplay of many



... but will result in

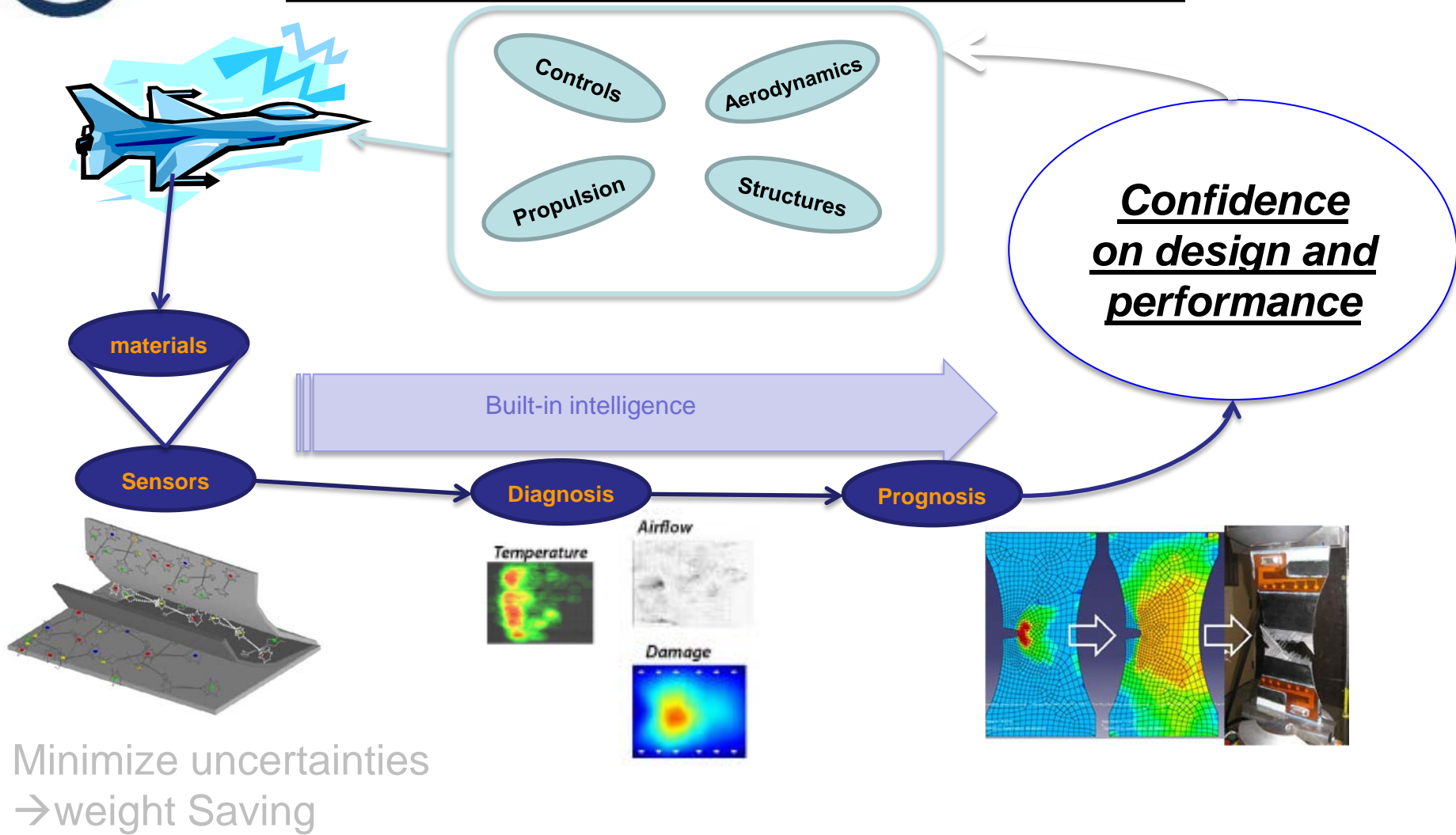


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Concept: "Build confidence on design"



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Life cycle management

Manufacturing



Transportation



Assembly



Service



Maintenance
& Repair



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