

# Integrated Computational Materials Science & Engineering

**3/3/2012**



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# Thesis Statement



Future innovation in defense-related products is critically dependent upon *simultaneous co-selection* of material properties, product design, and manufacturing process.



## Material Choices:

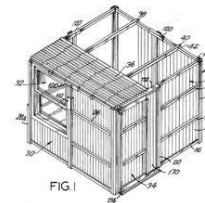
- Brick
- Straw
- Wood
- Composite
- Gingerbread

**Interdependent!**



## Manufacturing Process:

- Whittle down sticks
- Bundle 10 to a tow
- Precision placement
- Glue?



## Product:

- Roof, walls, door
- Hurricane Safe
- Well-ventilated (airflow/hour)
- Max Cost < \$1000
- Max Weight
- Min Volume

# Thesis Statement



This type of co-design is *only possible* with the maturation of advanced computational methods:

1. **Multiscale modeling**
2. **Material informatics**
3. **Computational manufacturing**

**The ultimate goal of ICMSE (Integrated Computational Materials Science & Engineering) is to demonstrate we can do simultaneous co-design!**

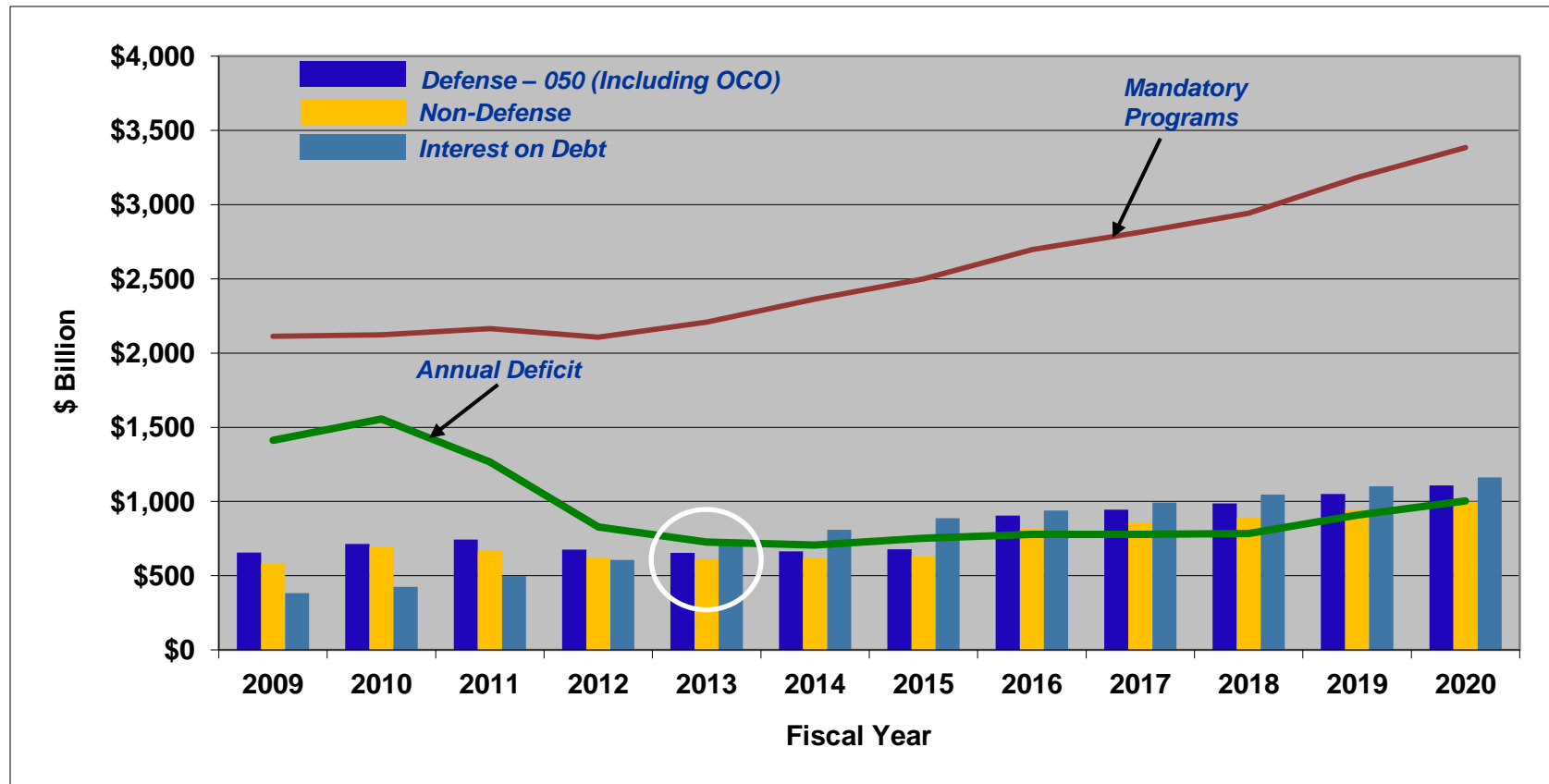
# Outline



- **Introduction: Why do we need ICMSE?**
- Case Studies
- Conclusion and Future Work: *What problems need to be solved?*

# Federal Budget Outlook

(Outlays \$ Billions)

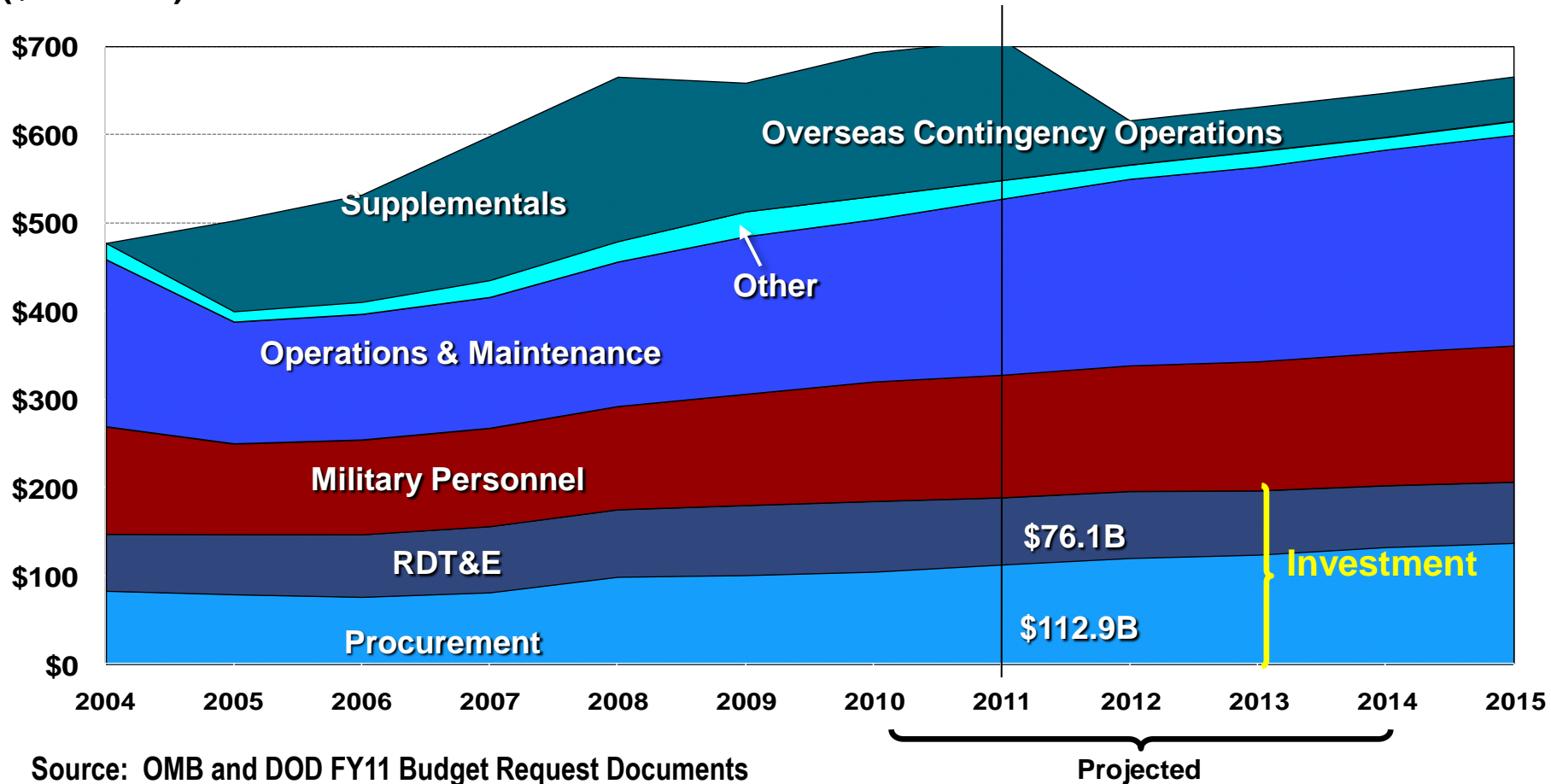


Source: OMB

***Interest on Debt Exceeds Defense Spending Starting in FY2013***

# DOD Budget by Title

(\$ Billions)

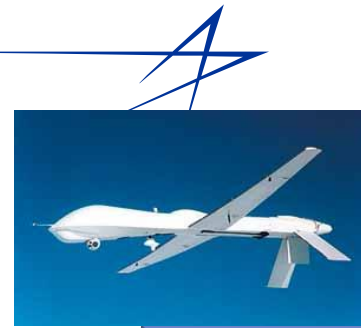


*Eng. and Mfg. Affordability are King in next Decade(s)*  
*Funding covers much wider threat spectrum; flexibility needed*

# Solution: Advanced Materials

- e.g., carbon nanostructures
- Need multiscale modeling with robust model linkages
  - *Fast, simultaneous co-design in simulation to reduce redesign*
  - *Virtual Microscope*
- Simultaneously, maximize performance and efficiency (cost, weight, manufacturability)

*Improved products at for lower cost*



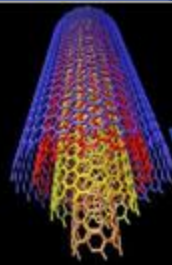
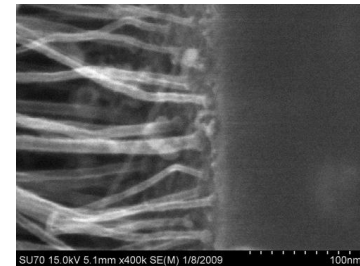
device /  
structure

micro  
scale

meso  
scale

Atomic  
scale

Quantum  
Scale



# Outline






- Introduction: What is ICMSE, why do we need it?
- **Case Studies**
- Conclusion and Future Work: *What problems need to be solved?*



# Scalable Nanocomposites






 WEEKLY E-NEWSLETTER  
Fast Reliable Composites News. **Subscribe!**

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May 2011

## Nanotechnology: Into the realm of real


Fast, scalable process grows nanostructures directly on composite reinforcements for a "drop-in" use in volume production processes.

Author: Sara Black  
Posted on: 5/2/2011  
High-Performance Composites





new partnership between Applied Nanostructured Solutions (ANS) and Owens Corning seeks t...



Step 1: The enclosed

Nanocomposites research and the massive benefits it promises have attracted considerable press coverage over the past decade. Actual commercial development of nano-based products for composites, however, has been slow. **But a new partnership between Applied NanoStructured Solutions LLC (ANS, Baltimore, Md.), a Lockheed Martin subsidiary, and Owens Corning (Toledo, Ohio) is about to accelerate growth.** ANS has worked for more than three years to develop a rapid, scalable manufacturing process that can produce reinforcements infused with carbon nanostructures (CNS) for composites fabrication. With Owens Corning now on board as a joint development partner, ANS seeks to commercialize the process for high-volume applications.

### LEARN MORE

### Editor's Picks

From specialty fillers to space elevators  
Nanomaterials research and early commercialization set stage for promising future of nanocomposites....

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### Related Suppliers

Owens Corning Composite Materials LLC

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### Supplier Categories

Aramid  
Materials

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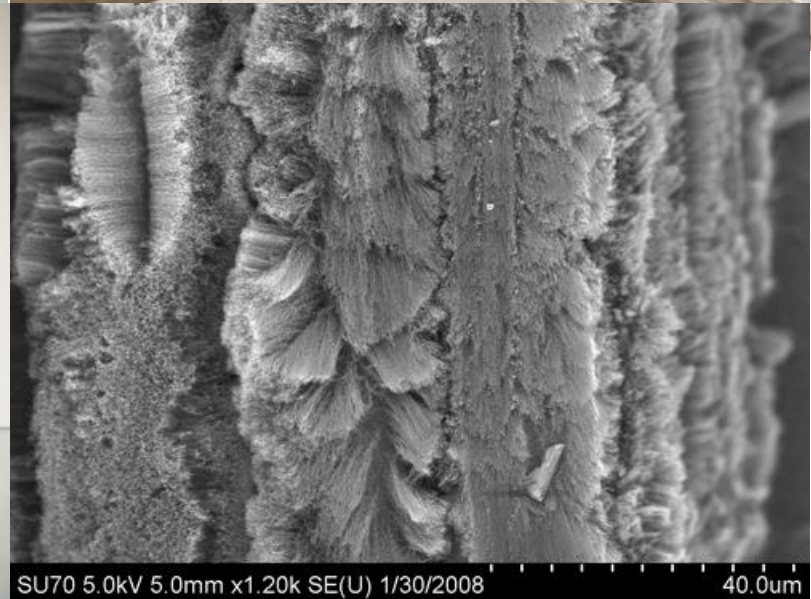
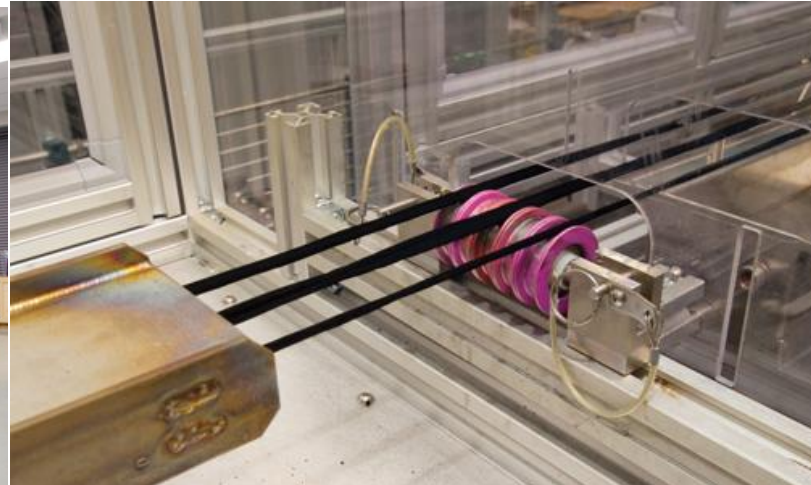
### Zones

Carbon Fiber  
Glass Fiber  
Nanomaterials

### CompositesWorld Weekly

Keep up with composites news with our weekly e-mail newsletter.  
[Sign up here.](#)

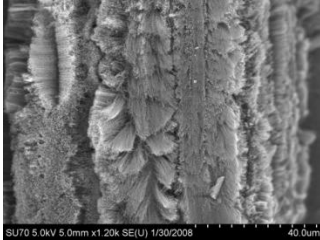
# Scalable Nanocomposites



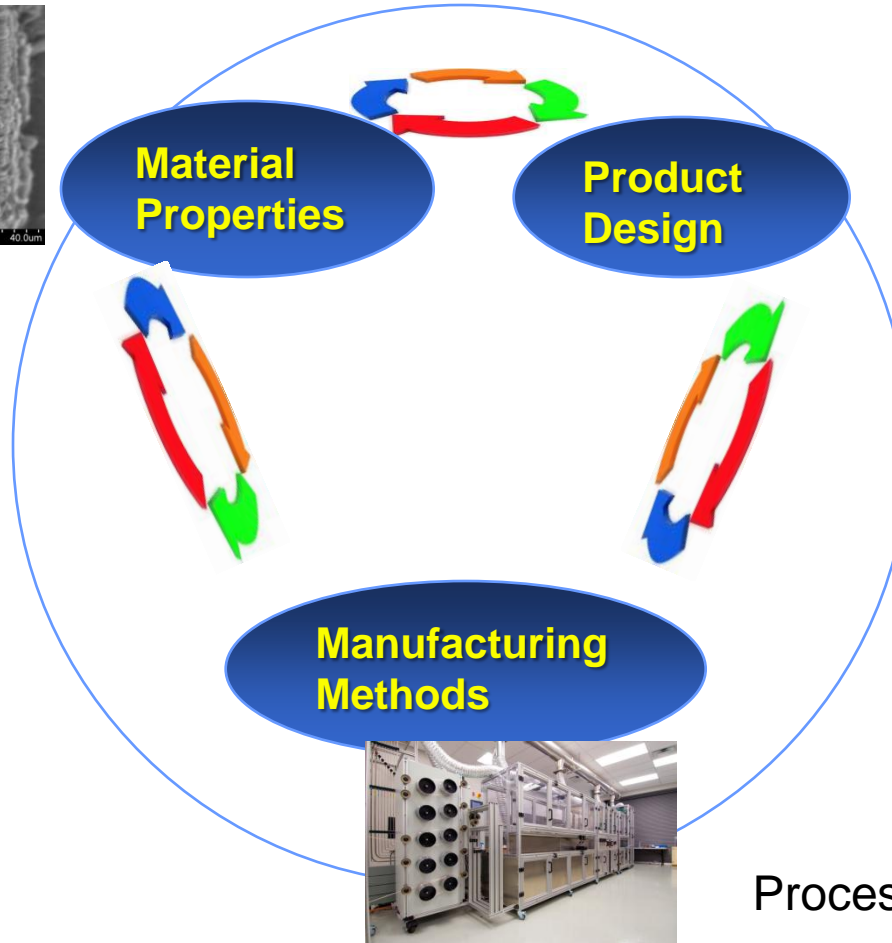
# Multiscale Modeling in the Loop



Material models from nano to micro



Macroscale models of Product  
Topological optimization

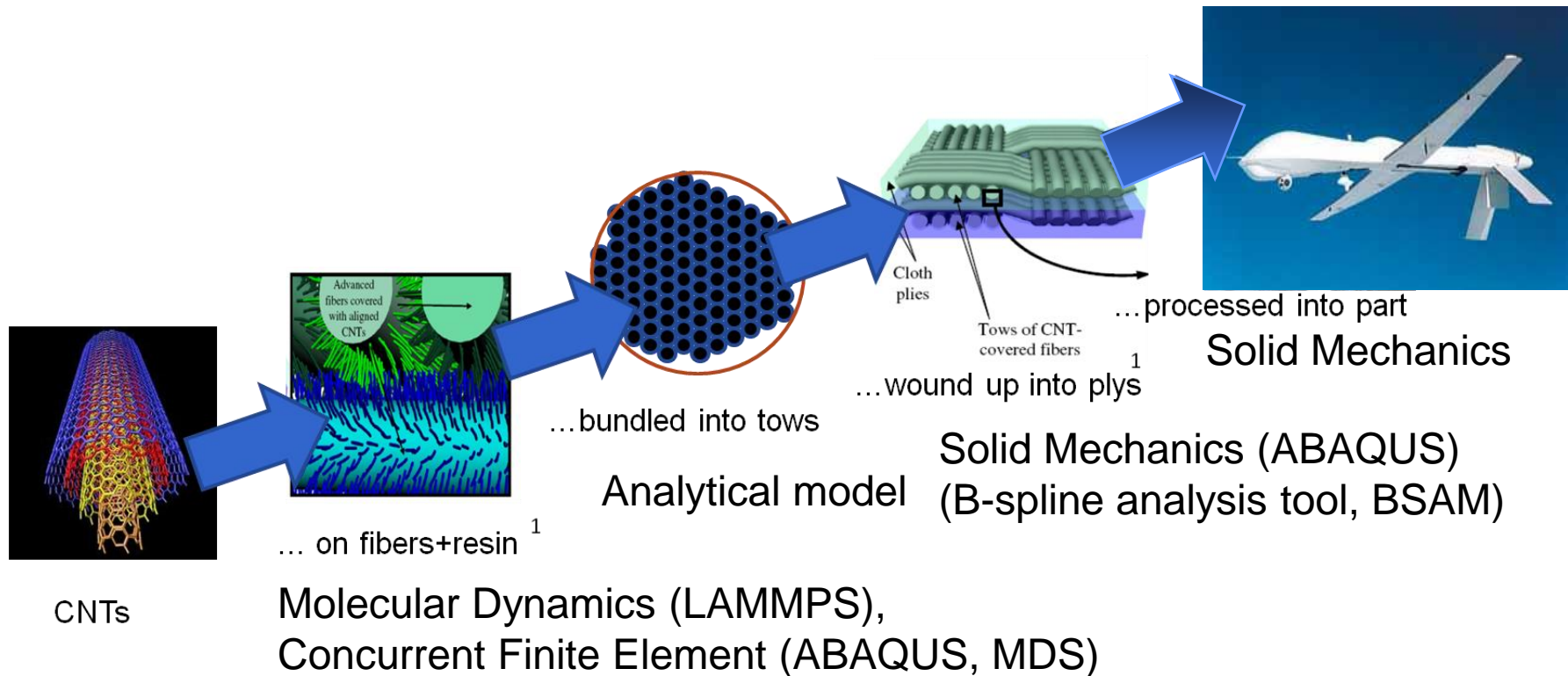


Process Models





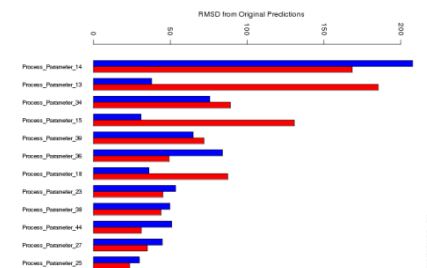
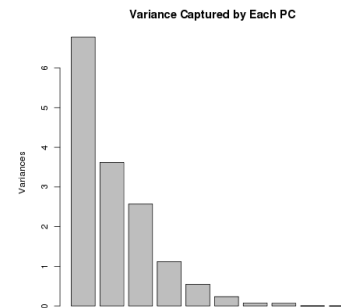
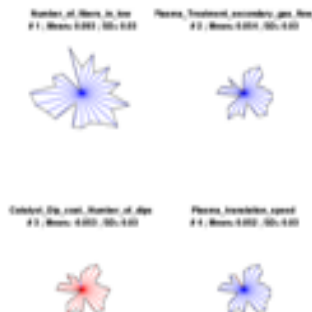
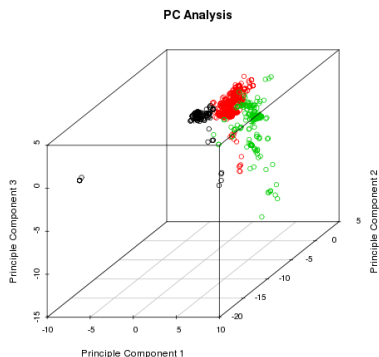
# Multiscale Modeling Hierarchy



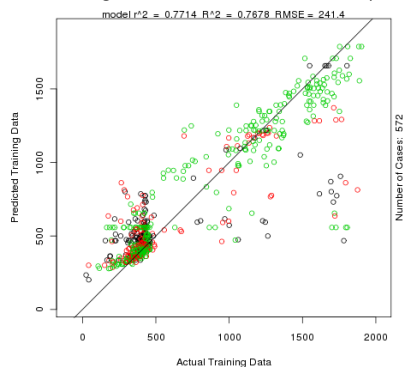
First Principles (VASP)  
Molecular Dynamics (LAMMPS)

***Multiscale Modeling can be an Art, Few Standard Tools.  
Sometimes problems can be too complex to model!***

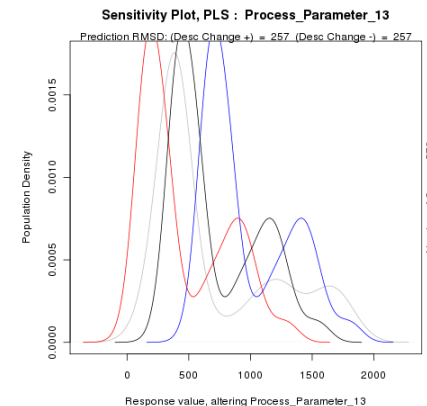
# Informatics Analysis Tools



**RF Training Model Evaluation: Predicted vs. Actual Response**



- Multiple Linear Regression (MLR)
- K – Means Clustering (PCA)
- Partial Least Squares (PLS)
- Support Vector Machines (SVM)
- Random Forest (RF)
- Star Plots
- Y-Scramble Validation
- Predictive Analysis
- Sensitivity Analysis
- Multivariable Comparative Analysis
- Multivariable Predictive Analysis
- Inverse-QSAR



**A combination of linear and nonlinear modeling with data visualization addresses model interpretability and predictivity**

# The Importance of Informatics



## The hot tech gig of 2022: Data scientist

FORTUNE

By Jessi Hempel, writer January 6, 2012: 5:00 AM ET

**By the end of the decade 50 billion devices will be emitting information nonstop. Data scientists will help manage it all.**

FORTUNE -- A decade from now the smart techies who decided to become app developers may wish they had taken an applied-mathematics class or two. The coming deluge of data (more on that in a moment) will create demand for a new kind of computer scientist -- a gig that's one part mathematician, one part product-development guru, and one part detective.

D.J. Patil is a pioneer in the field of data science, a new discipline that aims to organize and make sense of all the data generated by machines. It's a challenge that will grow exponentially over the next decade.

**Tech in 2012: Face-offs, failures and fairly big changes at the office**

Today there are some 400 million devices connected to the Internet, mostly phones and computers. By 2020 some 50 billion devices, from cars to appliances, will be



PHOTO: CODY PICKENS

D.J. Patil: "If you can't measure it, you can't fix it."

<http://tech.fortune.cnn.com/tag/data-scientists/>

# 3D Printing Revolution



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## 3D printing: The world's first printed plane

Updated 17:47 01 August 2011 by [Paul Marks](#)  
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Video: [First flight of 3D printed plane](#)



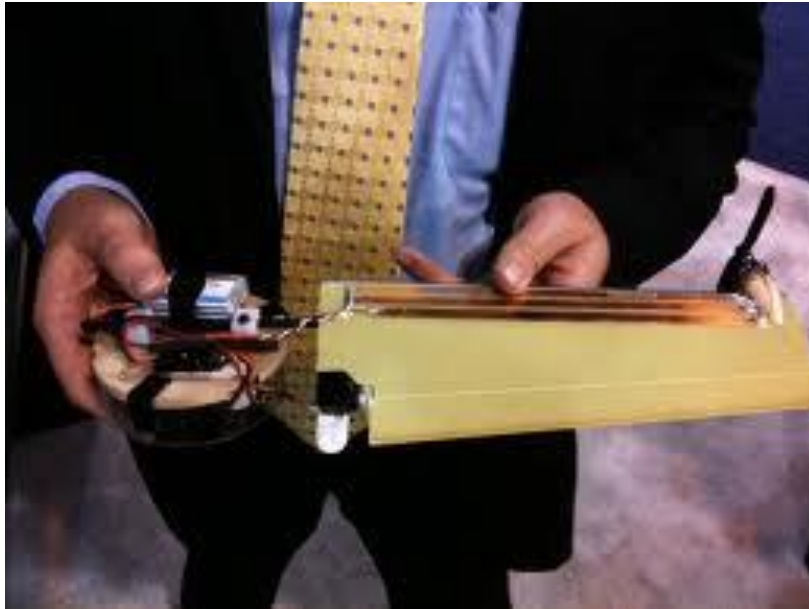
The future of flight? (Image: University of Southampton)

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**NewScientist**

<http://www.newscientist.com/article/dn20737-3d-printing-the-worlds-first-printed-plane.html>

# Computational Manufacturing



## Need to understand:

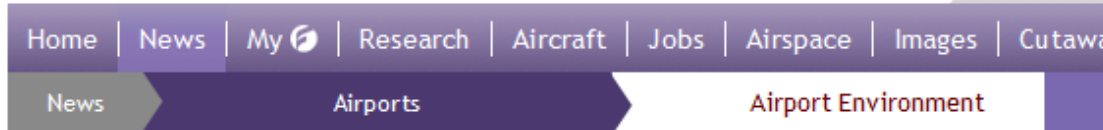
- What are the properties of the material you create?
- What beneficial design changes does this allow you to make?



**PRINTED SAMARAI:**  
(3D printed; <15 mins assembly)



# Pouring an Airplane?



## Lockheed Martin reveals F-35 to feature nanocomposite structures

By: **STEPHEN TRIMBLE** WASHINGTON DC

Source: **FLIGHT** INTERNATIONAL



02:00



Lockheed Martin has revealed the [F-35 Lightning II](#) will be the first mass-produced aircraft to integrate structural nanocomposites in non-load bearing airframe components.

A thermoset epoxy reinforced by carbon nanotubes will replace carbon fibre as the material used to produce F-35 wingtip fairings beginning with low rate initial production (LRIP)-4 aircraft, said Travis Earles, a manager for corporate nanotechnology initiatives.

Meanwhile, the same carbon nanotube reinforced polymer (CNRP) material is being considered to replace about 100 components made with other composites or metals throughout the F-35's airframe, he said.

The shift to CNRP as an airframe material has been anticipated ever since carbon nanotubes were discovered in 1991. It is widely considered one of the strongest materials ever invented - several times stronger than carbon fibre reinforced plastic (CFRP), yet lighter by about 25-30%.

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# Conclusion



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**This type of co-design is only possible with the maturation of advanced computational methods:**

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# Future Critical Needs for ICMSE



- Automated, dynamically reconfigurable factories for the production of any product using any material with tailored properties in small quantities
- Foundational failure physics method development
  - Bonded joints / Large fastened structures
  - Moisture intrusion / impact in sandwich structures
- Rigorous quantification of model error
- Scale linkages in multiscale modeling: Mapping from first principles to semi-empirical
- Standardization of model interoperability (process models and material models)
- Multiscale meta-workflows and data shared across the community of interest

# Android Analog for Interoperable Structural Models and Design Tools

