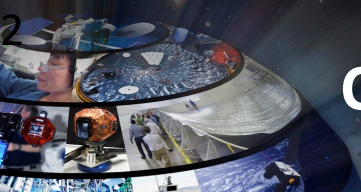


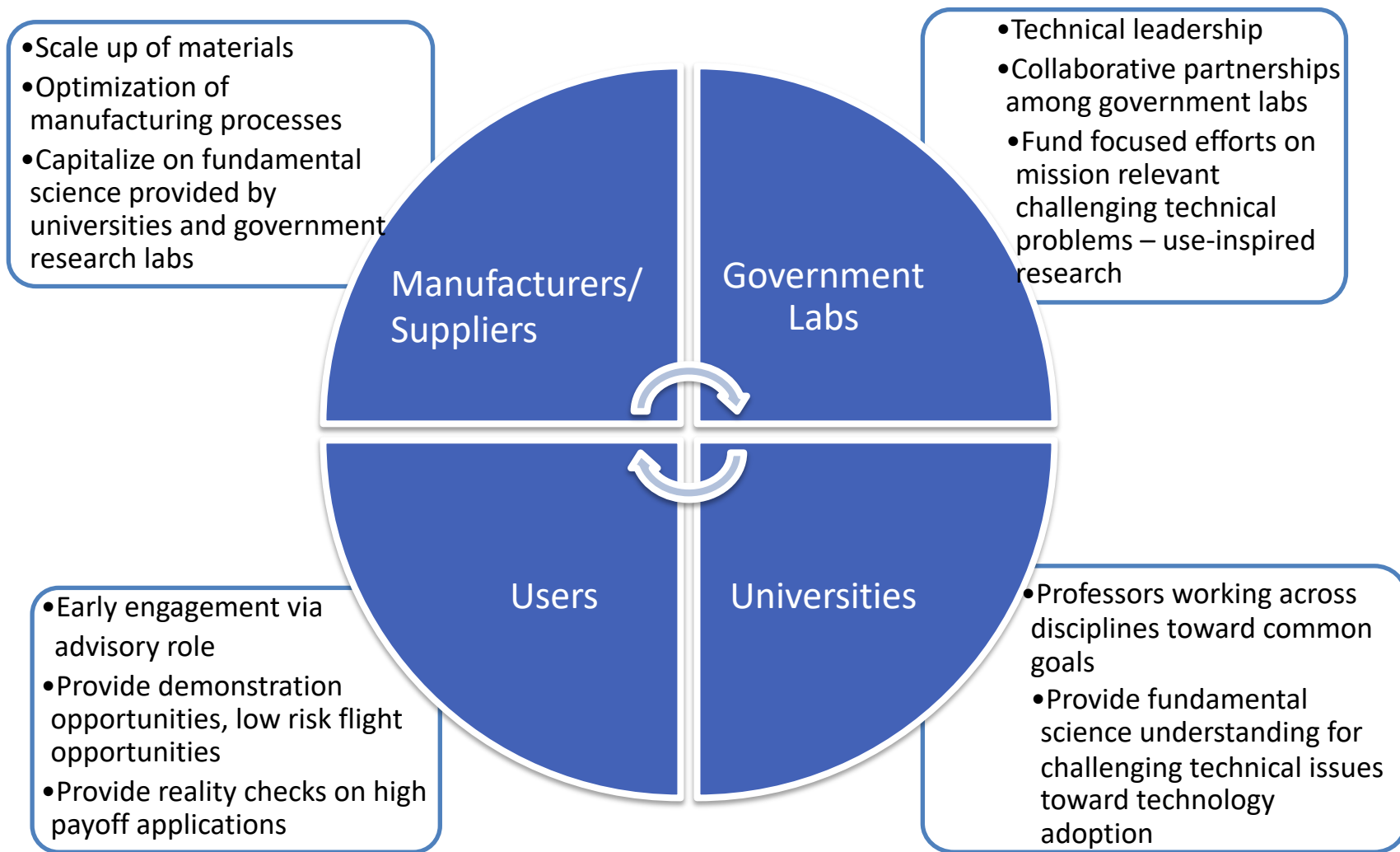


# Computationally Accelerated Materials Development for Ultra High Strength Lightweight Structures

**NASA Advisory Committee Meeting**  
**December 7, 2018**

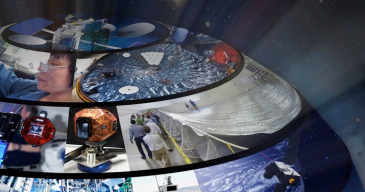


# Collaborative Partnerships in Materials Ecosystem



**Accelerated technology adoption through engagement of key players to enable a sustainable advanced aerospace materials ecosystem**





# Challenge

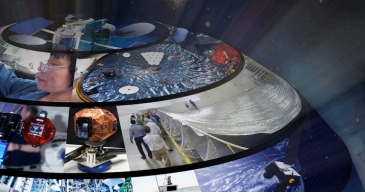


- Cost increases in proportion to the mass ratio
- Mass ratio increases linearly with the dry mass and exponentially with  $\Delta v$
- Reducing structural mass reduces mission cost at constant payload or increases mission capability at constant cost

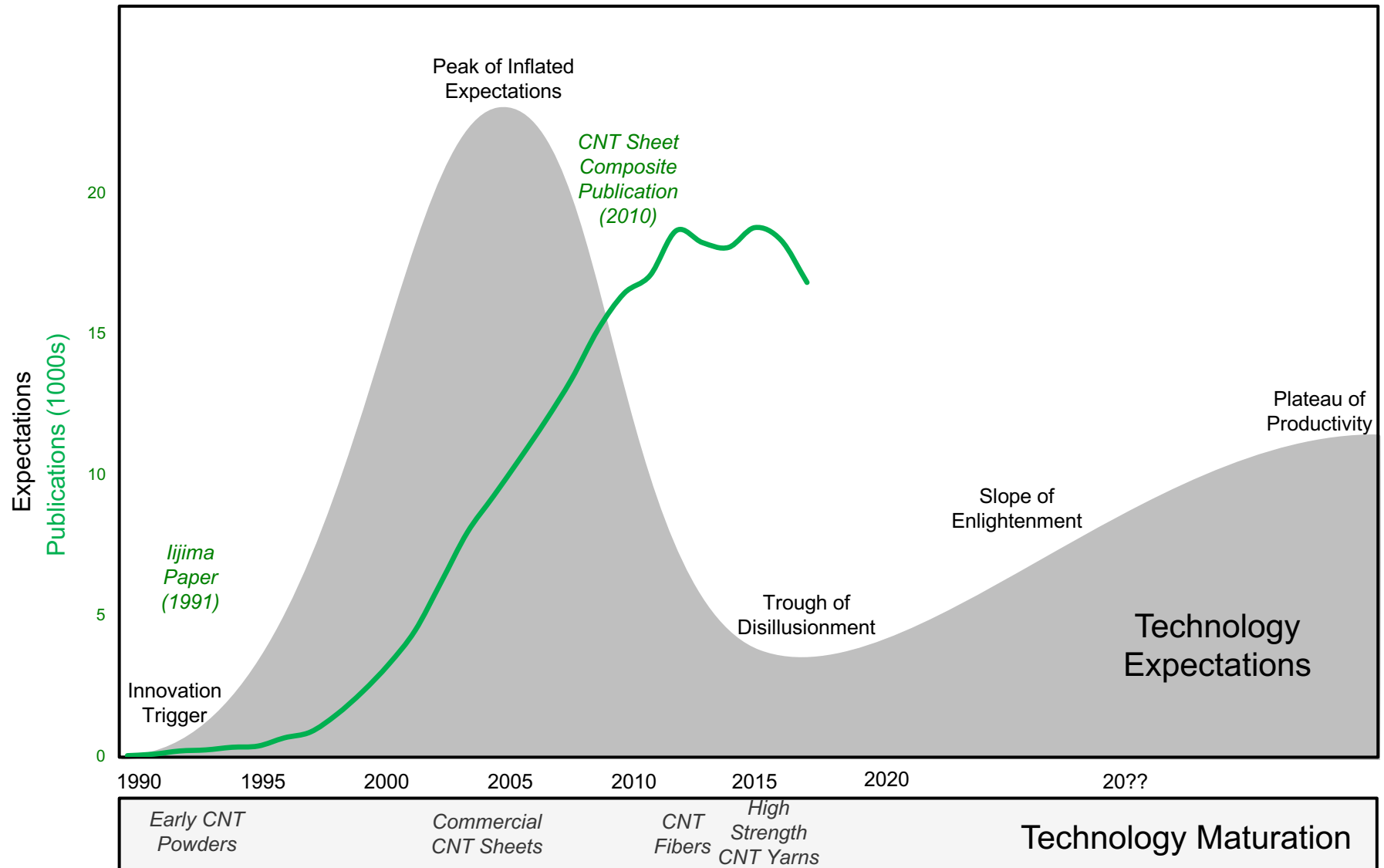
	Mass Ratio*	Cost per pound*
Low Earth Orbit	20	\$4,000
Earth to Moon	200	\$40,000
To Moon, Return to Earth	500	\$100,000
Earth to Mars	500	\$100,000
To Mars, Return to Earth	5000	\$1,000,000

\* Order of magnitude estimates for mass ratios and costs.

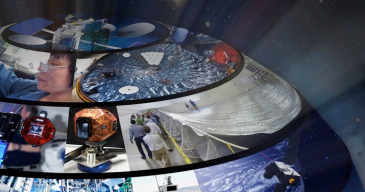
G. Gordon, AIAA SPACE 2007, paper 6278.



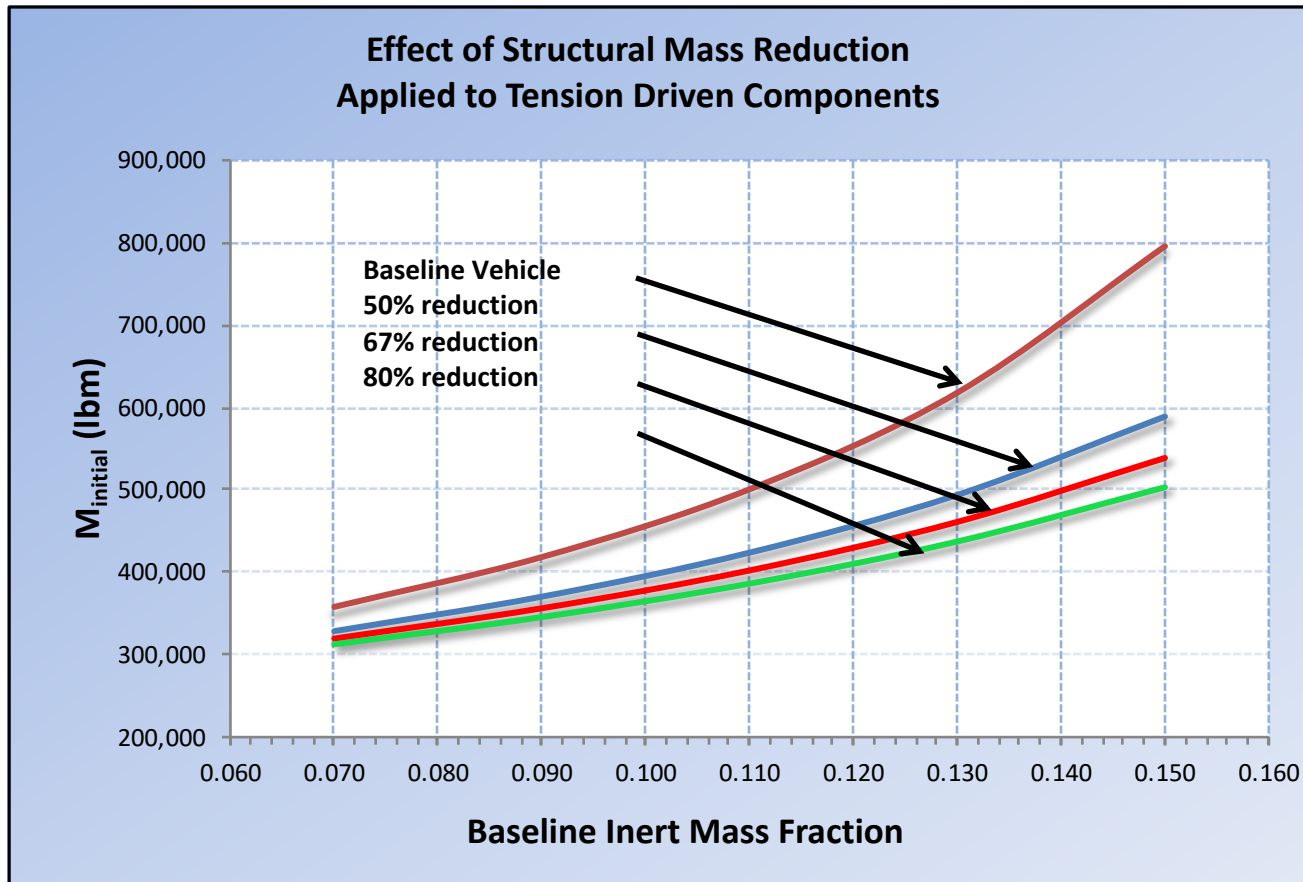
# Carbon Nanotube (CNT) Gartner Hype Cycle



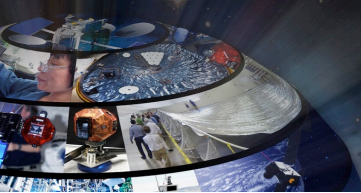




# Setting Goals using Systems Analysis



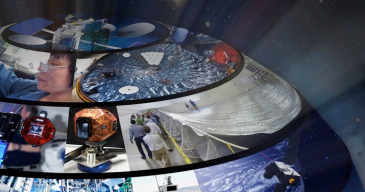
- A 2-3x improvement in specific mechanical properties will permit substantial mass reduction in structural and non-structural components
- Mass savings are potentially large enough to change design concepts



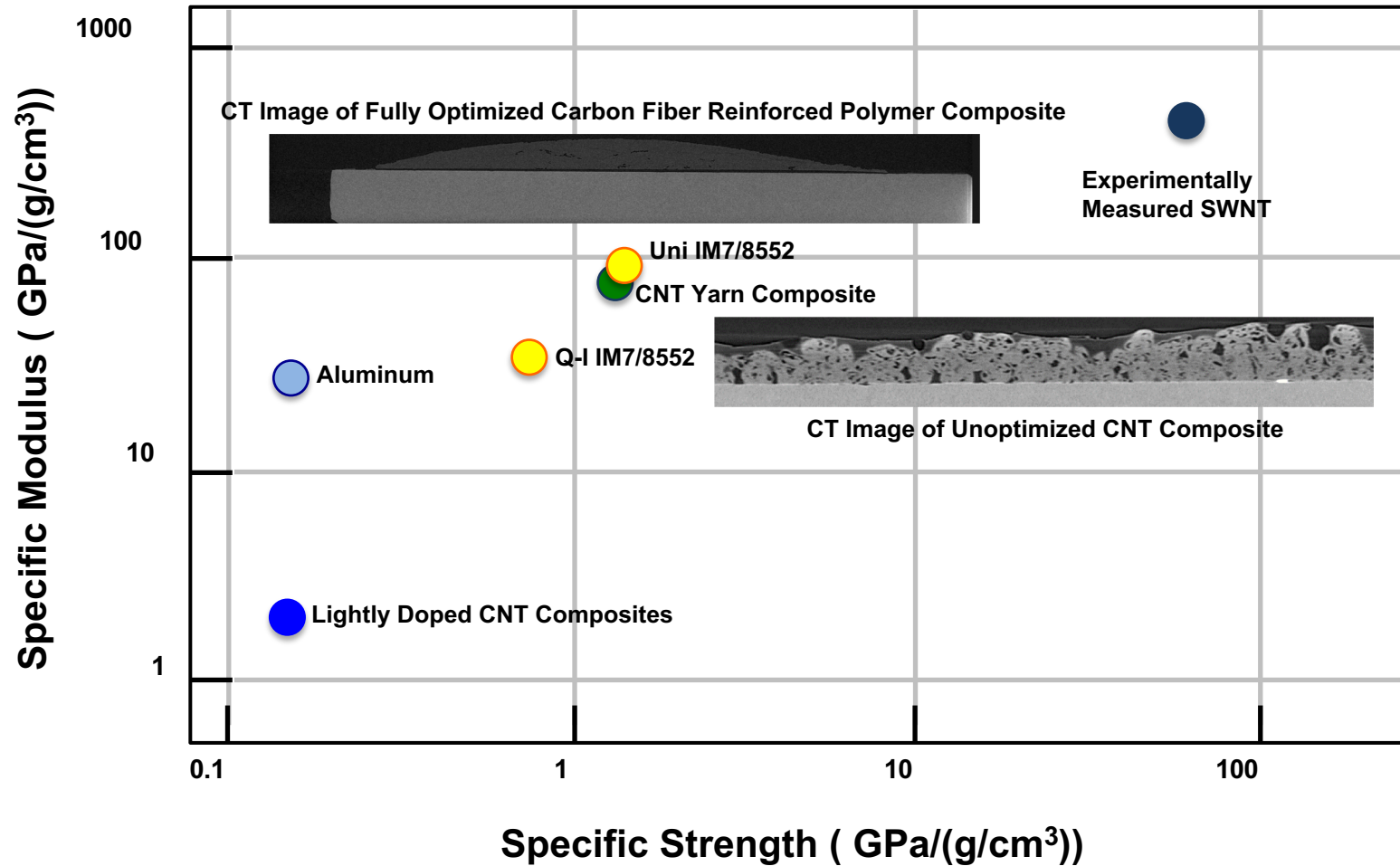
# State of the Art Lightweight Structural Material

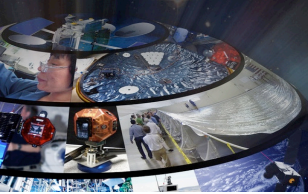






# Structural CNT Potential





# Computationally Accelerated Materials Development for Ultra High Strength Lightweight Structures



## Topic Focus

Ultra high strength lightweight structural material enabled by Materials Genome Initiative (MGI) inspired computational guidance

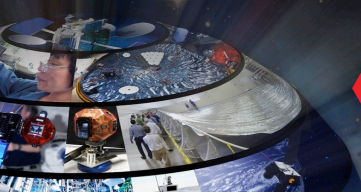
## Distinctive Features of Topic

- MGI approach that spans entire materials development cycle
- Requires demonstration article with challenging property targets at the end of performance period
- Panel properties specified are at least double that of state of the art carbon fiber composite properties
- Properties defined with systems guidance on overall payoff in mass reduction for aerospace systems

## Computational Guidance Spans Materials Development Cycle

- Application-guided structural materials design – predictive modeling of material properties including load transfer mechanisms that will influence material and structure design
- Computationally guided design, synthesis, and processing to enable macroscale fabrication of ultra high strength composite
- Accelerated testing and evaluation of material properties to inform iterative advancement of materials design, synthesis, and processing





US COMP

# NASA Space Technology Research Institute



University of Utah



Michigan Tech University



Florida State University



Massachusetts Institute of Technology



Pennsylvania State University



University of Minnesota



University of Colorado

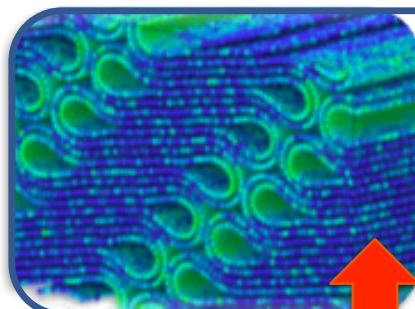


nanosystems  
TECHNOLOGIES, INC.



Johns Hopkins University

SOLVAY



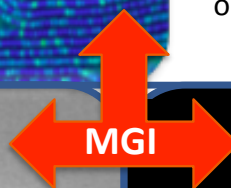
## Computational tools

- Multiscale simulation
- Topology optimization



## Experimental tools

- Multiscale characterization
- Panel-level mechanical tests



## Digital data for design

- Structure-property relationships
- Mechanical property database



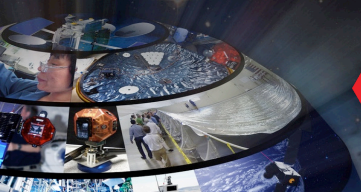
Virginia Commonwealth University



Georgia Tech



Florida A&M University



## **Research Objectives**

- Develop novel Ultra-high strength lightweight (UHSL) structural material per NASA requirements
- Establish new computationally-driven material design paradigm for rapid material development
- Develop modeling, processing and testing tools and methods for CNT assemblage-based UHSL materials
- Train a pool of highly skilled scientists and engineers to contribute to the materials development workforce



# US-COMP Organizational Structure

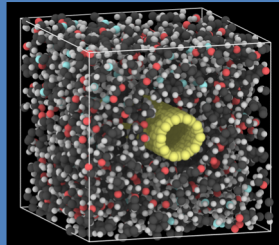


## Technical Advisory Board (TAB)

### Simulation & Design Team (SDT)

Team lead: Greg Odegard

- Force field development
- Atomistic/molecular modeling
- Meso-scale modeling
- Continuum modeling



Testing  
feedback &  
model  
validation

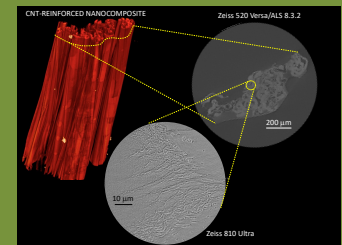
Material  
structure

## Leadership Team

### Testing & Characterization Team (TCT)

Team lead: Mike Czabaj

- Materials characterization
- Thermo/electro/mechanical properties



Optimized  
material design

Synthesis  
feedback

Validation  
Characterization

Prototypes

Structure data

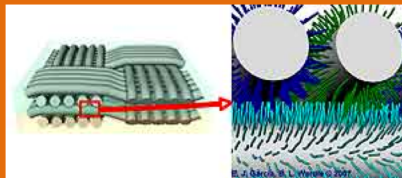
Quality  
feedback

Test panels

### Material Synthesis Team (MST)

Team lead: John Hart

- Small-scale material prototyping
- Material screening



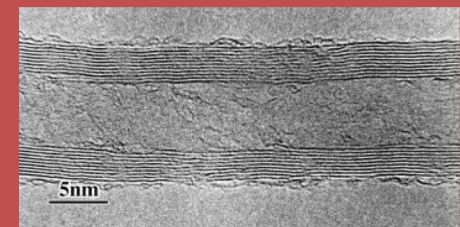
Manufacture  
feedback

Material  
prototypes

### Material Manufacturing Team (MMT)

Team lead: Richard Liang

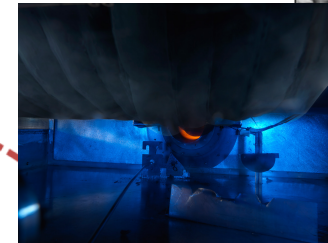
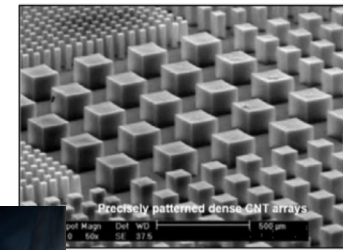
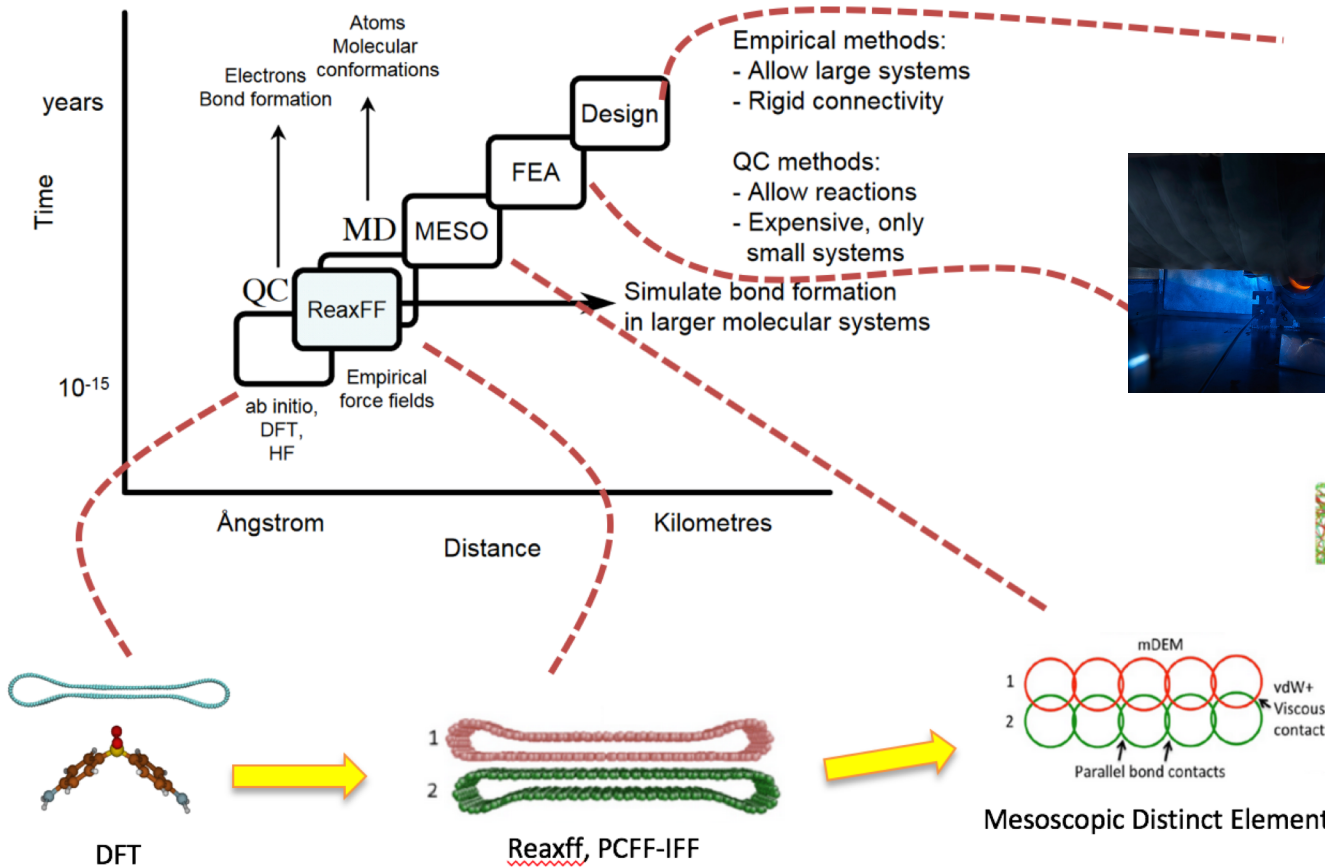
- Manufacturing scale-up
- Materials characterization



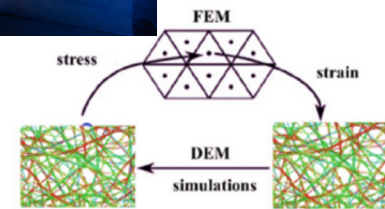
# Multiscale CNT Composite Modeling



Hierarchy of computational chemical methods



Manufacturing



Finite Element Method

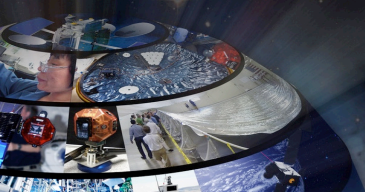
Mesoscopic Distinct Element Method

Simulation & Design Team (SDT)

Team lead: Greg Odegard

- Force field development
- Atomistic/molecular modeling
- Meso-scale modeling
- Continuum modeling





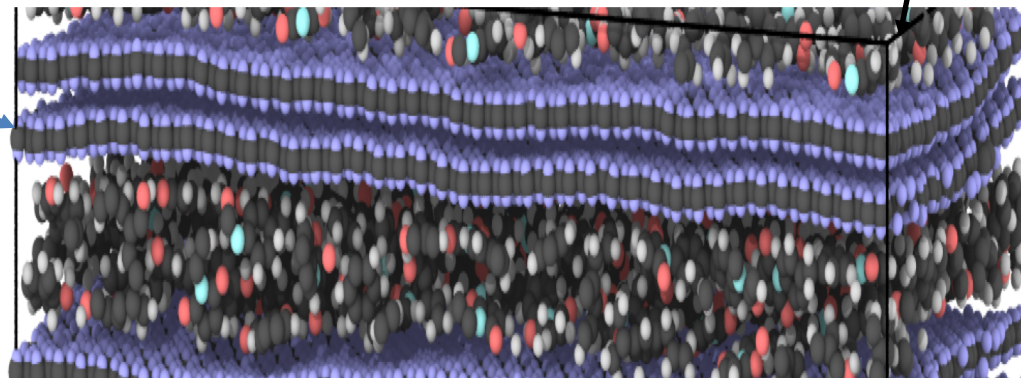
# Molecular Modeling



- Understanding the interaction characteristics between CNTs and polymers (for optimal load transfer)
  - Most compatible CNT/polymer combinations
  - Influence of polymer crosslinking/polymerization
  - Optimal levels of polymer content

Flattened  
CNT

Polymer

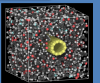


**Molecular dynamics model**

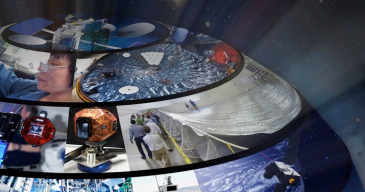
Simulation & Design Team (SDT)

Team lead: Greg Odegard

- Force field development
- Atomistic/molecular modeling
- Meso-scale modeling
- Continuum modeling





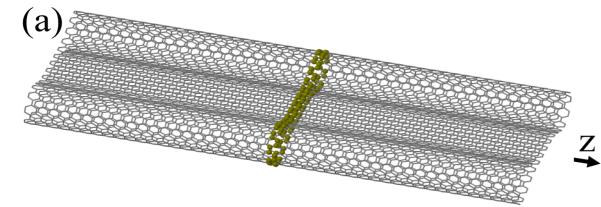


# Meso-Scale Modeling

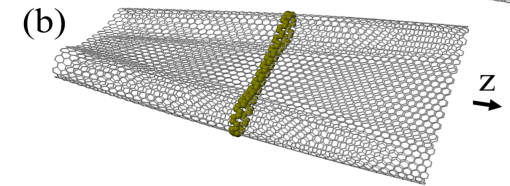


- Meso-scale (atomistically informed) models can now predict the CNT-CNT interaction at larger length scales
- The failure behavior of CNT bundles can be predicted

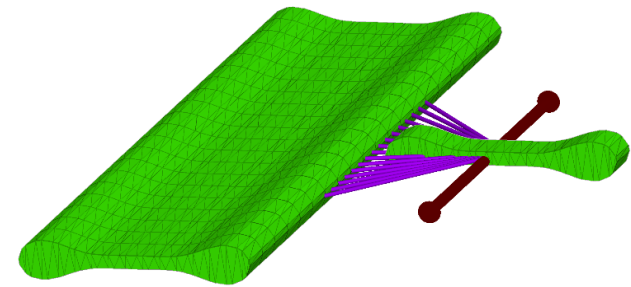
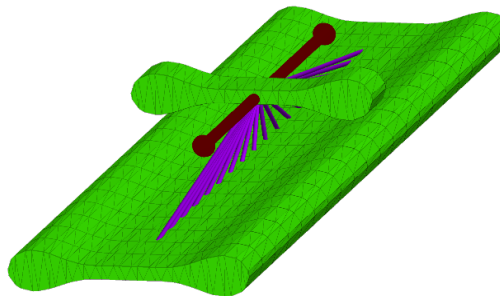
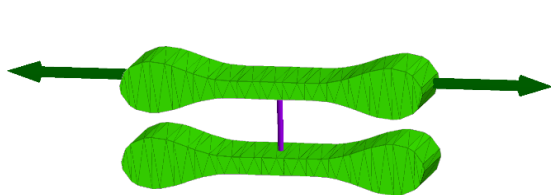
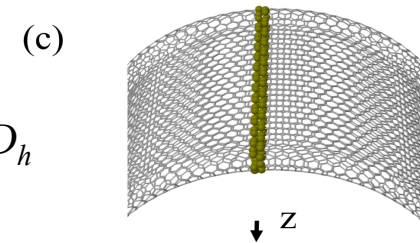
Stretching  $\rightarrow C$



Twisting  $\rightarrow K$



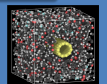
Bending  $\rightarrow D_s, D_h$

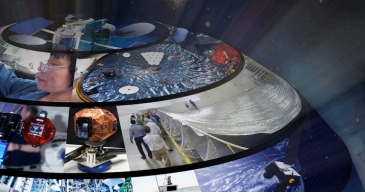


Simulation & Design Team (SDT)

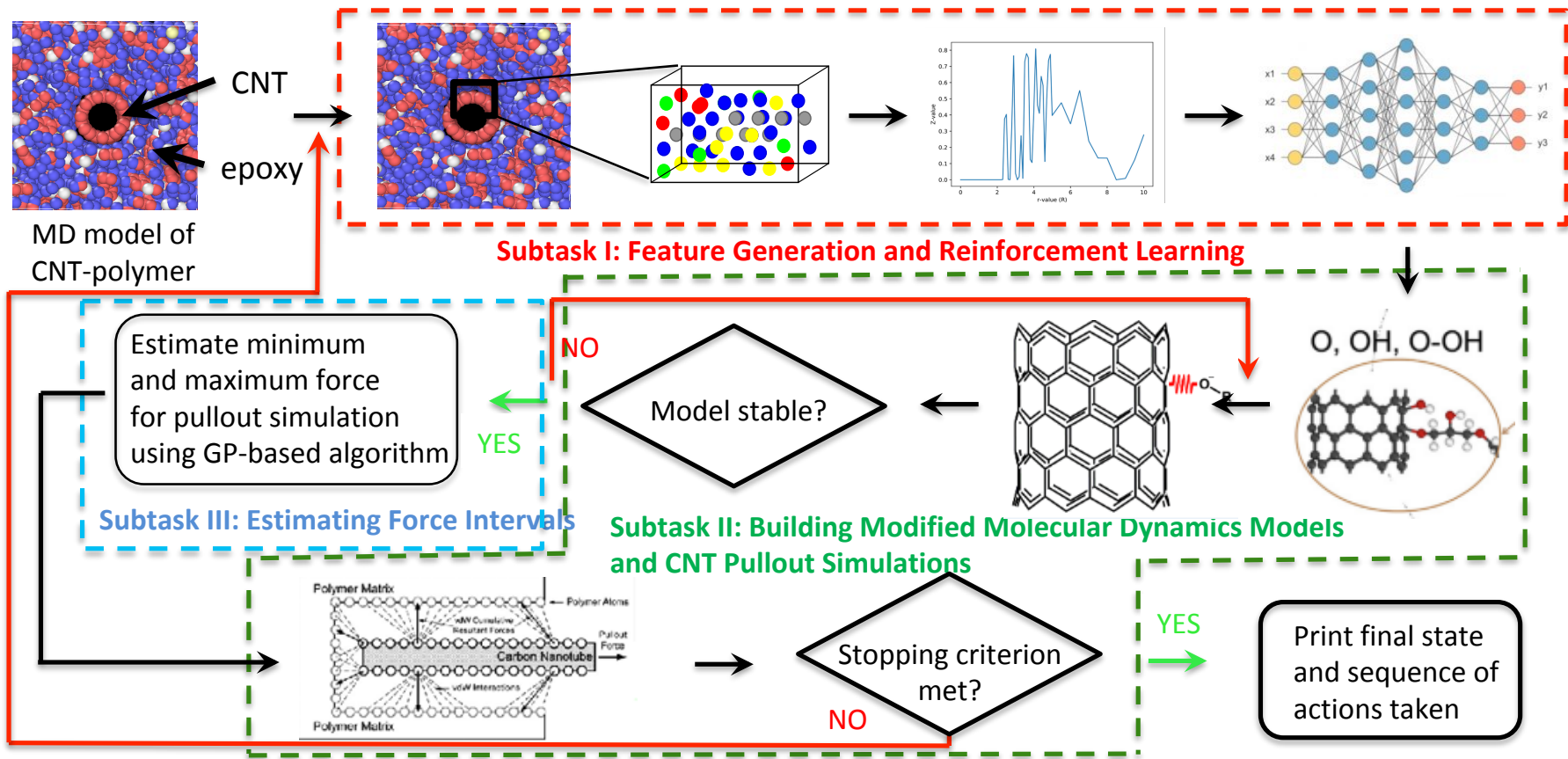
Team lead: Greg Odegard

- Force field development
- Atomistic/molecular modeling
- Meso-scale modeling
- Continuum modeling






# Machine Learning for Materials Design



**Proof-of-concept ML algorithm for designing simple CNT/polymer composites with optimal interfaces**

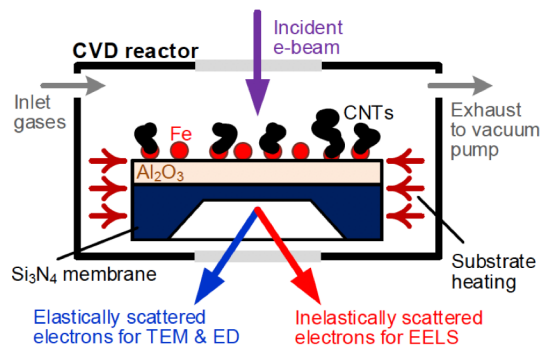
**Simulation & Design Team (SDT)**  
Team lead: Greg Odegard

- Force field development
- Atomistic/molecular modeling
- Meso-scale modeling
- Continuum modeling



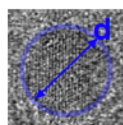
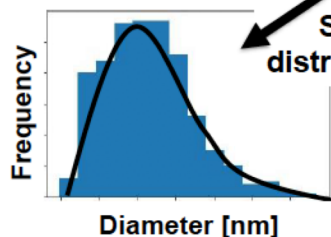


# Identification of High-Yield CNT Growth Conditions

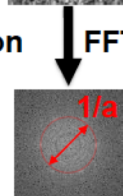


Lognormal distribution  $f(\mu, \sigma^2)$

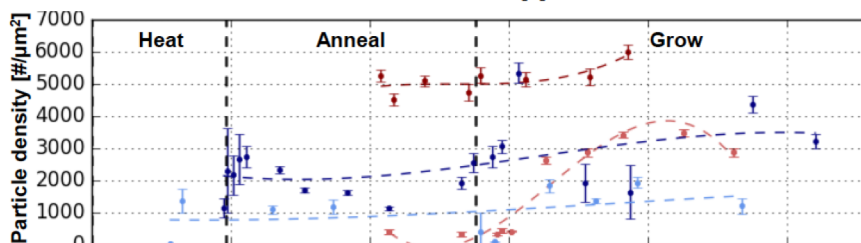
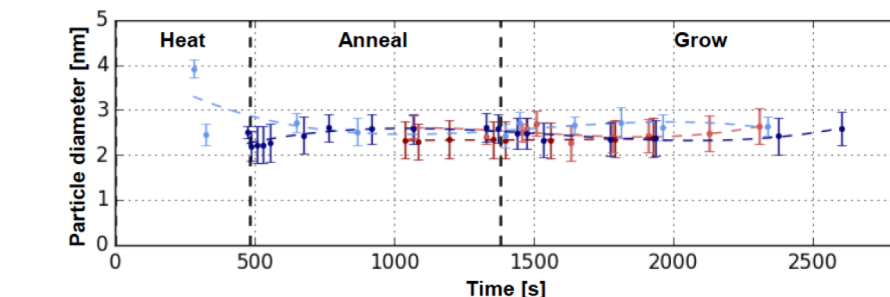
$$\text{PDF: } \frac{1}{x\sigma\sqrt{2\pi}} e^{-\frac{(\ln x - \mu)^2}{2\sigma^2}}$$



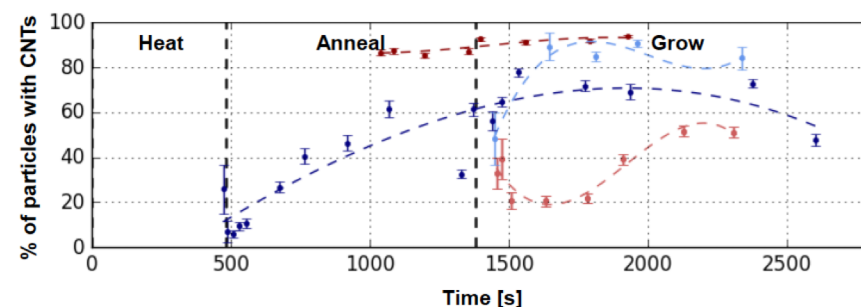
Size distribution



Phase ID



- $\text{H}_2$
- $\text{H}_2 + \text{C}$  preload
- $\text{NH}_3$
- $\text{NH}_3 + \text{C}$  preload

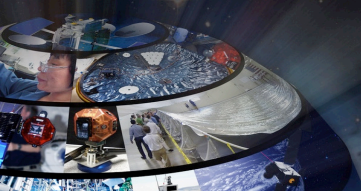


Material Synthesis Team (MST)

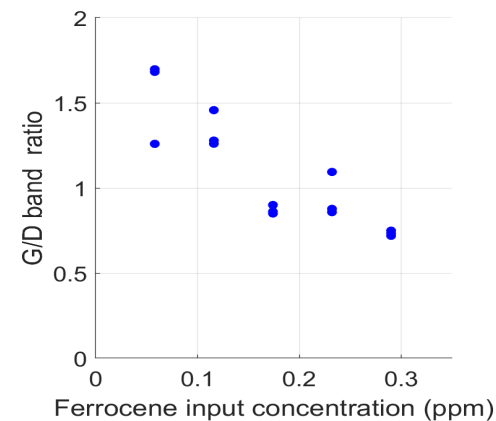
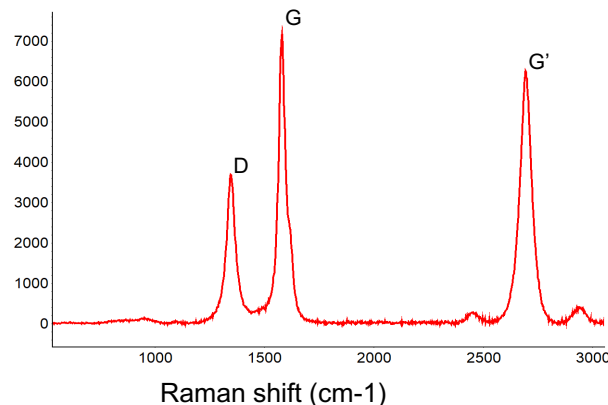
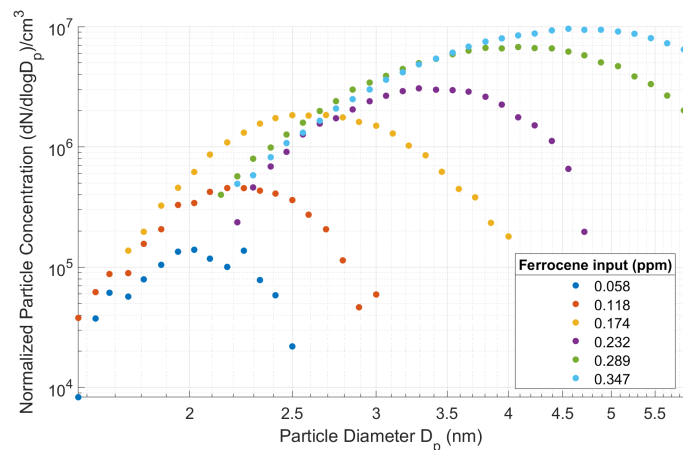
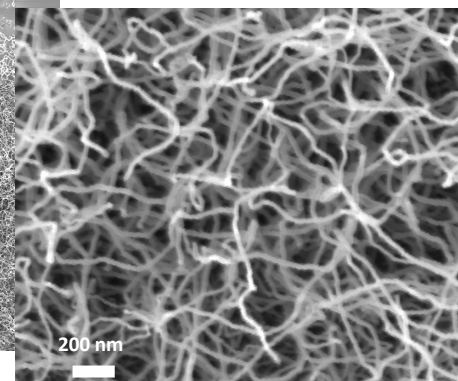
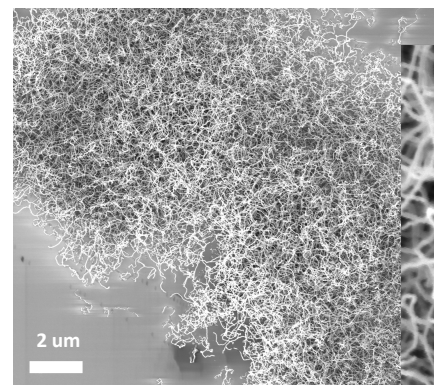
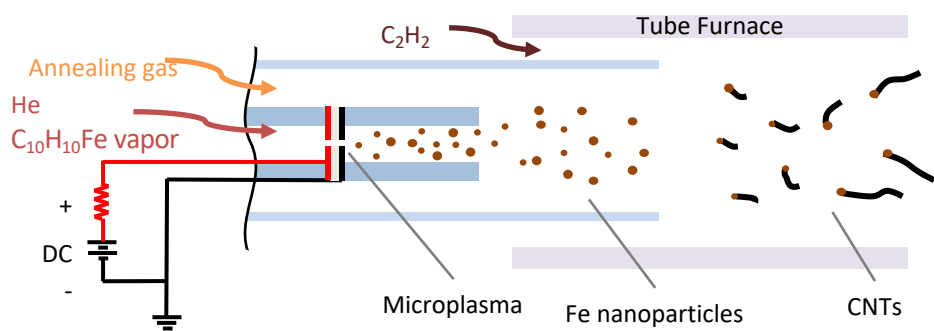
Team lead: John Hart

- Small-scale material prototyping
- Material screening





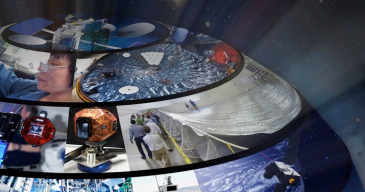
# Efficient Gas-Phase Production of High-Quality CNTs



**Material Synthesis Team (MST)**  
Team lead: John Hart

- Small-scale material prototyping
- Material screening



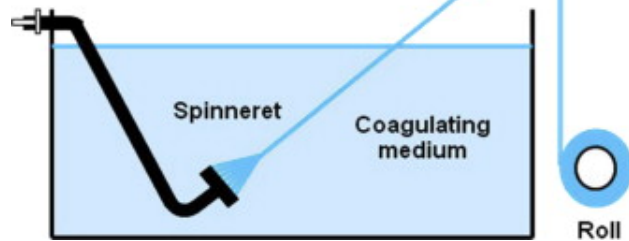


# Microfluidic Spinning of CNT Fibers for Composites

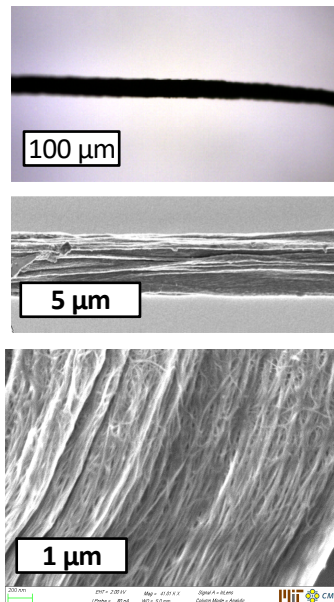


- Using microfluidics, we spin continuous CNT fibers with controlled density
- Fiber properties are currently limited by CNT length (aspect ratio) and alignment

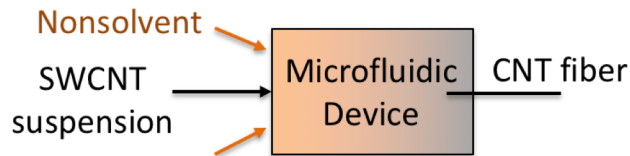
Conventional wet-spinning setup



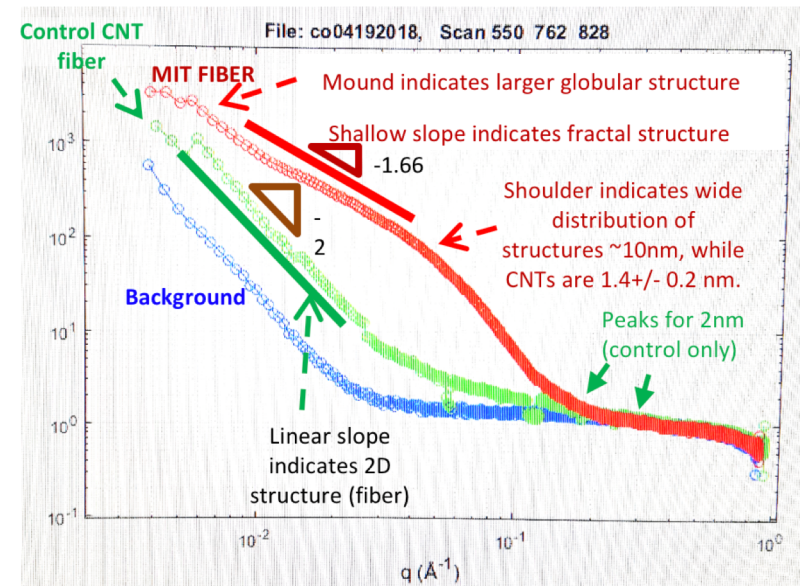
CNT fibers spun at MIT



Microfluidic spinning (MIT)



Small-Angle X-Ray scattering

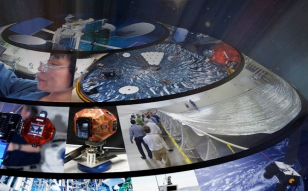


Material Synthesis Team (MST)

Team lead: John Hart

- Small-scale material prototyping
- Material screening



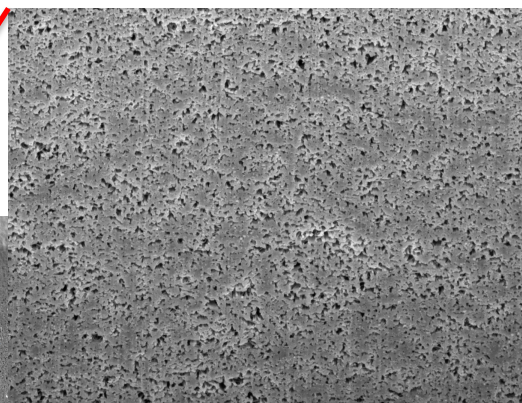


# Fundamental Understanding of Material Characteristics



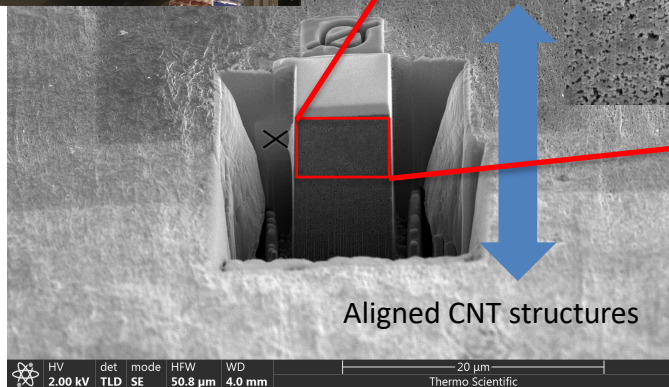
FIB for  
Multiscale 3D  
Tomography  
Analysis

Cross-section of Aligned  
CNT Networks

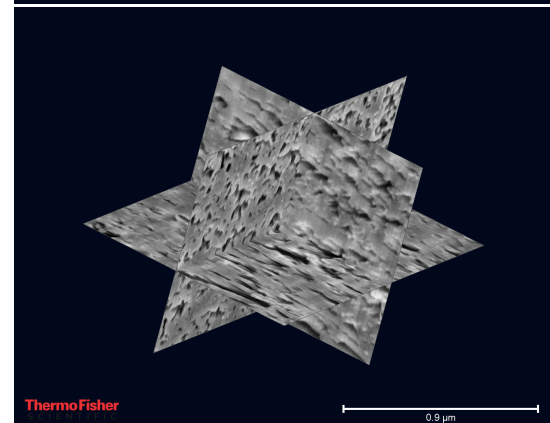
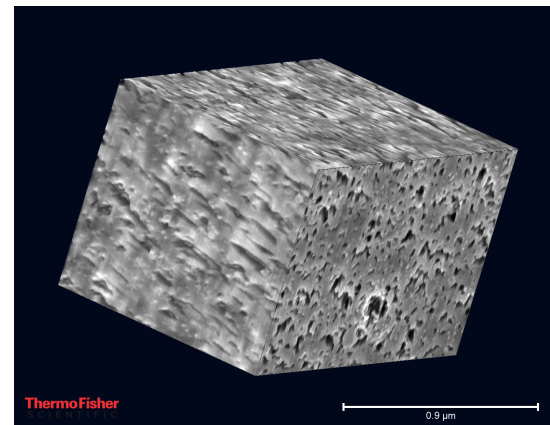


W=6.5  $\mu\text{m}$

Pixel resolution  
3.14 nm X 3.14 nm X 5 nm



Aligned CNT structures



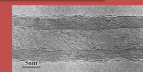
Stretching-induced alignment in CNT tape

**Fundamental understanding of structures within CNT materials provides guidance for synthesis and manufacturing**

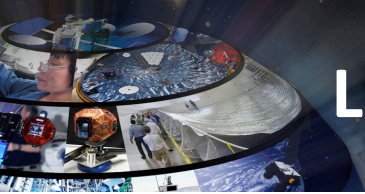
Material Manufacturing Team (MMT)

Team lead: Richard Liang

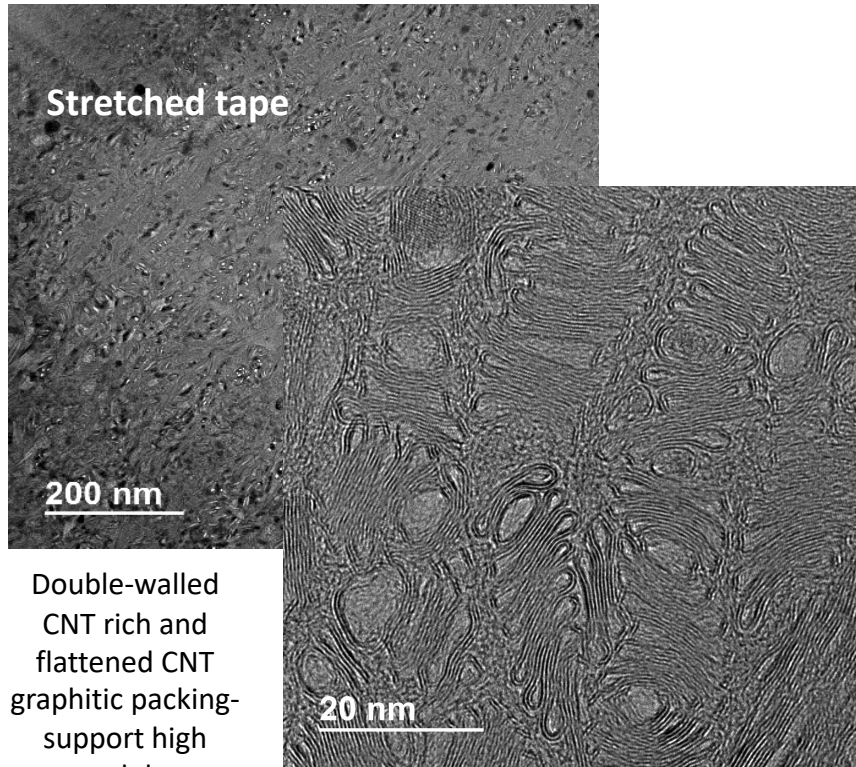
- Manufacturing scale-up
- Materials characterization



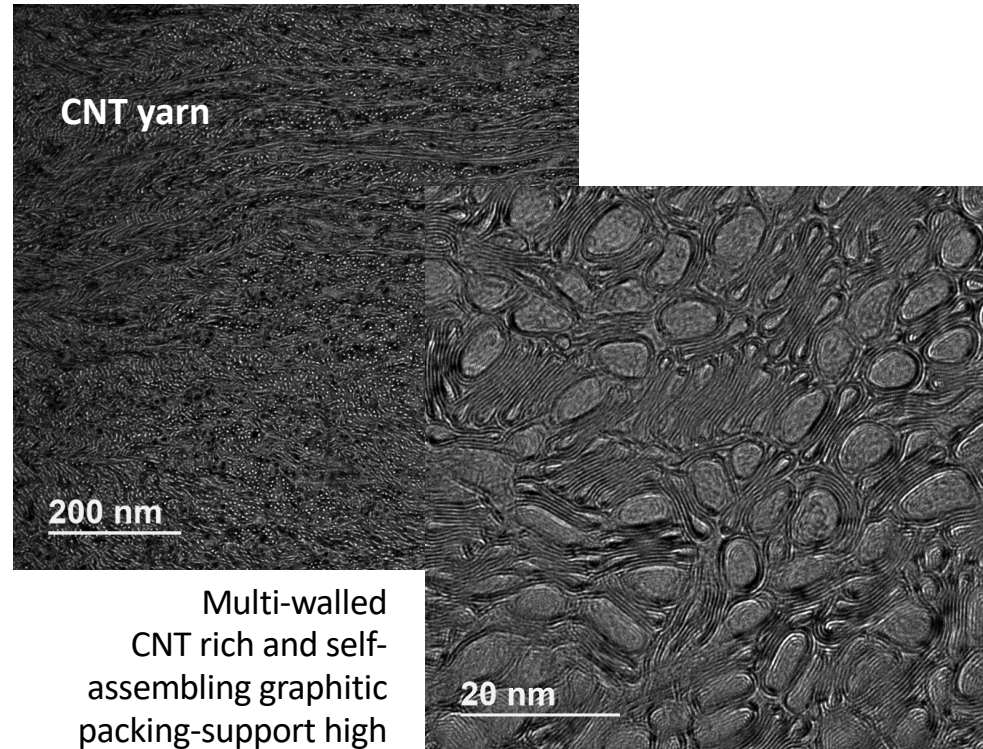




# Load Transfer by CNT Reinforcement



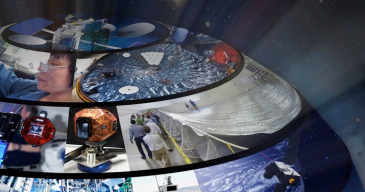
Double-walled  
CNT rich and  
flattened CNT  
graphitic packing-  
support high  
modulus



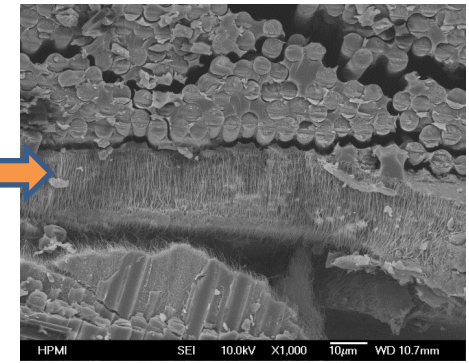
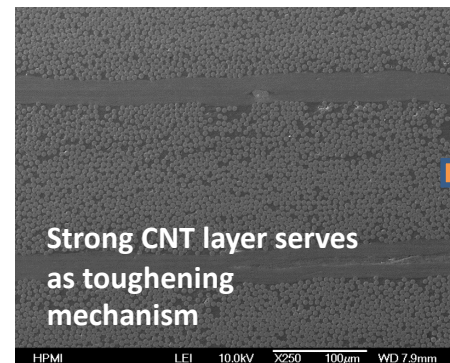
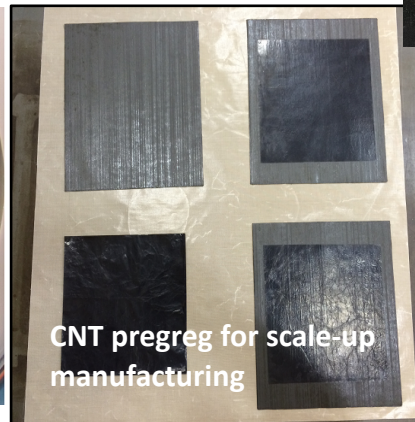
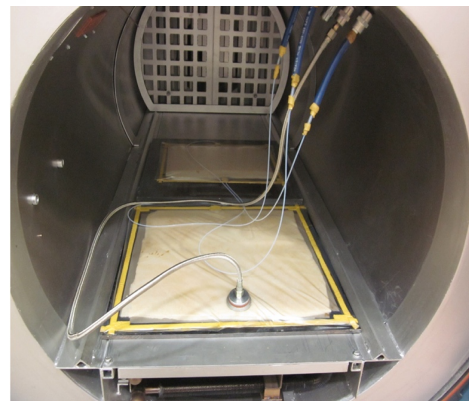
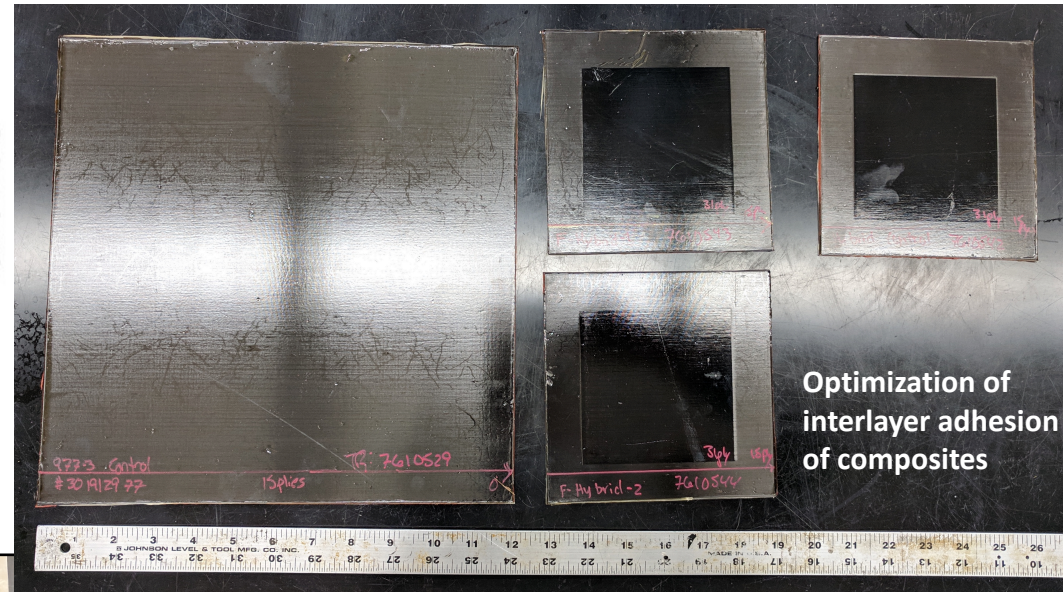
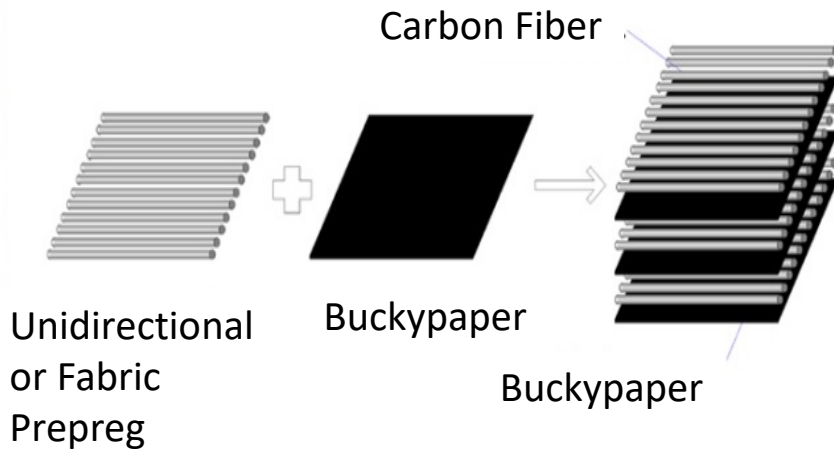
Multi-walled  
CNT rich and self-  
assembling graphitic  
packing-support high  
strength

**Microstructures provide insight on load transfer mechanism for high strength CNT composites**





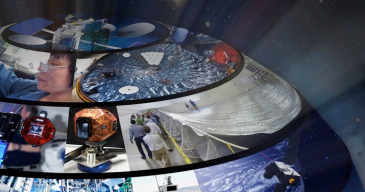
# Fabrication of Aerospace Quality Hybrid Composites



**Material Manufacturing Team (MMT)**  
 Team lead: Richard Liang

- Manufacturing scale-up
- Materials characterization



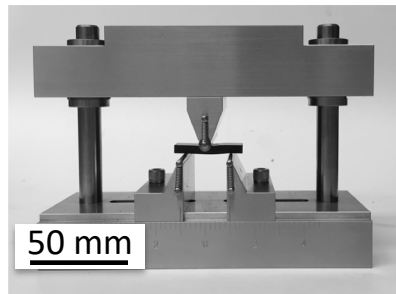


# Experimental Characterization

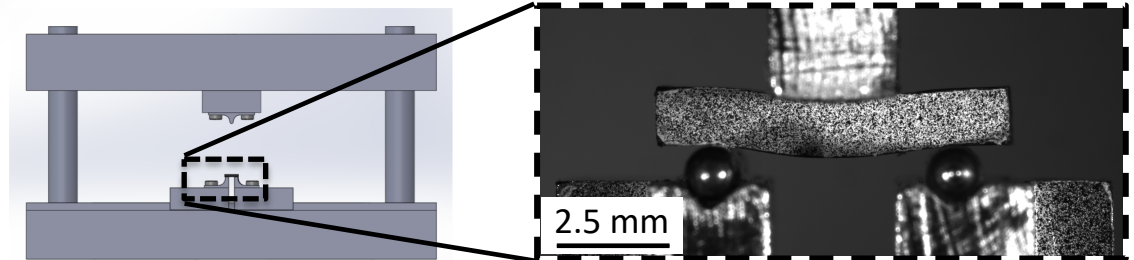


## Short Beam Shear Tests for Laminates with Thickness $\sim 1$ mm

ASTM D2344



Miniature D2344

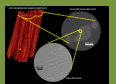


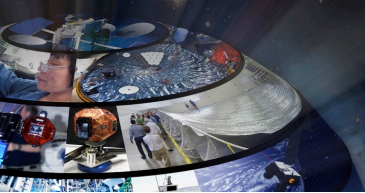
**Development of new composite systems can be accelerated by using scaled-down structural characterization tests**

Testing & Characterization Team (TCT)

Team lead: Mike Czabaj

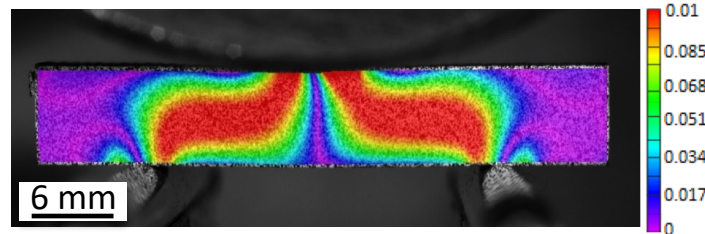
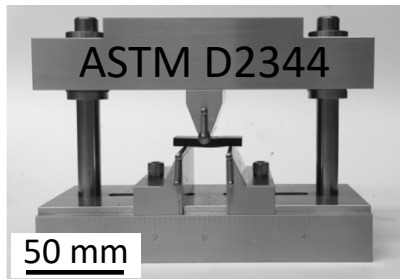
- Materials characterization
- Thermo/electro/mechanical properties



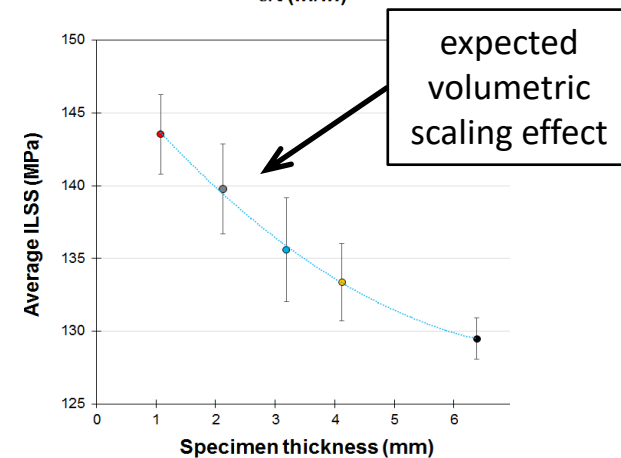
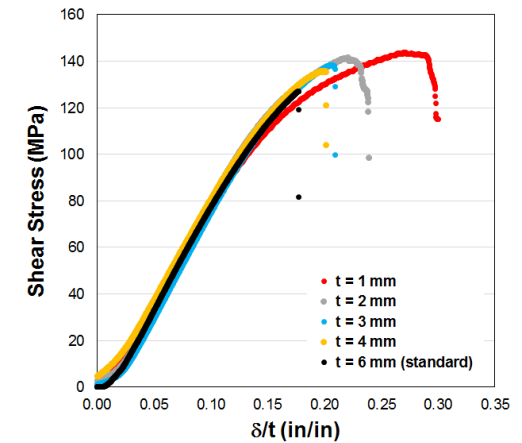
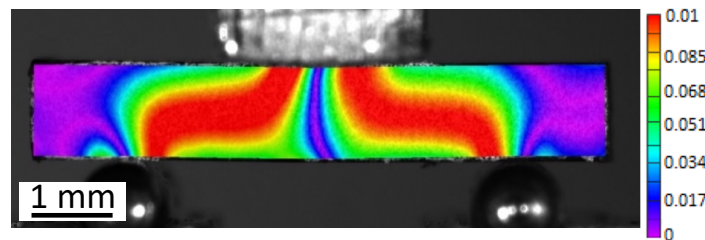
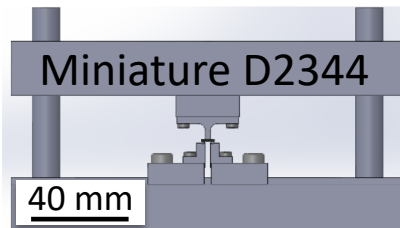


# Experimental Characterization

## Validation of Miniaturized Mechanical Test



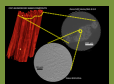
shear strain from DIC

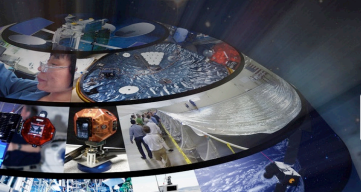


Testing & Characterization Team (TCT)

Team lead: Mike Czabaj

- Materials characterization
- Thermo/electro/mechanical properties

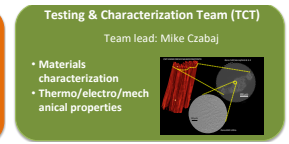
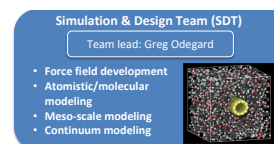




# MGI efforts – Modeling & Characterization



- US-COMP registered at repositories
  - CDMHub
  - NanoHub
- Data sharing and IFF website update in progress
  - Integration in CHARMM-GUI (with Adri van Duin, Wonpil Im)
  - New automatic conversion utilities for using IFF with NAMD and GROMACS released
- Received Special Creativity Award in NSF-MGI initiative (DMREF)
- Sharing and remote/real-time viewing of tomographic image data (Czabaj)
  - Initiated a new collaboration with the University of Utah **Scientific Computing and Imaging** (SCI) Institute to enable remote and real-time access to large quantities of image data collected during in situ experiments
- Sharing of image processing and SAXS analysis codes (Hart)
- Opportunity for HPC ETEM video analysis (Hart)



# Publications



## Special Issue

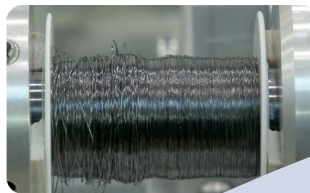
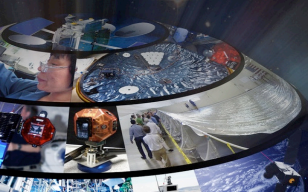
***Carbon Nanotube Composites for Structural Applications***, Odegard, G., Liang, Z. and Wise, K. E. (eds.), *Composites Sci. and Technol.*, **166**, 1-182, September, 2018.



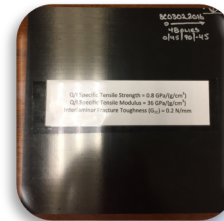
- Radue, M. S., Odegard, G. J., “Multiscale Modeling of Carbon Fiber/Carbon Nanotube/Epoxy Hybrid Composites: Comparison of Epoxy Matrices,” *Composites Sci. and Technol.*, **166**, 20-26, 2018.
- Nakarmi, S., Unnikrishnan, V. U., Varshney, V., Roy, A. K, “Computer-Aided Design of Three Termination (3T) Zig-Zag SWCNT Junctions and Nanotube Architectures,” *Composites Sci. and Technol.*, **166**, 36-45, 2018.
- Pramanik, C., Nepal, D., Nathanson, M., Gissinger, J. C., Heinz, H., “Molecular Engineering of Interphases in Polymer/Carbon Nanotube Composites to Reach the Limits of Mechanical Performance,” *Composites Sci. and Technol.*, **166**, 86-94, 2018.
- Gair, J. L., Lambeth, R. H., Cole, D. P., Wardle, B. L., “Strong Process-Structure Interaction in Stoveable Poly(Urethane-Urea) Aligned Carbon Nanotube Nanocomposites,” *Composites Sci. and Technol.*, **166**, 115-124, 2018.
- Jolowsky, C., Sweat, R., Park, J. G., Hao, A., Liang, R., “Microstructure Evolution and Self-Assembling of CNT Networks During Mechanical Stretching and Mechanical Properties of Highly Aligned CNT Composites,” *Composites Sci. and Technol.*, **166**, 125-130, 2018.
- Kalfon-Cohen, E., Kopp, R., Furtado, C., Ni, X., Wardle, B. L., “Synergetic Effects of Thin Plies and Aligned Carbon Nanotube Interlaminar Reinforcement in Composite Laminates,” *Composites Sci. and Technol.*, **166**, 160-168, 2018.



# Computationally Accelerated Materials Development for Ultra High Strength Lightweight Structures



High Strength CNT Yarn



Ultra High Strength Composite Panel



CNT Sheets



CNT Powder

**1991-Early 2000s**

- Early national investments in CNT research
- NASA interest in structural properties
- Powder form CNT unable to enhance mechanical properties to compete with state of the art structural materials

**2004**

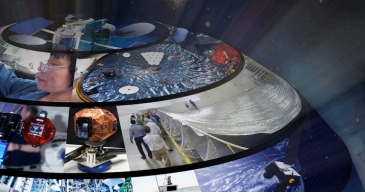
- CNT sheets first became available
- Manufacturing maturation heavily supported by DoD, including Title III funding
- Property enhancements were focused on electrical properties
- CNT sheets for electrostatic charge dissipation were used on Juno which launched in 2011

**2015**

- NASA Game Changing Development Program supported efforts in structural CNT resulted in mechanical property improvements to commercially available CNT yarn for composite application
- NASA's internal efforts supported 500% increase in specific strength and 1600% increase in specific modulus of CNT composites over 3 years despite non-optimal CNT composites
- CNT composites at tipping point, needing better understanding of mechanisms for load transfer to continue improvements in mechanical properties

**2022**

- 5-year Space Technology Research Institute (STRI) funding expected to yield fundamental understanding of CNT composite mechanical properties to reach panel level properties that will enable systems level mass reduction
- Materials Genome Initiative accelerated panel properties development required by STRI will yield both models to enhance understanding of CNT composites and continued maturation of CNT materials manufacturing
- Vision for STRI includes complementary internal NASA efforts to assure timely integration of this technology in systems architecture concepts



# Collaborative Partnerships for Advancement of Structural CNT



## NASA Centers

LaRC  
MSFC

## ESI

U of Minnesota  
U of Virginia

## Public/Private Partnerships

Northrup  
Grumman/Orbital ATK

## OGA Partnerships

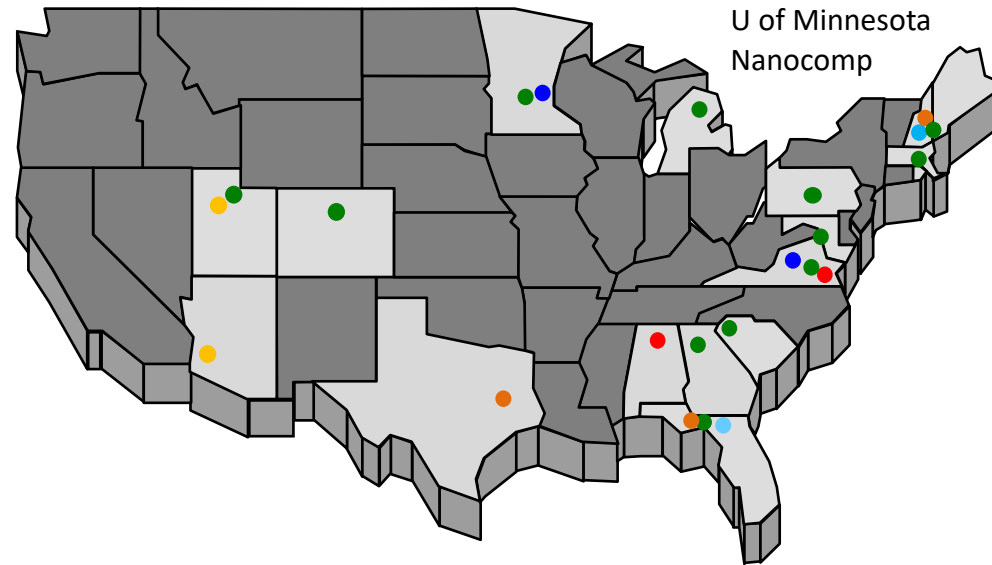
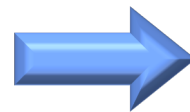
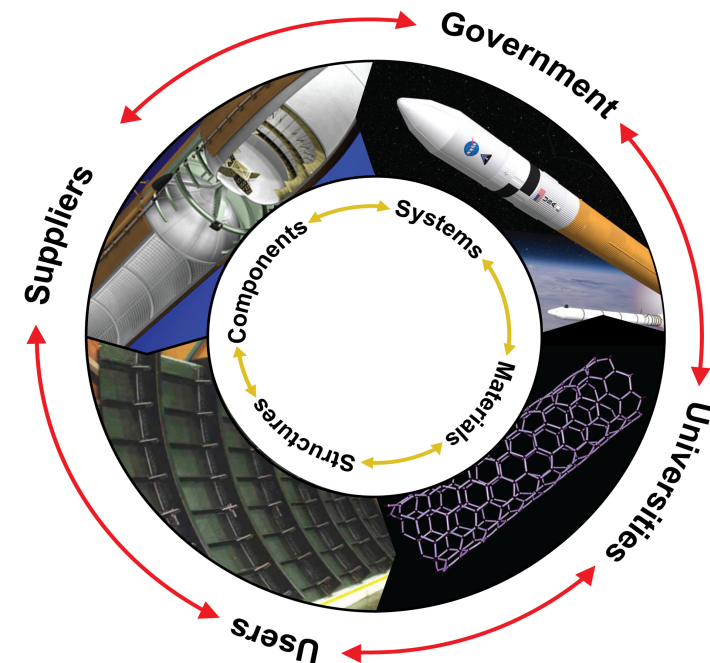
AFOSR  
AFRL – STTR,  
ManTech

## SBIR/STTR

Florida State U  
Dexmat, Inc.  
Nanocomp Technologies, Inc.

## NSTRI

Florida State U  
MIT  
VCU  
Ga Tech  
Penn State U  
FL A&M U  
Solvay  
Michigan Tech  
U of Utah  
U of Colorado  
Johns Hopkins  
U of Minnesota  
Nanocomp



Collaborative multidisciplinary partnerships to leverage fiscal resources, ideas, knowledge & expertise



# Complementary Manufacturing Development of High Strength CNT

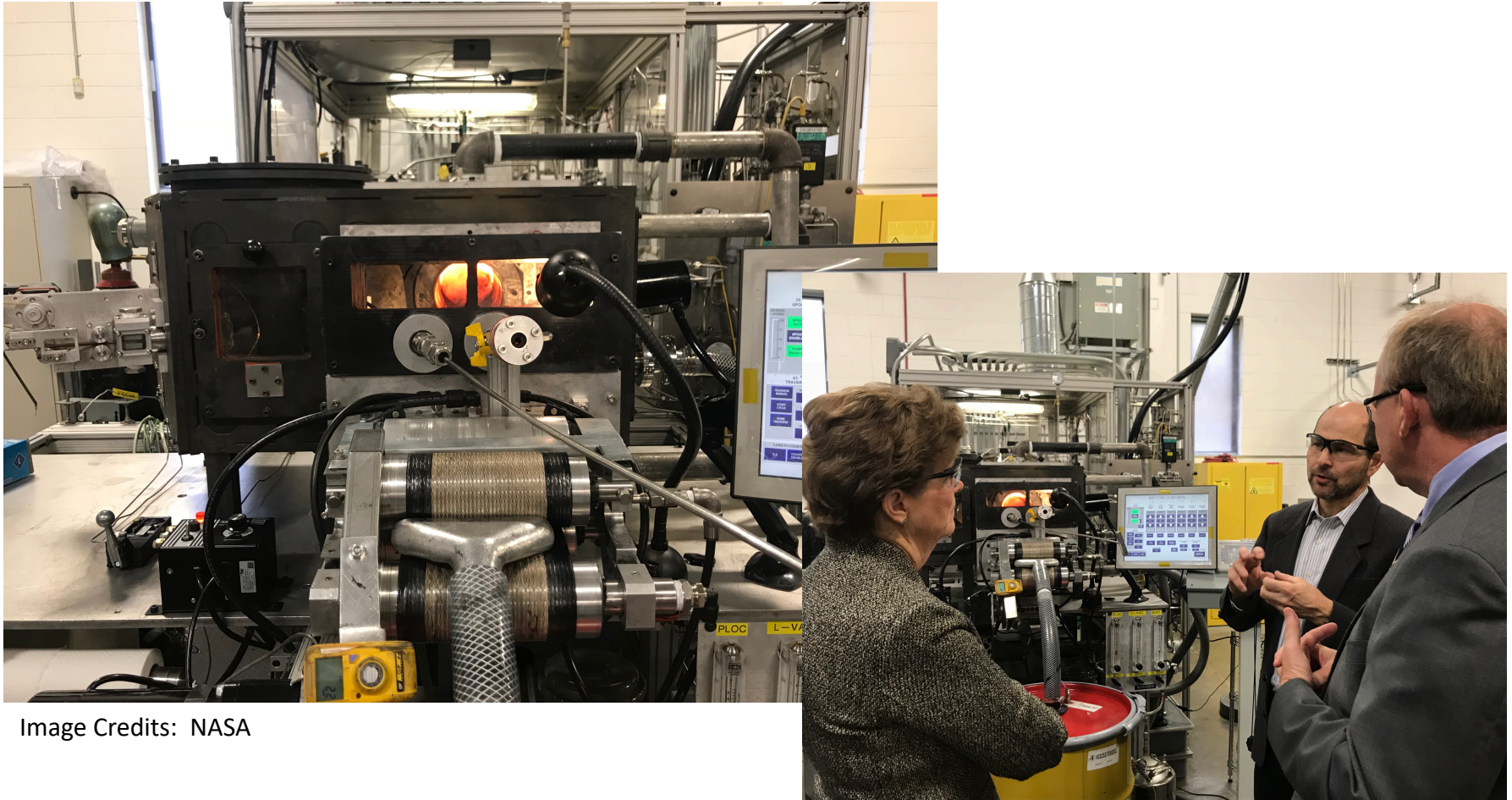


Image Credits: NASA

NASA awarded Phase III SBIR for scale-up of high strength CNT as part of Game Changing Program to develop superlightweight aerospace composites.