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Transformational Tools and Technologies (T³) Project The NASA Multiscale Analysis Tool: An Enabling Platform for Achieving Vision 2040

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Innovative solutions through foundational research and cross-cutting tools

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Vision 2040: A Roadmap for Integrated, Multiscale Modeling and Simulation of Materials and Systems



Provides a public/private investment strategy for the design of fit-for-purpose materials and structures



2040 Vision State:

A cyber-physical-social ecosystem that impacts the supply chain to **accelerate** model-based concurrent design, development, and deployment of materials and systems throughout the product lifecycle for **affordable**, **producible** aerospace applications

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Study Identified 9 Key Element Domains



Identified Critical Gaps & Possible Subset of Actions Required To Close Each Gap



	Key Flement	Critical Gan	Priority Action	Time Frame	End State Characteristics
	Liement	Circlear Gap		2018 2020 2025 2030 2035 204	0
	1	Underdevelopment of physics-based models that link length and time scales for relevant material systems	Multiscale V&V methods (5.6) Integration of uncertainty across scales (1.13) ICME-based fast process models (1.21) Multiscale models for rare-events/nucleation (1.22) Information framework for 3D/4D model dev. (2.11) Models for key uncertainty sources (1.23)		•
	2	Inability to conduct real time characterization and measurement of structure and response at appropriate length and time scales	Real-time measurement methods (2.14) Real-time visualization for experiment modeling (6.15) Lifecycle data: automated ingestion and storage (6.23) Protocols: link characterization, test data, models (2.10)		()
	3	Lack of reliable optimization methods that bridge across scale	New optimization formulation methods (3.13) Education modules: data analytics tools/methods (8.2) Optimization methods with uncertainty incorporated (3.11) Coupled multiphysics and optimization methods (3.5) Surrogate models for large scale optimization (4.15)		
	4	Existing models and software codes are not designed to compute input sensitivities and propagate uncertainties to enable UQ	Benchmark characterization methods (2.3) Optimization methods with uncertainty incorporated (3.1) UQ: sensitivity analysis methods (4.19) Holistic test methods (2.16) Models for key uncertainty sources (1.23)		
	5	Lack of guidelines and practitioner aids for multiscale/multiphysics (e.g., ICME) V&V	Best practices: data collection (5.7) Multiscale V&V standards and definitions (5.1) Student resources: industry V&V data (8.8) V&V training (5.2) Holistic test methods (2.16)		
	6	No widely accepted community standards or schema for materials information storage and communication methods	Workflow data modeling: automation, recognition, tagging (7.1) Training: informatics framework interpretation & integration (6.21) Best practices: data federation (6.1) Best practices: defining multidisciplinary ontologies (6.3)		5 xt > 5
	7	Lack of open, community/industry standards defining inputs/outputs, needed functionality, data quality, model maturity levels, etc. for smooth operation in the envisioned ecosystem	Access-controlled example workflows (7.9) Best practices: multi-domain workflows (7.16) Data quality and model maturity standards (7.21) Access-controlled adaptive file formats (6.2)		۲۲ ۲۲ ۲
	8	Education/training does not bridge the gap between "essential" or "fundamental" knowledge and industrially relevant skills	Education/Training: decision/UQ approaches (4.7) New computational certifications programs/tracks (8.14) Workforce transition training for students (8.5) V&V training (5.2) Student access to equipment/facilities (8.6)		<i>3</i> (•)
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Relevance and Background

Integrated Computational Materials Engineering (ICME) Is The Future



Micromechanics: The Link Between Structures and Materials





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Aboudi, J., Arnold, S.M., and Bednarcyk, B.A. (2013) *Micromechanics of Composite Materials: A Generalized Multiscale Analysis Approach*, Elsevier, Oxford, UK., pp 1-984. 6

NASA Multiscale Analysis Tool (NASMAT)

- Clean-sheet development based on legacy MAC/GMC and FEAMAC tools (~30 years of tool development)
- A framework designed to support massively multiscale modeling (M3) on high-performance computing (HPC) systems
 - Solves real, large-scale, non-linear, thermo-mechanical problems
- Modular design to support "plug-and-play" capabilities
 - Operational components categorized into NASMAT procedures
 - Each procedure has access to a library of modules
- Developed for enhanced interoperability
 - Integrates with 3rd party structural analysis codes (e.g., FEA)
 - Arbitrary number of length scales
 - Arbitrary micromechanics theories (including user-defined)
 - Library constitutive laws/damage models (including user-defined)
 - Data output in HDF5 file format
- ASCII input, pre/post-processor under development





NASMAT Workflow





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Comparison of Different Modeling Approaches



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	Mori-Tanaka	GMC	HFGMC	FEA
General Global Accuracy	Good	Very Good	Excellent	Excellent
Computational Efficiency	Superior	Excellent	Fair	Fair
Local Field Accuracy	Poor	Good	Excellent	Excellent
Normal/Shear Coupling	No	No	Yes	Yes
Admits Local Inelasticity	Yes*	Yes	Yes	Yes
Suitable for Inclusion in Structural Models	Excellent	Excellent	Good	Fair
Multi-Axiality	Yes	Yes	Yes	Yes
Ability to Model Debonding	Yes*	Yes	Yes	Yes
Ability to Model Disordered Microstructures	n/a	Fair	Excellent	Excellent
Local Fields Insensitive to Refinements in Mesh	Yes	Yes	No	No

*Features not in NASMAT

Multiscale Recursive Micromechanics (MsRM)

- Efficient, semi-analytical micromechanics theories
- Call each other (or themselves, recursively)
- Captures microstructure on **arbitrary** number of scales
 - No limit on depth of scales





Development of a 3D Woven Repeating Unit Cell (RUC)





Failure Prediction of a 3D Woven Composite



- Warp-direction strength predicted
- Use of quasi-brittle damage model improved overall prediction of stress-strain curve

- Failure mode predicted disbonding of binder tows
- Crack band model results in more shear nonlinearity
- Runtimes: Subvolume elimination ~ 30 sec., crack band ~ 15 min.

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Sensitivity Analysis of 3D Woven Composites





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Multifidelity Integration with Abaqus

Stress (MPa)



Stress (MPa)



- NASMAT acts as an Abagus material
- Arbitrary number of RUCs may be deployed as user materials
- NASMAT libraries linked using an Abaqus environment file



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Application to a Realistic, Industrial Sized Problems

- Multiscale simulation of realistic SiC/SiC CMC turbine vane subjected to thermal and internal pressure loading
 - Fully integrated nonlinear analysis
 - 5.5 hrs, 102 CPUs



 Nodal displacement monitored as cavity bursts



- FE Mesh ~0.5M C3D10 quadratic tets
- GMC3D SiC/SiC CMC RUC



 Failure invoked at the microscale in the constituents



Failure progression monitored in constituent



Microscale Tailoring of a Multiphase Metallic Alloy Disk







Multiscale Modeling: Supported through NASA SBIR – ADDITIVE MANUFACTURING INNOVATIONS, LLC; PI: Ajit Achuthan



Additive Manufacturing: collab. with Gustafson (Western Michigan University)

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Multiphysics Governed by Vector Constitutive Laws

- New HFGMC formulation can solve any physics governed by vector constitutive law
- Predicts: ٠
 - Effective properties (given constituent properties and arrangement) •
 - Local fields (given global field loading) ٠
- Second order potential or (temperature, etc.) expansion:

$$\begin{split} \psi^{(\alpha\beta\gamma)} &= \bar{X}_{j} x_{j} + \theta^{(\alpha\beta\gamma)}_{(000)} + \bar{y}^{(\alpha)}_{1} \theta^{(\alpha\beta\gamma)}_{(100)} + \bar{y}^{(\beta)}_{2} \theta^{(\alpha\beta\gamma)}_{(010)} + \bar{y}^{(\gamma)}_{3} \theta^{(\alpha\beta\gamma)}_{(001)} \\ &+ \frac{1}{2} \bigg(3 \bar{y}^{(\alpha)2}_{1} - \frac{d^{2}_{\alpha}}{4} \bigg) \theta^{(\alpha\beta\gamma)}_{(200)} + \frac{1}{2} \bigg(3 \bar{y}^{(\beta)2}_{2} - \frac{h^{2}_{\beta}}{4} \bigg) \theta^{(\alpha\beta\gamma)}_{(020)} + \frac{1}{2} \bigg(3 \bar{y}^{(\gamma)2}_{3} - \frac{l^{2}_{\gamma}}{4} \bigg) \theta^{(\alpha\beta\gamma)}_{(002)} \end{split}$$

- System of $3N_{\alpha}N_{\beta}N_{\gamma}$ algebraic equations:
- Concentration equation:
- Global (effective) constitutive equation:
- Where, effective property tensor is:

$$\mathbf{X}^{(\alpha\beta\gamma)} = \mathbf{A}^{(\alpha\beta\gamma)}\,\overline{\mathbf{X}}$$

$$\mathbf{Z}^* = \frac{1}{DHL} \sum_{\alpha=1}^{N_{\alpha}} \sum_{\beta=1}^{N_{\beta}} \sum_{\gamma=1}^{N_{\gamma}} d_{\alpha} h_{\beta} l_{\gamma} \mathbf{Z}^{(\alpha\beta\gamma)} \mathbf{A}^{(\alpha\beta\gamma)}$$

$$$$

 $\mathbf{K} \boldsymbol{\Omega} = \mathbf{f}$

 $\overline{\mathbf{Y}} = \mathbf{Z}^* \overline{\mathbf{X}}$

Physics Governed by Vector Constitutive Laws

Heat conduction (Fourier's Law)	$\mathbf{q} = -\mathbf{\kappa} \nabla T$	\mathbf{q} = heat flux vector $\mathbf{\kappa}$ = 2nd order thermal conductivity tensor T = temperature	
Electrical conduction	$\mathbf{J}=-\mathbf{\sigma} abla\phi$	J = electic current density vector $\sigma = 2nd order electric conductivity tensor$ $\phi = electical potential$	Electric field: $\mathbf{E} = -\nabla\phi$
Diffusion (Fick's Law)	$\mathbf{j} = -\mathbf{d} \nabla C$	<pre>j = permeant flux vector d = 2nd order diffusivity tensor C = concentration</pre>	
Magnetic permeability	$\mathbf{B} = -\mathbf{\mu} \nabla \boldsymbol{\xi}$	$J = magnetic \ flux \ density \ vector$ $\sigma = 2nd \ order \ magnetic \ permeability \ tensor$ $\phi = magnetic \ potential$	Magnetic field : $\mathbf{H} = -\nabla \boldsymbol{\xi}$
Electrical permittivity	$\mathbf{D} = -\mathbf{\epsilon} abla \phi$	$\mathbf{D} = electric \ displacement \ vector$ $\mathbf{\varepsilon} = 2nd \ order \ electric \ permittivity \ tensor$ $\phi = electric \ potential$	Electric field : $\mathbf{E} = -\nabla \phi$
In General	$\mathbf{Y} = -\mathbf{Z}\nabla\psi = \mathbf{Z}\mathbf{X}$	Governing Equation: $ abla \cdot \mathbf{Y} = 0$	

Multiscale Thermal Conductivity – C/Phenolic TPS Material

Three scales (woven composite/tows/voids)

Sample local flux and temperature fields in tow (normalized)

Anisotropic effective thermal conductivity as a function of tow and void representation k22 (warp) k11 (through-thickness) k33 (fill) 4x8 Tow - Refined Void 4x8 Tow - Coarse Void 4x8 Tow - Oblate Void AR6 100x100 Tow - Refined Void 100x100 Tow - Coarse Void 100x100 Tow - Oblate Void AR6 Multiscale Tow - Refined Void Multiscale Tow - Coarse Void Multiscale Tow - Oblate Void...

0 0.1 0.2 0.3 0.4 0.5 0.6 0.7 Effective Thermal Conductivity (W/mK)

Coupling NASMAT with Machine Learning Tools

- Couples Tensorflow to NASMAT
- Machine learning models developed to accurately replace physics-based models

Properties /

Performance

 $o(\sigma_x, \varepsilon_x)^{PLS}$

stress,

 $(\sigma_{\chi}, \varepsilon_{\chi})^{UTS}$

strain. ε

 Currently validating approach for large-scale problems

fast

Physics

Simulation

Neural

Network

10⁶ times faster

Rapid

Optimization

Training

Processing /

Structure

000000000

0000000000

0000000000

Framework for Multiscale Process Modeling

generator

Hierarchical process modeling approach (FEA)

- Analysis outputs at lower length scales become inputs to analysis at higher length scales
- Allows characterization of in-situ residual stresses
 - Proposed key driver of initial damage Random RVE

Highly porous phenolic matrix *Microscale Level I*

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Blended carbon/phenolic tow microstructure *Microscale Level II*

Plans to incorporate into NASMAT

*collaboration with T³-funded NRA (M. Maiaru – U. Mass. Lowell)

Micropillar Composite Testing to Validate Microscale Modeling

- Novel compression testing of micropillar composites (AFRL – M. Flores)
- Test useful for validating microscale modeling approaches
- Modeling performed with NASMAT/Abaqus
- Stiffness prediction close to experiments
- Exploring methods for comparing local DIC/ model fields
- Planning to model compressive failure

*Partnership with AFRL

9.37

10.05

10.79

Stiffness (GPA)

22

10.06

Dry Fabrics for Entry Parachute Applications

- Simulate dry fabric behavior by allowing the tow orientation in each subcell to change with applied loading
 - ϕ Crimp or tow undulation angle
 - ϑ Relative tow rotation angle
- Failure predicted for both fiber breakage and yarn pullout
 - Fiber breakage accounts for statistical variation observed experimentally
 - Yarn pullout failure criteria developed for macroscale (coupon)
 - Able to capture full field strain development

Warp-Aligned Uniaxial Tension (100 simulations)

Fabric RUC with defining angles

Modeling of Ceramic Matrix Composite (CMC) / Environmental Barrier Coating (EBC) Systems

- Coupled thermal-mechanical analysis performed using legacy tools and FEA
- Porting legacy capability over to NASMAT to analyze
- Focused on understanding driving forces
- Modeling captures temperature dependence, creep, volumetric changes
- Generating more realistic models by incorporating measured data (roughness, thickness, crack spacing)
- Developing lifing methodology for CMC/EBC systems

POCs: S. Mital/J. Stuckner

NASA GRC Database Schema for ICME

Database/Simulation Management in ICME

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POC: B. Hearley

Summary

- NASMAT is an efficient and accurate nonlinear deformation and damage framework for the design and analysis of composite materials and structures (laminated and woven)
- NASMAT is an enabling tool to realize Vision 2040
- Suitable for modeling various materials (composite, fabrics, metallics)
- Able to capture relevant mechanisms at multiple scales
- Variable fidelity models available to balance computational efficiency and accuracy
- Has multi-physics modeling capability (including sequentially coupled)
- Can be coupled to external third-party software (e.g., FEA)
- Ongoing work focused on parallelizing multiscale recursive models within NASMAT

How to Get

- NASA Software Catalog
- https://software.nasa.gov/software/LEW-20244-1
- Format: Windows/Linux standalone executable and Abaqus compiled libraries
- Prerequisites: Intel OneAPI Base and HPC toolkits, HDF5 (1.10.6)
- Contact: <u>nasmat@lists.nasa.gov</u>

Materials And Processes NASA Multiscale Analysis Tool (NASMAT) (LEW-20244-1)

Overview

The NASA Multiscale Analysis Tool (NASMAT) serves as a state-of-the-art, plug and play, software package which utilizes multiscale recursive micromechanics as a platform for massively multiscale modeling of hierarchical materials and structures subjected to thermomechanical loads on high performance computing systems.

Request Software

Software Details

Category	Materials and Processes
Reference Number	LEW-20244-1
Release Type	U.S. and Foreign Release
Operating System	Windows, Linux

Contact Us About This Technology

Glenn Research Center grc-sra-team@mail.nasa.gov

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- NASA GRC co-workers (P. Gustafson, B. Hearley, I. Kaleel, S. Mital, P. Murthy, P. Naghipour, J. Stuckner)
- NASMAT primarily developed with support from the NASA ARMD Transformational Tools & Technologies Project
- Support also obtained from multiple other sources:
 - NASA STMD Composite Technologies for Exploration
 - NASA STMD Entry Systems Modeling
 - NASA STMD Thermoplastics Development for Exploration Activities
 - Office of Naval Research
- Special thanks to collaborators:
 - NASA Langley Research Center, Ames Research Center
 - NASA OSTEM and NASA Postdoctoral Program
 - Air Force Research Laboratory
 - Many university partners (especially interns and fellows)

Thanks for Your Attention

Questions

Contact: Trenton.M.Ricks@nasa.gov

2040 Ecosystem Revolutionizes Design Paradigm

The cyber-physical-social ecosystem that marries "the design of materials" (material scientist viewpoint) with "the design with materials" (structural analyst viewpoint) approaches into one concurrent transformational digital paradigm.

Today' s Design Paradigm	2040 Design Paradigm
Design Of Materials And Systems Is	Design Of Materials And Systems Is
Disconnected	Integrated
Stages Of The Product Development	Stages Of The Product Development
Lifecycle Are <i>Segmented</i>	Lifecycle Are <i>Seamlessly Joined</i>
Tools, Ontologies, And Methodologies Are	Tools, Ontologies, And Methodologies Are
<i>Domain-specific</i>	Usable Across The Community
Materials Properties Are Based On	Materials Properties Are Virtually
<i>Empiricism</i>	Determined
Product Certification Relies Heavily On	Product Certification Relies Heavily On
<i>Physical Testing</i> .	Simulation

Virtual Testing Can Enable Significant Cost Savings in Certification Process

NASMAT Input File

- Input file is an ASCII text file use any text editor
- Keywords and Specifiers described in user manual (distributed with code)
- Pre/Post-processor under development to aid users

Fidelity vs. Efficiency in Composite Micromechanics

Simpler Methods HFGMC **GMC** FEA Mean Field **Transverse Loading** 50% Glass/Epoxy ~11,000 GPS Elements 1024 Subcells 676 Subcells (Avg: 75 373.68 359.63 345.58 331.53 317.48 303.43 269.38 275.33 261.28 247.22 233.17 191.02 233.17 191.02 205.07 191.02 176.97 148.87 134.82 120.77 144.82 120.77 144.82 120.77 144.82 120.75 150.51 50.51 von Mises stress (J₂) 5, Pressure (Avg: 75%) 44,39 21,27 9,70 -1.86 -33,43 -24,99 -36,12 -59,68 -71,25 -82,81 -105,94 -117,57 -117,57 -117,57 -117,57 -117,57 -116,462 -152,20 -158,462 -221,58 -223,15 -223,15 Pressure $(= -\sigma_{mean})$ (MPa)

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Individual Stress Components

Axial stress (MPa)

Transverse stress in loading direction (MPa)

Transverse stress (MPa) normal to loading direction

Transverse shear stress (MPa)

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Application to Random Microstructures

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0

Local Heat Flux Fields

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Above "percolation threshold"

NASA

Multiscale Process Modeling of Thermoplastics

Discrete Long Fiber Composite

—HFGMC —CUF

--Fiber End

0.007

- Semi-crystalline thermoplastic involves 4 separate scales
 - Nano -> micro
- Can <u>predict</u> stiffness, CTE, thermal conductivity as <u>function of crystallinity</u>
 - <u>Purely computational</u> prediction
 - MD at lowest scale, integrated micromechanics at other scales
- Repeating unit cell (RUC) model of discrete long fiber composites
- <u>Can capture</u> complex local stress state due to shear lag effect
 - Critical for nonlinear predictions
- Next phase will link thermoplastic and discrete fiber models together

Multiscale HPC Performance, NASMAT with Abaqus

• Profiling of 4 mesh densities, each element int. pt. calling micro model (5 microscale refinements)

