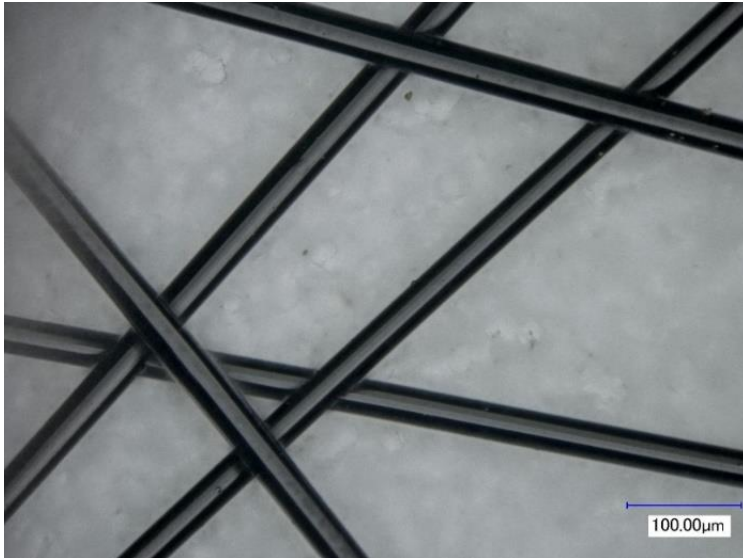


# Integrated Computational Materials Engineering (ICME) Predictive Tools for Low-Cost Carbon Fiber



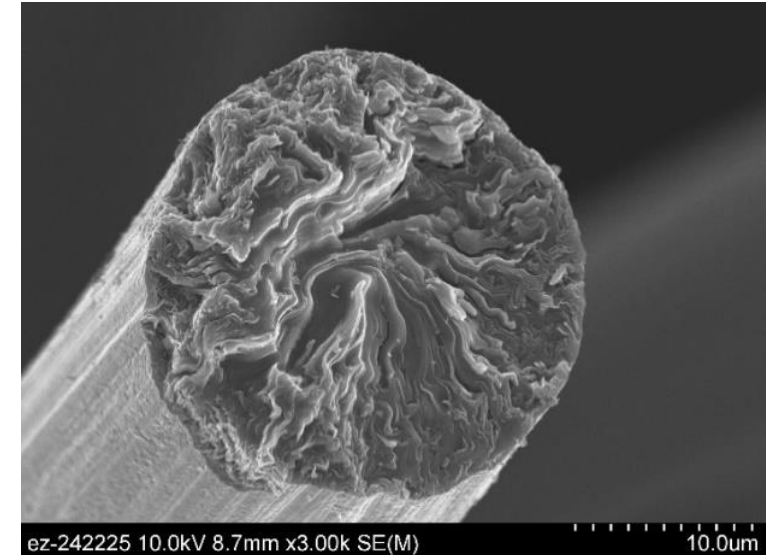
**Western Research**  
INSTITUTE

## Consortium Team:

Jeramie J. Adams (PI) (WRI),  
Jeff Grossman/Nicola Ferralis (MIT),  
Amit Naskar/Logan Kearney (ORNL),  
Amit Goyal (SRI), Chris Boyer (ACP),  
Stacey McKinney/Brett Johnston (Koppers),  
Charlie Atkins (RAMACO),  
Ray Fertig/Carl Frick (UW)

Project ID #: MAT125

June 3, 2020



## Overview

### Timeline:

Start: October 2017 (3 month no-cost extension in 2018 putting BP1 end December 2019)

End: June 2021 (6 month no-cost extension in 2019 putting BP2 end June 2020)

Completion: 65%

### Budget:

Total: \$5,242,820

DOE Share: \$3,745,413

Cost Share Total: \$1,497,407 (28.6%)

FY 2018 DOE Share: \$1,371,684 / FY 2018 Cost Share: \$792,199

FY 2019 DOE Share: \$821,245 / FY 2019 Cost Share: \$353,384

### Barriers (US Drive Material Technology Roadmap for CF Composites)

- Low-cost high-volume manufacturing of CF of appropriate mechanical properties for vehicles
- Low-cost CF starting materials to make larger utilization of CF in more vehicle components
- Predictive modeling from the molecules of starting materials to CF properties

### Partners with WRI

Oakridge National Laboratories (ORNL)

Massachusetts Institute of Technology (MIT), Jeff Grossman Group

Southern Research Institute (SRI)

Advanced Carbon Products, LLC (ACP)/ Koppers

University of Wyoming (UW)

Ramaco Carbon, LLC (RAMACO)

Solvay Composites - Industry Advisor

## Relevance & Objectives

### Overall Objectives

- Develop an integrated computational materials engineering (ICME) suite** capable of predicting select mechanical properties of carbon fiber (CF) tow all the way down to the feedstock molecules
- Provide a map of common high-volume low-cost major feedstocks** from petroleum, coal and biomass relative to CF production and end CF mechanical properties

### Technical Targets

- ICME:  $\geq 15\%$  of predicted properties**
- Mechanical properties of CF resin: strength (250 Ksi), modulus (25 Msi), strain (1%)**
- Cost:  $\leq \$5$  lb**

### Impact

- Reduction in vehicle mass**
  - Less fuel/energy consumption, and less wear on transportation infrastructure (roads, bridges, parking lots, tollways, etc.) and load bearing vehicle components
- Accelerate sustainable implementation of affordable light weight CF in vehicle use**
  - Achieving the above mentioned objectives, while also providing long term sustainability by providing a portfolio of different materials capable of achieving the same desired properties that mitigates the risks and market fluctuations associated from becoming exclusively dependent on any one high-volume source of feedstock, while being flexible for the future

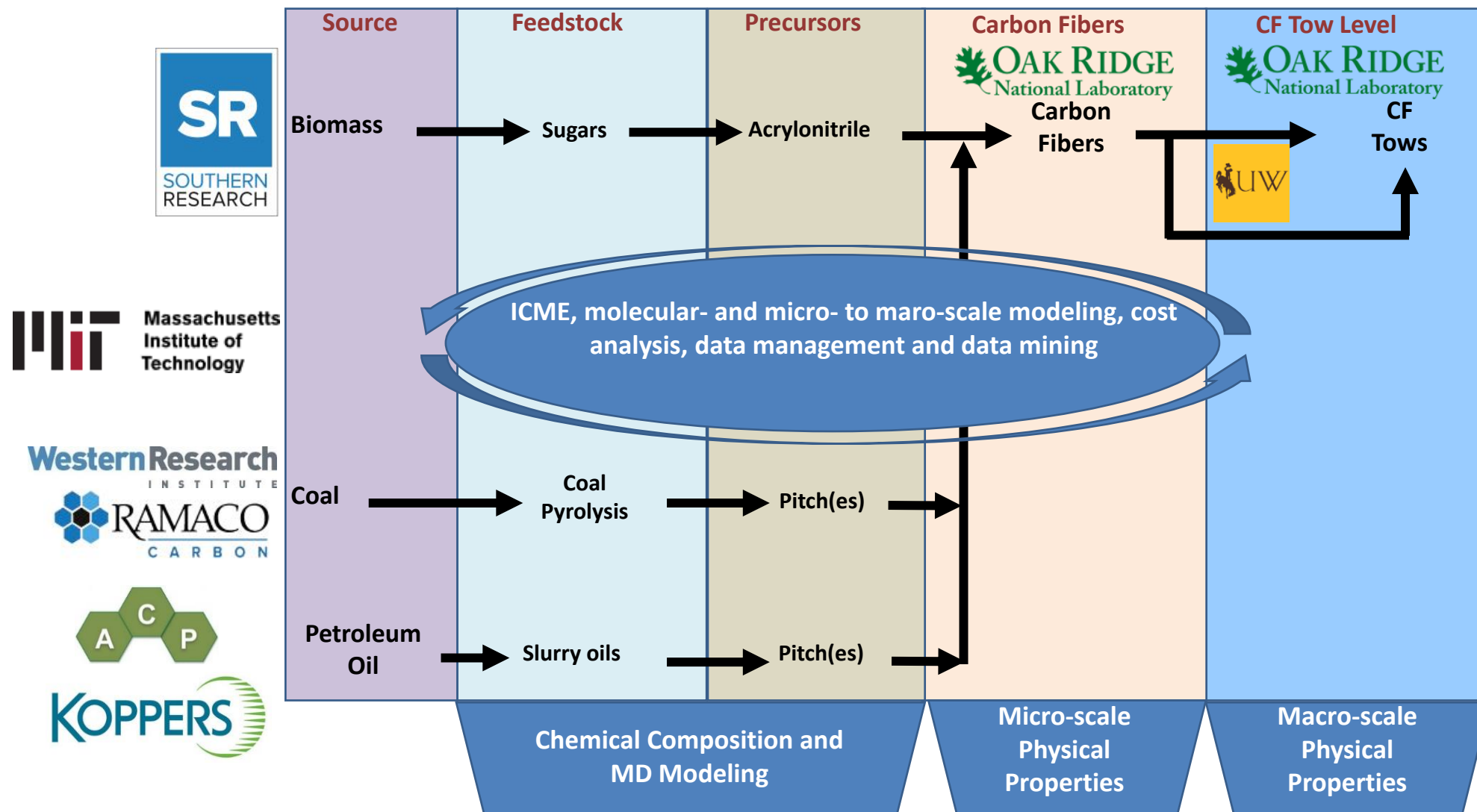
# Milestones

Budget Period, FY	Milestones (M) and Go/No-Go (GNG) Decisions	Status (Date)
1, 18	M: Major subcontracts executed	Complete (April 18)
1, 18	M: Raw Material feedstock verified as acceptable to process into CF	Completed (Jan 18)
1, 18	M: Precursor verified as acceptable to make CF	Completed (Nov 18)
1, 18	GNG: CF strength and cost goals achieved	Completed (Dec 18)
2, 19	M: Verify Macro-level finite element models, tow uniaxial creep and mechanical properties, +/- 15%	On Target
2, 19	M: Micro-level models validated, +/- 15%	On Target
2, 19	M: Establish CF tow strength-weight ratio, 30-15% less than steel	On Target
2, 19	M: Rank precursors and CF vs. DOE goals using machine learning	On Target
2, 19	GNG: Scaled up precursors produce CF with strength and cost goals	On Target

**FY 2020 Milestones:** macro-scale modeling  $\pm$  5%, micro-scale modeling  $\pm$  5%, CF tow strength to weight ratio is 30 to 50% steel, use machine learning to identify and rank precursor materials and combinations for CF

**Go/No Go:** Meets DOE strength and < \$5/lb for scaled up batches of precursor material

## Approach



## Accomplishments for FY 2019

### Bio-acrylonitrile (bio-ACN) – Southern Research

#### Feedstock

(Sugars)

Wheat Straw  
Corn Stove Biomass  
Sugar Cane Bagasse  
Sorghum Straw  
Hybrid Poplar

#### Impurities (Organic/Inorganic)

(Range of each impurity was mapped)

Organic: furfural, acetic acid, formic acid, acetate,  
phenolics, aliiphatic acids, aromatic acids,  
hydroxymethylfuran

Inorganic:  $\text{SiO}_2$ ,  $\text{Al}_2\text{O}_3$ ,  $\text{TiO}_2$ ,  $\text{Fe}_2\text{O}_3$ ,  $\text{CaO}$ ,  $\text{MgO}$ ,  $\text{Na}_2\text{O}$ ,  $\text{K}_2\text{O}$ ,  
 $\text{P}_2\text{O}_5$ ,  $\text{Cl}$

#### Intermediate

bio-ACN,  $\geq 99.2\%$

#### Impurities

Water and Acetonitrile

#### CF Production (ORNL)

Bio-ACN/methyl acrylate  
153,000 Daltons  
Carbonization

#### Scaled Up CF Properties (ORNL)

CF Diameter $7.74 \pm 54.0$ ( $\mu\text{m}$ )	Strength: $328.9 \pm 54$ (ksi)
1512 filament tows	Modulus: $30 \pm 1$ (Msi)
	Strain: $1.11 \pm 0.15$ (%)

Cost: Bio-ACN price driven by sugar price can range from \$0.59 – \$0.93/lb

## Accomplishments for FY 2019

### Coal Tar Pitch (CTP-Koppers) – Western Research Institute

#### Feedstock

CTP:  
High temperature from  
metallurgical coal

#### Impurities (Physical/Chemical)

Physical: primary quinoline-insolubles (coal/coke) 3 – 17 wt%, > 0.22 microns

Chemical: heteroatoms of O (0.9-1.5 %), N (0.9-1.0 %) and S (0.4-1.0 %)

#### Intermediate

Mesophase Pitch:  
1L, 400 °C with flow  
inert gas, variable times

#### Properties

Mesophase content: 60-95%  
Softening point: 310-330 °C  
Carbon residue: 80-95 %  
H/C: 0.46-0.49

#### CF Production (ORNL)

75-85% Mesophase  
20 °C Softening Pont  
Carbonization

#### Single Shot CF Mechanical Properties (ORNL)

CF Diameter 17 (µm)	Strength: 333 (ksi)
Single filament (scaled up MP)	Modulus: 40 (Msi)
	Strain: 0.95 (%)

Cost: CTP ≈ \$0.25-\$0.4/lb; filtration, mesophase, side products ≈ \$1.5/lb, CF production cost ≈ \$3.6/lb, economics are improved from the recycle or selling of mesophase effluent.



## Accomplishments for FY 2019

### Petroleum Pitch (PP) – Koppers

#### Feedstock

PP:  
Produced from FCC  
Decant Oil

#### Impurities (Physical/Chemical)

Physical: quinoline-insolubles (catalyst fines) >0.05 wt%, > 0.22 microns

Chemical: heteroatoms of O (0.61 %), N (0.19 %) and S (0.32 %)

#### Intermediate

Mesophase Pitch:  
Koppers

#### Properties

Mesophase content: 65-75%

Softening point: 298 °C

Carbon residue: >77 %

Sulfur 0.24 - 0.28

#### CF (ORNL)

65-75+% Mesophase  
298 °C Softening Pont  
Carbonization

#### Single Shot CF Mechanical Properties (ORNL)

CF Diameter 21 (μm)

Strength: 263 (ksi)

Single filament (scaled up MP)

Modulus: 55 (Msi)

Strain: 0.57

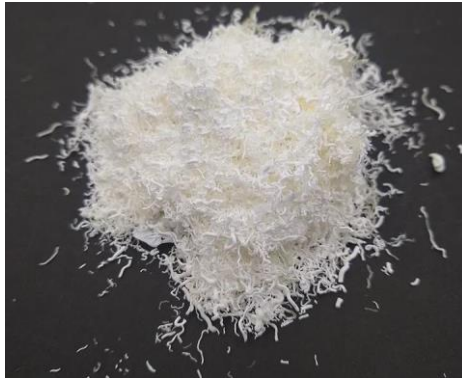
Cost: PP mesophase from FCC slurry oil using ACP isotropic and mesophase processes < \$1.5/lb, CF production cost ≈ \$3.6/lb, mesophase economics are based on petroleum refinery scale process.



## Accomplishments for FY 2019

### CF Spinning – ORNL

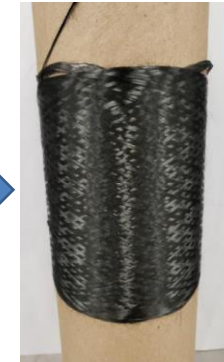
- Scaled up polymerization of bio-ACN to bio-PAN with methyl acrylate and solution spinning (1512 filament tows)
  - Stabilization, carbonization, optical microscopy and mechanical properties



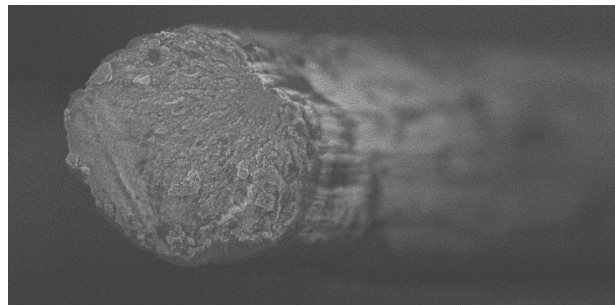
Bio-PAN



As Spun Fibers



Stabilized & Carbonized CF



SEM of Bio-PAN CF  
7-8  $\mu$  diameter  
Strength:  $328.9 \pm 54$  (ksi)  
Modulus:  $30 \pm 1$  (Msi)  
Strain:  $1.11 \pm 0.15$  (%)

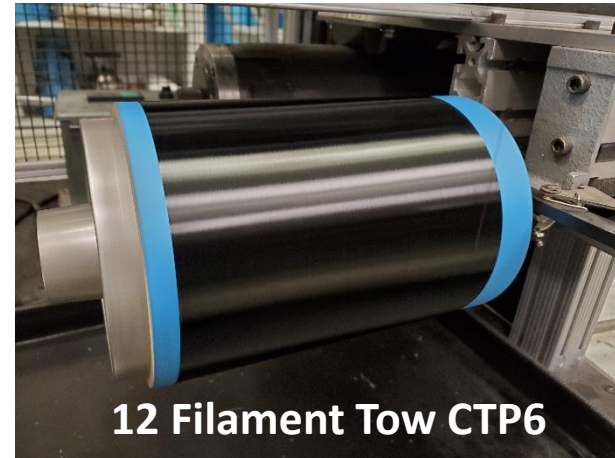
## Accomplishments for FY 2019

### CF Spinning – ORNL

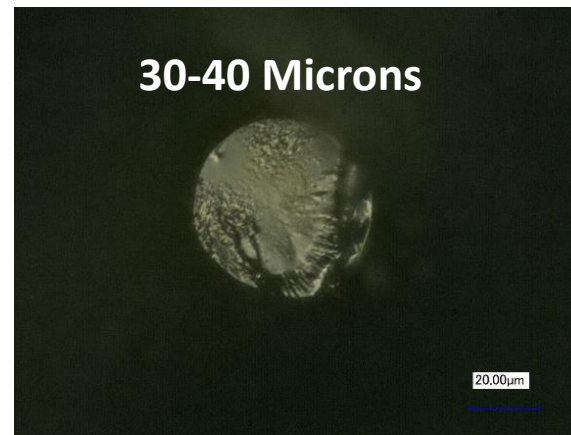
- Melt-spinning of scaled up batches of CTP and PP mesophase (validation of materials), and scaled up multi-filament melt spinning



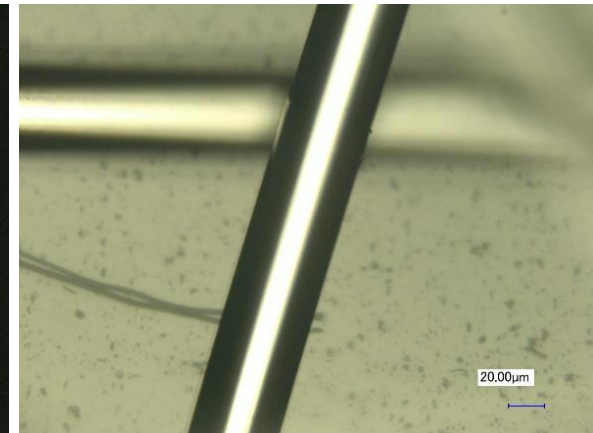
Multi-filament melt spinner



12 Filament Tow CTP6

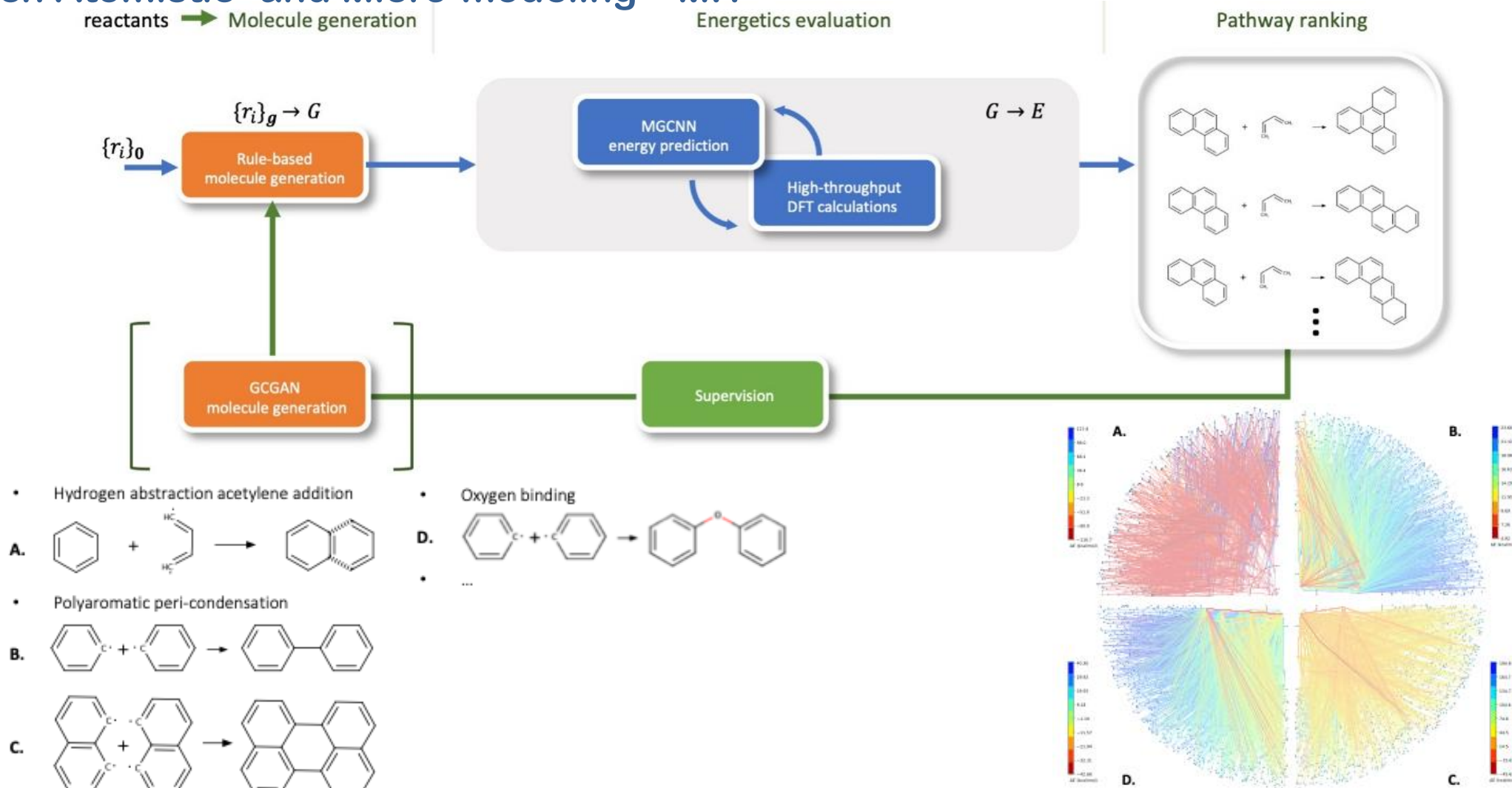


30-40 Microns



## Accomplishments for FY 2019

### Pitch Atomistic- and Micro-modeling – MIT



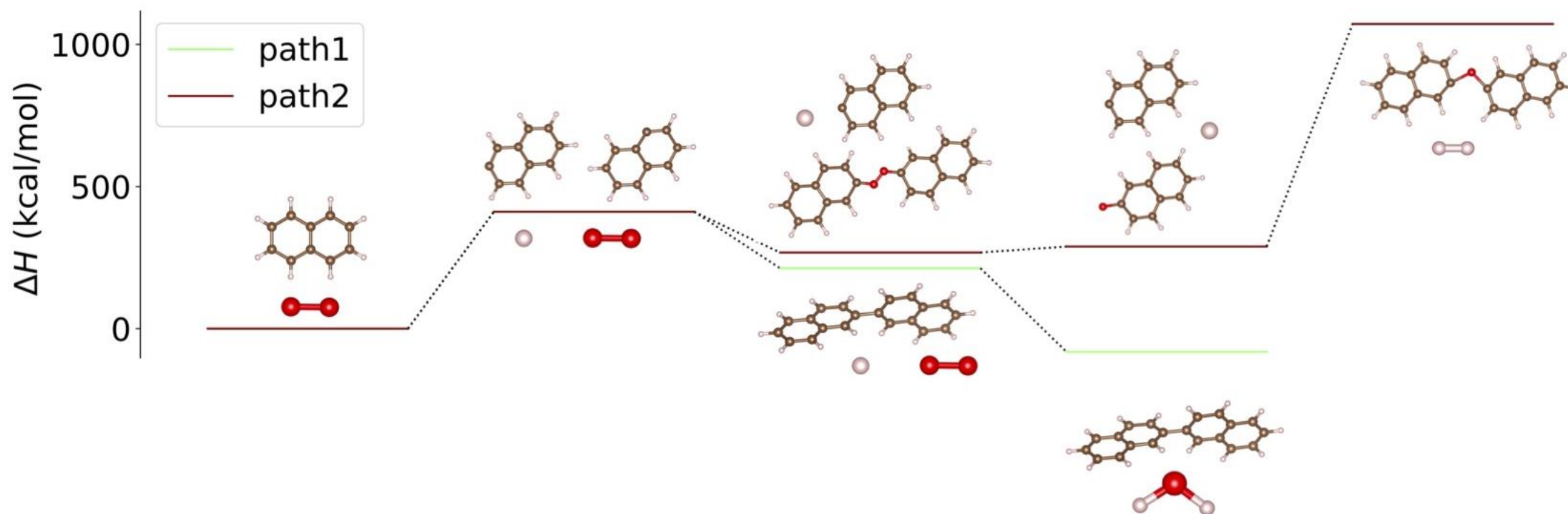


## Accomplishments for FY 2019

### Pitch Atomistic- and Micro-modeling – MIT

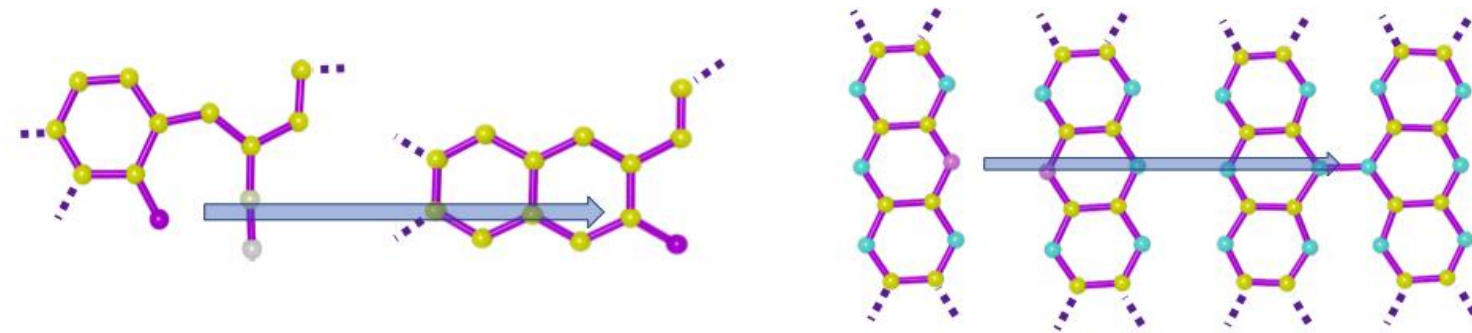
**Stabilization (Oxidation):** PP oxidizes to significantly take up more oxygen than CTP at the same temperature.

- Investigating effect of alkyl substituent on PP vs. CTP
- Investigating differences in solid and volatile products for PP vs. CTP

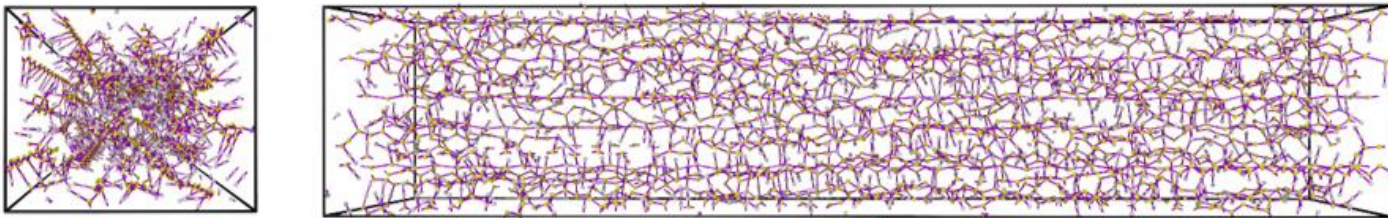


## Accomplishments for FY 2019

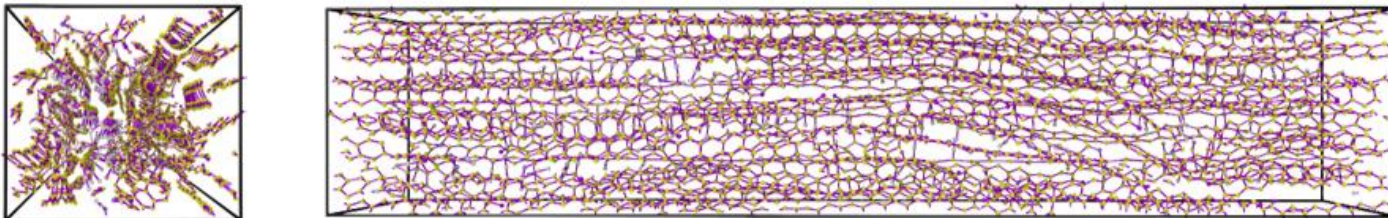
### PAN Atomistic- and Micro-modeling – MIT Coarse-grained Molecular Dynamics (CGMD)



(a)



(b)



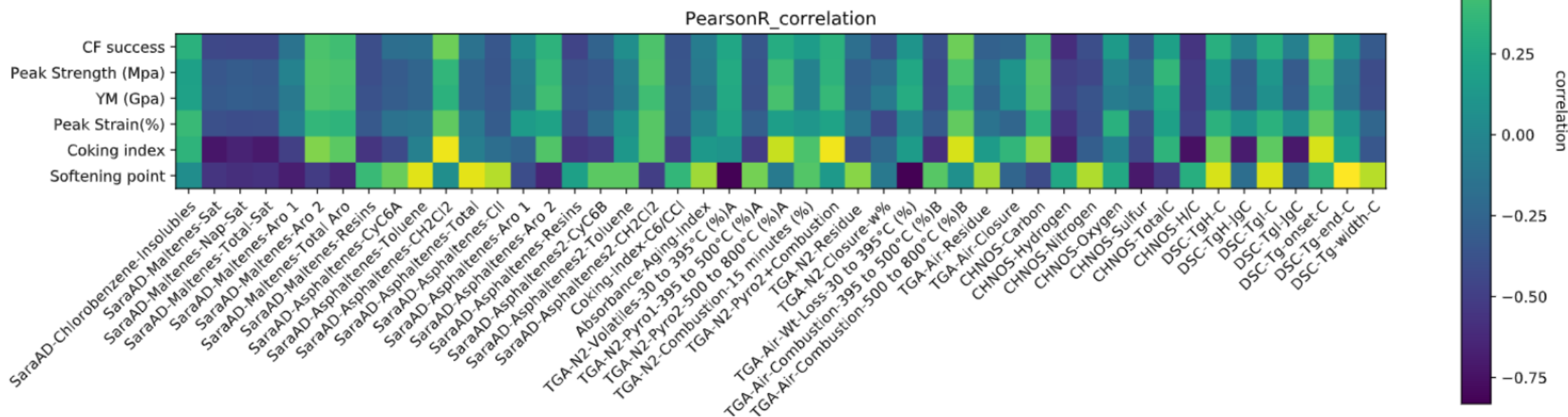
CGMD	Young's modulus
Predicted	221 GPa
Experimental	231 GPa (Solvay Thorne T-300)

More ordered  
PAN ladder  
structure

## Accomplishments for FY 2019

### Modeling– Machine Learning (WRI/MIT)

Heat Map to Down-Select Most Important Characterization Parameters to Reduce Overfitting



### Machine Learning

**Physical Input:** Softening Point, Optical Microscopy, Differential Scanning Calorimetry, Thermogravimetric Analysis, Insolubles

**Chemical Input:** SAR-AD™, LDI-MS, FTIR, Fluorescence Spectroscopy, Elemental Composition

**Correlation Output:** FTIR, TGA (coking value/carbon residue), Fluorescence, Softening Point



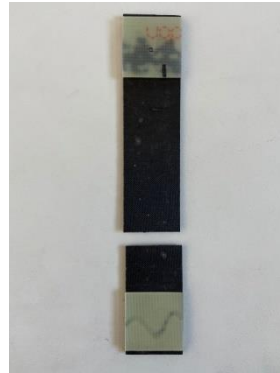
## Accomplishments for FY 2019

### CF Resin Composites and Macro-Modeling – University of Wyoming

**Tensile Testing**



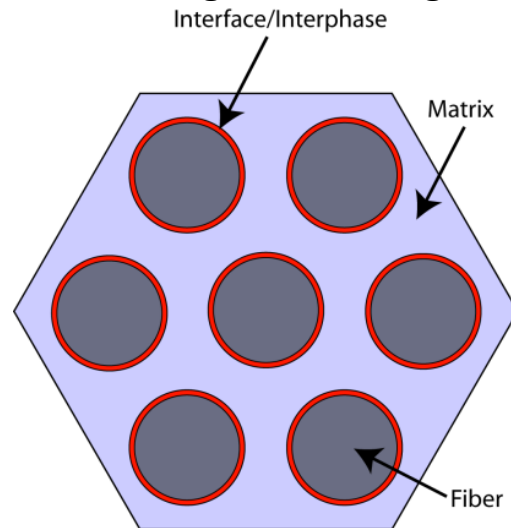
**90 ° Tensile**



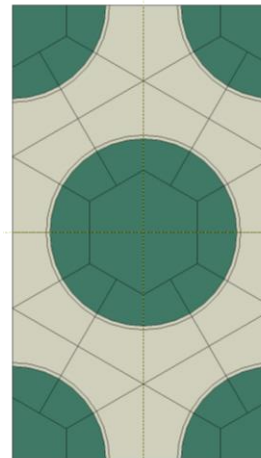
**45 ° Tensile**



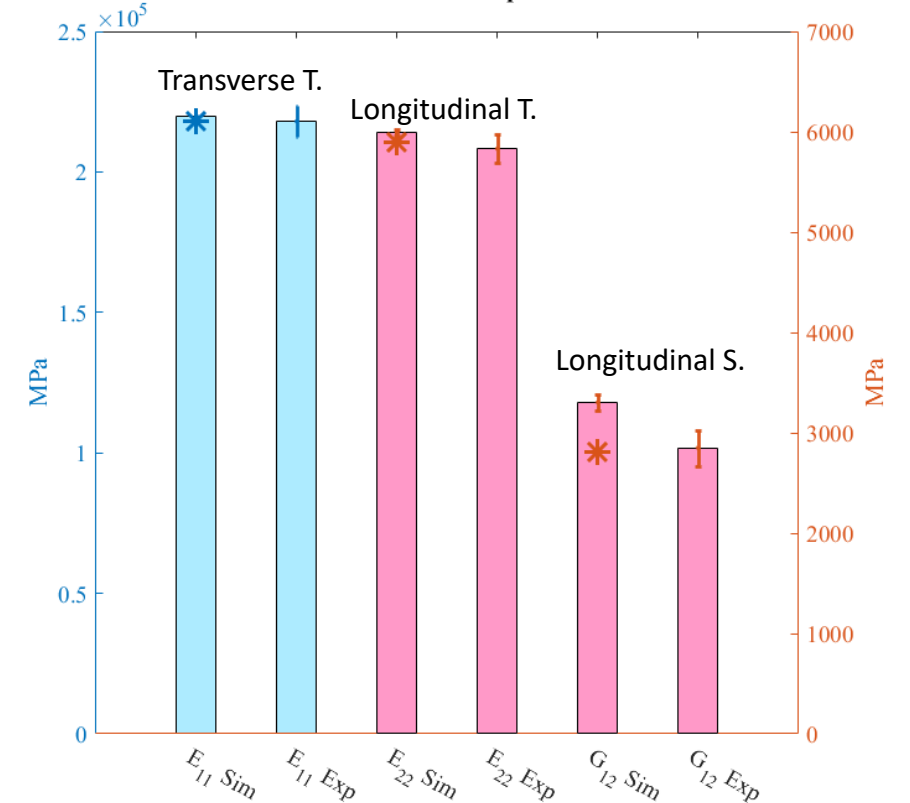
**Hexagonal Packing**



**Representative Volume Element**



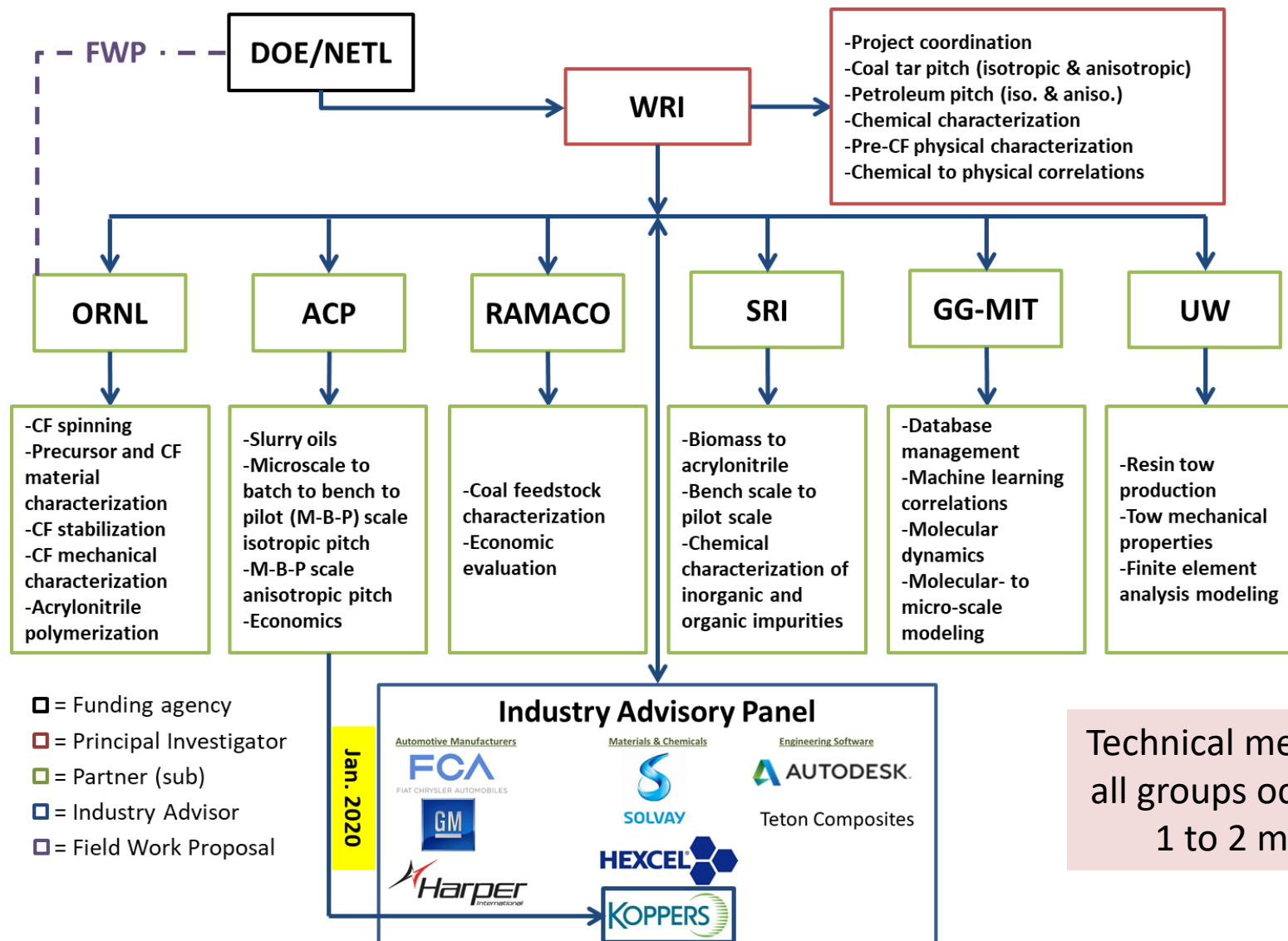
**Thornell P-55 Carbon Fiber Composite - Elastic Moduli**



Models are within  $\pm 15\%$



## Partnerships / Collaborations



Technical meetings for all groups occur every 1 to 2 months

## Response to Previous Year Review Comments

**Reviewers:** Clarity for techno economic analysis (TEA) details

**Response:** Sujit Das (Techno economic Analysis of Coal Pitch Carbon Fiber Manufacturing, Carbon 2019, Lexington, KT. July 14-19 2019.) Shows that when considering all the production costs the cost for producing CTP by melt spinning the total cost of production is estimated to be \$0.74/lb for labor, \$2.54/lb for capital, \$0.5/lb for energy and \$1.94/lb for mesophase pitch (TOTAL = \$5.72). However, this considered graphitized fibers (\$0.34/lb) but graphitization is not necessary to produce CF necessary for the current requirements. Also, ACP models show that working at larger scale the production of mesophase pitch can be brought down to a sellable cost of \$1.50/lb. Scale up and not applying graphitization this saves \$0.78/lb bringing the overall cost down to \$4.94/lb.

Independent analysis by RAMACO put PP and CTP at about the same cost of \$3.56/lb and bio-PAN at \$6.56. Production costs for PAN based CF is fundamentally different because of the solution spinning process and strict stabilization and carbonization requirements. We are continuing to work with ORNL to refine these values.

**Reviewers:** Impurities and their relationship to product variability and elongation

**Response:** Elongation values slightly < 1% for bio-PAN generated in BP1 may have been partially due to impurities from acetonitrile and water. Each sample of bio-ACN was checked by GCMS to quantify known impurities. A more likely explanation is due to the formulation of the polymer with comonomer. Scaled up batches of bio-PAN for BP2 showed significantly better elongation > 1%.

Regarding, CPT and PP CF, significant characterization of the isotropic pitch and mesophase pitch samples were obtained in BP1, additional characterization of scaled up batches is occurring in BP2. BP1 CF were obtained using a single-shot melt spinner which was prone to higher variability/noise due to a lack of thermal control after the samples left the spinneret. BP2 CF are produced using multi-filament spinner with significantly better thermal controls. This should help determine variability/noise and better links to the effect of impurities. For BP1 SEM analysis were performed on several broken and failed CF samples which showed most of the defects were due to CF spinning and processing.

## **Proposed Future Research\***

### **Feedstock/Intermediate FY20**

#### **Coal Tar Pitch**

- Continue scale up of mesophase CTP for CF multi-filament production
- Continue physical and chemical characterization of intermediates/precursors/mesophase from the scaled up products and compare to BP1 materials

#### **Slurry Oil Pitch**

- CF multi-filament production
- Continue physical and chemical characterization of intermediates/precursors/mesophase

#### **Bio-acrylonitrile**

- Understand variability in bio-ACN product during production in the SR pilot plant

\*Any proposed future work is subject to change base on funding levels

## Proposed Future Research\*

### CF, Modeling and Database, Resins, Economics FY20

#### CF Production and Characterization

- Produce PP and CTP multi-filament CF with  $< 20 \mu\text{m}$  diameters
- Scaled up multi-filament CF production, morphological characterization and mechanical testing of fibers from various precursor materials
- Stabilization and carbonization of multi-filament spun fibers to CF

#### Modeling and Database

- Continue modeling oxidative stabilization move towards graphitic domains
- Integration of: molecules  $\rightarrow$  mesogens  $\rightarrow$  stabilization  $\rightarrow$  graphitic domains  $\rightarrow$  CF
- Verify model simulation properties to actual produced material properties
- Continue to add data to the database and apply and optimize machine learning

#### Resin CF Tow Fabrication and Marco-scale Modeling

- Resin CF tow-level testing from scaled up multi-filament PP, CTP and bio-ACN CF
- Application of finite element modeling to multi-filament samples
- Feedback to atomistic models and for ML for integration

#### Economic Evaluation

- Economic evaluation of feedstock/intermediate/precursor materials

\*Any proposed future work is subject to change base on funding levels

## Summary

### Relevance

- Develop ICME tools to predict CF physical properties from the molecular level up through micro-scale CF and macro-scale CF tow resin composites
- Develop a catalogue of materials that can achieve light-weight high-volume CF for use in vehicles at < \$5/lb with the following requirements: strength (250 Ksi), modulus (25 Msi) and strain (1%)

### Approach

- Assemble a consortium to look at various materials appropriate for CF production from biomass, petroleum and coal
- Characterize the chemical and physical properties of these materials at different production stages
- Correlate properties with the resulting CF properties

### Accomplishments

- Chemical and physical characterization of feedstocks/intermediates/precursors/mesophase/CF
- Production of scaled up multi-filament CF from bio-ACN and mesophase CTP
- Production of scaled up bio-PAN CF that met DOE requirements
- Developed models to go from the molecules to CF properties and machine learning (ML) models

### Future Research

- Multi-filament production of PP mesophase CF, and multi-filament CTP mesophase refinement
- Further chemical and physical characterization of BP2 materials for modeling and ML
- Optimize atomistic- and micro-models regarding stabilization and carbonization
- Continue to gather tow-level mechanical properties and apply finite element analysis modeling
- Integration of modeling from the atomistic level → tow-level finite element analysis → ML

