

ChemCatBio DataHub WBS: 2.6.2.500

U.S. Department of Energy (DOE) Bioenergy Technologies Office (BETO)

2019 Project Peer Review

Carrie Farberow March 4th, 2019



ChemCatBio Foundation

Integrated and collaborative portfolio of catalytic technologies

and enabling capabilities

Catalytic Technologies

Catalytic Upgrading of Biochemical Intermediates (NREL, PNNL, ORNL, LANL, NREL*)

Catalytic Upgrading of Indirect Liquefaction Intermediates (NREL, PNNL, ORNL)

> Catalytic Fast Pyrolysis (NREL, PNNL)

Electrocatalytic and Thermocatalytic CO₂ Utilization (NREL, ORNL*)

*FY19 Seed Project

Enabling Capabilities Advanced Catalyst Synthesis and Characterization

(NREL, ANL, ORNL, SNL)

Catalyst Cost Model Development (NREL, PNNL)

Consortium for Computational Physics and Chemistry (ORNL, NREL, PNNL, ANL, NETL)

Catalyst Deactivation Mitigation for Biomass Conversion (PNNL)

Cross-Cutting Support

ChemCatBio Lead Team Support (NREL)

ChemCatBio DataHUB (NREL)

Industry Partnerships (Directed Funding)

Gevo (NREL)

ALD Nano/JM (NREL)

Vertimass (ORNL)

Opus12(NREL)

Visolis (PNNL)

Lanzatech (PNNL) - Fuel

Gevo (LANL)

Lanzatech (PNNL) - TPA

Sironix (LANL)

ChemCatBio

Goal

Enable **ChemCatBio** and the **bioenergy industry** to **accelerate** the **catalyst** and **process development** cycle by establishing the DataHub for:

- 1. Centralized and secure data storage, sharing, and analysis
- 2. Development and application of publicly available advanced analytics tools that provide **predictive capabilities** for catalyst R&D

Outcomes

- Data repository for easy and fast storage and sharing of data amongst project teams and, as desired, with the public for knowledge dissemination
- Customized plug-ins and data analysis tools to increase research efficiency
- Integrated catalyst design engine that accelerates the catalyst development process by optimizing for predicted performance and material cost

Relevance to Bioenergy Industry

 Pathway-independent tools developed reduce the time and cost to develop active, selective, low-cost and durable real-world catalysts to produce desired end-products from biomass and waste resources

Quad Chart Overview

Timeline

- Project start date: 10/1/2017
- Project end date: 9/30/2020
- Percent complete: 50%

| | Total Costs Pre FY17** | FY 17 Costs | FY 18 Costs | Total Planned Funding (FY 19-Project End Date) |
|---------------|---------------------------------|----------------|----------------|---|
| DOE Funded | \$0 | \$0 | \$200k | \$400k |

Barriers addressed

- Ct-F Increasing the yield from catalytic processes
- Ct-G Decreasing the time and cost to develop novel industrially relevant catalysts

Objective

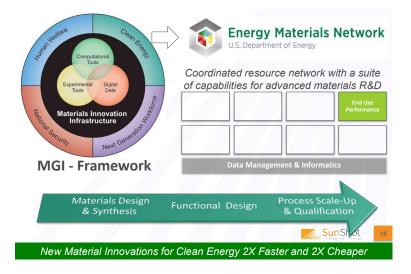
Develop and provide access to accelerated data storage, sharing, and advanced analytics tools to reduce the time and cost to develop catalysts for the production of desired end-products from biomass and waste resources.

End of Project Goal

Produce a data repository alongside customized plugins and data tools that are accessible to all ChemCatBio project teams and industry partners, including completion of the infrastructure of an integrated catalyst design engine that simultaneously considers predicted performance and catalyst material cost to accelerate the catalyst design cycle.

Overview: The ChemCatBio DataHub

In support of the Materials Genome Initiative, each DOE EMN consortium is tasked with providing an accessible, searchable data resource.

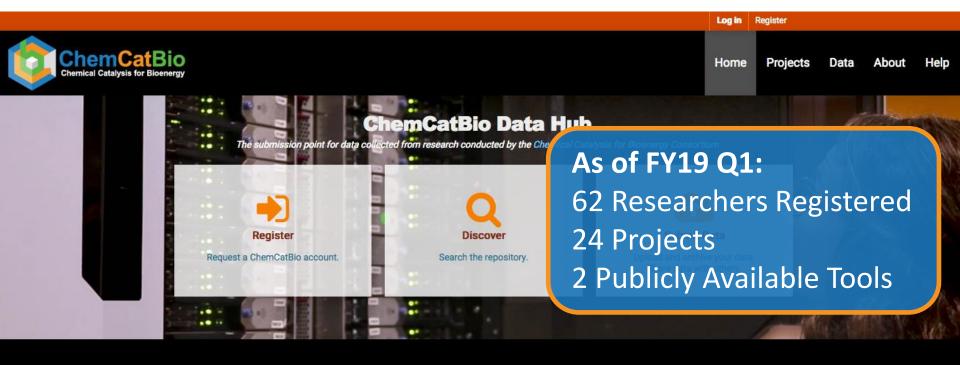


Key Project Outcomes

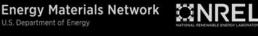
- Provides a secure project space for storing and sharing project data
 - Outcome: Faster, less burdensome cross-institution collaboration
- Enables **controlled public accessibility** of selected datasets
 - Outcome: Distribution of knowledge and reduction in research redundancy
- Facilitates development of and access to **advanced data analysis tools**
 - Outcome: Application of state-ofthe-art predictive approaches that accelerate catalyst R&D

Overview: The ChemCatBio DataHub

The ChemCatBio DataHub is publically accessible at *datahub.chemcatbio.org*















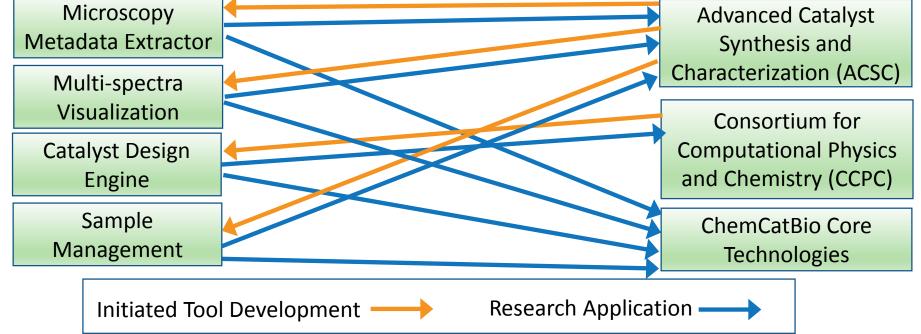
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Management Approach

Develop tools responsive to researcher needs through **researcher-centric approach**

Task 1: Build DataHub Infrastructure and Tools Build DataHub framework Develop plug-ins for storing, searching, and processing Develop advanced analytics tools Task 2: Interface with Researchers Solicit regular researcher feedback to guide tool development Ensure deliverables are responsive to researcher needs Examples of Data Tools Microscopy Advanced Catalyst



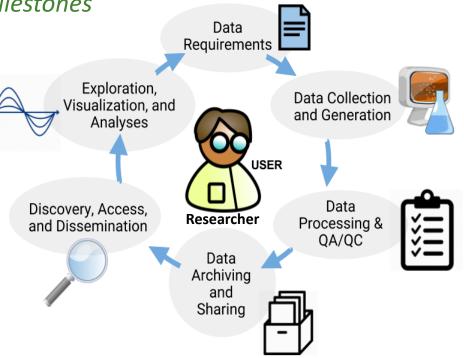
ChemCatBio

Management Approach

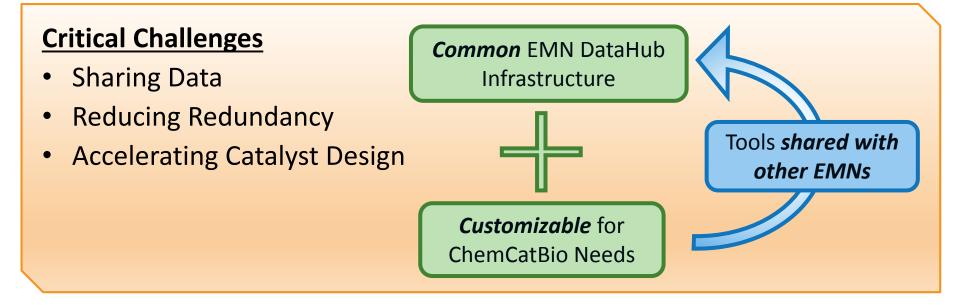
Develop tools responsive to researcher needs through researcher-centric approach

FY18 Go/No-Go: The need for additional scope in FY19 will be assessed based on feedback from the ChemCatBio technical teams and steering committee.

- Led Data needs discussion at face-to-face meeting and teleconference and solicited specific researcher input through survey
- Feedback clearly indicated that **greatest value** is in **tool development**
- Applied results to define FY19/20 milestones



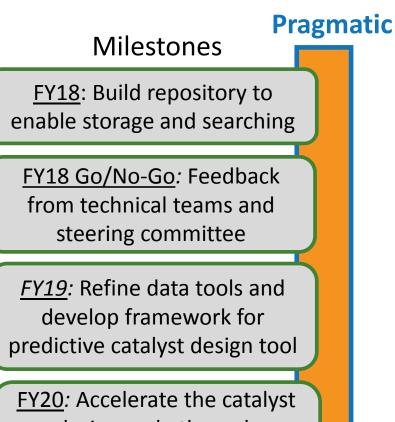
Technical Approach: Critical Challenges and Risk Mitigation



Risk Mitigation

- Utilized by researchers
 - Integrate functionalities responsive to researcher needs
- Eliminates extra burdens
 - Develop plug-ins that upload large amounts of data with minimal researcher input

Technical Approach: Milestones and Success Indicators



<u>FY20</u>: Accelerate the catalyst design cycle through demonstrated application of the advanced analytics tools

Critical Success Factors:

 Data generated by researchers and industry partners can be securely stored, easily searched, and quickly shared with team members

2. Data is **processible** into formats that provide **key actionable information**

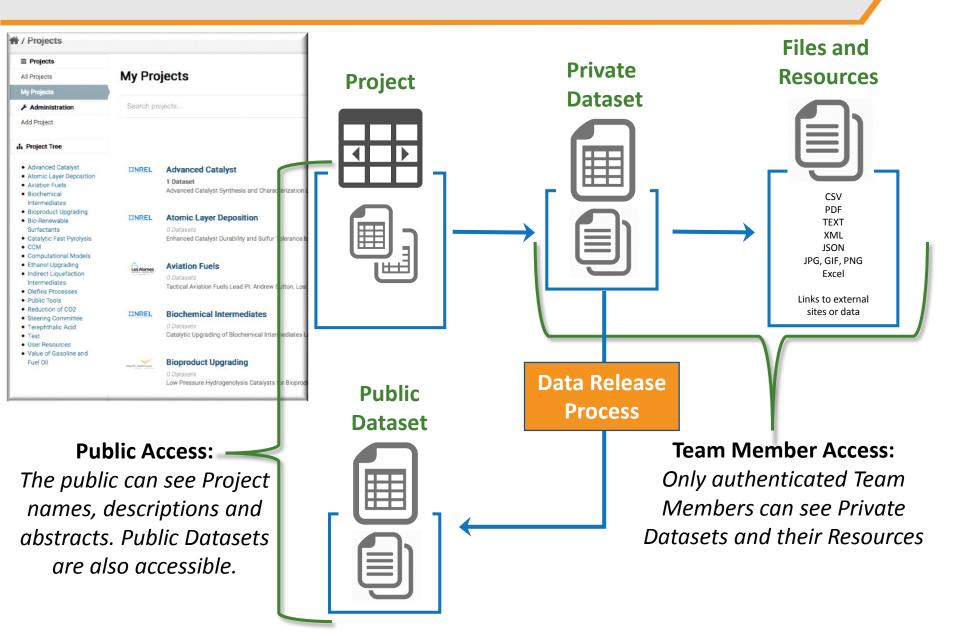
Data repository facilitates
 dissemination of ChemCatBio research
 through controlled, public access

4. Provide **predictive** capabilities that accelerate the design of high-performing catalysts

Transformational

ChemCatBio

Progress: Centralized and Secure Data Repository



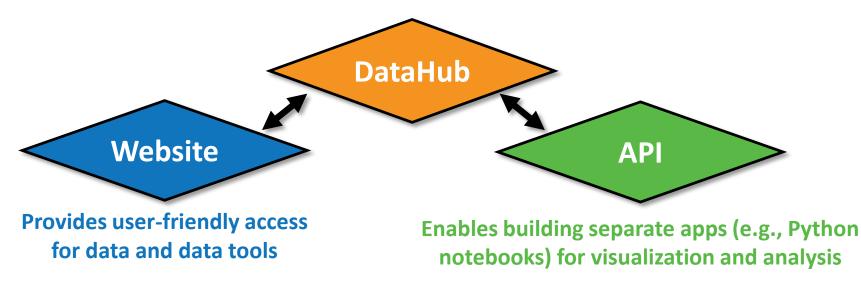
Progress: Efficient User Data Search

Users can search across all accessible data

| A / Datasets | | | | | |
|------------------------------------|--|----------|-------------------------|---------------------|-----------------------|
| ▼ Projects | | | | M | etadata |
| Test (4) | Add Dataset | | | | |
| User Resources (3) | Search datasets | | Ent | tered/extrac | cted at data upload |
| Public Tools (2) | | | | | |
| Advanced Catalyst (1) | Order by: Relevance - | | • Sei | lected based | d on researcher input |
| | | ۲ | | | |
| ▼ Tags | | | | | |
| catalyst (1) | A Resources Search Bar | | | Dataset Metadata | |
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| metal carbide (1) | Facets update for further na | rrowing | г | | |
| multiple (1) | Metal-modified metal carbides | | | DOI: | 10.17042 |
| SPE (1) | 11 Resources XRD, TEM | | | Sample Barcode: | |
| Show More Tags | TXT TIFF application/postscript DOCX | | | | |
| ▼ Institution | Pueuc CatApp Database | | | Collection Date: | 9/18/2018 |
| NREL (4) | 2 Resources | | | | |
| SNL (1) | A database of adsorption energies and activation energy barriers for various species/elementary reactions on metal surfaces | | | Data Source Type: | select an option |
| | | | | Comments: | Comments |
| ▼ Data Source Type | PRIVATE Data Tools | | | comments. | Comments |
| Advanced Catalyst C (2) | 7 Resources This dataset shows out of the box data tools as well as custom data tools the data hub is currently capable | | | | |
| Catalyst Performanc (1) | of. | | | | |
| Galdiyst Performanc (1) | | | | | |
| | PUBLIC Help and Tutorial | | | | |
| | 1 Resource The user guide details the functionality of the data hub. Contact the data dub administrator with any | | | | |
| | questions: emnadmin@nrel.gov | | | | |
| | PDF | | | | |

Progress: Easy Access and Utilization of Data

Data Access and Application:



Universal EMN Data Tool: Quick visualization, filtering, and searching

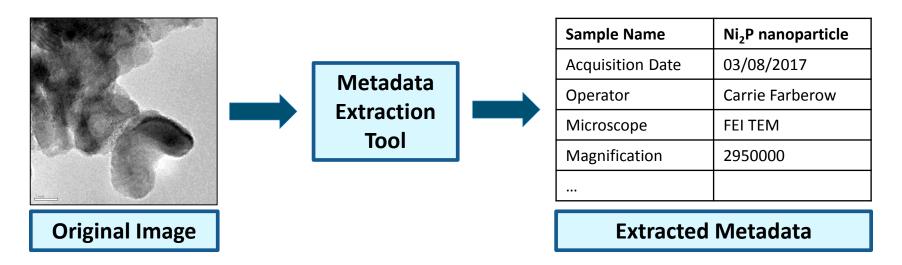
- Grid format or dynamic plotting of structured data (e.g., CSV files)

| | | | | | | | | 1750 - | | | | | Current Density(ma/cm^2) Resistance (%) | Graph Type |
|-----------|------------|----------|-----------|---------|----|---|-------------|--------|------------|------------|--------------|--------------------------|--|----------------------------|
| dd Filter | | | | | | | | 1500 | | | | | | Group Column (Axis 1) |
| _ | | | | | | | | 1250 | | | | | | Voltage(V) |
| Grid G | raph Map | 120 rec | ords « | 1 – 100 | >> | Q | Search data | | | | | | | Series A (Axis 2) [Remove] |
| | | | | | | | | 1000 | | | | | | Current Density(ma/cm^2) |
| d | Voltage(V) | Current | Resista | | | | | 750 | | | | | | Series C (Axis 2) [Remove] |
| | -0.2 | -30.7525 | 0 | | | | | | | | Л | | | Resistance (1/2) |
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Custom data tools address the unique data needs of ChemCatBio researchers

Automated Microscopy Metadata Extraction

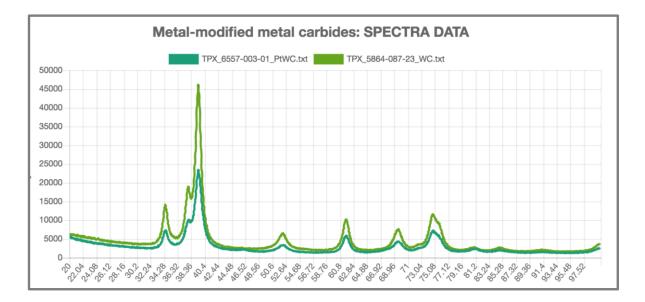
- Requested by ACSC project team
- Enables **fast, batch data upload** and automatic extraction of instrument-specific metadata
- Enables **cross-institution collaboration** through advanced searching for image identification
- Shared across all EMNs through the EMN-Data Github repository



Custom data tools address the unique data needs of ChemCatBio researchers

Multi-spectra Visualization

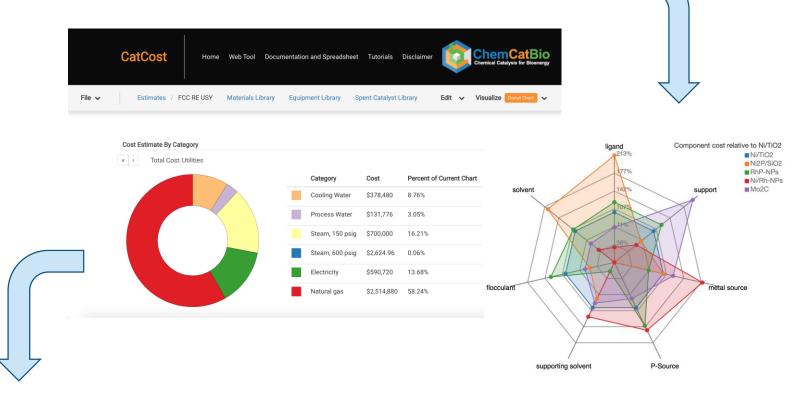
- Requested by ACSC project team
- Enables rapid comparison of data generated across institutions through quick visualization of multiple spectral data files in a single plot
- Shared across all EMNs through the EMN-Data Github repository



Progress: Facilitate Application of CatCost Tool

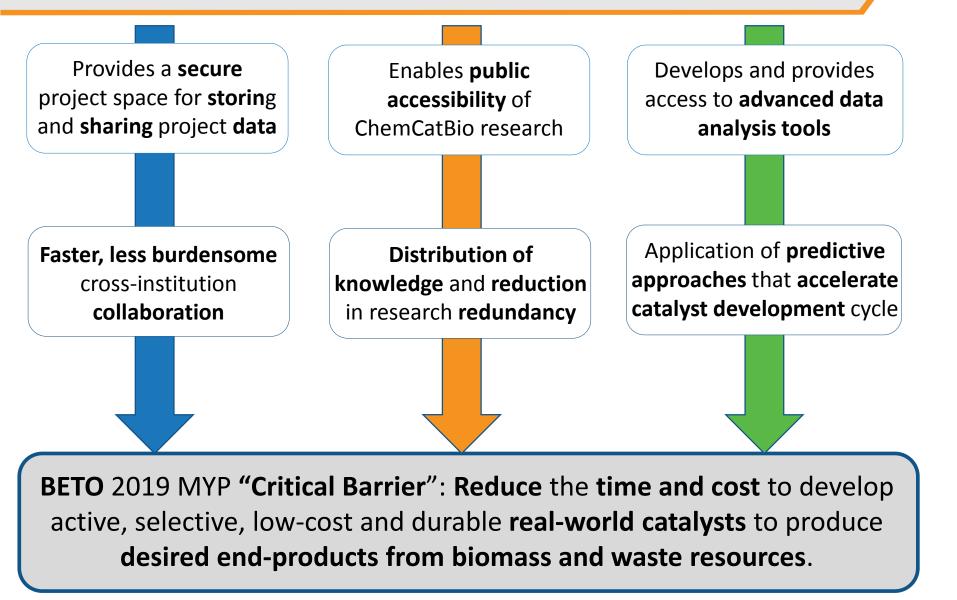
Integrated CatCost tool in DataHub for easy application in ChemCatBio research

• Import materials libraries and estimates from the DataHub



• Export model outputs to the DataHub for archive and sharing

Relevance: Faster, Less Costly Catalyst Development



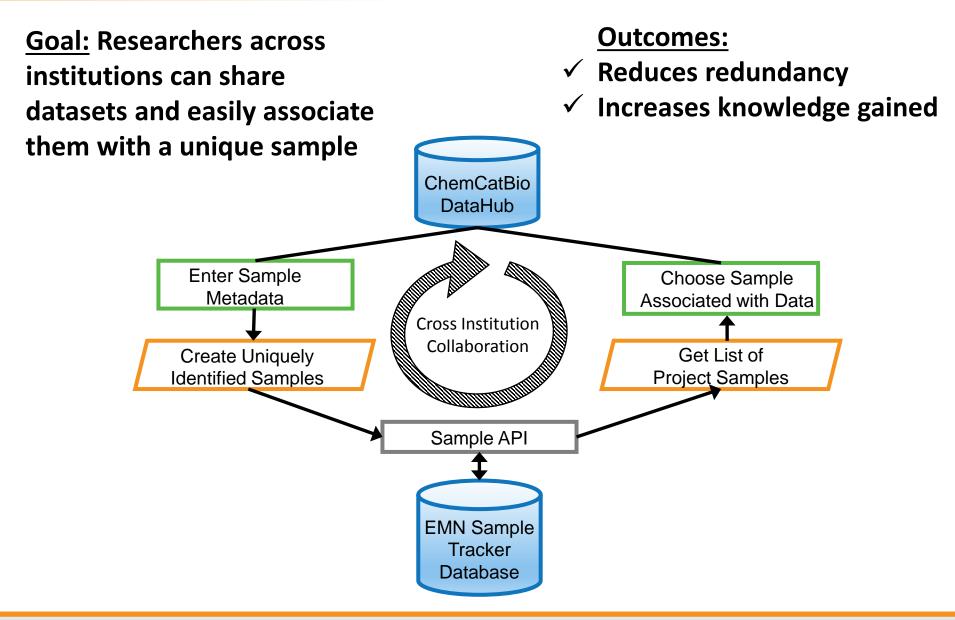
Relevance: Broadly Applicable Catalyst R&D Tools

This project develops and provides access to broadly applicable and transformative catalyst R&D tools

- Tools developed are pathway-independent and therefore widely applicable by industry for catalyst development
- **Public access** to both general and reaction-specific catalyst property data and associated analysis tools
- Centralized data storage and sharing location for ChemCatBio
 DFA projects creates immediate value to industry partners



Future Work: Sample Management



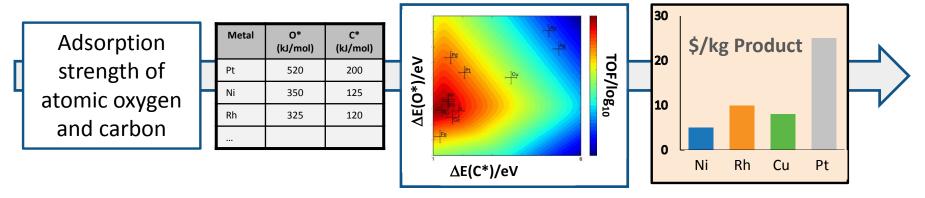
ChemCatBio

Future Work: Catalyst Design Engine

Conventional State-of-the-Art Computational Catalyst Screening Process



Example: Methane Steam Reforming

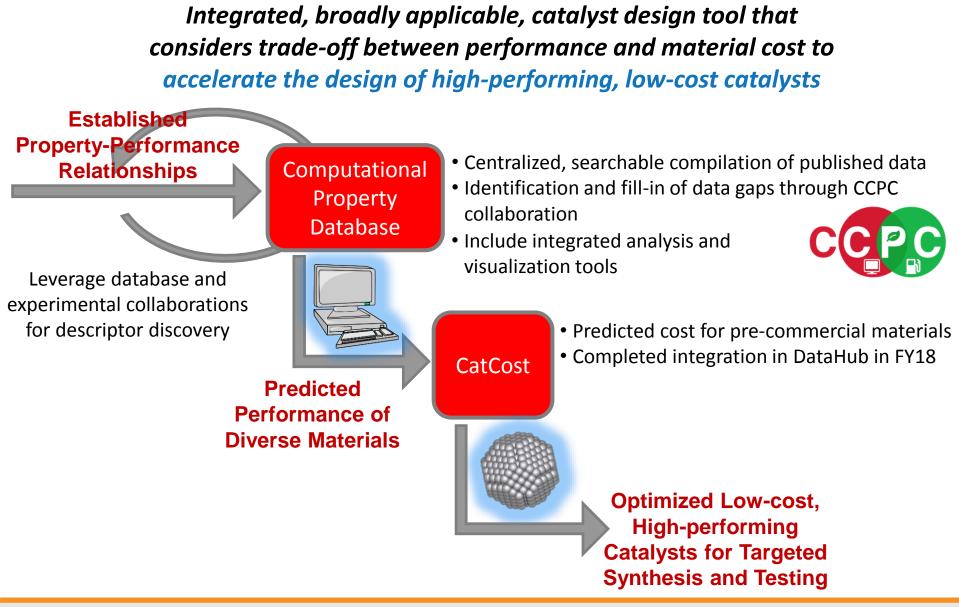


Process Deficiencies

- Redundancy in descriptor value calculations
- Candidate materials often limited to expensive noble metals
- Difficult to consider economics for pre-commercial materials
- Lack of known descriptors for many complex reaction chemistries

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Future Work: Catalyst Design Engine



Future Work: Computational Catalyst Property Database

Progress to Date:

- Determined rules for data inclusion that maximize database utility while minimizing database compilation time
- Designed user interface framework
- Created prototype filter and search functions
- Populated database with initial set of 900+ calculations from literature

Next Steps:

- Expand data an order of magnitude (FY19Q2-Q4)
- Refine user interface (FY19Q2-Q3)
- Add analysis features, including visualization and plotting (FY20)

| Comp Cat DB | ≡ | | | | | | | | | |
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| | 7 | Fm3barm | (111) | Ir | 2x2 | PW91 | ultrasoft | н | 0.25 | hcp |
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Summary

Project Goal: Reduce the time and cost for ChemCatBio and the bioenergy industry to develop real-world catalysts for the production of desired endproducts from biomass and waste resources by providing:

- 1. Secure data storage, sharing, and analysis for cross-institution collaboration and knowledge dissemination
- 2. Development and application of advanced analytics tools that provide predictive catalyst development capabilities

Approach: Researcher-centric to ensure that the tools developed are responsive to researcher needs and collaborative with other EMN data teams to eliminate redundancy

Future work defined based on researcher feedback focuses on development of transformational tools including a pathway-independent integrated catalyst design engine that considers critical trade-off between predicted performance and catalyst material cost to accelerate the design of optimized catalyst formulations for a diversity of targeted end-products.

Acknowledgements

NREL EMN Data Team

Kristin Munch Courtney Pailing Nicholas Wunder John Yarbrough David Evenson

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Thank you.





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