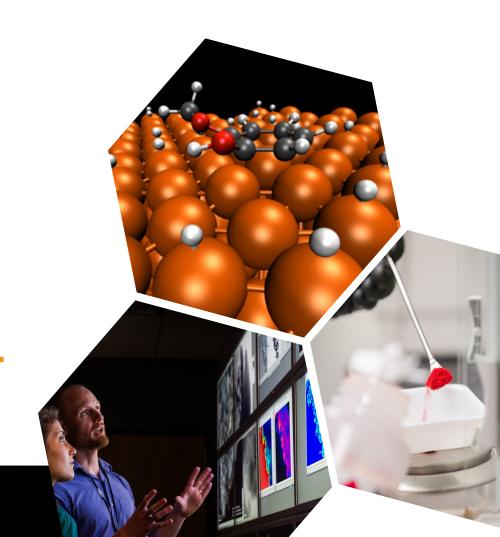


BETO 2021 Peer Review: ChemCatBio Data Hub (2.6.2.500)

March 9, 2021 Catalytic Upgrading Review Panel Kurt Van Allsburg, NREL



The Data Hub Project within ChemCatBio

Integrated and collaborative portfolio of catalytic technologies and enabling capabilities

Catalytic Technologies

Catalytic Upgrading of Biochemical Intermediates

(NREL, PNNL, ORNL, LANL)

Upgrading of C1 Building Blocks (NREL)

Upgrading of C2 Intermediates (PNNL, ORNL)

Catalytic Fast Pyrolysis (NREL, PNNL)

Electrocatalytic CO2 Utilization (NREL)

Enabling Capabilities

Advanced Catalyst Synthesis and Characterization (NREL, ANL, ORNL)

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

Catalyst Deactivation Mitigation for Biomass Conversion(PNNL)

Industry Partnerships (Phase II Directed Funding)

Opus12 (NREL)

Visolis (PNNL)

Sironix (LANL)

Cross-Cutting Support

ChemCatBio Lead Team Support (NREL)

ChemCatBio Data Hub (NREL)

Project Overview

The Data Hub project:

Harnessing data to accelerate catalyst discovery

FY18–19: Develop the **Data Hub**, a general data repository

FY20-present: Develop the **Catalyst Property Database**, as part of a shift to focus on transformational tools enabling catalyst R&D



datahub.chemcatbio.org

Released in 2018



cpd.chemcatbio.org

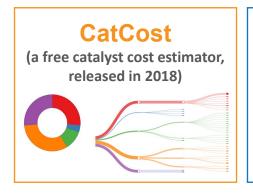
Released in 2020

Project Overview: the Data Hub (FY18–19)

FY18-19: The Data Hub

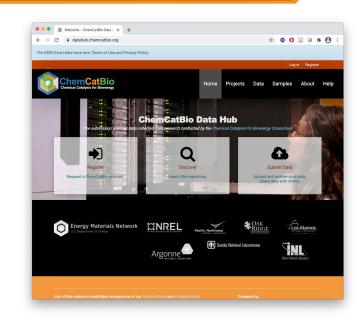
- A requirement for ChemCatBio as an EMN consortium
- A dropbox for all kinds of scientific data, with advanced tools (e.g., visualization of common data types)
- Public and private datasets, curated by ChemCatBio

Data Hub, a framework for transformational tools enabling catalyst R&D



The Catalyst Property Database

(current focus of this project)



datahub.chemcatbio.org

Released in 2018

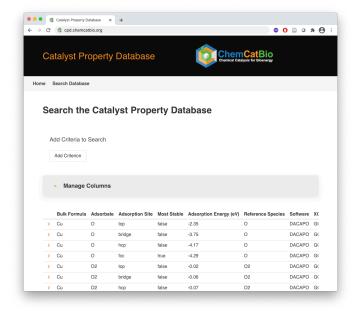
EMN = Energy Materials Network, a group of DOE-funded consortia

Project Overview: the CPD (FY20-present)

FY20–present: The Catalyst Property Database, a transformational tool enabling catalyst R&D

- Intended to accelerate materials discovery
- A resource for the entire catalyst community, not only ChemCatBio
- Open to public to view (FY20) and upload (FY21), subject to quality control

Informed by the vision for a Catalyst Design Engine



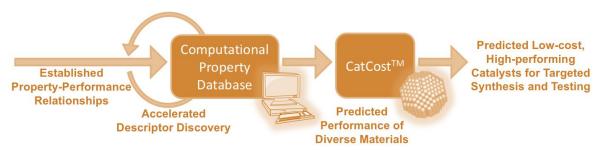
cpd.chemcatbio.org

Released in 2020

The Catalyst Design Engine

The Catalyst Design Engine is a vision for a free, publicly available tool that combines catalyst performance and cost insight

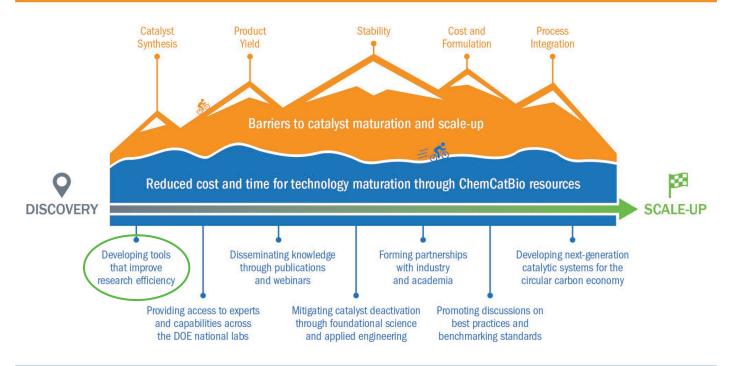




To work toward this vision, we first need to develop the building blocks: CatCost (released 2018) and the Catalyst Property Database (in development, initial release 2020)

Accelerating Catalyst Discovery

The path to catalyst deployment is slow and difficult.



ChemCatBio is accelerating the catalyst and process development cycle.

Project Overview: Heilmeier Questions

What are you trying to do?
 Harnessing catalyst property data to accelerate catalyst discovery

How is it done today and what are the limits?

When data is used in catalyst discovery, it is **often collected/computed from scratch** because of the challenges in finding **reliable**, **directly comparable** datasets

Why is it important?

It's inefficient.

Current practice results in **redundant calculations** being repeatedly performed Furthermore, only a **small subset** of published data is brought to bear

What are the risks?

Users find the database irrelevant or too difficult to use

Market Trends Addressed by the Data Hub

Product

Feedstock

Capital

Gasoline/ethanol demand decreasing, diesel demand steady

Increasing demand for aviation and marine fuel



Demand for higher-performance products



Increasing demand for renewable/recyclable materials



Sustained low oil prices



Decreasing cost of renewable electricity



Sustainable waste management



Expanding availability of green H₂



Closing the carbon cycle



Risk of greenfield investments



Challenges and costs of biorefinery start-up



Availability of depreciated and underutilized capital equipment



Carbon intensity reduction



Access to clean air and water



Environmental equity

As a cross-cutting effort to enable accelerated catalyst discovery, the ChemCatBio Data Hub is most relevant to those market trends calling for new, advanced catalysts

1. Management: Team and Collaborations

Management Plan: A project team with diverse, targeted expertise



Kurt Van Allsburg, Ph.D.
PI
Experimentalist
Experienced developer of R&D tools such as CatCost



Nalinrat Guba, Ph.D.
Lead Developer
Software engineer
(previously at Oracle)



Advisors:

Qiyuan Wu, Ph.D. Experimentalist Experienced web developer



Carrie Farberow, Ph.D.
Technical expert,
former Pl
Computational
researcher



Sean Tacey, Ph.D.
Technical expert
Computational
researcher

Josh Schaidle, CCB Director
Tom King, NREL, UI designer
Nick Wunder, NREL, web dev expert

Kathy Cisar, NREL Communications

Project Tasks:

- Task 1: Data Hub and Computational Catalyst Property Database Development
- Task 2: Data Hub Maintenance, Security, and Oversight

Project Collaborations:

- CCPC Atomistic Modeling Task, (PI: Carrie Farberow)
- CatCost (PI: Fred Baddour)





1. Management: Tasks

Project Tasks:

- Task 1: Data Hub and Catalyst Property Database Development (\$325,000)
 - New milestone-related features in Catalyst Property Database (CPD)
 - Bug fixes and usability improvements in CPD and Data Hub

Tracked & prioritized using Agile methods

- Research demonstrations of CPD
- Adding new datasets to CPD
- External user interviews, user training & documentation, webinars/screencasts, quality control
- Task 2: Data Hub Maintenance, Security, and Oversight (\$25,000)
 - Security upgrades to Data Hub and Catalyst Property Database
 - Managing site hosting with Amazon Web Services

1. Management: Risk Mitigation

Risk 1: Development Scope & Schedule Creep

Risk 2: Database Does Not Match User Needs (irrelevant / wrong features)

Risk 3: Database Is Too Difficult To Use or Does Not Justify Required Effort

Risk 4: Data Quality/Quantity Issues

Mitigation: Use Agile (Scrum) software development systems & practices

Mitigation: Go/No-Go milestone (FY21Q2) focuses on seeking expert / potential user feedback on development direction & pitfalls

Mitigation: Ongoing input from catalyst researchers as part of Go/No-Go, NREL technical software developers & UI experts, and ChemCatBio stakeholders

Mitigation:

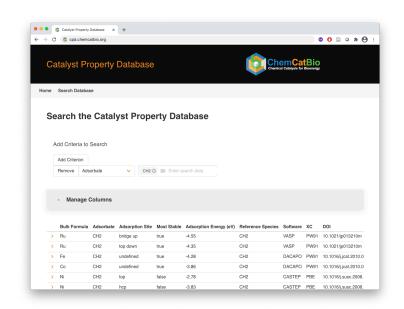
Quality: Establish curation & training (FY21Q3) Quantity: Use partnerships with CCPC, CCB, external interviewees to gain buy-in & users, leverage "prestige" factor for data uploads

2. Approach: the Catalyst Property Database

In FY20–22, the Data Hub project is focused on developing the **Catalyst Property Database** as a collaboration and discovery tool

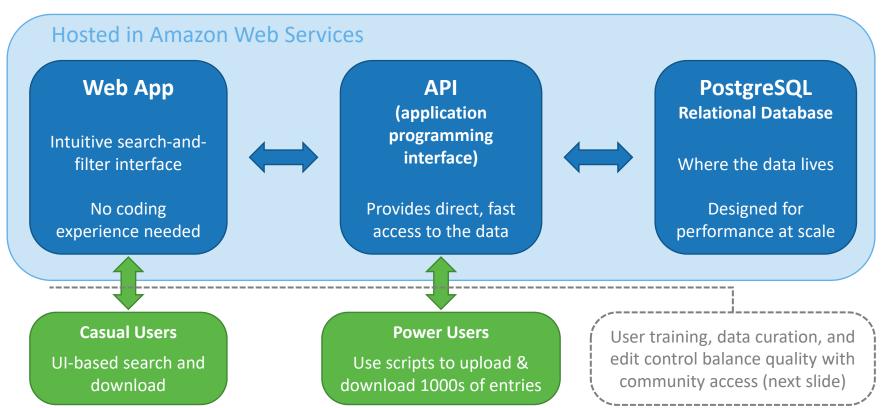
The Catalyst Property Database (CPD)

- ➤ A centralized, searchable repository of catalyst properties
- Publicly accessible to view and upload
 - Uploads subject to quality control
- ➤ Initial release: DFT-computed adsorption energies for intermediates on catalyst surfaces



2. Approach: CPD Architecture

The CPD uses a modern design for fast performance as the database grows



2. Approach: Data Growth & Curation

Problem:

Achieving sustainable growth for the CPD while maintaining high quality

CPD Solution:

Open the database to public contributions, but use robust quality controls

Data Growth:

- Work with our partners to encourage large uploads



Quality Controls:

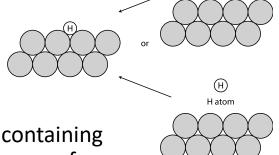
- Strict data requirements built into database
- Initial data curated by Data Hub team
- Long-term: use a Wikipedia model, but with qualified & trained curator-editors

2. Approach: Reference Species Translation Feature

Background: Computed adsorption energies, the critical DFT output included in the Catalyst Property Database, may be reported with different reference species

Adsorption energy (E_{i*} , in eV; 1 eV = 96.5 kJ/mol) for atomic H on a Pt(111) surface calculated with different gas-phase references.

Gas-phase reference	Ei∗ (eV)	Difference (eV)
Н	-2.80	2.26
1∕2H2	-0 .54	2.26



Problem: Data reported with different reference species, while containing similar information, **cannot be directly compared**, limiting the scope of data that can be applied in predictive catalyst applications

CPD Solution: Create a Reference Species Translation feature to enable interconversion between compatible reference species sets.

This is a key differentiator not found in any public database or resource.

2. Approach: Development Plan

Foundational Transformational

FY20: Release CPD as a readonly resource FY21: Focus on external users & enable uploads

FY21 Go/No-Go: Interview external experts FY22: Demo a research advancement enabled by CPD

FY21 Go/No-Go:

Interview 10+ experts to confirm that CPD development plans align with the needs of potential users and adjust as necessary.

Focus areas for interviews, to support CPD innovation:

- Preferred features
- Experience with competing solutions
- Strengths-Weaknesses-Opportunities-Threats
- Preferences for UI, scripting, etc.

3. Impact: Faster & Cheaper Catalyst Discovery

2019 Peer Reviewer Comment:

"We see considerable duplication of effort in catalysis research"

Every year, more experimental and computational catalyst data is generated, but the methods and tools to apply this data have not kept up.

The CPD is advancing the state of the art for application of computational data:

- Stop spending time and money re-creating data that already existed
- Enable new approaches to catalyst discovery that require large datasets

By harnessing the power of data, the Data Hub and the Catalyst Property Database are accelerating catalyst discovery



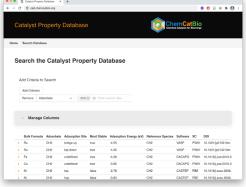
3. Impact: Diverse R&D Applications of the CPD

The Catalyst Property Database has diverse R&D applications, starting now and expanding as the database grows:



Computational Researcher
Data Validation/
Benchmarking







Catalysis Machine Learning



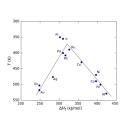


High-Throughput Calculations





1.000-100.000



Reactivity Descriptor Discovery

DFT = density functional theory

4. Progress: Create Database Data Structure

FY20: Developed the data structure for computed adsorption energies

Field	Data Type	Required Field?	
Material Properties			
Formula	String	Yes	
Primary Class	String	No	
Secondary Class	String	No	
Stretched?	Boolean	Yes, default False	
Compressed?	Boolean	Yes, default False	
Space Group	String	No	
Lattice Constants (3)	Numeric	No	
Surface/Particle Properties			
Nanoparticle Size	Numeric	No	
1st Layer Composition	String	No	
2nd Layer Composition	String	No	
Facet	String	No	
Termination	String	No	
Cell Symmetry	String	No	
Methods			
Software	String	Yes	
Exchange correlation	String	Yes	
Potentials	String	No	
Basis Set	String	Yes	
SpinPol?	Boolean	No	
ZPE?	Boolean	No	
Fixed Substrate?	Boolean	No	

Field	Data Type	Required Field?
Adsorbate and Reference Species		
Adsorbate	Table	Yes
Adsorption Site	String	No
Coverage	Numeric	No
Reference Species (multiple)	Table	At least one entry required
Reference Species coefficient	Numeric	Yes
Metadata		
DOI	String	Yes
Notes	String	No
User	String	Yes
Adsorption Energy Data		
Adsorption Energy	Numeric	Yes
Most Stable?	Boolean	Yes, default True

Outcome: This structure and the associated rules are essential to data quality control & curation

✓ On-time FY20Q1 milestone completion

4. Progress: Create Database Data Structure

FY20: Converted the data structure into a PostGreSQL database

adsorption measurement

INTEGER

INTEGER

INTEGER

INTEGER INTEGER

INTEGER

INTEGER

NUMERIC(10.5)

CHARACTER VARYING(255

CHARACTER VARYING(255

Structure of the PostGreSQL database in the CPD:

bulk_surface_property_set

adsorbate_species_i

adsorbate fraction is

adsorption_reference_sp

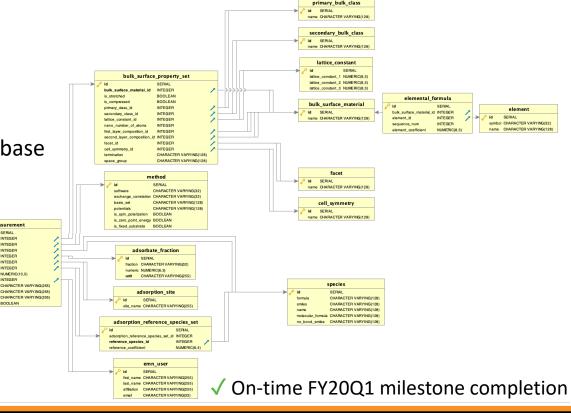
method_id

external not

internal note

is_most_stable_sit

Outcome: Database ready to efficiently scale up to millions of entries



4. Progress: Standardize Data & Create Rules

FY20: Created dictionaries of recurring entries, such as adsorbate/reference species, and rules for naming, data input/curation, etc.

Molecular Formula	Name	SMILES
O2 (g)	oxygen (g)	[00]
00	dioxygen	00
02	oxygen	0=0
HH	hydrogen (g)	[HH]
H2	hydrogen	[H][H]
0	oxygen, atomic	[O]
N2	nitrogen	N#N
СНЗСООН	acetic acid	CC(=O)O
HCO	formyl	[CH]=O
CH2	methylene	[CH2]
СООН	carboxyl	[C](=O)O

Outcomes from dictionaries & data rules:

- Quality control
- Faster performance
- Faster, easier search
- Gives users confidence in the data

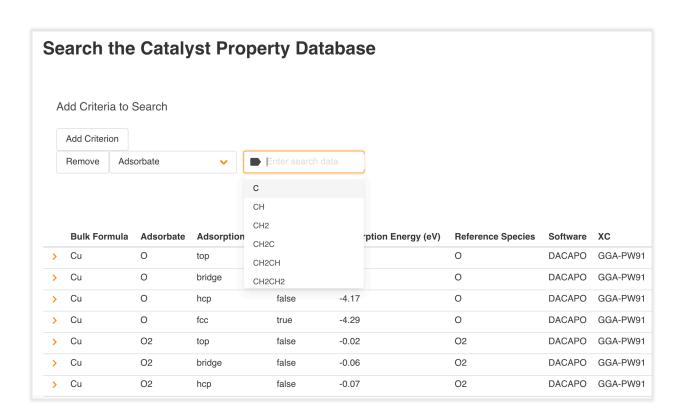
✓ On-time FY20Q1 milestone completion

4. Progress: Create User Interface

FY20: Developed the UI for the Catalyst Property Database, including a live-updating search/filter approach:

Outcome:

The clean, modern interface allows catalyst researchers of all backgrounds to access valuable data



√ On-time FY20Q3 milestone completion

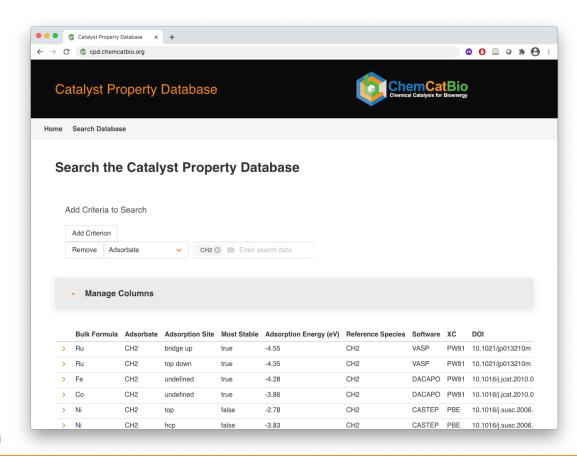
4. Progress: Initial Public Release

FY20: Released the Catalyst Property Database to the public in Sept 2020

cpd.chemcatbio.org

Outcome:

The CPD is now available for users to test and provide feedback.



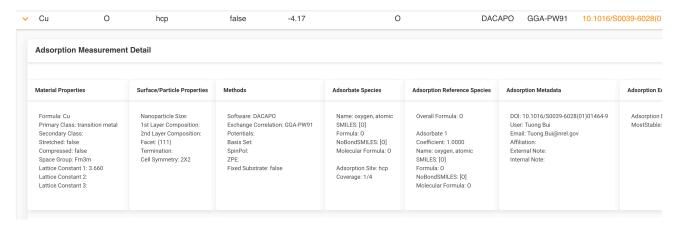
√ On-time FY20Q4 milestone completion

4. Progress: Ongoing Development

FY21: Added a Manage Columns dialog to allow users to select columns for display...

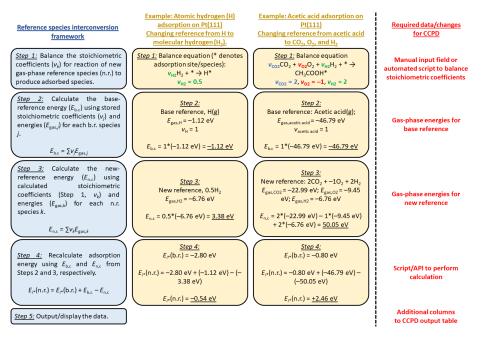
- Manage Columns		
🗸 Bulk Formula 🗸 Adsorbate 🗸 Adsorption Site 🗸 Most Stable 💆 Adsorption Energy (eV) 💆 Reference Species 💆 Software 💆 XC 💆 DOI		
Primary Class Secondary Class First Layer Second Layer Space Group Facet Termination Cell Symmetry Potential		
Basis Set Coverage Stretched Compressed Spin Pol ZPE Fixed Substrate Nanoparticle Size		

... and a "detail view" to show all available metadata for a row



4. Progress: Reference Species Translation

FY21: Created a detailed development plan for this feature, including required data



Outcome: This key differentiator is complex to implement, so we broke it down into achievable development steps.

On-time FY21Q1 milestone completion

Future Work

Foundational Transformational

FY20: Release CPD as a readonly resource FY21: Focus on external users & enable uploads

FY21 Go/No-Go: Interview external experts FY22: Demo a research advancement enabled by CPD

Upcoming work in the Data Hub project:

FY21Q2: Go/No-Go – Interviews with external experts; guide development direction

FY21Q3: Develop training, documentation, and curation procedures

FY21Q4: Add batch upload capability, including examples (e.g., Python script)

FY22: Demonstrate a research advancement enabled by the unique data-sharing capabilities of the CPD. Time savings of 2–10X compared to best alternative methods.

Quad Chart

Timeline

Project start date: 10/1/2019Project end date: 09/30/2022

	FY21	FY20-FY22
DOE Funding	\$350k	\$1.05M

Barriers addressed

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

Funding Mechanism

AOP

Project Goal

Enable ChemCatBio and the bioenergy industry to accelerate the catalyst and process development cycle through development of publicly available advanced analytics tools. Demonstrate application of the Computational Catalyst Property Database (CPD) in a predictive design application that is dramatically accelerated (2–10X) by the use of the CPD's unique capabilities.

End of Project Milestone

Demonstrate a research advancement enabled by the unique data-sharing capabilities of the CPD. Pilot and document a research use case of the CPD that results in a time savings of 2–10X compared to the best alternative methods. Perform this demonstration with a suitable partner, such as a high-throughput computational research group.

Acknowledgements

Data Hub Team Advisors

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Sean Tacey Tom King

Matt Jankousky

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Kris Munch Jesse Glover

Courtney Pailing Andrea Bailey

Josh Schaidle Nicole Fitzgerald

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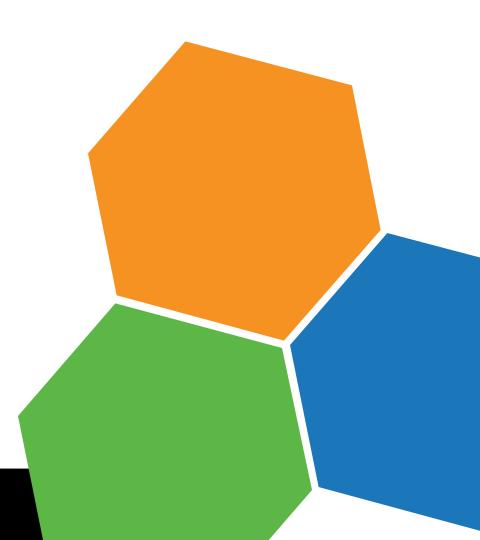
This work was performed in collaboration with the Chemical Catalysis for Bioenergy Consortium (ChemCatBio, CCB), a member of the Energy Materials Network (EMN)





Thank you!





Data Hub: Informed by 2019 Peer Review

"We see considerable duplication of effort in catalysis research"

The Catalyst Property Database aims to make data easier to find and reuse, cutting down on redundant computations/measurements

Should allow contributions from non-CCB researchers

> The CPD is designed for contributions by the broader catalysis community

"It would be nice to see...a more universal repository of the sort that NIST curates"

> The newly-renamed Catalyst Property Database is designed to work toward this vision

Should use Agile project management principles

➤ We are using Agile/Scrum in our development

User feedback and confirmation of usefulness is essential

➤ We have made external user feedback the core of our Go/No-Go milestone