

## Catalyst Cost Model Development

WBS: 2.5.4.301/302

U.S. Department of Energy (DOE)  
Bioenergy Technologies Office (BETO)  
2017 Project Peer Review  
Thermochemical Conversion

March 7<sup>th</sup>, 2017

**Project Leads:**

Frederick Baddour

– NREL

Lesley Snowden-Swan

– PNNL

# ChemCatBio Structure

## Core Catalysis Projects

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

**Liquid Fuels via Upgrading of Indirect Liquefaction Intermediates**  
(NREL, PNNL)

**Fast Pyrolysis and Upgrading**  
(PNNL, ORNL)

**Catalytic Fast Pyrolysis**  
(NREL, PNNL)

**Recovering and Upgrading Biogenic Carbon in Aqueous Waste Streams**  
(PNNL, NREL)

Zeolites and Metal  
Oxide Catalysts

Supported Metal  
Catalysts

Cross-cutting Discussion Groups

## Enabling Projects

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

**Catalyst Cost Model Development**  
(NREL, PNNL)

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

### *Consortium Integration*

- Core catalysis projects focused on specific *applications*
- *Collaborative* projects leveraging core capabilities across DOE laboratories
- *Cross-fertilization* through discussion groups

# Goal Statement and Outcomes

**Project Goal** – Develop a **catalyst cost estimation tool** to enable rapid and informed cost-based decisions in research and commercialization of catalysts

## Project Outputs and Outcomes

- ***An industrially validated*** and ***publicly-available*** catalyst cost estimation tool
- ***A first-of-its-kind*** tool for considering costs of ***novel and pre-commercial catalysts*** and paves the way for ***faster commercialization*** catalytic materials
- ***Catalyst R&D is accelerated*** by focusing efforts on cost and scaling challenges
- More informed decisions can be made on the basis of ***both cost and performance metrics***

## Relevance to Biofuels

- **Nearly all biomass conversion processes rely on catalysis as do many biochemical processes**
  - Catalytic technology development is leveraged by a major portion of conversion pathways across BETO's portfolio
  - Design and optimization of novel catalysts to improve selectivity, efficiency, and durability to enhance yields spans multiple R&D areas
- **An absence of available tools**
  - ***The need for tools*** to guide catalyst development towards economical and commercially viable targets has been identified as a key research challenge

# Quad Chart Overview

## Timeline

- Project start date: 10/1/2015
- Project end date: 9/30/2018
- Percent complete: 42%

## Barriers addressed & Actions

- **Ct-H** – Efficient Catalytic Upgrading of Sugars/Aromatics, Gaseous and Bio-Oil Intermediates to Fuels and Chemicals
  - *Guiding R&D efforts towards developing cost-effective and scalable catalysts*

## Budget

	FY15 Costs	FY16 Costs	Total Planned Funding (FY17-FY18)
DOE Funded	\$0	\$228	\$250k*

## Partners

- **National Labs**
  - NREL (75%)
  - PNNL (25%)
- **Industry**
  - Forge Nano

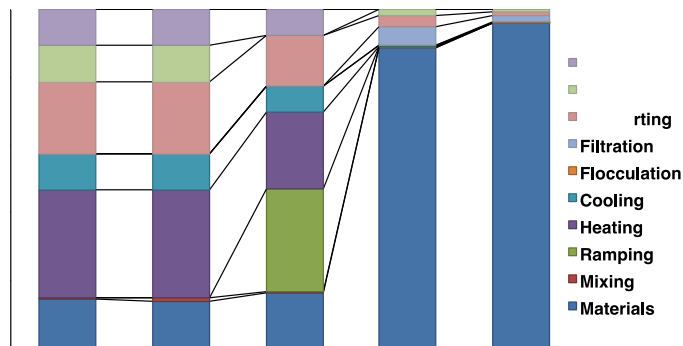
\*FY17 operating budget reduced to \$125k

# Overview: The Catalyst Cost Model (CCM)

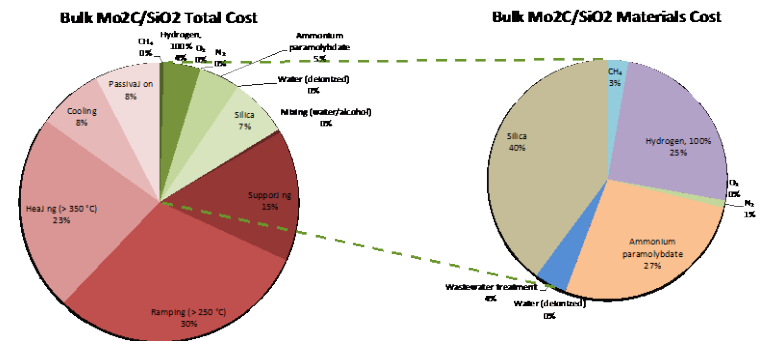
What information does the CCM provide to researchers?

- **Estimated costs** of manufacture for pre-commercial catalysts
- Identification of **areas of greatest cost**
- **Identification of roadblocks** to scaling and suggested mitigation strategies
- **A standard metric** for comparing catalyst synthesis methods and materials

**Comparison of Multiple Catalysts**  
(purchasing, deployment testing)



**Component Cost Analysis**  
(directing R&D to areas of need)

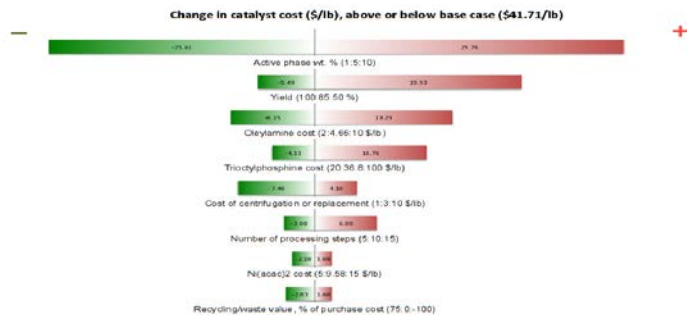


# Overview: The Catalyst Cost Model (CCM)

What does this information enable researchers to *do*?

- **Focus efforts** on areas with greatest potential for cost reduction
- **Make decisions** based on performance and cost
- **Guide catalyst development** at early stages
- **Improve the accuracy** of TEA involving pre-commercial catalysts

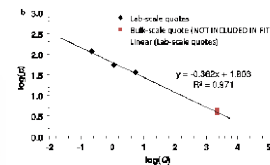
## Cost Sensitivity Analysis (assessing commercialization potential and risks)



## Cost Analysis Framework (incorporation into TEA studies; LCA-compatible outputs, etc.)

$$m_{AP} = m_{LR} / MW_{LR} \times \left( \frac{mol_{AP}}{mol_{LR}} \right) \times MW_{AP} \times yield$$

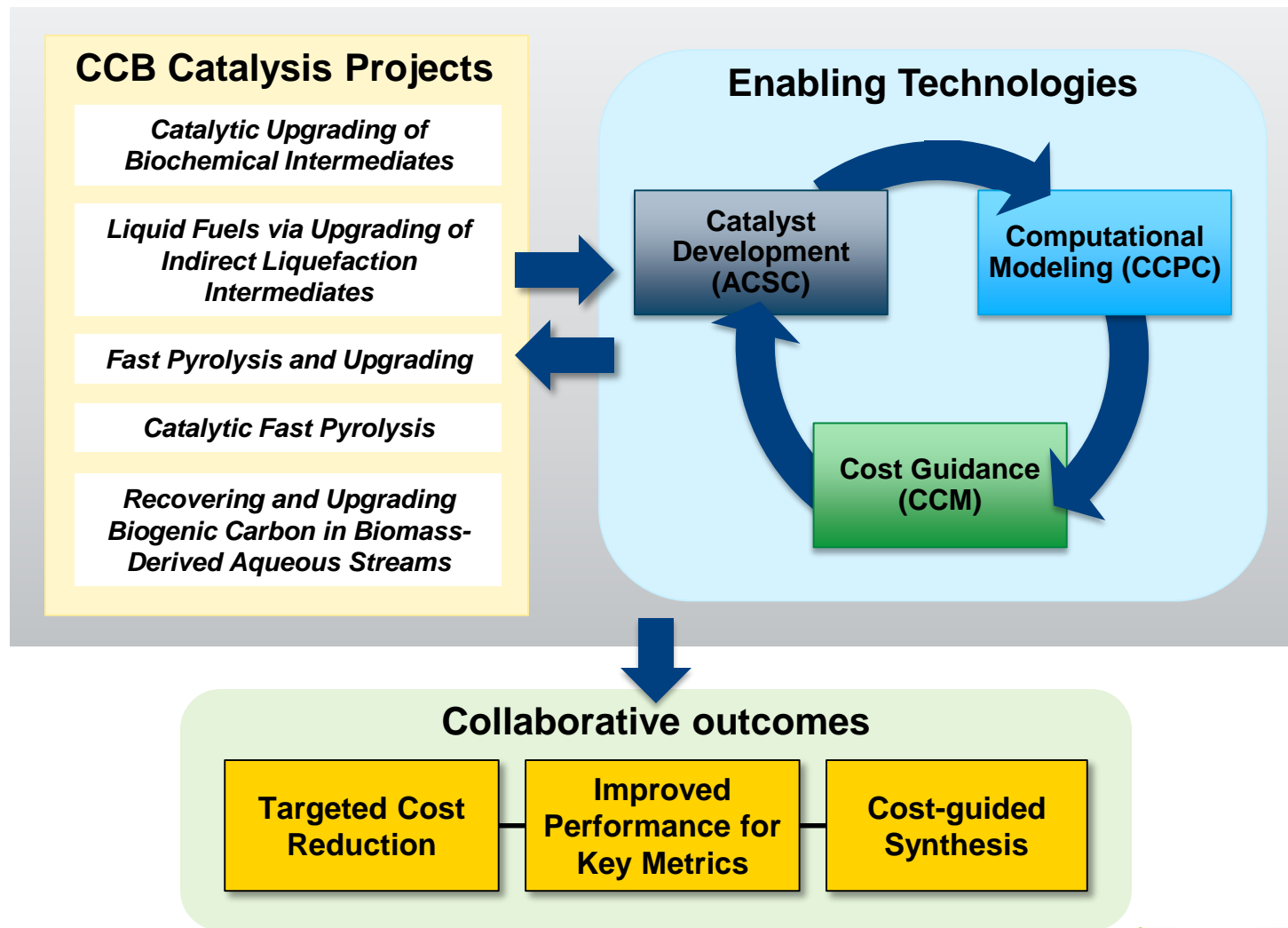
Limiting Reagent for Reaction Step	Quantity	Unit	MW (g/mol)	Concentration	Quantity to be	Unit	Unit Price	Total Cost per
1	0.001	kg	200	0.0040	250.000	kg	5.00	1,250.000
2	0.001	kg	100	0.0040	250.000	kg	5.00	1,250.000
3	0.001	kg	100	0.0040	250.000	kg	5.00	1,250.000
4	0.001	kg	100	0.0040	250.000	kg	5.00	1,250.000



$$(\text{Per-Unit Labor Cost})_i = \frac{\left( \frac{\text{Operator Hours}}{\text{Equipment Hours}} \right)}{(\text{Productivity})} \times (\text{Local Labor Rate})$$

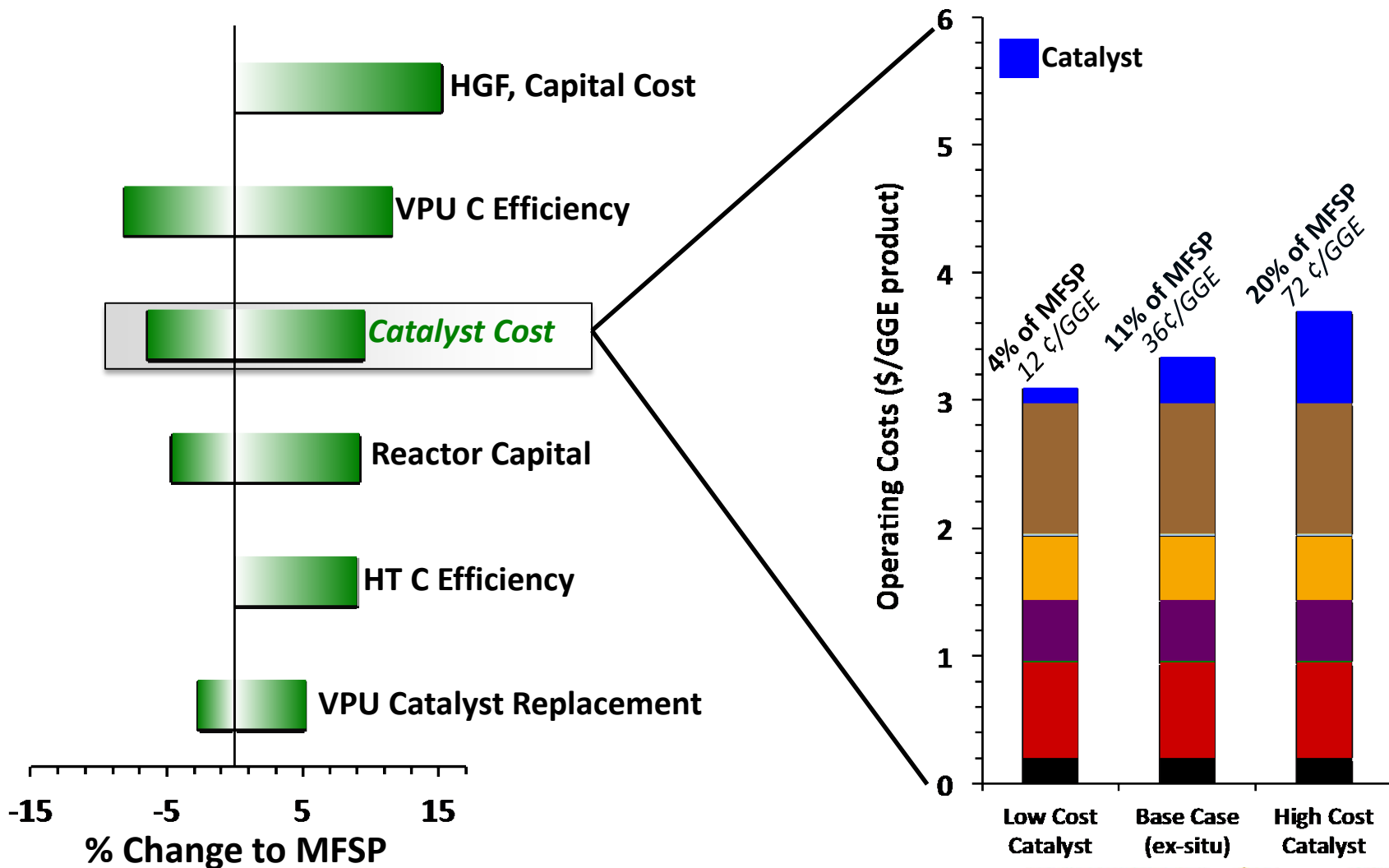
# Project overview – Integrated approach

*Establish an integrated and collaborative portfolio of catalytic and enabling technologies*



# Overview: Impact of Uncertain Catalyst Cost

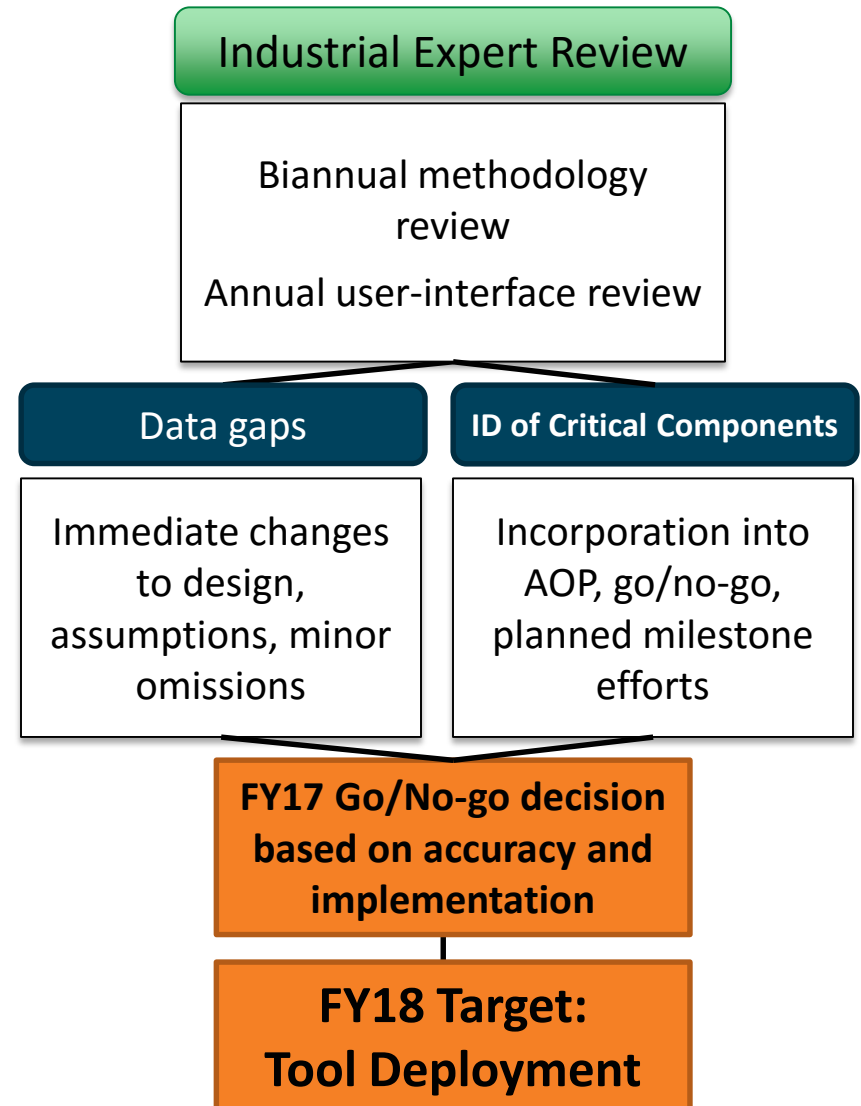
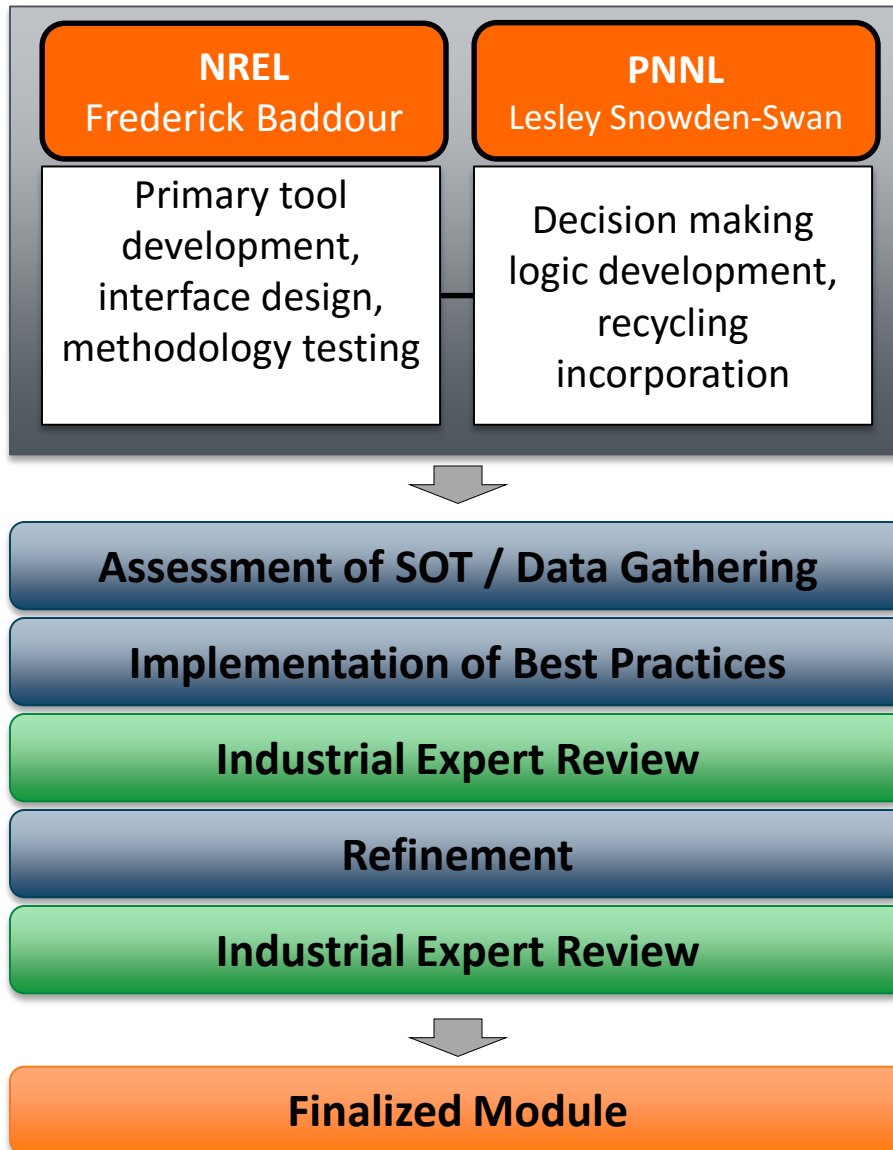
*Objective: To reduce uncertainty associated with pre-commercial catalyst cost in techno-economic analysis and **guide cost driven catalyst development***



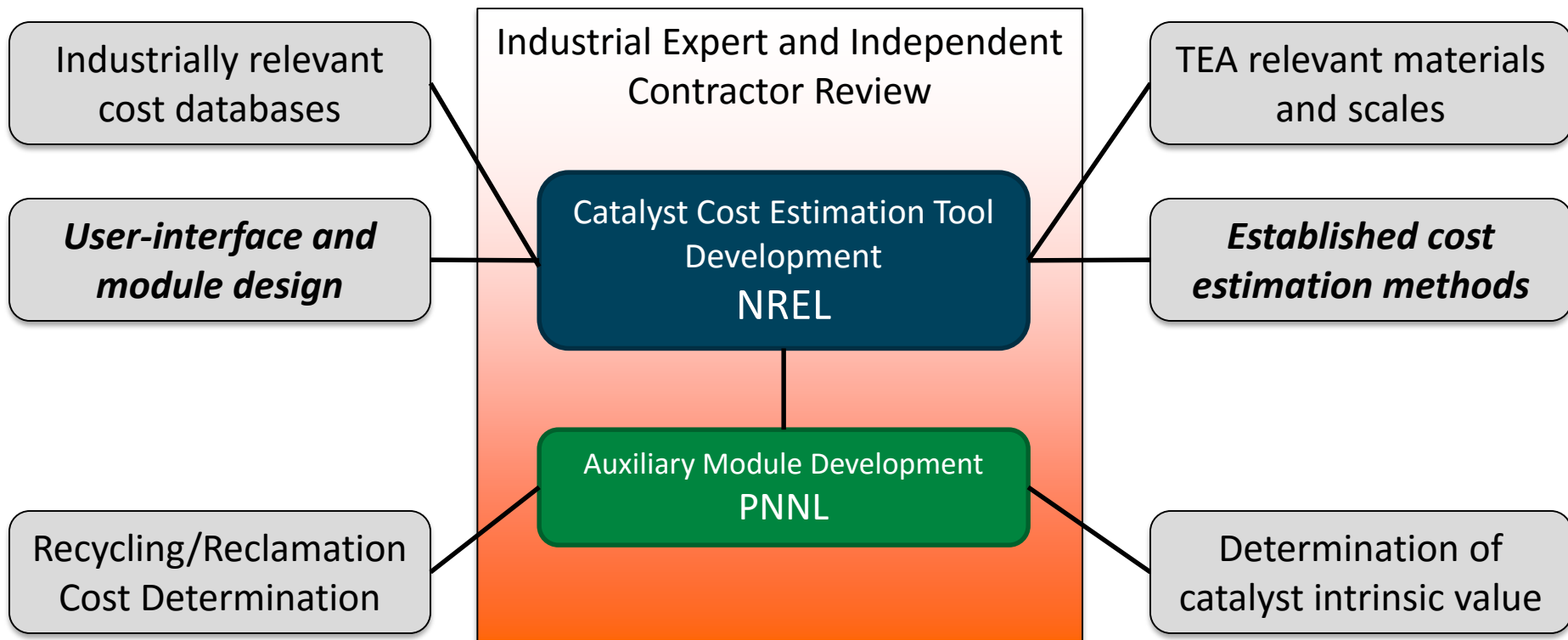


# Management Approach

*Closely integrated with industry to guide development of functional and relevant tool*



# Technical Approach



## Success Factors

- Production of an **accurate** and **industrial validated** tool with **broad applicability**
- **Flexibility** to handle multiple catalyst scale-up technologies
- **Informative visualization** and comparative tools
- **Public release** and consumption
- **Internal deployment** throughout BETO's core catalysis projects
- **Integration** with well-established analysis tools (GREET)

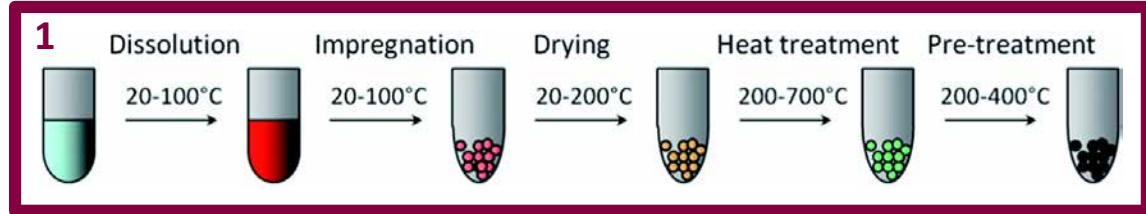
## ***Method Development:*** Building the Catalyst Cost Estimation Tool

*Implementation:* Utilization of the Tool

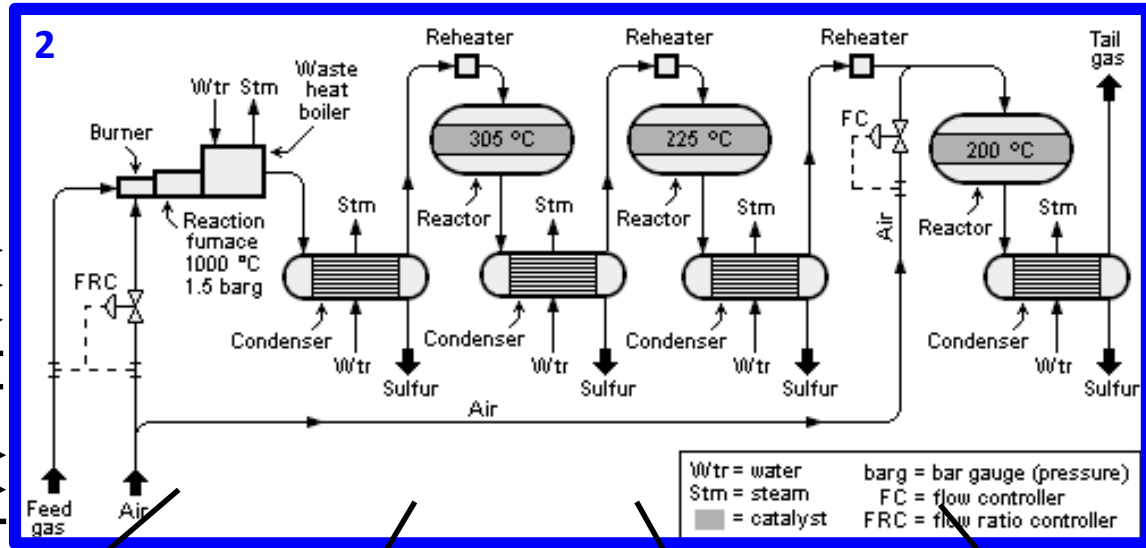
# Technical Approach: Determining Cost Contributors

**Challenge – Identify and incorporate major cost drivers involved in translating from bench to industrial scales**

1. Lab-scale process
2. Industrial process (PFD)
3. Design parameters
4. Cost components



- 3**
- Materials Flows (FY16)**
- Raw material supply
  - Byproducts
  - Waste/Salvage
- 4**
- Materials Costs**
- Utility Flows**
- Electricity
  - Steam
  - Cooling water
  - Wastewater
- Utility Costs**
- Factored Costs**
- Contingencies
  - Working Capital
  - Administrative



- Operating Labor**
  - Direct
  - Supervisory
  - Lab/QA

↓

**Labor Costs**
- Maintenance**
  - Supplies
  - Labor
  - Site Services

↓

**Maint. Costs**
- Equipment Capital**
  - Installation
  - Piping
  - Instrumentation

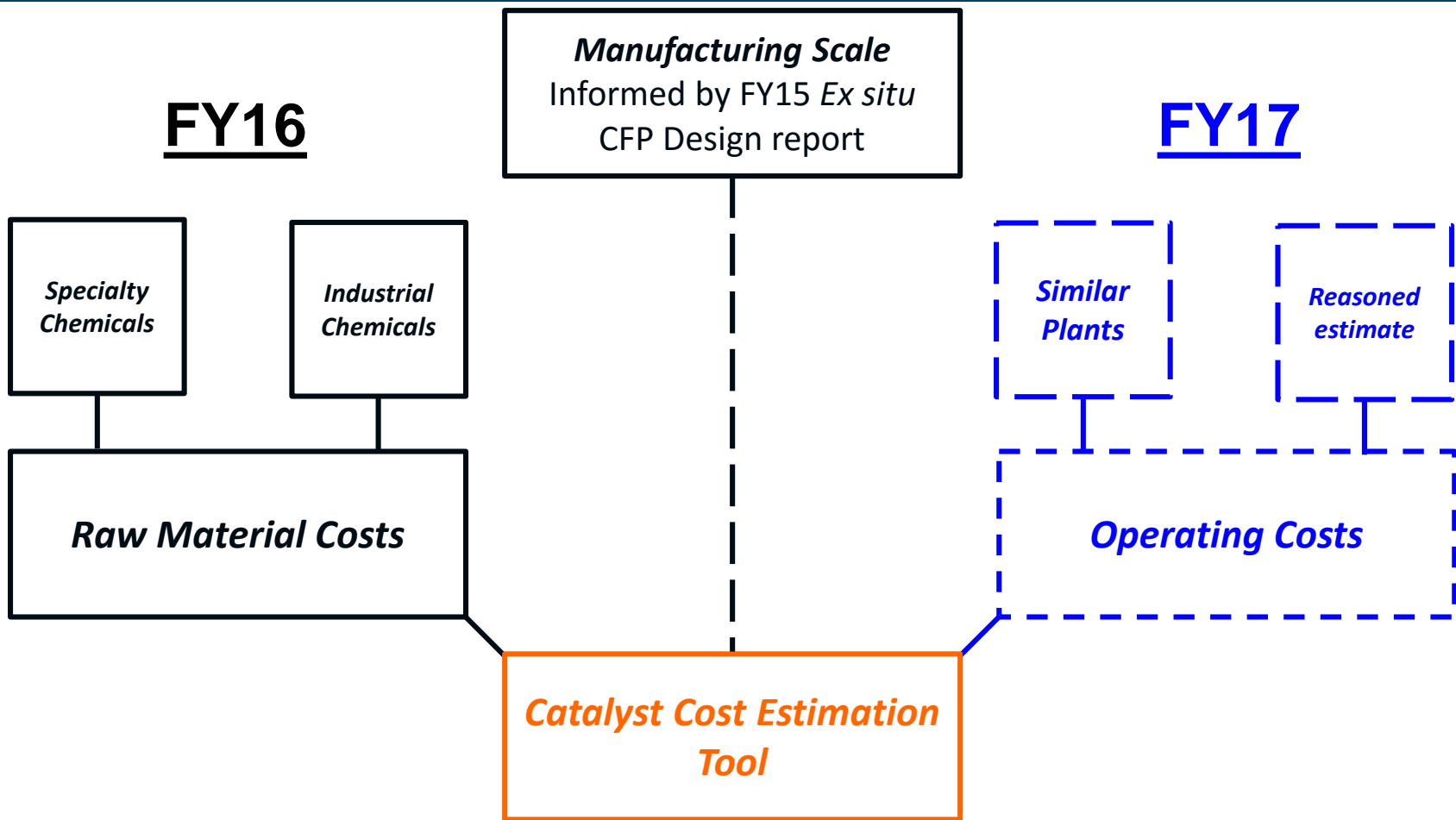
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**Equipment Costs**
- Production Site**
  - Buildings
  - Land
  - Design & Constr.

↓

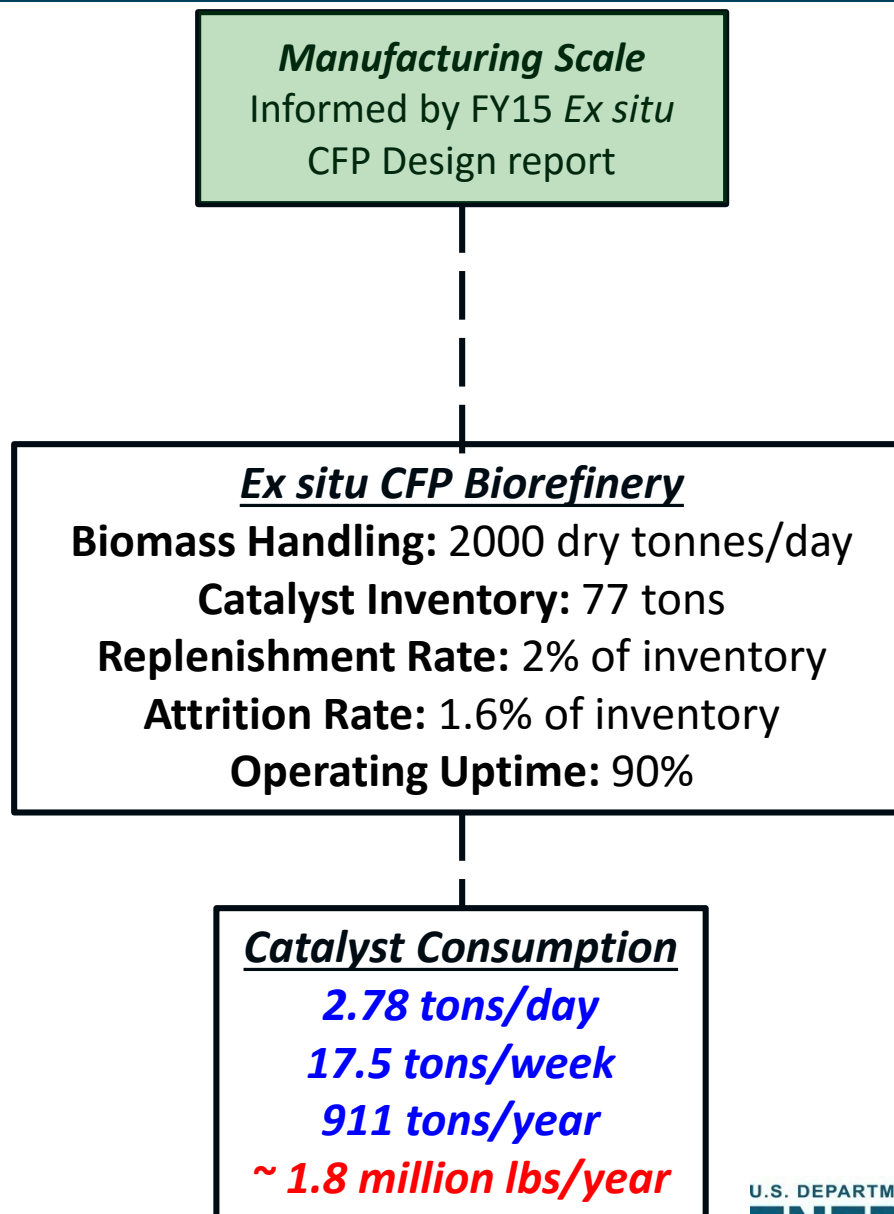
**Site Costs**

# Research Progress: Building a Framework



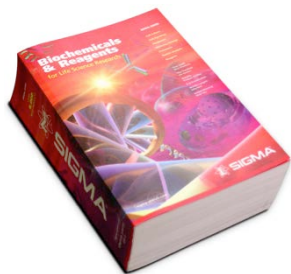
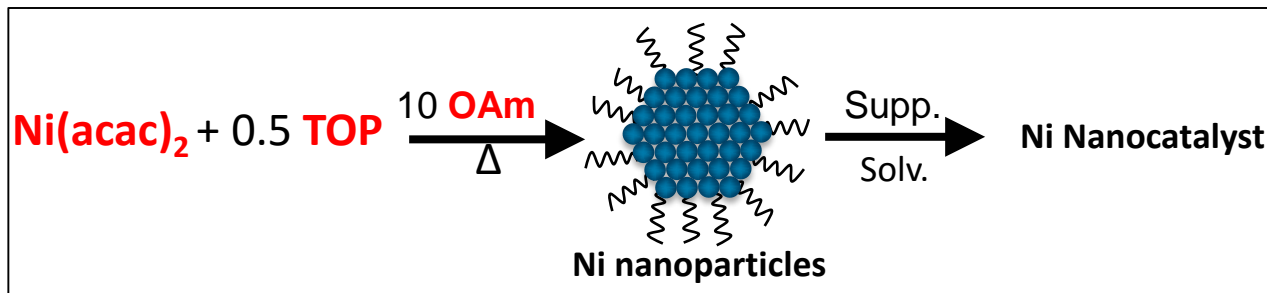
***3 modes of raw material cost entry incorporated into the CCM tool:  
bulk quote, Integrated open-source database, lab-to-pilot extrapolation***

# Research Progress: Building a Framework



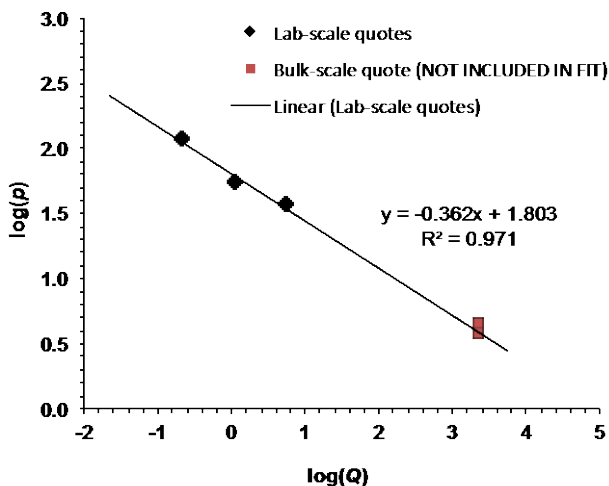
# Research Progress: Laboratory to Plant Material Pricing

**Challenge – Many chemicals required for synthesis of pre-commercial catalyst require raw materials that lack industrial market data**



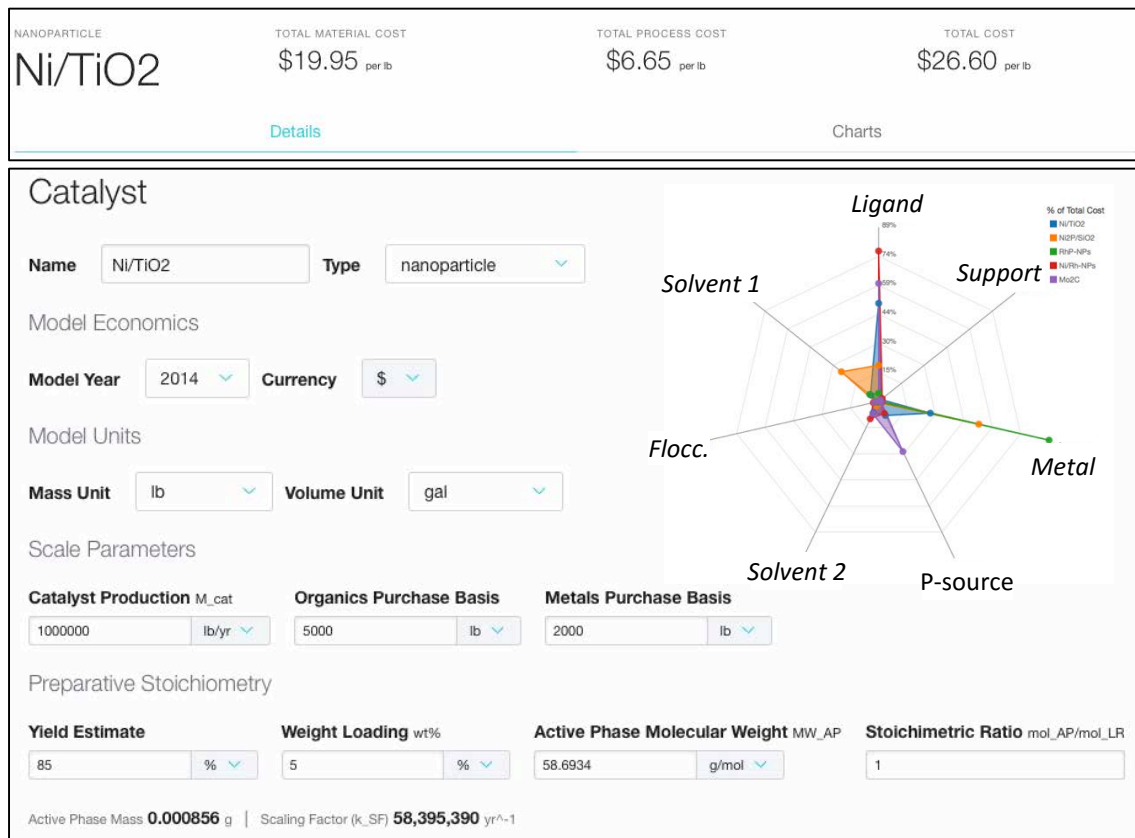
Quote Information (Inputs)		
Quantity, Q	Units	Total Price, P (\$)
100	g	25.72
500	g	60.20
2.5	kg	200.09

c Nickel(II) Acetate Tetrahydrate Lab-Scale Log-Log Fit Details						
Quote Information (Inputs)			Calculated Values			
Quantity, Q	Units	Total Price, P (\$)	Quantity, Q, in lb	Unit Price, p, (\$/lb)	Log(Q)	Log(p)
100	g	25.72	0.22	116.66	-0.66	2.07
500	g	60.20	1.10	54.61	0.04	1.74
2.5	kg	200.09	5.51	36.30	0.74	1.56
Data Fit			Calculated Bulk Pricing			
Slope: -0.363			Bulk Quantity = 2,000 lb			
Intercept: 1.803			Bulk Price = 4.04 \$/lb			



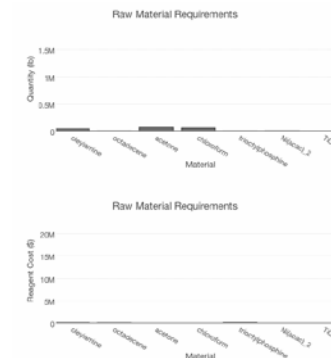
- Determination of **price as a function of scale**
- Provides reasonable estimation of **unconventional materials**
- **Expanded the scope** of the CCM tool to include **pre-commercial** catalysts requiring specialty chemicals

# Research Progress: UI Design



Yield Estimate **85 %**

Weight Loading **0.9 %**

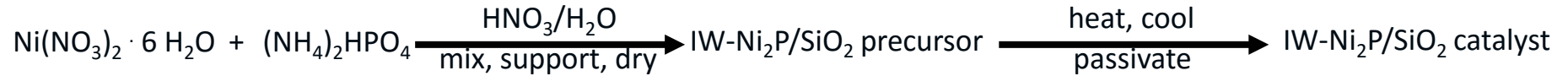


## Our Web UI Offers:

- **Seamless user experience** with the same spread-sheet core functionality
- **Powerful visualization** tools for cost comparison between catalysts
- **Real-time** variable adjustment
- **Up-to-date** pricing information from public databases
- **Exportable** cost data



# Research Progress: A Complete Scaffold



## Processing Steps

Cost (\$/lb)

0.05

mix

2

support

1

dry

3

heat

1

cool

1

passiv.

Catalyst	Material	Function	density	MW of precursor	amount	unit
<i>IW-Ni<sub>2</sub>P/SiO<sub>2</sub></i>	water	solvent		1	35	mL
	ammonium phosphate dibasic	P-source			0.89	g
	Conc. Nitric Acid	additive	1.51		1	mL
	Ni(NO <sub>3</sub> ) <sub>2</sub> · 6 H <sub>2</sub> O	metal source		290.79	1.96	g
	Sipernat-22	support			9.50	g
	<b>Final Catalyst</b>				<b>10.00</b>	<b>g</b>

Scaled by basis for purchase

Materials	Quantity (Lb)
water	135830
ammonium phosphate dibasic	3454
Conc. Nitric Acid	5860
Ni(NO <sub>3</sub> ) <sub>2</sub> · 6 H <sub>2</sub> O	7606
Sipernat-22	36868

Price (\$/Lb material)	Price (\$)	Source
0.005	677	IHS PEP
0.462	1597	IHS PEP
0.089	522	IHS PEP
1.984	15089	Alfa
0.874	32227	IHS CEH

Σ costs

*Comprehensive approach to estimating novel catalyst costs*

**\$10/lb IW-Ni<sub>2</sub>P/SiO<sub>2</sub>**

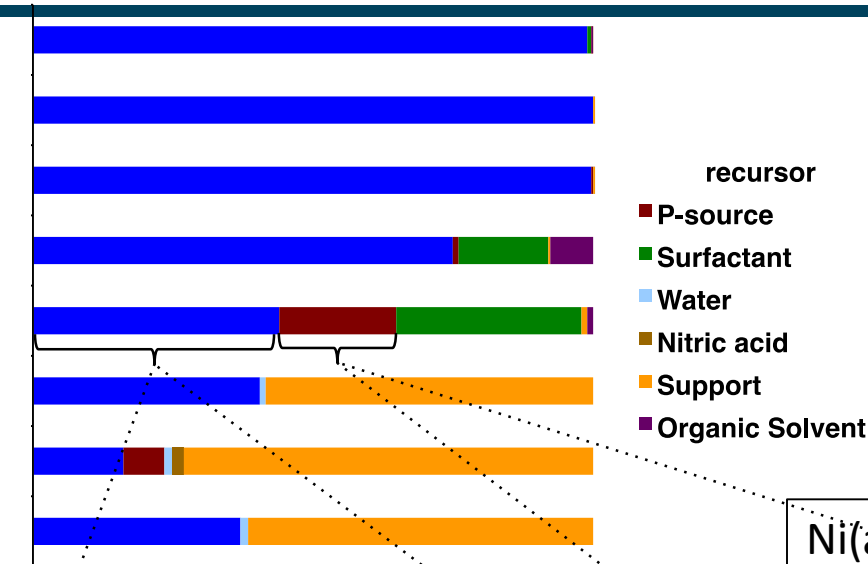
# Research Progress Roadmap

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*Method Development:* Building the Catalyst Cost Estimation Tool

***Implementation:*** Utilization of the Tool

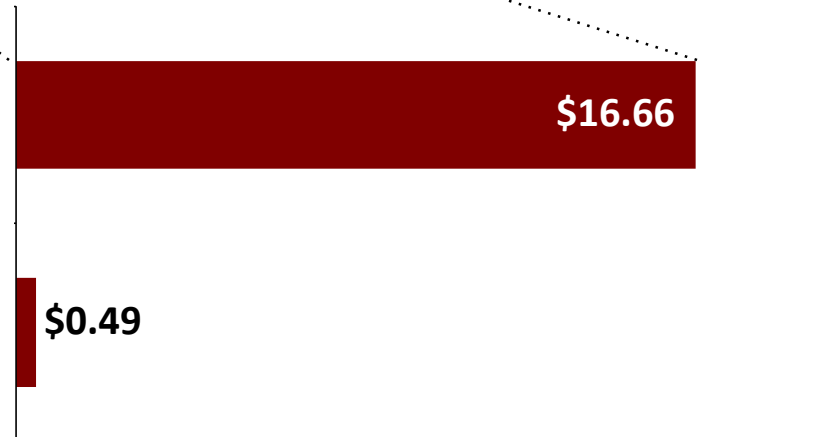
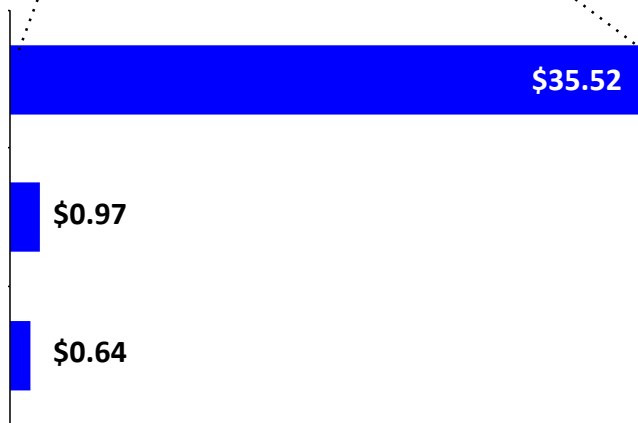
# Research Progress: *Ex-situ* CFP Case Study



*The CCM tool successfully assessed the areas of greatest cost for CFP catalysts*

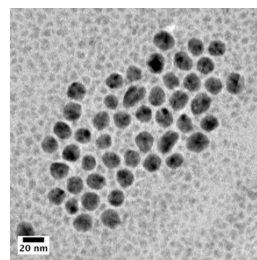
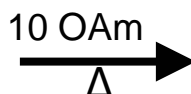
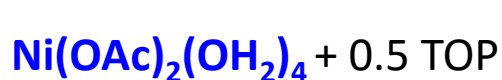
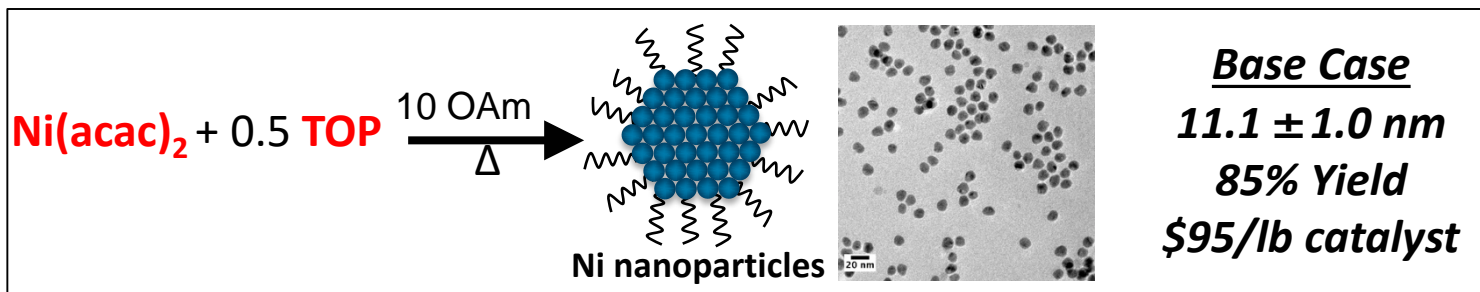
Ni(acac)<sub>2</sub> → Ni(OAc)<sub>2</sub> : **38% mat. cost red.**  
 TOP → PPh<sub>3</sub> : **18% mat. cost red.**

Materials Cost Allocation

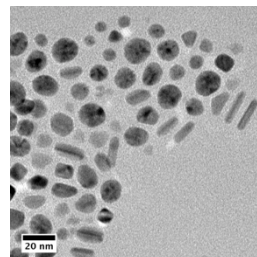
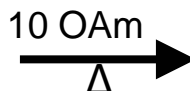


# Relevance: Cost-effective Synthesis with the ACSC

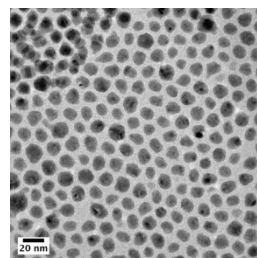
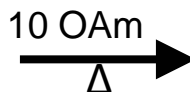
*Utilizing the CCM to directing synthesis towards lower cost targets*



**19 nm**  
**75% Yield**  
**\$65/lb catalyst**

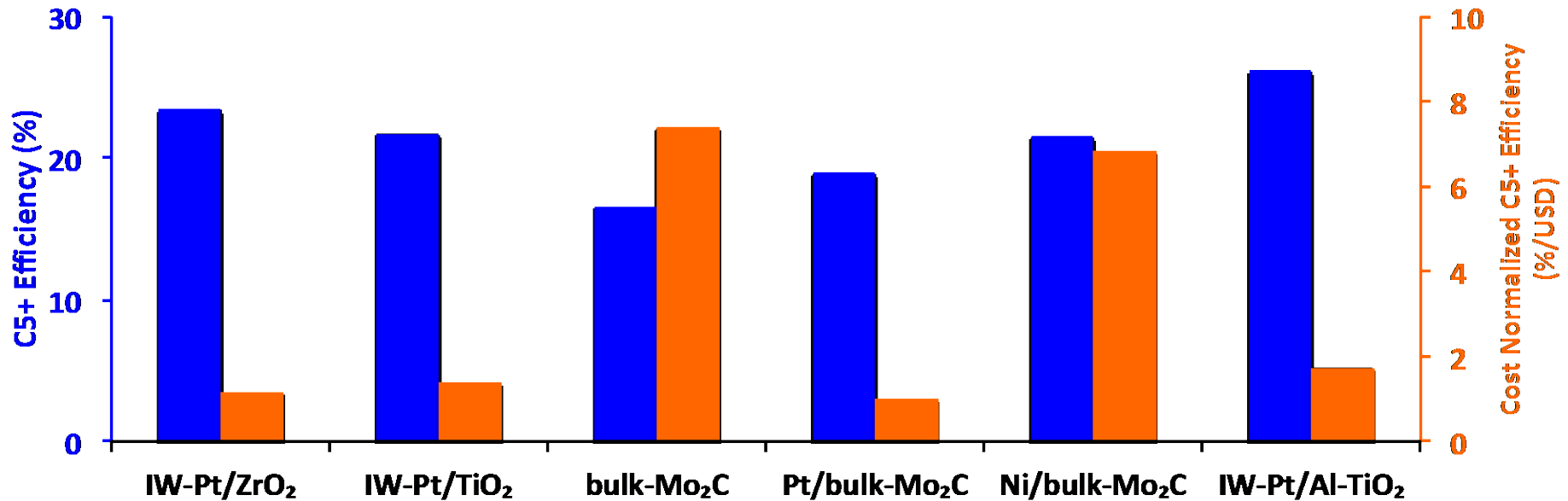


**22 nm**  
**50% Yield**  
**\$64/lb catalyst**



**12.0 nm ± 1.8**  
**85% Yield**  
**\$46/lb catalyst**

# Relevance: Assessing the Value Proposition



- Analysis with the CCM tool enables an early assessment of the ***value proposition of a catalyst***
- Catalyst performance metrics (e.g. lifetime, yields, regenerability) can be ***normalized by cost***

# Relevance

**Pre-commercial catalyst development and usage is heavily-leveraged within BETOs conversion portfolio**  
The CCM tool enables a detailed assessment of the **value proposition** of advanced catalysts early in development

**Catalyst cost contributes significantly to biofuels commercialization risk**  
Sensitivity analyses show catalyst cost as one of the top factors driving uncertainty in MFSP

**CCM-generated cost metrics offer guidance for catalyst development**

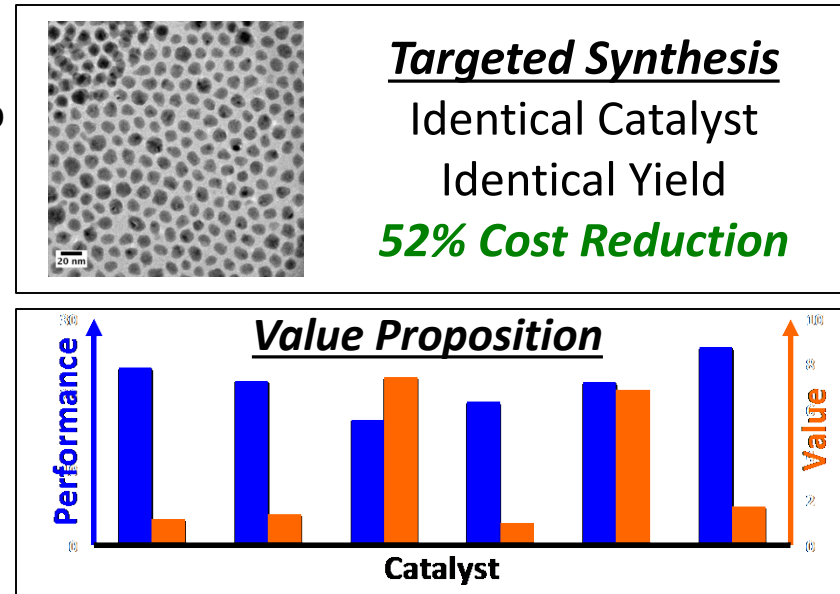
The CCM can be used to **guide materials development** much like TEA guides research through performance targets

**External R&D groups have demonstrated interest in the CCM tool and its capabilities**

University professors, national laboratory staff, and companies have expressed interest in collaborating on both tool development and testing



***Established new collaboration with a small manufacturing business***



# Future Work: Recycling and Decision Making

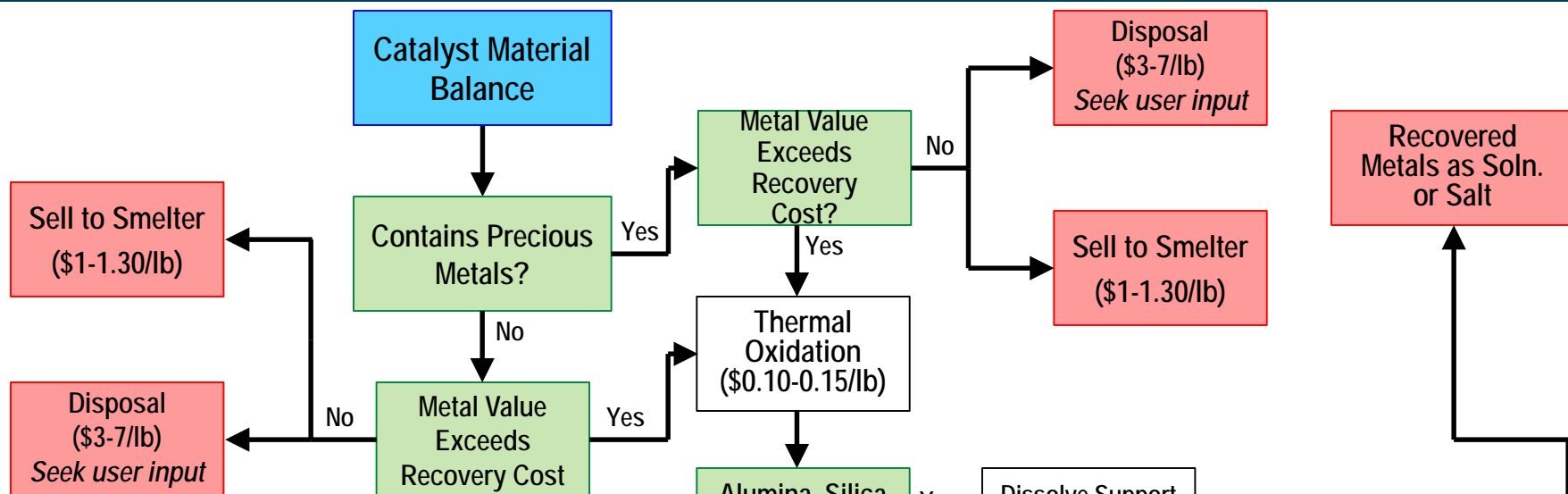


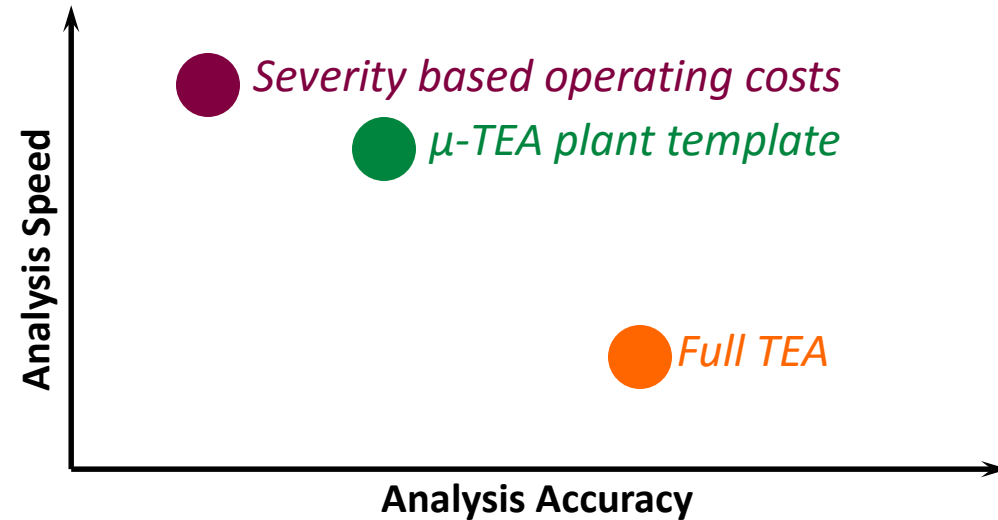
Table 1. Preliminary data supporting catalyst salvage value estimation in the CCM.

Metal	Typical Recovery (%)
Iron	60
Cobalt	80
Nickel	80
Copper	<sup>a</sup>
Aluminum	30
Molybdenum	70–80
Ruthenium	75–85
Rhodium	90–95
Palladium	95–98
Tungsten	50
Iridium	90
Platinum	96–98
Silver	97–98
Gold	97–99 <sup>b</sup>

Support Material	Typical Recovery Method
Carbon	Combustion followed by acid extraction
Silica	De-coking and dissolution of silica
Titania	De-coking and extraction of metals
Alumina	De-coking and dissolution of alumina
No support (e.g. zeolite catalyst)	Dissolution of framework, extractions

Paraphrased comments from CCM reviewers: <sup>a</sup>Copper is difficult to separate from precious metals during recovery. <sup>b</sup>Few smelters will accept Au-containing catalysts, and none will accept Ru, Re, or Os-containing catalysts. Catalysts containing these elements in their active phase would require hydrometallurgical processing, after decoking, to recover the metals.

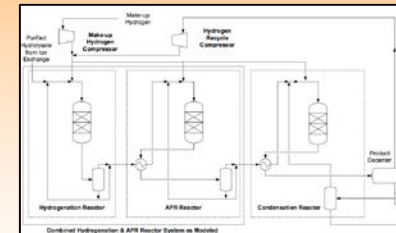
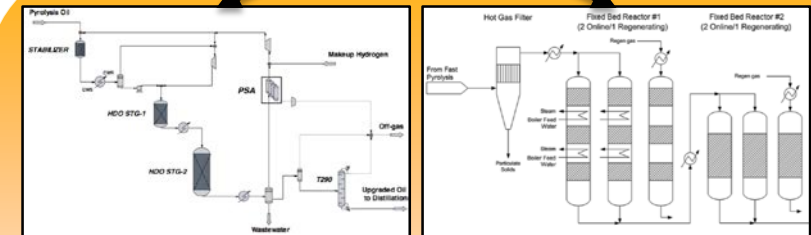
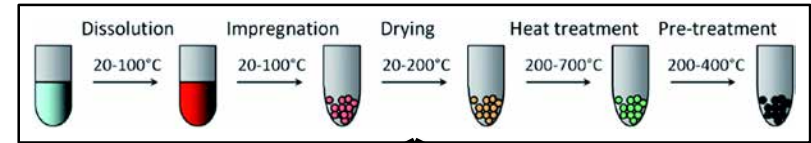
# Future Work: A Tiered-complexity Approach to Operating Costs



## Tiered Complexity of Operating Costs

- **Severity based**
  - Order-of-magnitude estimate
- **Templated full-plant analysis**
  - **TEA templates** to include traditional means of catalyst production
  - Informed by TEA from industrial databases
  - **Rapid analysis** of processing costs
  - All fields **user-adjustable**

## Laboratory Procedure



## Parameterized scale-up templates

**Rapid and accurate processing cost estimation**



# Future Work: Linking Cost and Environmental Impact

*The CCM Tool generates data that can be incorporated into existing LCA tools (GREET)*

## CCM Tool Inputs

- Catalyst composition
- Raw material usage
- Energy consumption to produce catalyst
- Water consumption
- Solvent consumption

Greenhouse gases  
Regulated  
Emissions  
Energy use in  
Transportation



## GREET Outputs

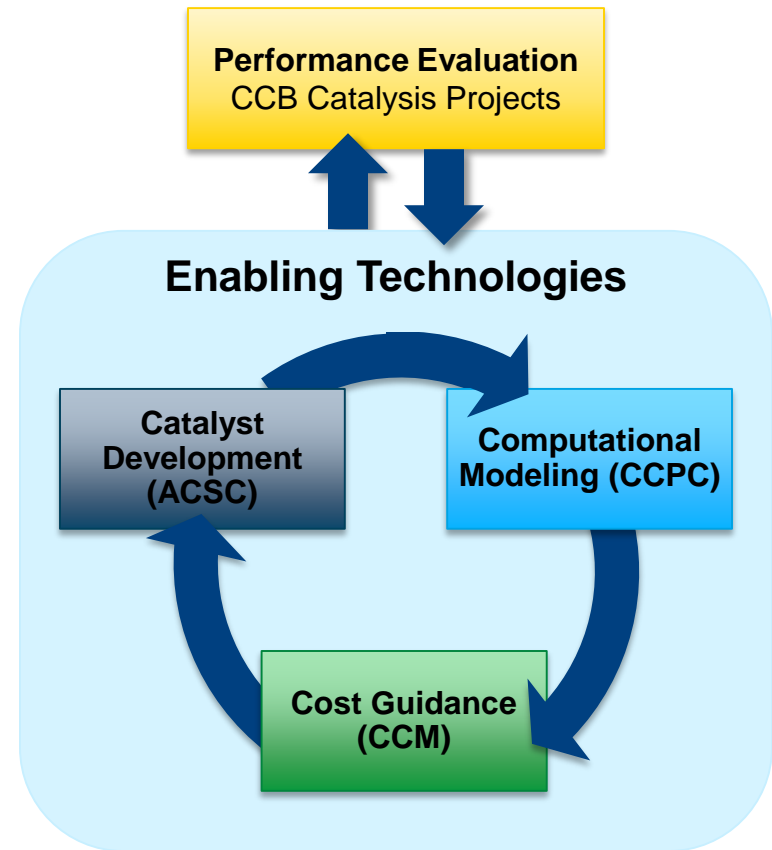
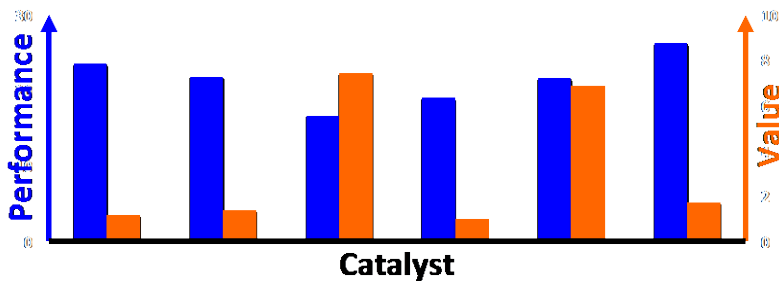
- Cradle-to-gate impacts of catalyst production
- GHG emissions (kg CO<sub>2</sub>e/kg catalyst)
- Air pollutant emissions (kg/kg catalyst)
- Water consumption (L/kg catalyst)
- Fossil fuel energy consumption (MJ/kg catalyst)

## Combined CCM/GREET Analysis enables:

- Determination of the ***relationship between cost and environmental impact*** for catalyst manufacture
- Identification of the major ***environmental and cost drivers*** of catalyst production and mitigation measures

# Summary

- A catalyst cost estimation tool has been developed **versatile materials pricing**, initial **processing cost estimation** methods, and **salvage value** of recycling.
- The CCM project enables an **assessment the value proposition** of pre-commercial catalysts developed within BETO's conversion portfolio
- **Rigorous industrial expert review** of the CCM tool has been conducted throughout development to ensure the relevance and veracity of the tool
- Future efforts aim to increase detail of existing modules, **interface with LCA frameworks**, and expand user-operability



# Acknowledgments

## Model Design

Kurt Van Allsburg  
Susan Habas  
Josh Schaidle  
Jesse Hensley



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## Web UI Design

Nick Wunder  
Kenny Gruchalla



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

## Recycling, Reclamation & Lifecycle Analysis

Lesley Snowden-Swan  
John Frye  
Eric Tan  
Jennifer Dunn  
Thathiana Pahola



**Energy Materials Network**  
U.S. Department of Energy

# Questions

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# Additional Slides

# Publications and Presentations

- Presentations
  - Frederick Baddour, Kurt Van Allsburg, Joshua Schaidle, “From Lab to Market: Designing a Cost Estimation Tool for Catalyst Scaling” *Frontiers in Biorefining*, **November 2016**, St. Simons Island, GA.
  - Kurt Van Allsburg, Joshua Schaidle, Frederick Baddour, “Development of a Catalyst Cost Estimation Tool to Reduce Information Barriers to Commercialization” *Invited talk at UC Berkeley*, **December 2016** Berkeley, CA.
- Publications
  - A. Dutta, J. A. Schaidle, D. Humbird, F. G. Baddour, A. Sahir; “Conceptual Process Design and Techno-Economic Assessment of Ex Situ Catalytic Fast Pyrolysis of Biomass: A Fixed Bed Reactor Implementation Scenario for Future Feasibility” *Top. Catal.* **2015**, 59, 1, 2-18.
  - J. A. Schaidle\*, S. E. Habas, F. G. Baddour, C. A. Farberow, D. A. Ruddy, J. E. Hensley\*, R. L. Brutchey, N. Malmstadt, H. Robota; “Transitioning Rationally Designed Catalytic Materials to Real “Working” Catalysts Produced at Commercial Scale: Nanoparticle Materials” *Catalysis, RSC Publishing*, **2017**, 29, 213, DOI: 10.1039/9781788010634-00213.

# Acronyms and abbreviations

<b>ACSC</b>	Advanced Synthesis and Characterization project
<b>ANL</b>	Argonne National Laboratory
<b>AOP</b>	Annual operating plan
<b>BETO</b>	Bioenergy Technologies Office
<b>CCB</b>	Chemical Catalysis for Bioenergy Consortium; ChemCatBio consortium
<b>CCM</b>	Catalyst Cost Model Development project
<b>CCPC</b>	Consortium for Computational Physics and Chemistry
<b>CFP</b>	Catalytic fast pyrolysis
<b>DOE</b>	U.S. Department of Energy
<b>EMN</b>	Energy Materials Network
<b>FY</b>	Fiscal year
<b>GGE</b>	Gallon gasoline equivalent
<b>HGF</b>	Hot gas filter
<b>HT</b>	Hydrotreating
<b>LANL</b>	Los Alamos National Laboratory
<b>LCA</b>	Life-cycle analysis

# Acronyms and abbreviations (cont.)

<b>MFSP</b>	Minimum fuel selling price
<b>MYPP</b>	Multi-Year Program Plan
<b>NETL</b>	National Energy Technology Laboratory
<b>NREL</b>	National Renewable Energy Laboratory
<b>Ni(acac)<sub>2</sub></b>	Nickel acetylacetonate
<b>Ni(OAc)<sub>2</sub></b>	Nickel acetate hydrate
<b>OAm</b>	Oleylamine
<b>ORNL</b>	Oak Ridge National Laboratory
<b>PFD</b>	Process flow diagram
<b>PNNL</b>	Pacific Northwest National Laboratory
<b>PPh<sub>3</sub></b>	Triphenylphosphine
<b>SOT</b>	State of technology
<b>TEA</b>	Techno-economic analysis
<b>TOP</b>	Trioctylphosphine
<b>VPU</b>	Vapor phase upgrading
<b>wt%</b>	Percentage by weight