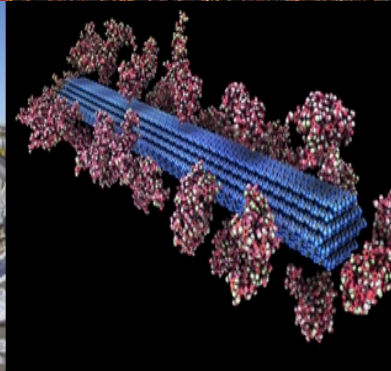




U.S. DEPARTMENT OF
ENERGY

Energy Efficiency &
Renewable Energy



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 7th, 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

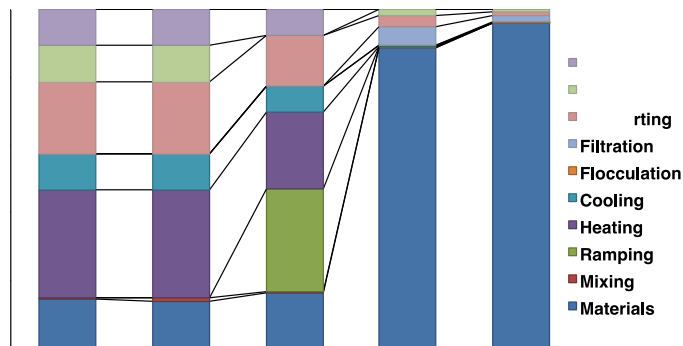
*FY17 operating budget reduced to \$125k

Overview: The Catalyst Cost Model (CCM)

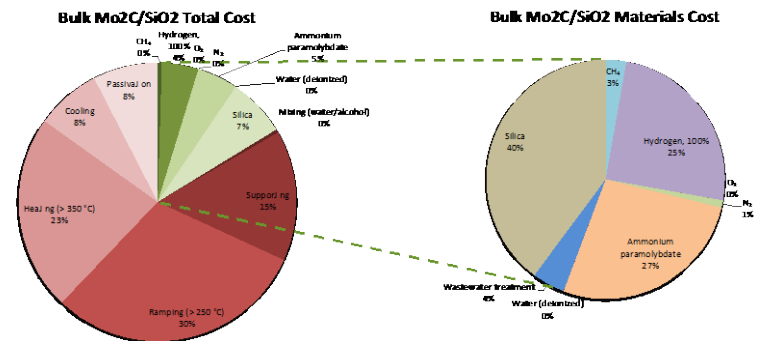
What information does the CCM provide to researchers?

- **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)

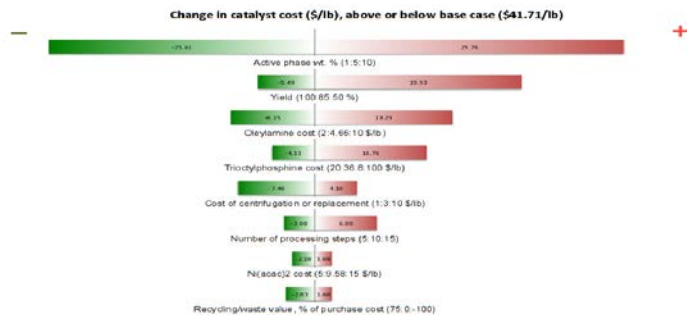


Overview: The Catalyst Cost Model (CCM)

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

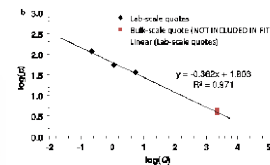
Cost Sensitivity Analysis (assessing commercialization potential and risks)



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

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

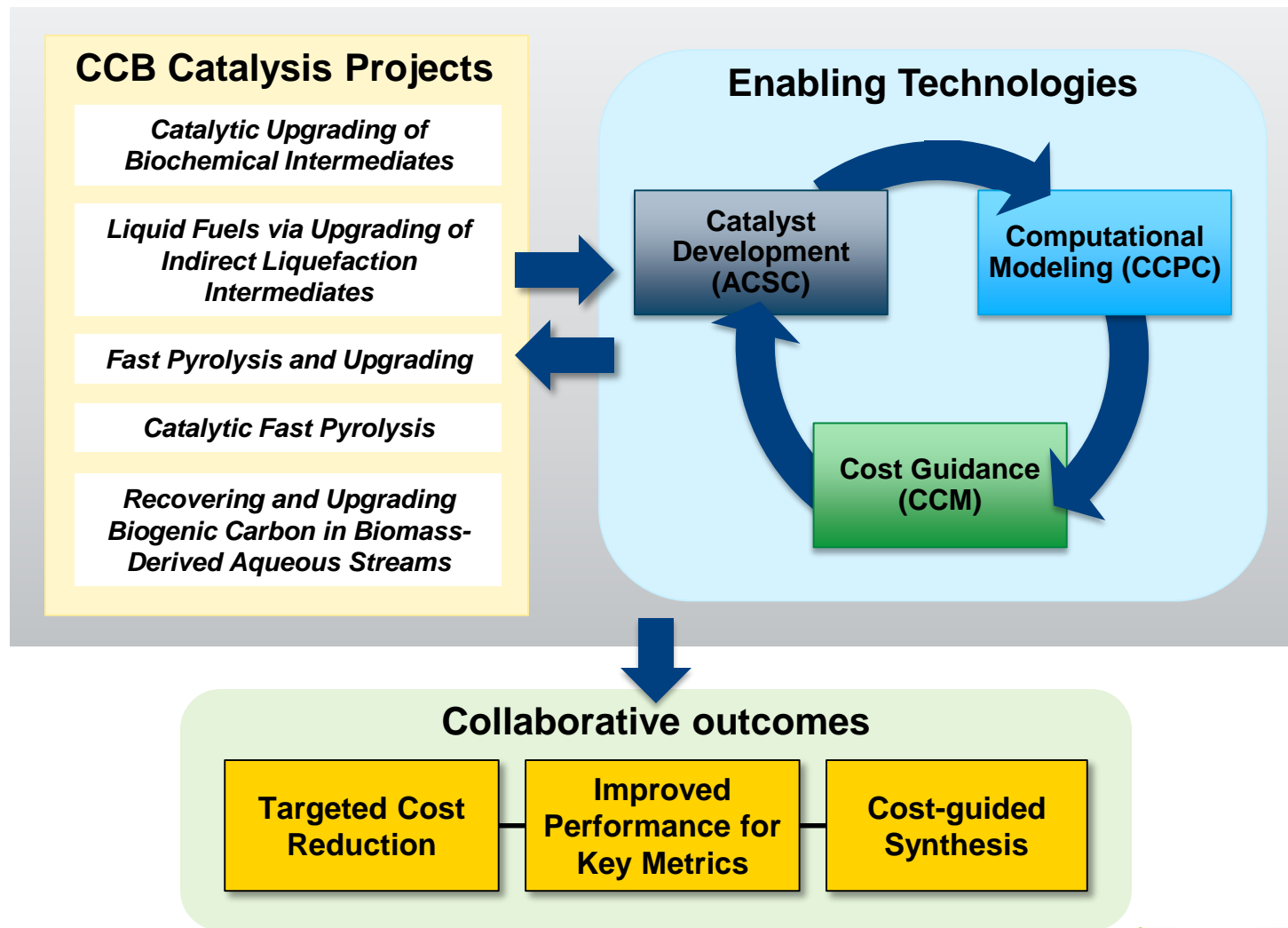
Uniting	Quantity	Unit	MW (g/mol)	Concentration	Quantity to be	Unit Price	Total Cost per
Reagent for	0.001	kg	200	0.0045	225.000	0.08	18.000
Reaction feed	0.001	kg	100	0.0045	225.000	0.08	18.000
	0.001	kg	100	0.0045	225.000	0.08	18.000
	0.001	kg	100	0.0045	225.000	0.08	18.000



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

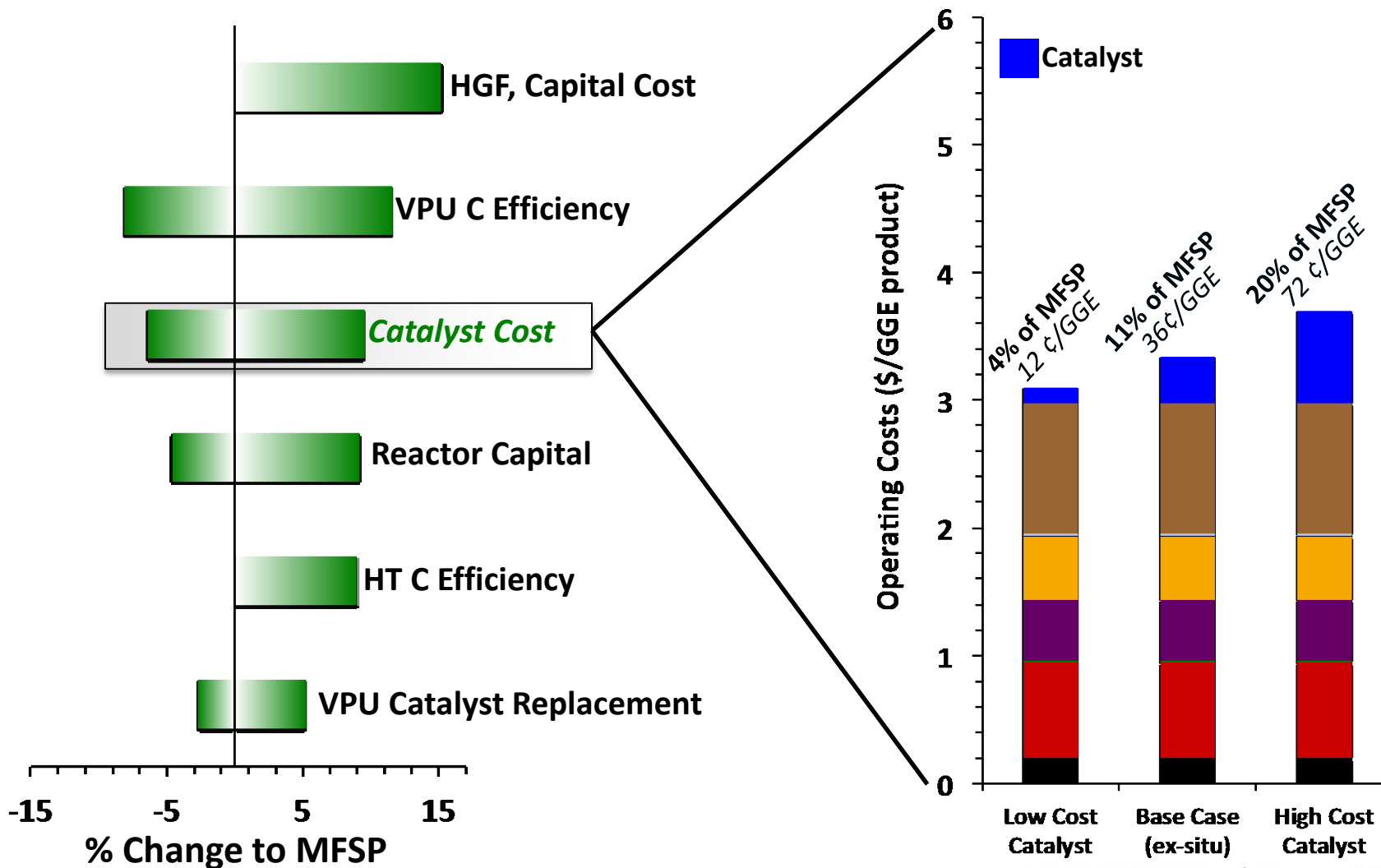
Project overview – Integrated approach

Establish an integrated and collaborative portfolio of catalytic and enabling technologies



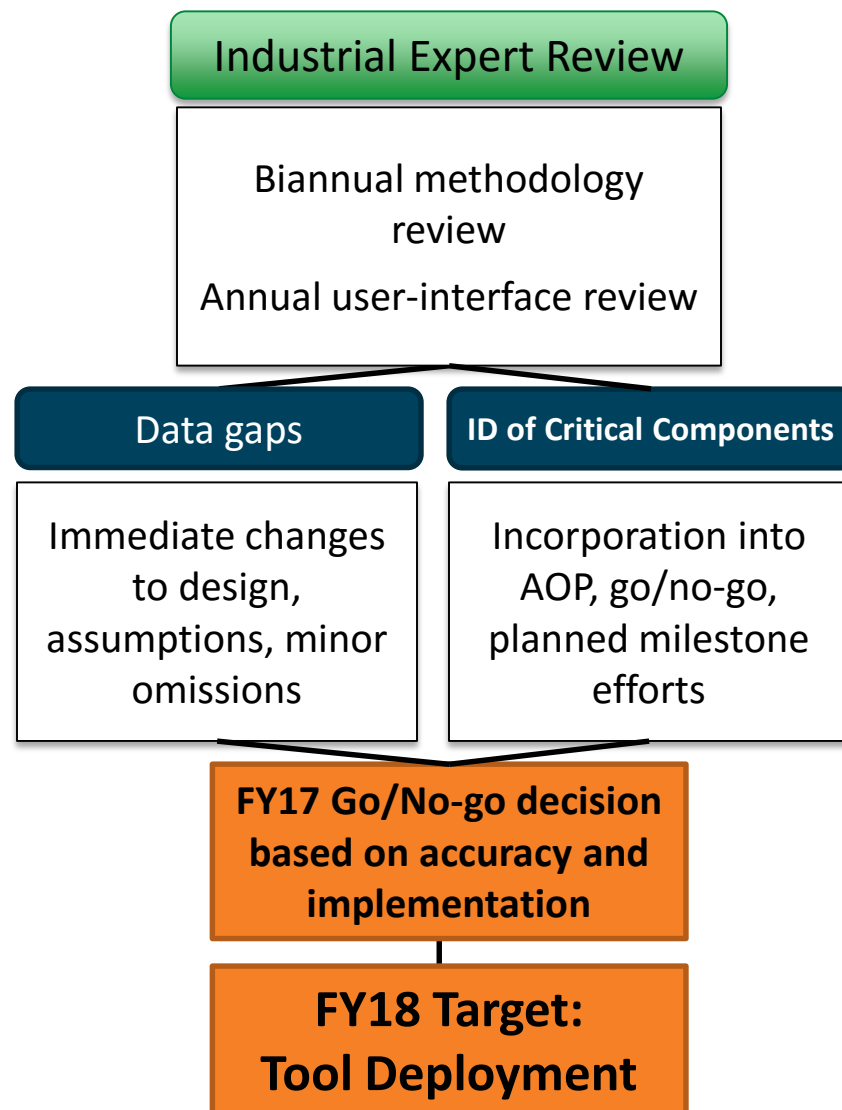
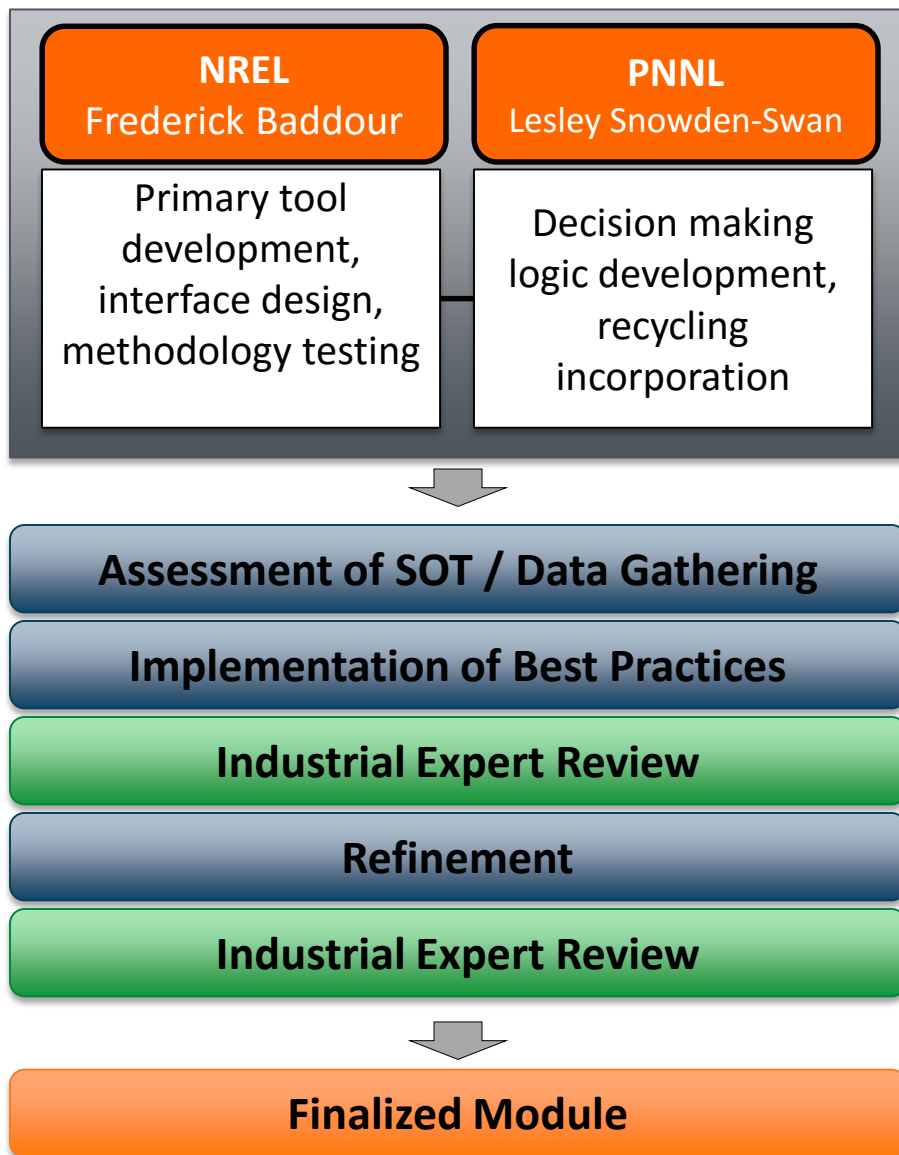
Overview: Impact of Uncertain Catalyst Cost

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

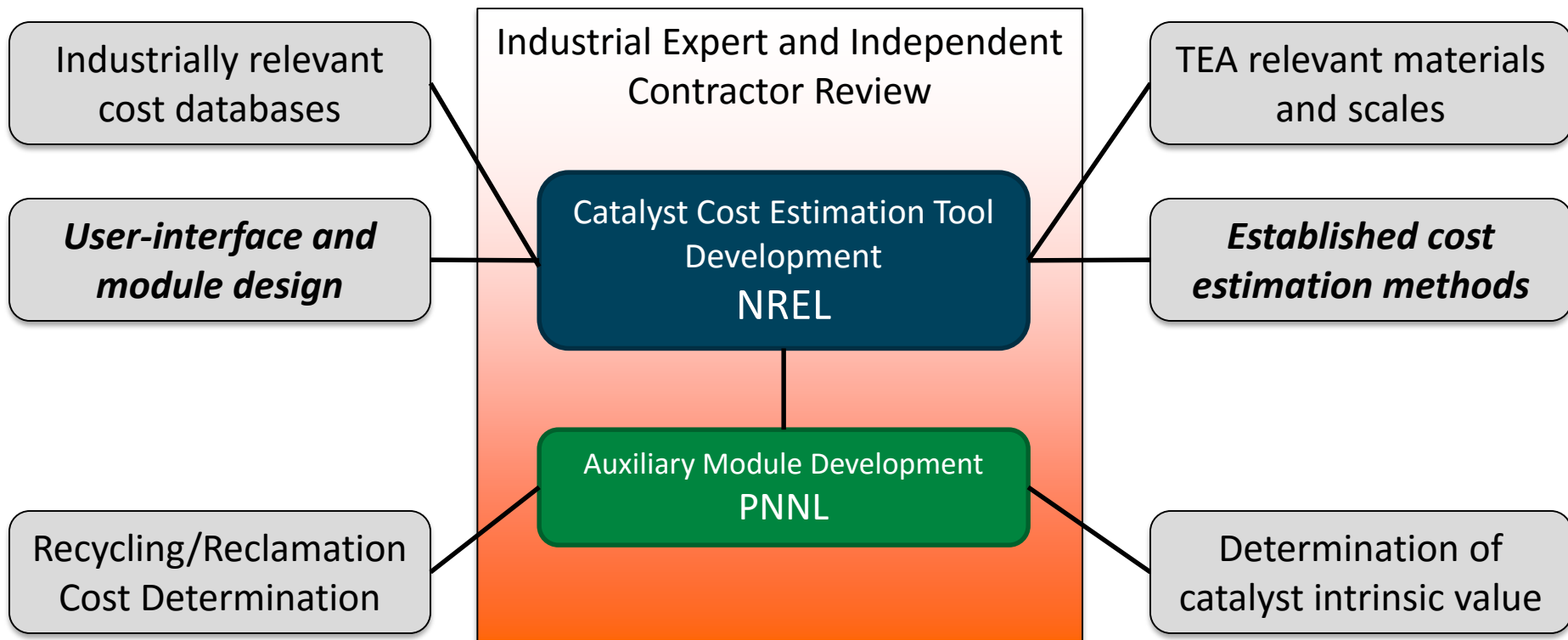


Management Approach

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)

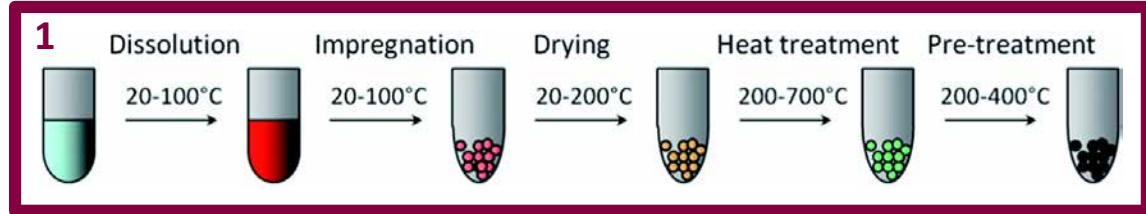
Method Development: Building the Catalyst Cost Estimation Tool

Implementation: Utilization of the Tool

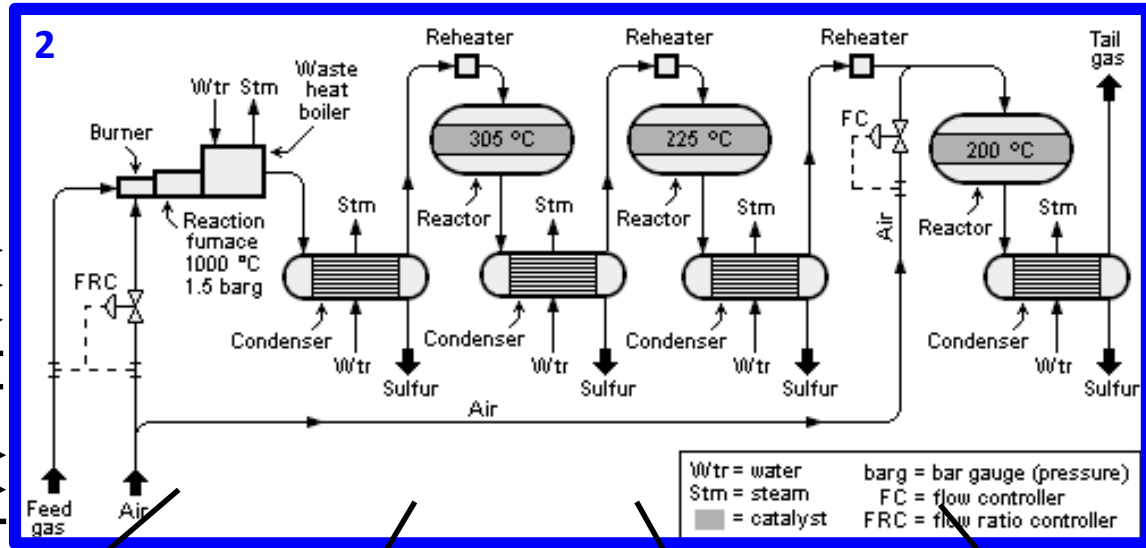
Technical Approach: Determining Cost Contributors

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

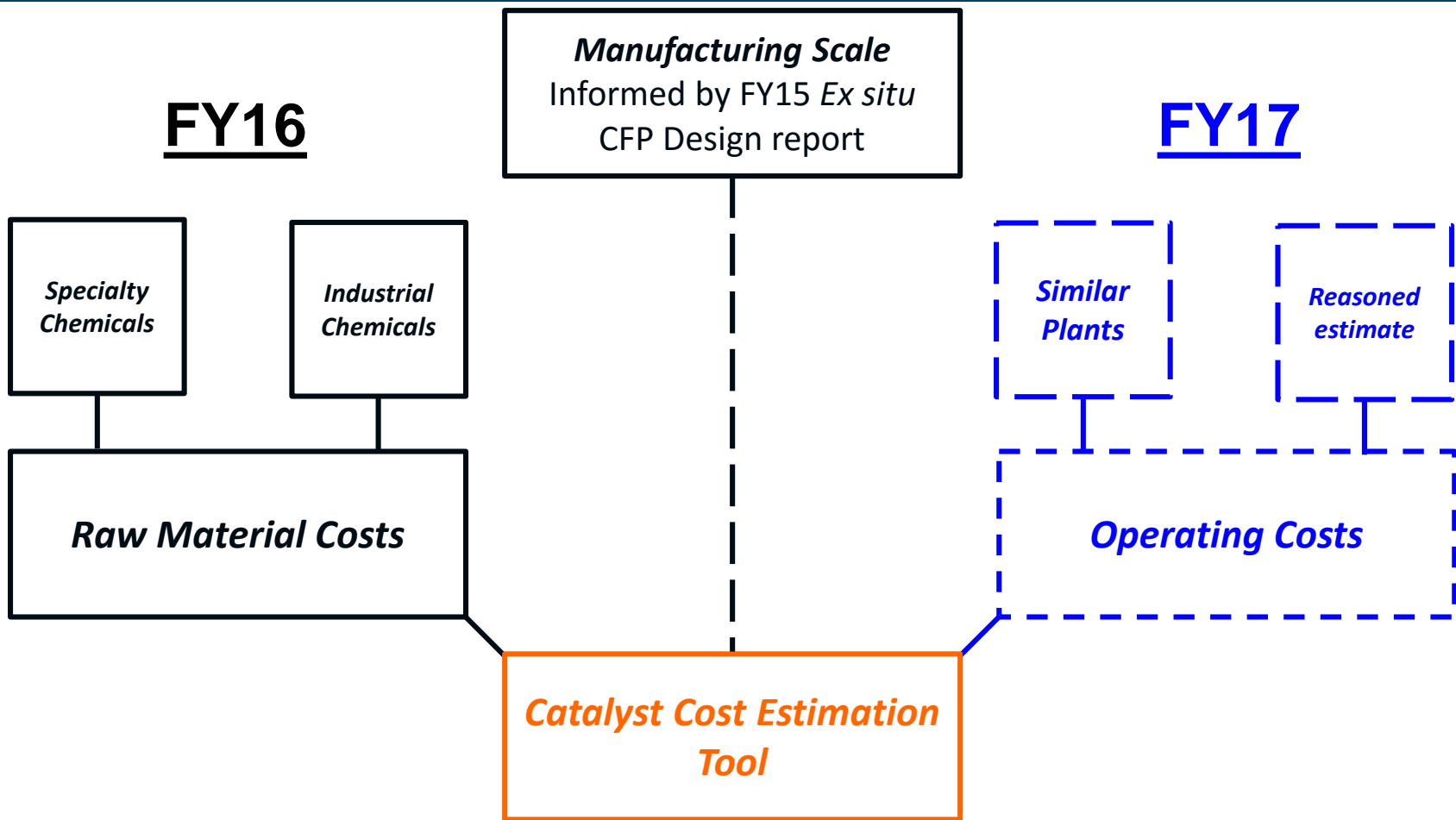
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Equipment Costs
- Production Site**
 - Buildings
 - Land
 - Design & Constr.

↓

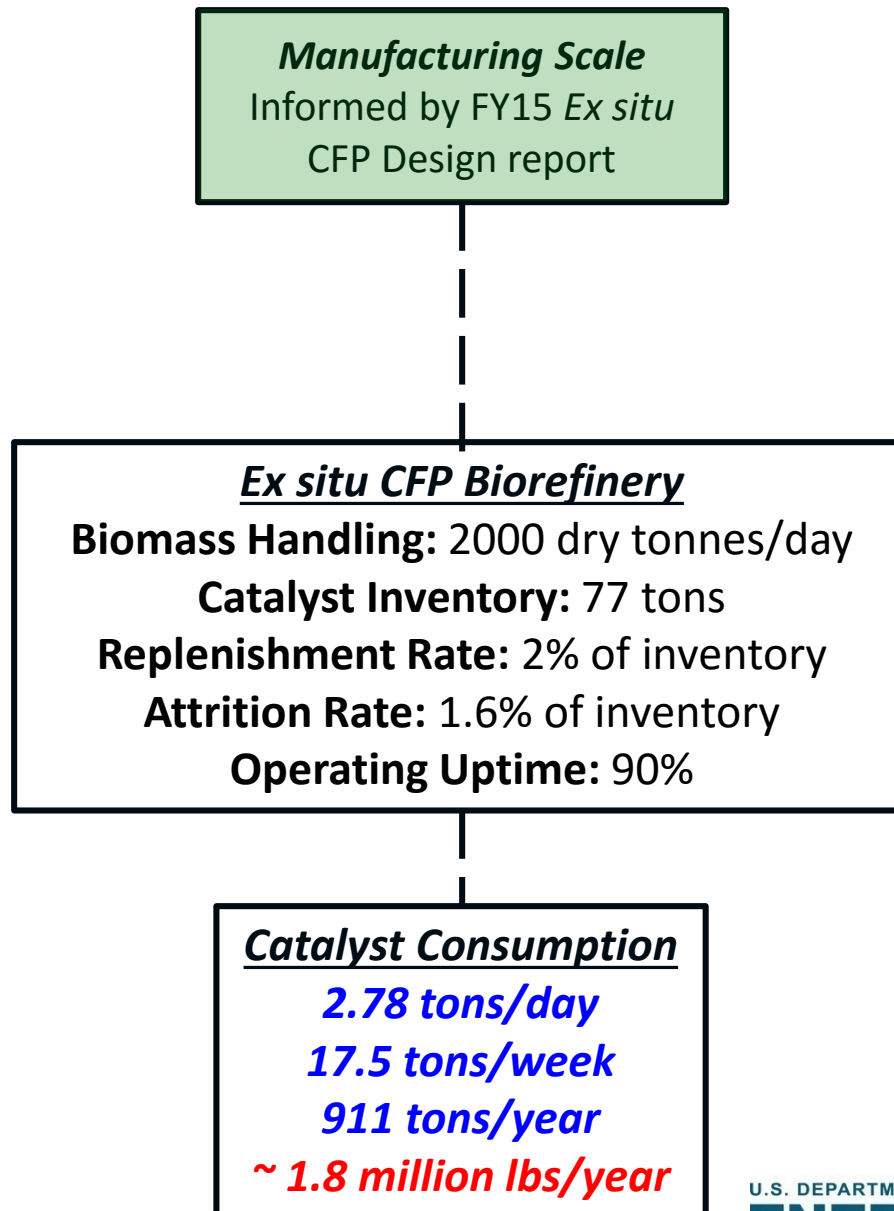
Site Costs

Research Progress: Building a Framework



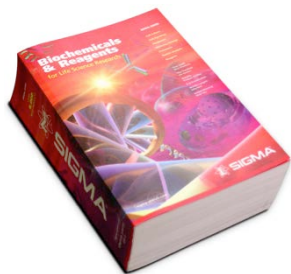
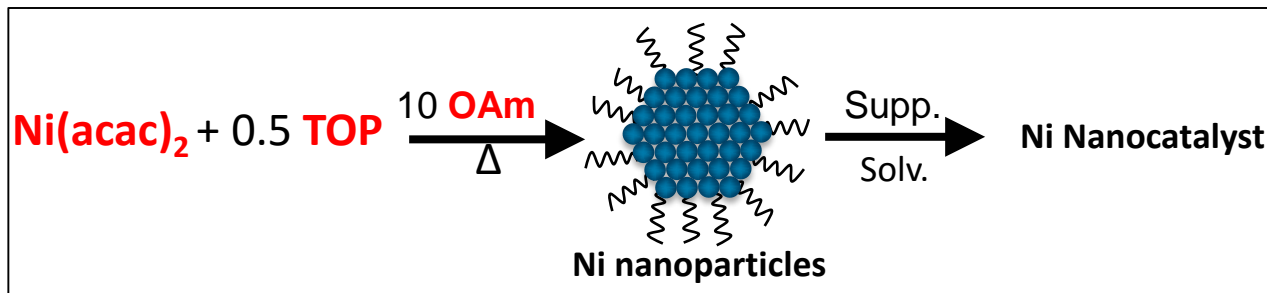
***3 modes of raw material cost entry incorporated into the CCM tool:
bulk quote, Integrated open-source database, lab-to-pilot extrapolation***

Research Progress: Building a Framework



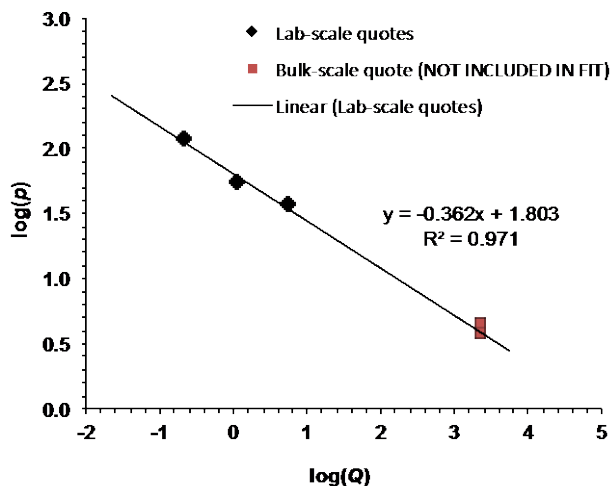
Research Progress: Laboratory to Plant Material Pricing

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



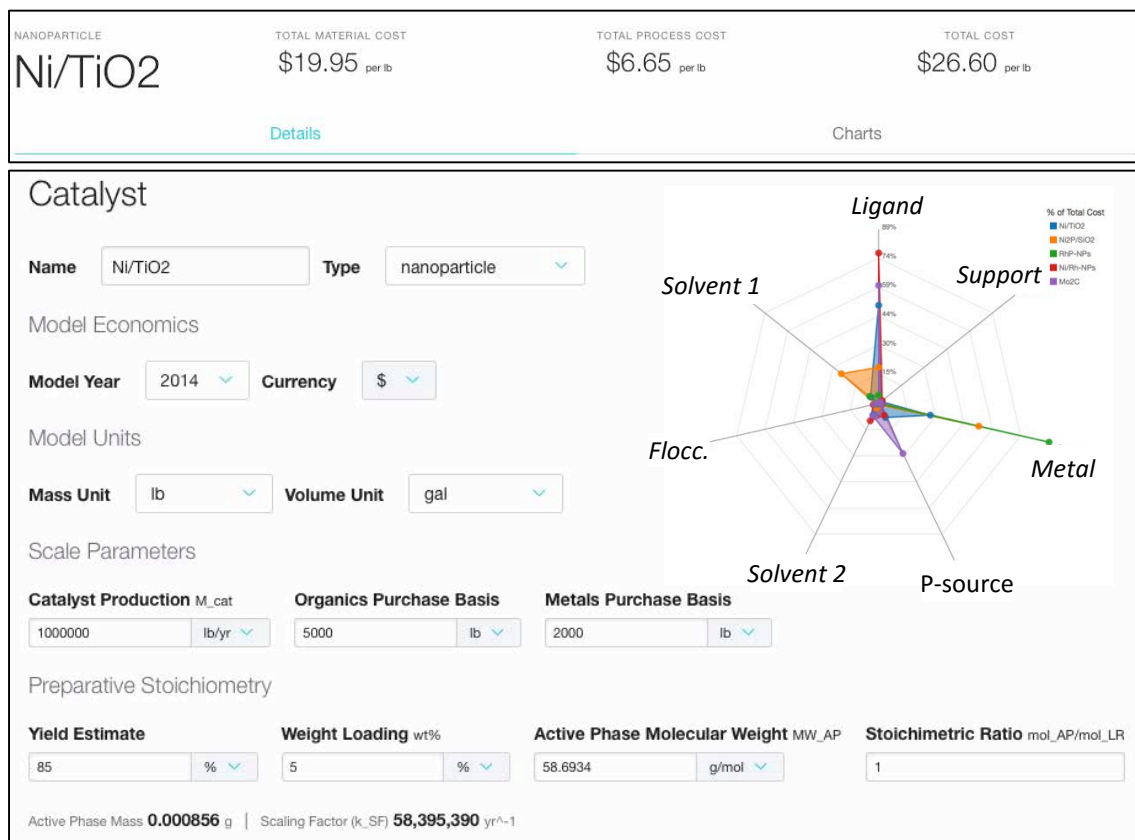
Quote Information (Inputs)		
Quantity, Q	Units	Total Price, P (\$)
100	g	25.72
500	g	60.20
2.5	kg	200.09

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			



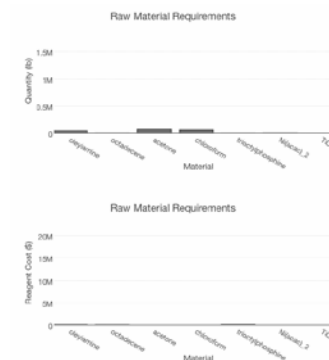
- Determination of **price as a function of scale**
- Provides reasonable estimation of **unconventional materials**
- **Expanded the scope** of the CCM tool to include pre-commercial catalysts requiring specialty chemicals

Research Progress: UI Design



Yield Estimate **85 %**

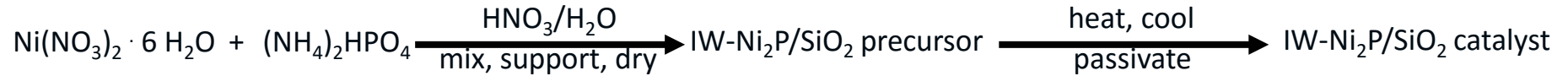
Weight Loading **0.9 %**



Our Web UI Offers:

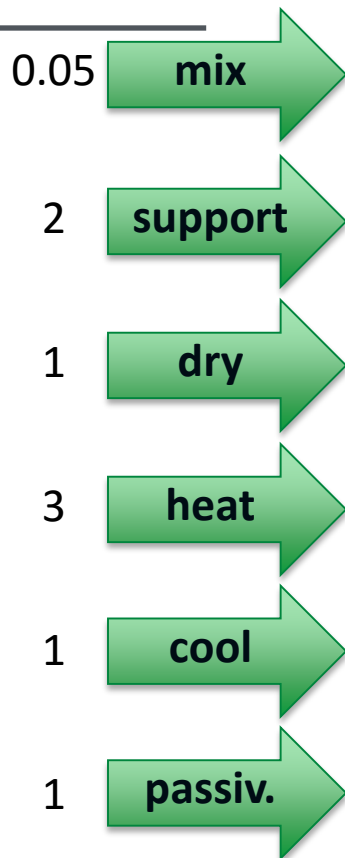
- **Seamless user experience** with the same spread-sheet core functionality
- **Powerful visualization** tools for cost comparison between catalysts
- **Real-time** variable adjustment
- **Up-to-date** pricing information from public databases
- **Exportable** cost data

Research Progress: A Complete Scaffold



Processing Steps

Cost (\$/lb)



Catalyst	Material	Function	density	MW of precursor	amount	unit
<i>IW-Ni₂P/SiO₂</i>	water	solvent		1	35	mL
	ammonium phosphate dibasic	P-source			0.89	g
	Conc. Nitric Acid	additive	1.51		1	mL
	Ni(NO ₃) ₂ · 6 H ₂ O	metal source		290.79	1.96	g
	Sipernat-22	support			9.50	g
	Final Catalyst				10.00	g

↓ Scaled by basis for purchase

Materials	Quantity (Lb)
water	135830
ammonium phosphate dibasic	3454
Conc. Nitric Acid	5860
Ni(NO ₃) ₂ · 6 H ₂ 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

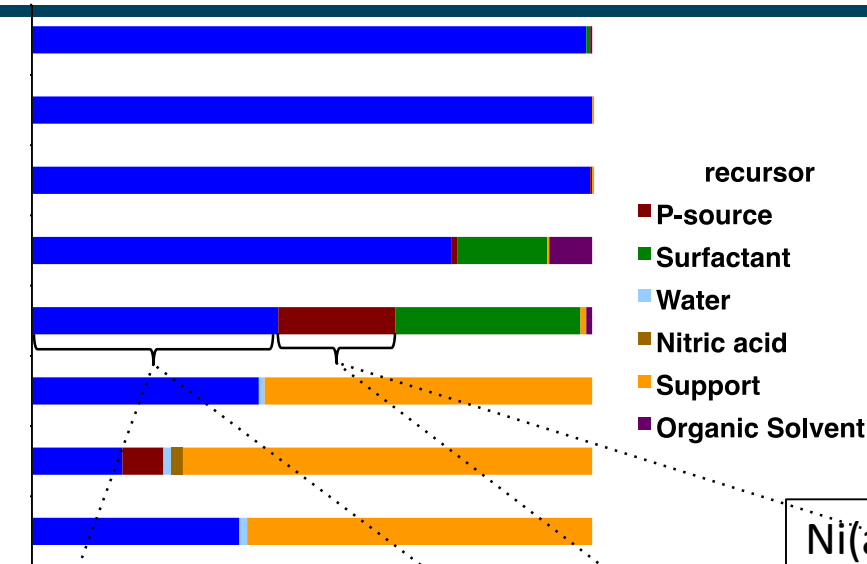
\$10/lb IW-Ni₂P/SiO₂

Research Progress Roadmap

Method Development: Building the Catalyst Cost Estimation Tool

Implementation: Utilization of the Tool

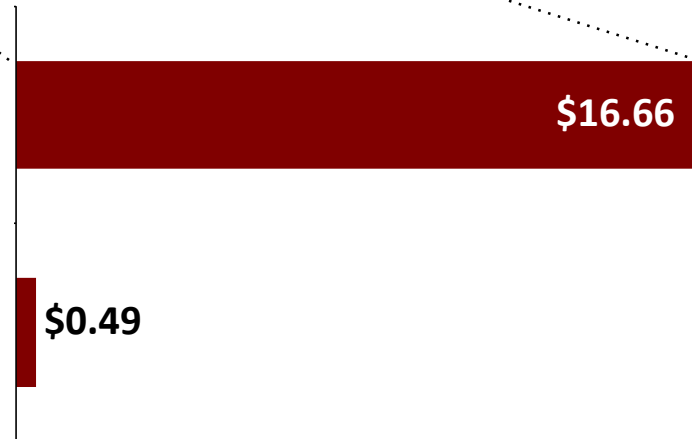
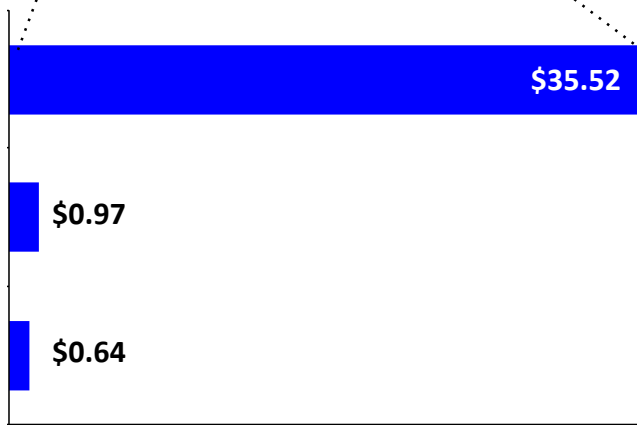
Research Progress: *Ex-situ* CFP Case Study



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

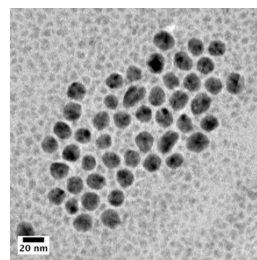
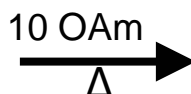
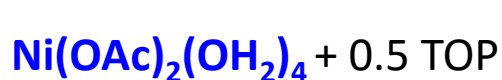
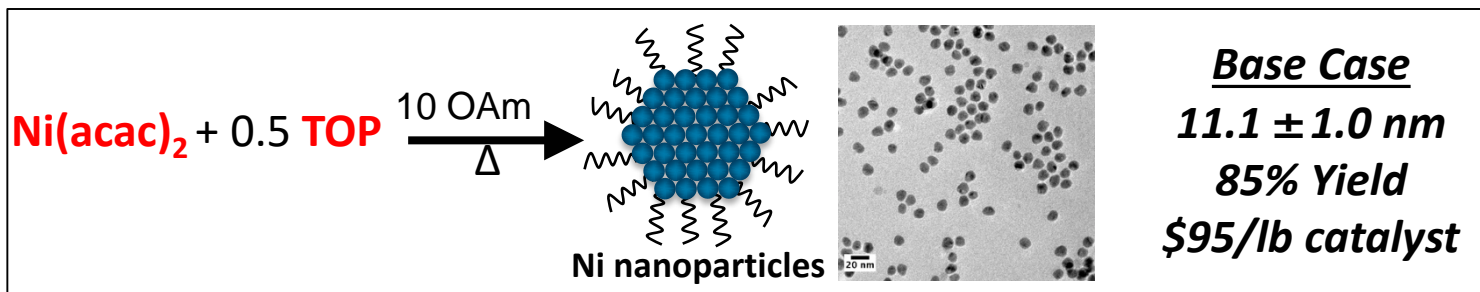
Ni(acac)₂ → Ni(OAc)₂ : **38% mat. cost red.**
 TOP → PPh₃ : **18% mat. cost red.**

Materials Cost Allocation

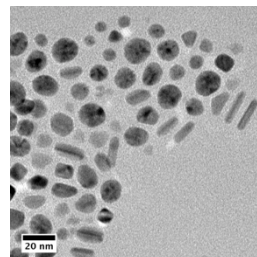
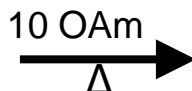


Relevance: Cost-effective Synthesis with the ACSC

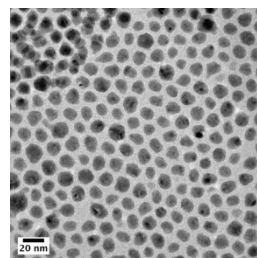
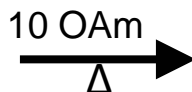
Utilizing the CCM to directing synthesis towards lower cost targets



19 nm
75% Yield
\$65/lb catalyst

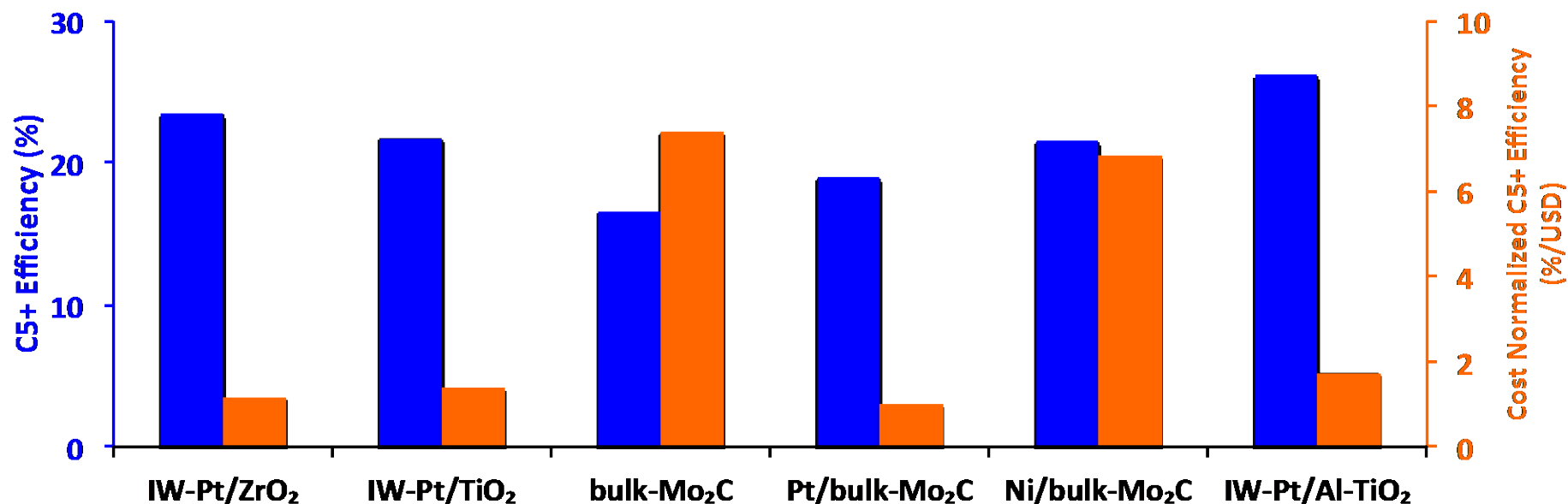


22 nm
50% Yield
\$64/lb catalyst



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

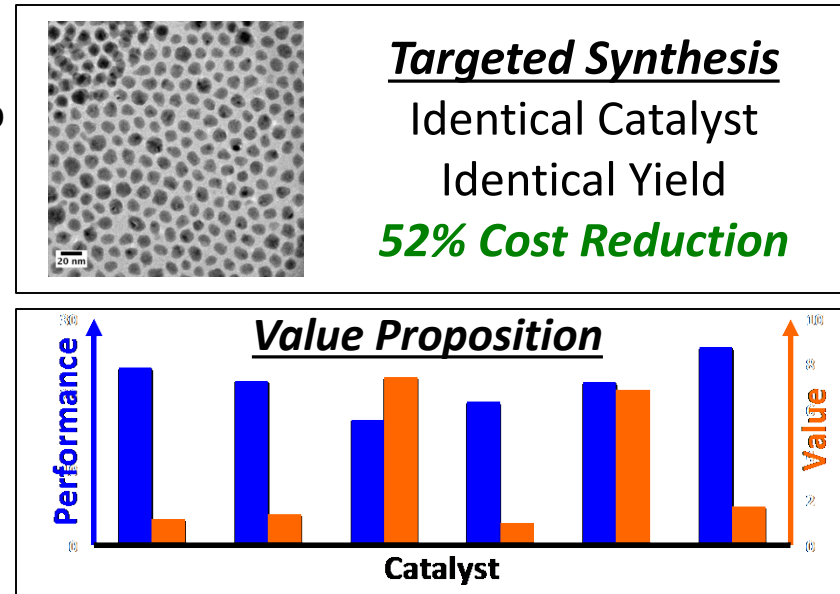
The CCM can be used to **guide materials development** much like TEA guides research through performance targets

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

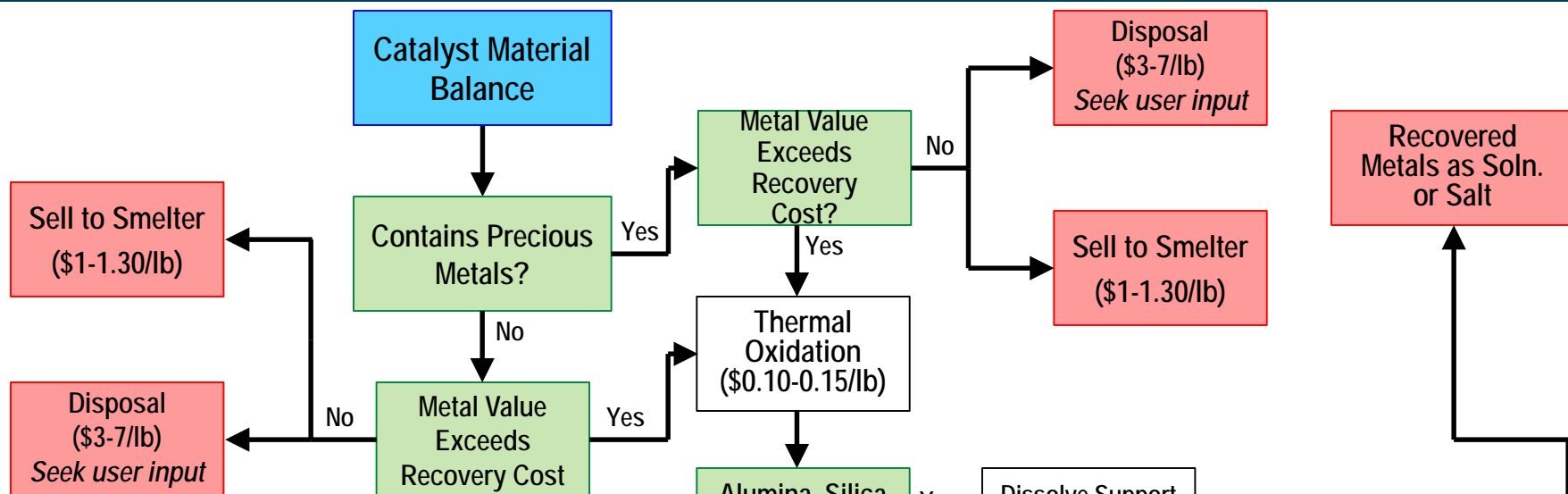


Table 1. Preliminary data supporting catalyst salvage value estimation in the CCM.

Metal	Typical Recovery (%)
Iron	60
Cobalt	80
Nickel	80
Copper	^a
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 ^b

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: ^aCopper is difficult to separate from precious metals during recovery. ^bFew 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: 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

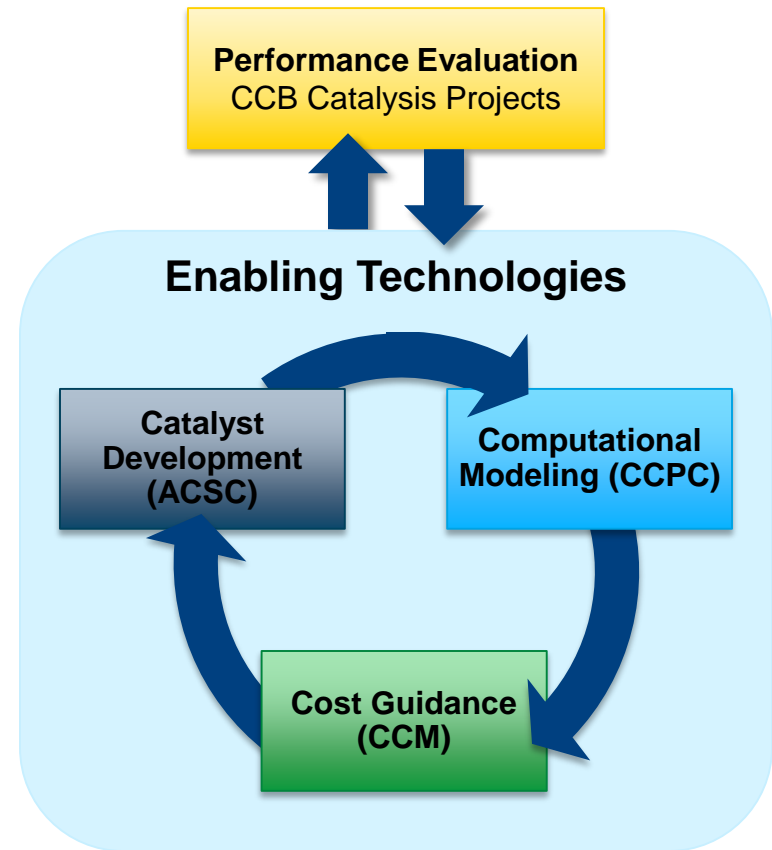
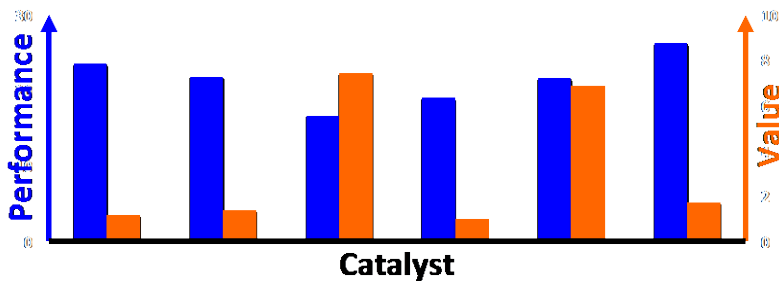
- Cradle-to-gate impacts of catalyst production
- GHG emissions (kg CO₂e/kg catalyst)
- Air pollutant emissions (kg/kg catalyst)
- Water consumption (L/kg catalyst)
- Fossil fuel energy consumption (MJ/kg catalyst)

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

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

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

Acronyms and abbreviations (cont.)

MFSP	Minimum fuel selling price
MYPP	Multi-Year Program Plan
NETL	National Energy Technology Laboratory
NREL	National Renewable Energy Laboratory
Ni(acac)₂	Nickel acetylacetonate
Ni(OAc)₂	Nickel acetate hydrate
OAm	Oleylamine
ORNL	Oak Ridge National Laboratory
PFD	Process flow diagram
PNNL	Pacific Northwest National Laboratory
PPh₃	Triphenylphosphine
SOT	State of technology
TEA	Techno-economic analysis
TOP	Trioctylphosphine
VPU	Vapor phase upgrading
wt%	Percentage by weight