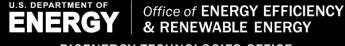


## Catalyst Cost Model Development (CatCost)

WBS # 2.5.4.301/302

U.S. Department of Energy (DOE) Bioenergy Technologies Office (BETO) 2019 Project Peer Review

Frederick Baddour – NREL Lesley Snowden-Swan – PNNL



**BIOENERGY TECHNOLOGIES OFFICE** 



## **Quad Chart Overview**

### Timeline

- Project Start: October 1, 2015
- Project End: September 30, 2018
- Percent Complete: 100%

	Total Costs Pre FY17	FY17 Costs	FY18 Costs	Total Planned Funding (FY19)
DOE Funded	\$225k	\$125k	\$300k	\$20k
Project Cost Share	N/A	N/A	N/A	N/A
Partners (FY16–FY18): NREL: \$650k (65%)				

**PNNL**: \$225k (35%)

### Barriers addressed

<u>At-E.</u> Quantifying economics of bioenergy to reduce risk and clarify value proposition <u>**Ct-G.**</u> Decreasing the Time and cost to developing novel industrially relevant catalysts

### Objective

The objective of this project is to develop a modular and flexible tool for accurately estimating the cost of precommercial catalyst manufacture to be distributed to the public free-of-charge as a web-based interface together with a downloadable spreadsheet-based model. This publiclyavailable model and the methodologies employed will be published online and a corresponding peer-reviewed article will be published demonstrating the ability of the tool to accurately estimate the costs of existing commercial catalysts to within 20%. This excel- and web-based tool will be the first of its kind to enable rapid assessment of the economics and environmental impacts of pre-commercial catalysts at industrially relevant scales.

### End of Project Goal

Develop an online and free-of-charge <u>catalyst cost</u> <u>estimation tool</u> to enable rapid and informed costbased decisions in research and commercialization of catalysts 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 CO<sub>2</sub> 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)

**Project Goal** – Develop a <u>catalyst cost estimation tool</u> 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

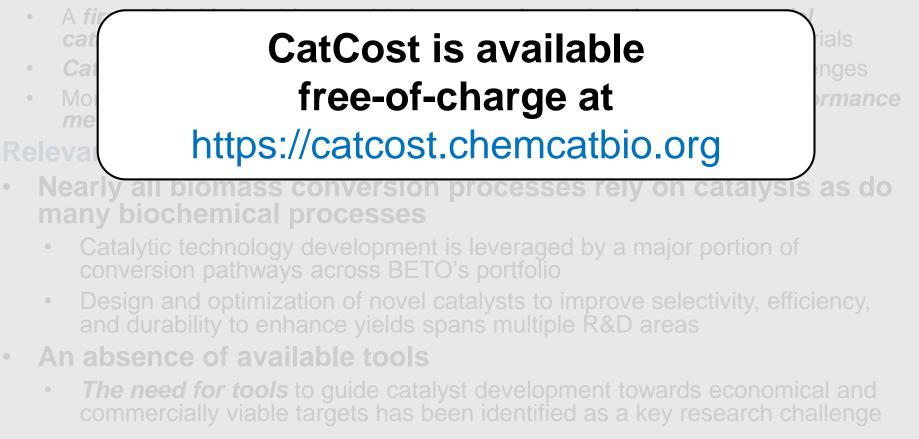
• **The need for tools** to guide catalyst development towards economical and commercially viable targets has been identified as a key research challenge

## **Goal Statement and Outcomes**

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

### **Project Outputs and Outcomes**

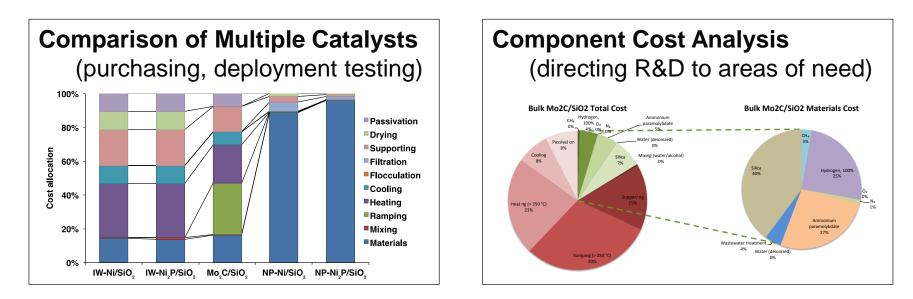
• An industrially validated and publicly-available catalyst cost estimation tool



## 1 – Overview of CatCost

What information does *CatCost* provide to researchers?

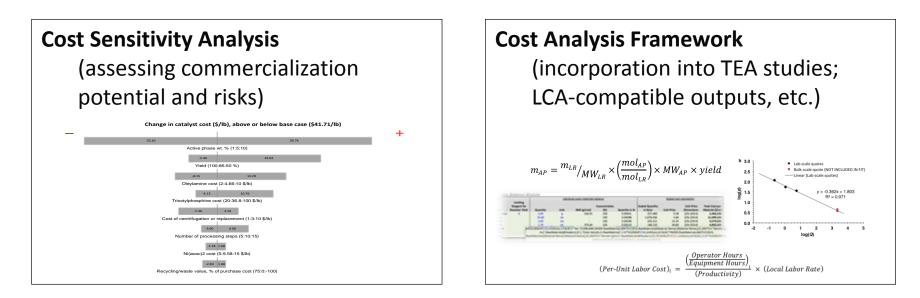
- Estimated costs of manufacture for pre-commercial catalysts
- Identification of areas of greatest cost
- Identification of *roadblocks to scaling* and suggested mitigation strategies
- A standard metric for comparing catalyst synthesis methods and materials



## 1 – Overview of CatCost

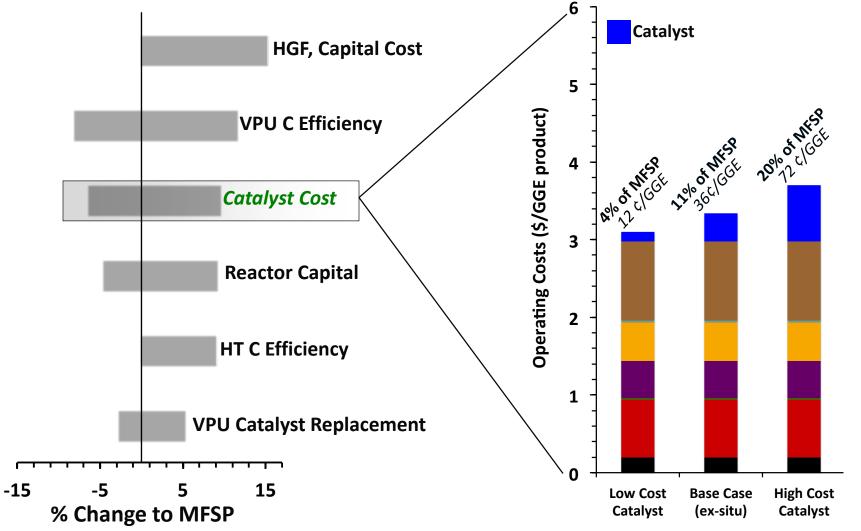
### What does this information enable researchers to do?

- 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



## 1 – The Uncertainty of Catalyst Cost

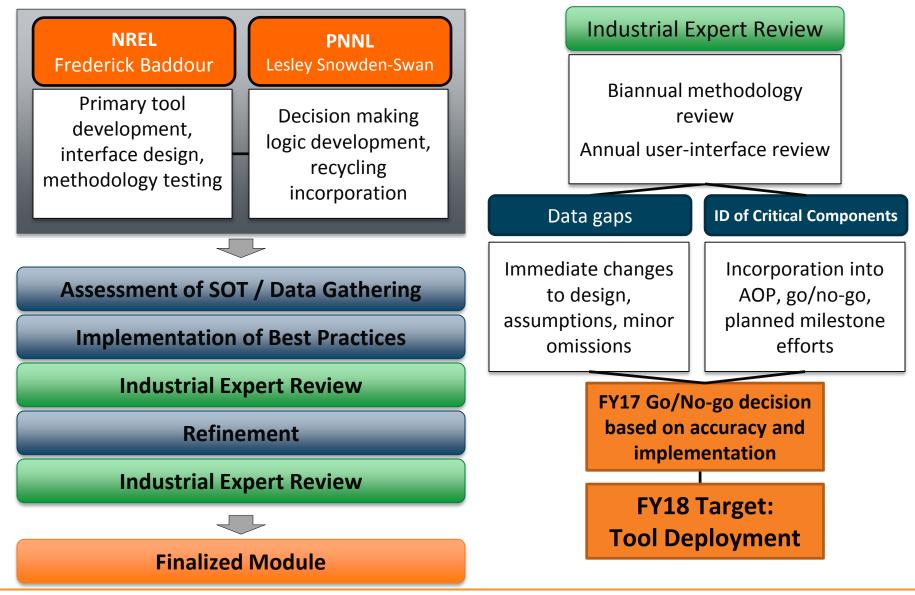
**Objective**: To **reduce uncertainty** associated with <u>pre-commercial</u> catalyst cost in techno-economic analysis and **guide cost driven catalyst development** 



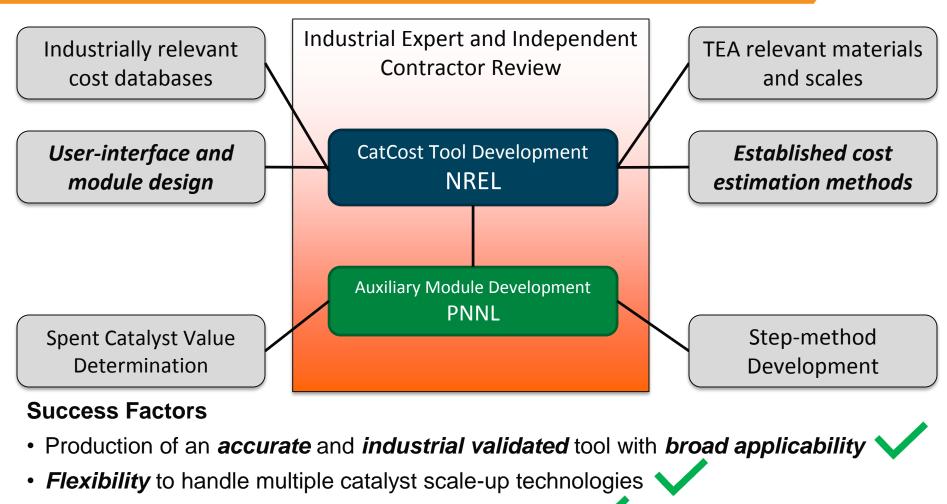
Process Design and Economics for the Conversion of Lignocellulosic Biomass to Hydrocarbon Fuels Thermochemical Research Pathways with In Situ and Ex Situ Upgrading of Fast Pyrolysis Vapors Abhijit Dutta, Asad Sahir, Eric Tan, David Humbird, Lesley J. Snowden-Swan, Pimphan Meyer, Jeff Ross, Danielle Sexton, Raymond Yap, and John Lukas

## 2 – Management Approach

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

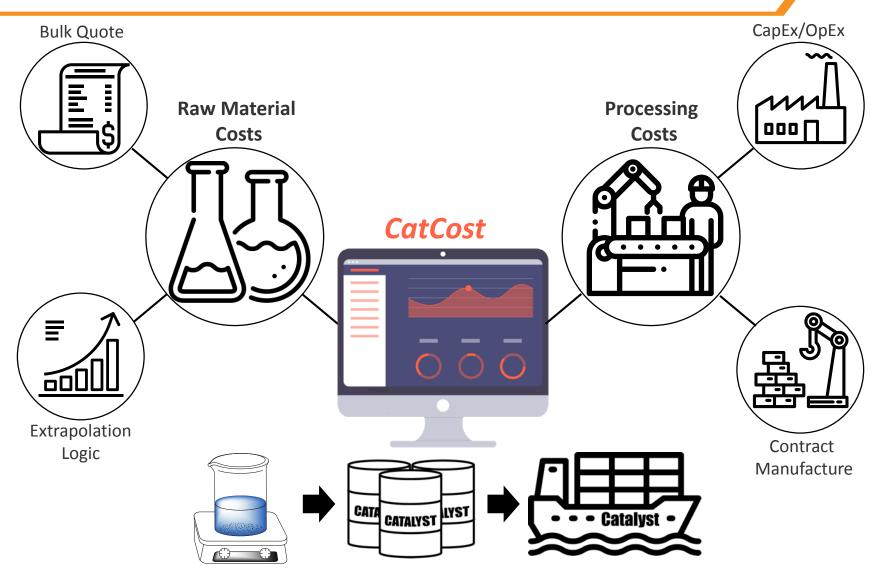


## 2 – Technical Approach



- Informative visualization and comparative tools
- Public release and consumption
- Internal deployment throughout BETO's core catalysis projects

## 2 – Approach: The CatCost Framework

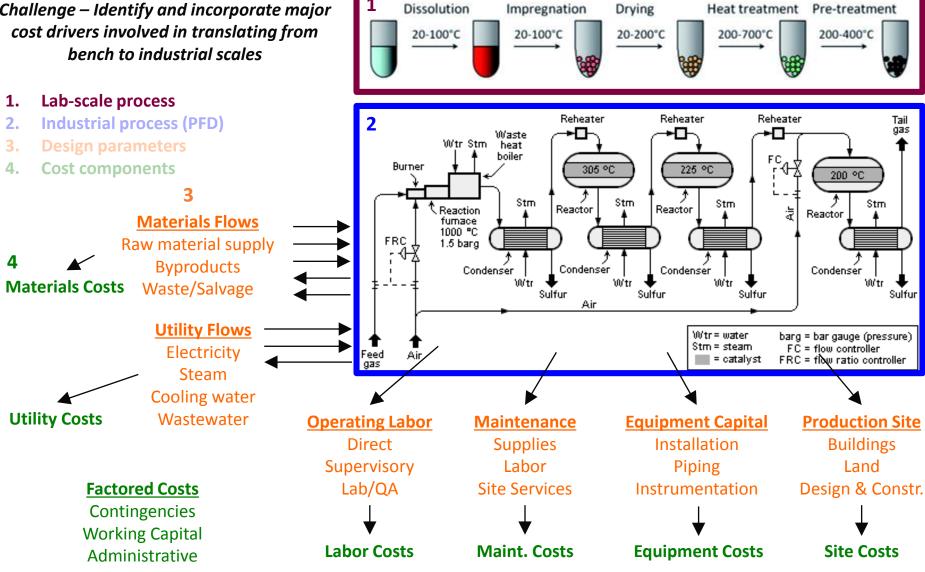


**CatCost** incorporates industry standard methods to accurately estimate manufacturing costs across scales

## 2 – Determining Cost Contributors

1

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



### **Primary costs – estimate in detail:**

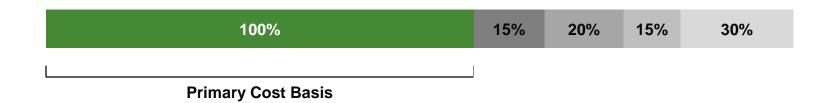
- List of equipment, including purchase cost
- Direct labor (e.g. equipment operator) requirements and cost

### **Secondary costs – estimate using "factors":**

CapEx: installation, piping, buildings, etc.

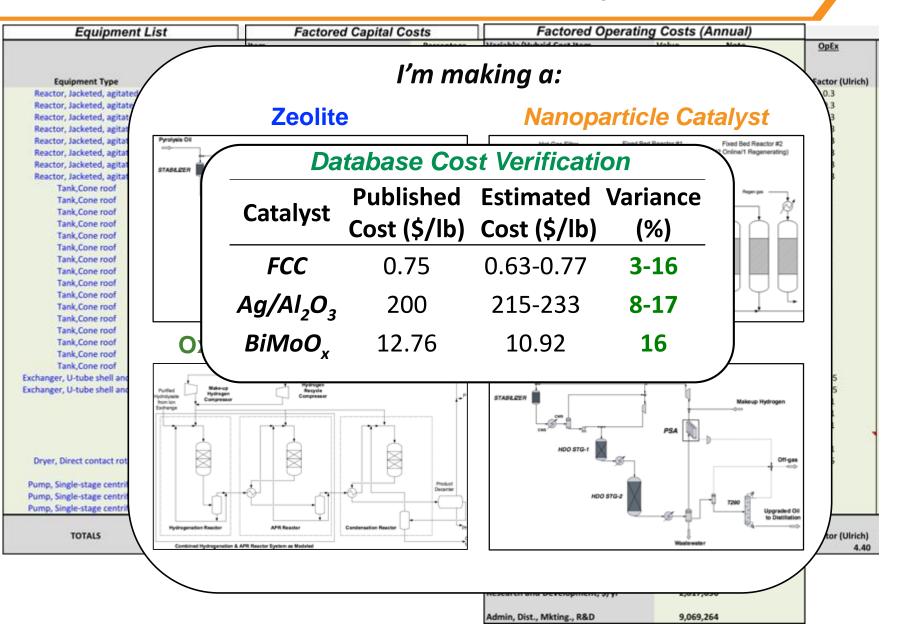
OpEx: supervisory, administration, lab, insurance, etc.

These factors are widely available in process design textbooks

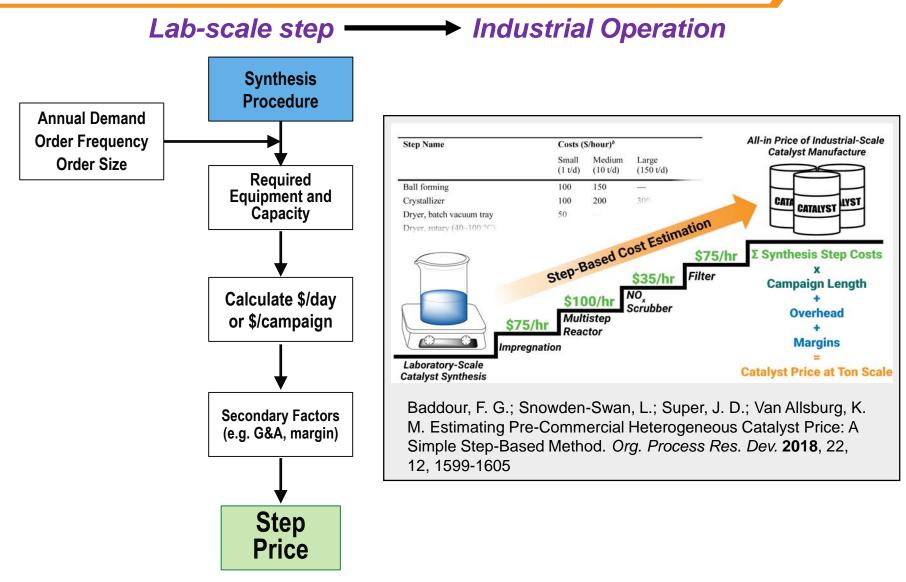


## Factored approach enables a high level of customization but requires expertise in process design

### 3 – CapEx & OpEx Factors: Manufacturing Templates



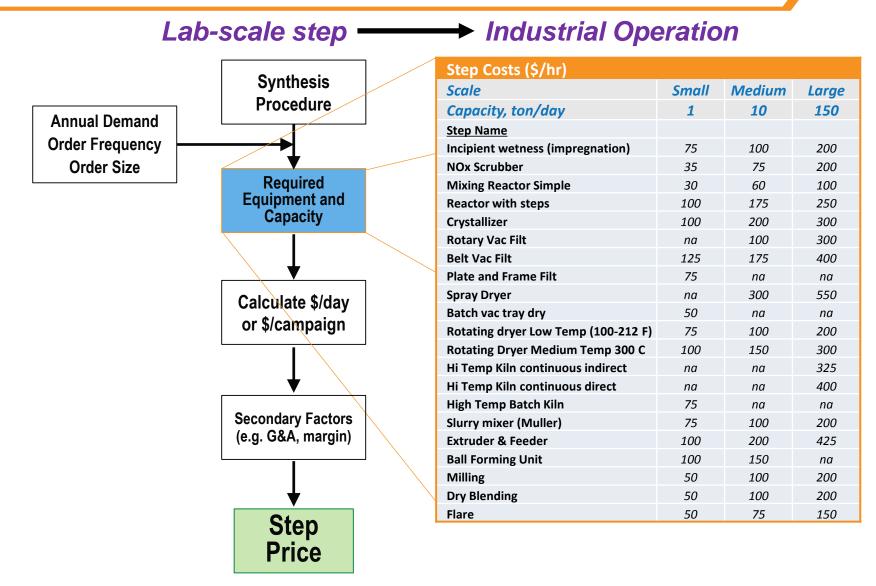
## 3 – CatCost Step Method (Toll Manufacturing)



Included databases of processing steps, estimated margins and hourly costs to simplify processing cost estimation

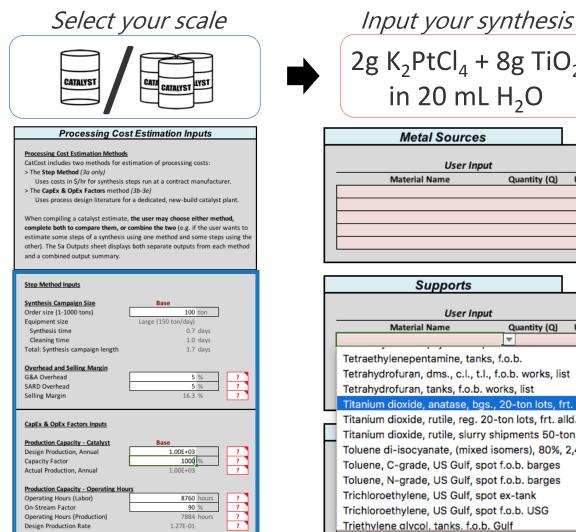
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## 3 – CatCost Step Method (Toll Manufacturing)



Included databases of processing steps, estimated margins and hourly costs to simplify processing cost estimation

## 3 – CatCost In Practice



mpar your synthesis
$2g K_2 PtCl_4 + 8g TiO_2$ in 20 mL H <sub>2</sub> O
Metal Sources
User Input Material Name Quantity (Q) Unit
Supports

#### User Input Material Name Quantity (Q) Unit $\nabla$ Tetraethylenepentamine, tanks, f.o.b. Tetrahydrofuran, dms., c.l., t.l., f.o.b. works, list Tetrahydrofuran, tanks, f.o.b. works, list Titanium dioxide, anatase, bgs., 20-ton lots, frt. alld. Titanium dioxide, rutile, reg. 20-ton lots, frt. alld. Titanium dioxide, rutile, slurry shipments 50-ton lots, dr Toluene di-isocyanate, (mixed isomers), 80%, 2,4- and 2 Toluene, C-grade, US Gulf, spot f.o.b. barges Toluene, N-grade, US Gulf, spot f.o.b. barges Trichloroethylene, US Gulf, spot ex-tank Trichloroethylene, US Gulf, spot f.o.b. USG Triethvlene alvcol. tanks. f.o.b. Gulf

### Select a Template





	Step Method: Inputs and	Total Processing Costs
	From CatCost "1 Inputs" Sheet Order size in tons Order size in model units Equipment size Synthesis campaign length	100 ton  Large (150 ton/day) 1.666666667 days
	Select a Process Template or Choose "Custo	om Step Process"
	Custom Step Process FCC Catalyst (USY w/ RE) Magnesia/Alumina Metal Carbide (Bulk) Metal Carbide on Metal Oxide	slate > /hr slate > /campaign slate > /catalyst
s	Metal (Earth Abundant) on Metal C Metal (PGM) on Carbon	ocess and Process T
Sh U sh	Metal (PGM) on Metal Oxide Red Mud Zeolite Beta (Bulk) Zeolite Beta with Metal Active Site	
S sho	Zeolite ZSM-5 (Bulk) w/hide Step Process Template: FCC Catalys	(USY w/ RE)



## 3 – Step Method Market Verification

Material	\$/lb	lb/lb cat.	\$/lb cat.
H <sub>2</sub> PtCl <sub>6</sub>	10.00	0.053	0.53
Carbon support	9.09	1	9.09
N <sub>2</sub> H <sub>4</sub>	0.68	0.26	0.18
NaOH	0.18	0.025	0.00
NaCI disposal	0.09	10	0.90
Fotal			10.70
Step Costs			
Step	\$/hr	\$/day	
ncipient wetness Reactor, multistep	75 100	1800 2400	
Scrubber, NOx	35	840	
Filter, plate and frame	75	1800	
Reactor, simple	30	720	
Dryer, rotary (40–100 °C)	75	1800	
Fotal	390	9360	
Synthesis Campaign Costs			
Order size, tons	2		
Production scale	Small (1 ton/day)		
Step cost, \$/day	9360		
Campaign length	2.5		
Campaign cost, \$	23400		
Campaign cost, \$/lb cat.	5.85		
Subtotal Before Overhead a	nd Margin		
Materials cost, \$/lb cat.	10.70		
Campaign cost, \$/lb cat.	5.85		
Subtotal, \$/Ib cat.	16.55		
Overhead and Margin			
G&A, \$/lb cat.°	0.83		
SARD, \$/lb cat.d	0.87		
Margin, \$/Ib cat. <sup>e</sup>	9.12		
Total Estimated Price			
Est. price, \$/lb cat. <sup>h</sup>	27.37		
Market Price			
Market price, \$/lb cat. <sup>a</sup>	34.09		
Difference	20%		
Estimated	•		
Market Pr		34.09/	
Variance	:	20	0%

#### 111 0 (24 ...

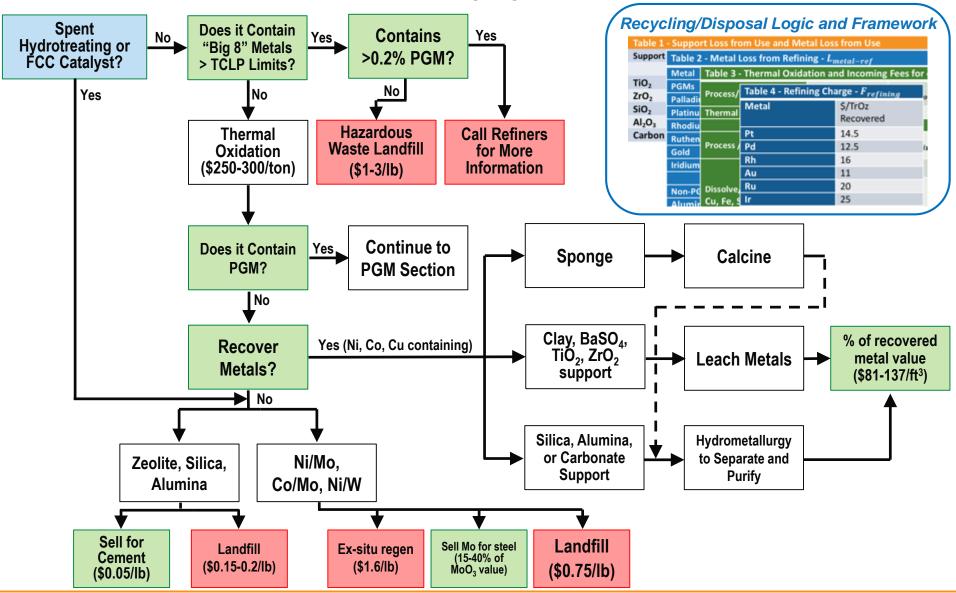
Materials Costs Material	\$/Ib	lb/lb cat.	\$/lb cat
Ni(NO <sub>3</sub> ) <sub>2</sub> •6H <sub>2</sub> O	2.50	1.04	2.59
Alumina (trilobes)	11.00	0.79	8.69
NaOH 50%	0.20	0.28	0.06
H <sub>2</sub> O <sub>2</sub> 50%	0.34	0.12	0.04
NaNO <sub>3</sub> landfill	0.50	0.02	0.01
H2 forming gas	1.10	0.45	0.50
Total			11.88
Step Costs			
Step	\$/hr	\$/day	
Incipient wetness	100	2400	
Dryer, rotary (40-100 °C)	100	2400	
Kiln, continuous indirect (300–1290 °C)	175	4200	
Scrubber, NOx	75	1800	
Crystallizer	200	4800	
Filter, rotary vacuum	100	2400	
Dryer, rotary (40–100 °C)	100	2400	
Kiln, continuous indirect (300-1290 °C) × 2		8400	
Total	1200	28800	
Synthesis Campaign Costs			
Order size, tons	20		
Production scale	Medium	n (10 ton/day)	
Step cost, \$/day	28800		
Campaign length	3		
Campaign cost, \$	86400		
Campaign cost, \$/lb cat.	2.16		
Subtotal Poforo Quarboad and Marria			
Subtotal Before Overhead and Margin Materials cost, \$/Ib cat.	11.88		
	2.16		
Campaign cost, \$/lb cat. Subtotal, \$/lb cat.	2.16		
Subtotal, \$/10 cat.	14.04		
Overhead and Margin			
G&A, \$/lb cat.	0.70		
SARD, \$/lb cat.	0.74		
Margin, \$/lb cat. <sup>1</sup>	5.11		
margin, who cat.	0.11		
Total Estimated Price			
Est. price, \$/lb cat.	20.59		
2011 p. 100, with out.	20.05		
Market Price			
Market price, \$/lb cat.	21.33		
Difference	3%		
Estimated Price	e: \$	20.59	)/lb
Market Price:	\$2	21.33	B/lb
			20/
Varianco			
Variance:			3%

USY-based FCC with rare	earth		
Materials Costs			
Material	\$/Ib	lb/lb cat.	\$/lb cat.
Ludox sodium silicate	0.25	0.819	0.205
AI(OH) <sub>3</sub>	0.3	0.14	0.042
NaOH 50%	0.2	0.074	0.015
H <sub>2</sub> SO <sub>4</sub> 98%	0.05	0.22	0.011
Clay	0.05	0.376	0.019
La <sub>2</sub> O <sub>3</sub>	1.5	0.035	0.053
HCI 31%	0.07	0.036	0.003
NH₄OH 28%	0.1	0.06	0.006
Total			0.352
Step Costs			
Step	\$/hr	\$/day	
Reactor, simple	200	4800	
Crystallizer	300	7200	
Filter, rotary vacuum × 2	600	14400	
Reactor, simple × 3	600	14400	
Kiln, continuous indirect (300–1290 °C)	325	7800	
Reactor, multistep	600	14400	
Filter, rotary vacuum	300 600	7200 14400	
Reactor, multistep	400	9600	
Reactor, simple × 2 Dryer, spray × 2	1100	26400	
Reactor, simple × 4	800	19200	
Filter, rotary vacuum × 2	600	14400	
Dryer, rotary (100–300 °C)	300	7200	
Total	6725	161400	
Synthesis Campaign Costs			
Order size, tons	200		
Production scale		150 ton/day)	
Step cost, \$/day	161400	)	
Campaign length	4 <sup>b</sup>		
Campaign cost, \$	645600	)	
Campaign cost, \$/lb cat.	1.61		
Subtotal Before Overhead and Margin			
Materials cost, \$/lb cat.	0.35		
Campaign cost, \$/lb cat.	1.61		
Subtotal, \$/Ib cat.	1.97		
· · · · · · · · · · · · · · · · · · ·			
Overhead and Margin			
G&A, \$/lb cat.	0.10		
SARD, \$/lb cat.	0.10		
Margin, \$/lb cat. <sup>g</sup>	0.24		
Territoria de Datas			
Total Estimated Price	2.44		
Est. price, \$/lb cat.	2.41		
Market Price			
Market price, \$/lb cat.	2.73		
Difference	12%		
Estimated Price			
Market Price:		\$2.73	3/lb
Variance:		1	2%
variance.			- /0

### Step method in good agreement with market data

## 3 – Spent Catalyst Recycle vs. Disposal

Included decision-making logic and databases



## 3 – Web UI Design

NI/TIO2	\$19.95 per b	\$6.65 per lb	\$26.60 perb		
	Details		Charts		
Catalyst			Ligand	Weight Loading 0.9 %	
Name NI/TIO2	Type nanoparticle	Solvent 1	Support	ſ <b>k</b>	
Model Economics					
Model Year 2014 V	Currency \$ ~			Raw Material Requirements	Raw Material Requirements
Model Units Mass Unit Ib	Volume Unit gal	Flocc.	Metal	13M 14 15 10 10 10 10 10 10 10 10 10 10	
Scale Parameters		Solvent	2 P-source	مروم مروم معنی میروند. Material مرومه میروند میروند.	ريان المحالية المحالي Material
Catalyst Production M_cat	Organics Purchase Basis	Metals Purchase Basis	P-Source	Raw Material Requirements	Raw Material Requirements
1000000 lb/yr		2000 lb V		M05 201 0 201 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0	Bandon Cost (3
Preparative Stoichiom	ietry			2 <sub>5M</sub>	Belative of the second s
Yield Estimate	Weight Loading wt%	Active Phase Molecular Weight MW_A	P Stoichimetric Ratio mol_AP/mol_LR	0 Charles Char	0 Contenting Contenting Material
85 % 🗸	<ul> <li>5</li> <li>% </li> </ul>	58.6934 g/mol 🗸	1		
Active Phase Mass 0.000856 g	Scaling Factor (K_SF) 58,395,390 yr^-1			J	

### Our Web UI Offers:

- Seamless user experience with the same core functionality of the spreadsheet
- **Powerful visualization** tools for cost comparison of multiple catalysts
- **Real-time** variable adjustment
- Up-to-date pricing information from public databases though Datahub integration
- Exportable cost data

File View Estimates / Pt/C edit simplifie	d	Advanced Webtool Features
New Equipment DATA Open JSON Download JSON	ASTIMATE NAME Pt/0 ECONOMICS Basis Year 2017  Corrency	Create any number of locally saved, searchable estimates
ESTIMATE		Rh2P
1 Inputs	OUTPUT UNITS Mass Unit ®	
Estimate Name Economics Output Units Production Capacity - Catalyst Production Capacity - Operating Hours	Ib PRODUCTION CAPACITY Design Production, Annual (*) 100000000 Ib Capacity Factor (*)	Export/Import functions to share and view prepared estimates
Selling Margin	100 Ib	Change in catalyst cost (\$/lb), above or below base case (\$41.71/lb)
2 Materials 3b Equipment	Actual Production, Annual ③ 100,000,000.00 lb	-25.63 29.76 Active phase wt. % (1:5:10) -5.49 19.93
3c Utilities 3d CapEx	PRODUCTION CAPACITY Operating Hours, Labor ®	Yield (100:85:50 %)           4.15         1129           Oleylamine cost (2:4.66:10 \$/lb)
3e OpEx 4 Spent Catalyst	100 hours	4.13         10.76           Triott/phosphine cost (20:36.8:100 \$/lb)         -7.40           4.10         4.10           Cost of centrifugation or replacement (1:3:10 \$/lb)
5a Summary Outputs 5b Detailed Outputs	Stream Factor ⑦ 100 %	-3.00 6.00 Number of processing steps (5:10:15) -2.18 1.68 Ni(acae)2 cost (5:9.58:15 \$/lb)
Same logic and estimation	Operating Hours, Production <sup>®</sup> 100.00 hours Design Production Rate <sup>®</sup> 1,000,000.00 lb/hr	Recycling/waste value, % of purchase cost (75:0:-100) All estimates are securely saved on the user's computer

%/year

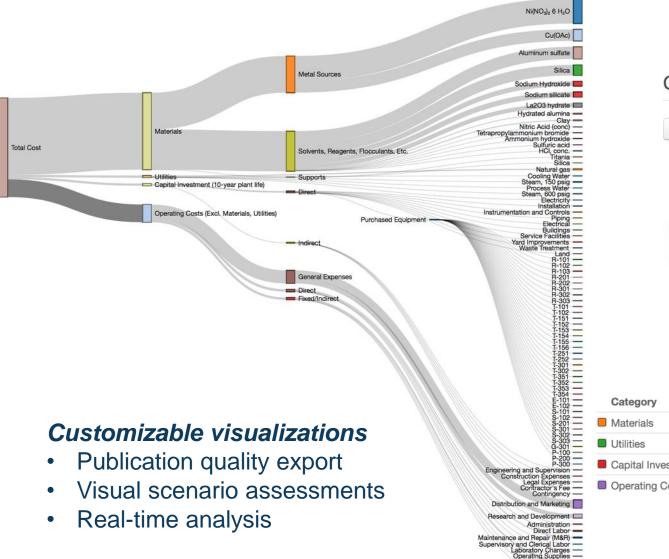
SELLING MARGIN

25

Return on Capital Invested ⑦

Same logic and estimation flow as spreadsheet tool

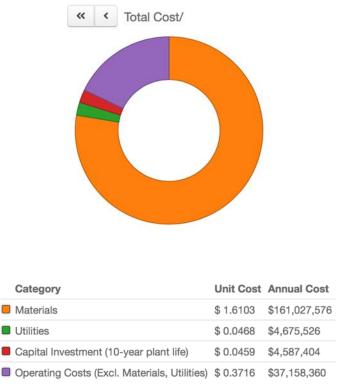
# 3 – Web UI: Interactive and Exportable Visualizations



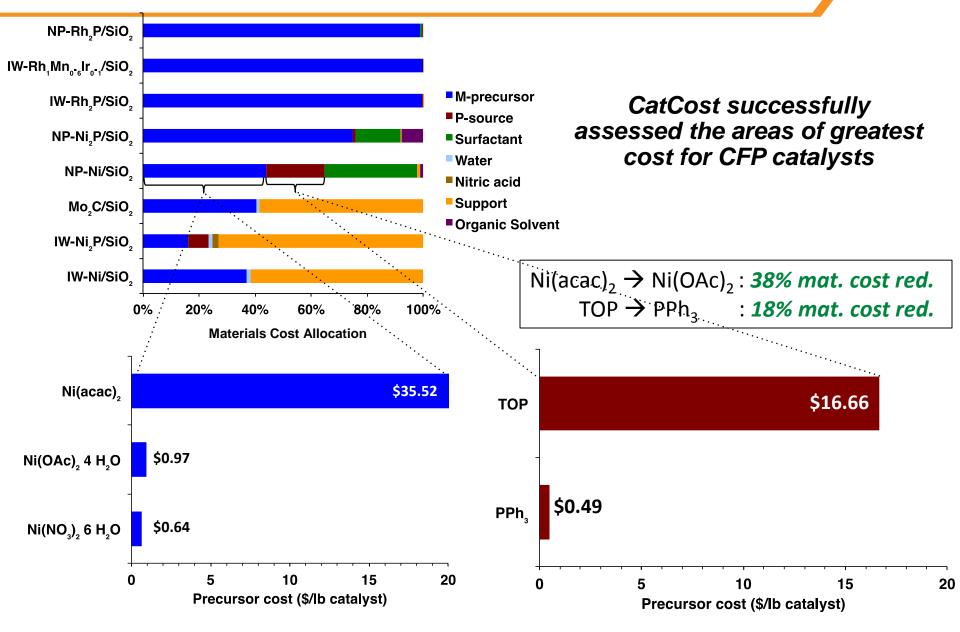
Local Taxes

Bent, % of value of rented land

#### Cost Estimate Breakdown



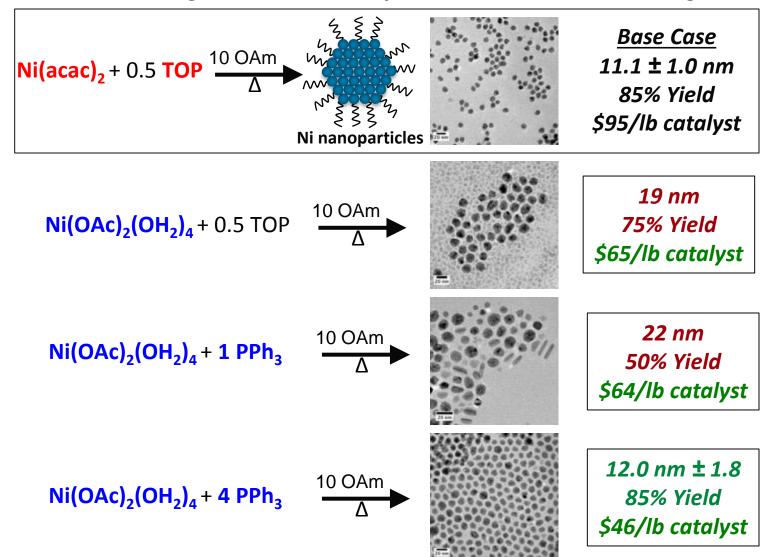
## 4 – Ex-situ CFP as a Case Study



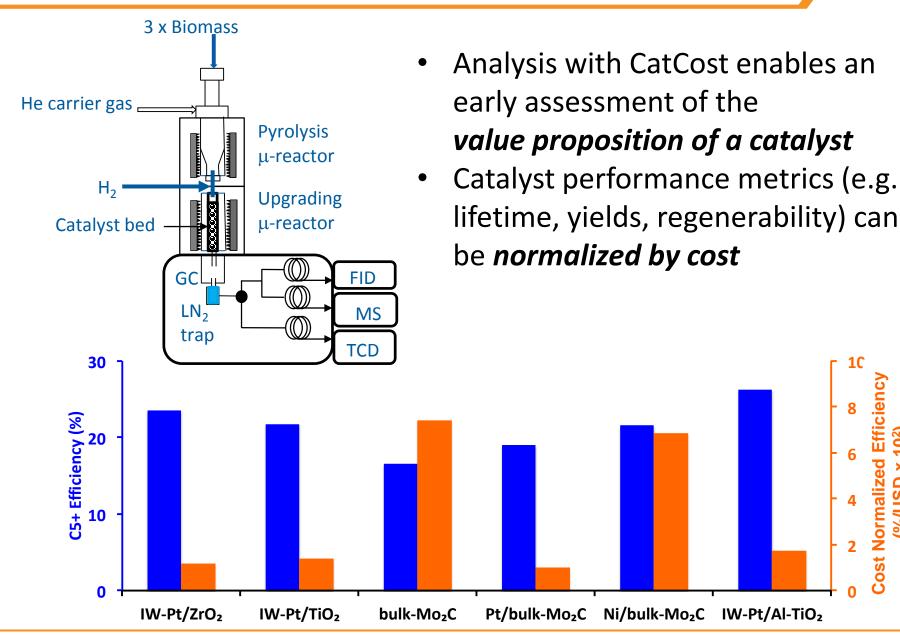
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## 4 – Driving Towards Cost-effective Synthesis

Utilizing CatCost to direct synthesis toward lower cost targets



## 4 – Assessing a Catalyst's Value Proposition



IW-Pt/Al-TiO<sub>2</sub>

Efficienc

**Cost Normalized** 

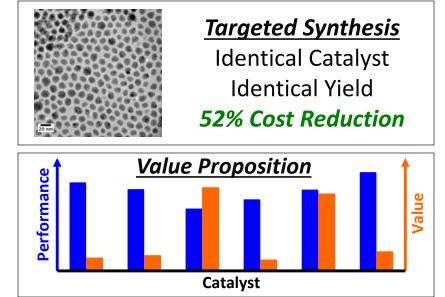
%/USD ×

## 4 – Relevance

#### Pre-commercial catalyst development and usage is heavily-leveraged within BETOs conversion portfolio

*CatCost* 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



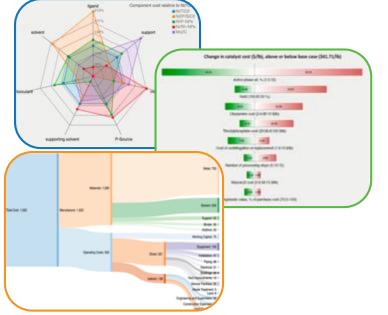
*CatCost*-generated cost metrics offer guidance for catalyst development

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

**External R&D groups have demonstrated interest in** *CatCost* **and its capabilities** University professors, national laboratory staff, and companies have reached out with positive feedback and it has been incorporated in 2 university curricula

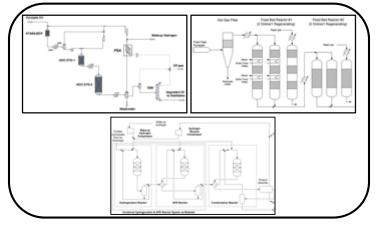
### Average of 100 estimates performed monthly since October 1<sup>st</sup> launch on webtool

## Summary



### Interactive and Powerful Visualizations

Parameterized Process Templates



- A catalyst cost estimation tool has
   been developed with *versatile materials pricing*, multiple
   *processing cost estimation* methods,
   and *salvage value* of catalysts.
- CatCost enables an *assessment the value proposition* of <u>pre-commercial</u> catalysts
- *Rigorous industrial expert review* of the CatCost tool has been conducted throughout development to ensure the relevance and veracity of the tool
- Future efforts will focus on increasing UI functionality and *incorporation of additional templates*

## Acknowledgements

#### **Model Design:**

Kurt Van Allsburg Lesley Snowden-Swan John Super Eric Tan Susan Habas Josh Schaidle Jesse Hensley

#### Web UI Design

Nick Wunder Kenny Gruchalla Kristi Potter John Yarbrough Matthew Jankousky

## Recycling, Reclamation & Lifecycle Analysis

James White John Frye Jennifer Dunn Thathiana Pahola

#### **Catalytic Data**

Calvin Mukarakate Kellene Orton Kristina lisa







This research was supported by the DOE Bioenergy Technology Office under Contract no. DE-AC36-08-GO28308 with the National Renewable Energy Laboratory

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



# **Energy Materials Network**

U.S. Department of Energy

## **Additional Slides**

## Peer Review FY17 Responses: Project Approach

**Comment:** It is *difficult to predict the effects of economy of scale* on catalyst. Finding companies interested in *producing small commercial batches of catalyst may be difficult and cost* far more than expected.

#### **Address:**

Implemented logic to differentiate calculated *cost* to produce and *price* to buy alleviates some economic ecosystem issues

Determined manufacturing margins for a number of classes of materials as a function of scale through contractor research

**Comment:** Web based system design will be powerful for both external relations and teams inside BETO

#### **Address:**

Increased funding allocation towards web development and visualization for deep integration with DataHub

Comment: Not obvious from the presentation but I encourage close collaboration with the TEA and Sustainability teams as well (suggested in future work)

#### Address:

- Comment likely because presentation did not emphasize existing relationship with TEA efforts
- Active collaboration with ANL established to enable CCM users to output valuable LCA relevant parameters to GREET for more detailed sustainability assessment

**Comment:** The accuracy of the tools could be checked by applying it to estimate the overall costs of an existing product.

Address: Accuracy of tool outputs verified to be within 20% for a number of large scale catalysts ZSM-5,  $Ag/Al_2O_3$ ,  $BiMoO_x$ . Verification of Pt/C,  $Ni/Al_2O_3$ , and USY underway.

**Comment:** The source of the raw material cost estimates is unclear, catalog prices for KG quantities are not appropriate.

#### Address:

- Commercial open-source pricing data is now being built into a database within DataHub.
- Users are now able to input their own obtained quotes for commercial quantities.
- Catalog price scaling equations will always be least accurate method, but the logic will be included to allow users to build estimates and continue to refine as the obtain better prices
- Included documentation will alert users to accuracy limitations of scaling catalog data

**Comment:** Particularly important is to include the effects of preparing large quantities of new catalyst on the global supply of metal.

Address: Visualization and total raw material consumption values (including metals) will enable to users to perform this analysis

## Peer Review FY17 Responses: Relevance

**Comment:** It should be kept in mind that the cost of actual catalyst in commercial plants (like the nth plant) most likely will be substantially lower than the estimated cost of pre-commercial catalyst. The relative cost of catalyst in the nth plant should therefore be expected to be a smaller percentage than currently used in several of the TEA analysis.

Address: Currently working to implement additional estimation modes that handle (1) grass-roots production and (2) production campaigns with no capital expenditure as determined by margins of operating contract manufacturers

**Comment:** The validity of the model has not been proven.

Address: Accuracy of tool outputs has since been verified to be within 20% for a number of large scale catalysts ZSM-5,  $Ag/Al_2O_3$ ,  $BiMoO_x$ . Verification of Pt/C,  $Ni/Al_2O_3$ , and USY underway.

**Other General Comments:** Development of catalyst cost model tools and making them available cross teams and externally are highly valued not only for the BETO program but across academics and industry worldwide and already showing in short time value for teams assessments.

Hugely valuable not only to CCB consortium projects, but also to public bioenergy/biofuels community.

The catalyst cost model will be a great tool for determining pre-commercial catalyst cost to be used in the early techno-economic analysis on a consistent basis.

- 1. <u>CatCost Symposium</u>: Tutorial on the Catalyst Cost Estimation Tool: Economic Insight for Catalyst Synthesis and Scale-up Research I & II, AIChE Annual Meeting, October 2018, Pittsburgh, PA.
  - 2. K. Van Allsburg; J. Super; L. Snowden-Swan; J. Schaidle; F. Baddour; "Introduction to Catalyst Cost Estimation" AIChE Annual Meeting, 369b
  - 3. <u>K. Van Allsburg</u>; "Tutorial on the CatCost Tool: FCC Catalyst Example" *AIChE Annual Meeting*, 369c
  - 4. K. Van Allsburg; J. Super; J. White; L. Snowden-Swan; J. Schaidle; <u>F. Baddour</u>; "Capability Highlight: A Simple Step Method for Estimating Processing Costs" *AIChE Annual Meeting*, 369d
  - 5. K. Van Allsburg; J. Super; J. White; L. Snowden-Swan; J. Schaidle; F. Baddour; "Capability Highlight: Estimation of Spent Catalyst Value" *AIChE Annual Meeting*, 369f
  - 6. K. Van Allsburg; "Tutorial on the CatCost Tool: Microfluidic Nanoparticle Synthesis Example" AIChE Annual Meeting, 431a
  - 7. J. Schaidle; "Commercialization Example: Catalytic Indirect Liquefaction of Biomass" AIChE Annual Meeting, 431b
- 8. <u>K. Van Allsburg</u>; L. Snowden-Swan; F. Baddour, "CatCost: An Estimation Tool To Aid Commercialization of Catalytic Materials," *Frontiers in Biorefining*, **November 2018**, St. Simons Island, GA.
- 9. <u>K. Van Allsburg</u>; F. Baddour; CatCost: An Estimation Tool to Aid Commercialization and R&D Decisions for Catalytic Materials" *ChemCatBio Webinar,* **September 2018**, Golden, CO.
- 10. <u>F. Baddour</u>; L. Snowden-Swan "Catalyst Cost Model Development: Introducing the CatCost Tool" *ChemCatBio/BETO Annual Face-to-Face Meeting*, **August 2018**, Golden, CO.
- 11. K. Van Allsburg; F. Baddour; "Introducing the CatCost Tool" ExxonMobil CRADA Annual Face-to-Face Meeting, August 2018, Golden, CO.
- 12. <u>K. Van Allsburg</u>; J. Super; J. White; J. Frye; L. Snowden-Swan; J. Schaidle; F. Baddour, "Cost insight for catalyst R&D and commercialization decisions with the catalyst cost estimation tool" 256<sup>th</sup> ACS National Meeting & Exposition, August 2018, CATL-170, Boston, MA
- 13. K. Van Allsburg; J. Super; J. White; J. Schaidle; L. Snowden-Swan; <u>F. Baddour</u>, "Catalyst cost estimation tool development: Reducing information barriers to commercialization" 255<sup>th</sup> ACS National Meeting & Exposition, **March 2018**, CATL-396, New Orleans, LA
- Hensley J.; S. Habas; F. Baddour; C. Farberow; D. Ruddy; J. Schaidle; R. Brutchey; N. Malmstadt; H. Robota "Transitioning rationally designed catalytic materials to real "working" catalysts produced at commercial scale: Nanoparticle materials" 255<sup>th</sup> ACS National Meeting & Exposition, March 2018, CATL-384, New Orleans, LA.
- 15. <u>Frederick Baddour</u>, 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.
- 16. <u>Kurt Van Allsburg</u>, 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

1. F. G. Baddour; L. Snowden-Swan; J. D. Super; K. M. Van Allsburg, "Estimating Pre-Commercial Heterogeneous Catalyst Price: A Simple Step-Based Method" Org. *Process Res. Dev.* **2018**, 22, 12, 1599-1605.

2. M. B. Griffin; K. Iisa; H. Wang; A. Dutta; K. A. Orton; R. J. French; D. M. Santosa; N. Wilson; E. Christensen; C. Nash; K. M Van Allsburg; F. G. Baddour; D. A. Ruddy; E. C. D. Tan; H. Cai; C. Mukarakate; J. A. Schaidle "Driving towards cost-competitive biofuels through catalytic fast pyrolysis by rethinking catalyst selection and reactor configuration" *Energy Environ. Sci.* **2018**, 11, 2904-2918

3. 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.

4. 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.

## Acronyms and Abbreviations

ACSC	Advanced Synthesis and Characterization project
ANL	Argonne National Laboratory
AOP	Annual operating plan
BETO	Bioenergy Technologies Office
ССВ	Chemical Catalysis for Bioenergy Consortium; ChemCatBio consortium
ССМ	Catalyst Cost Model Development project
ССРС	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
нт	Hydrotreating
LANL	Los Alamos National Laboratory
LCA	Life-cycle analysis

## Acronyms and Abbreviations (Cont.)

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

## 1 – Overview of CatCost

**CatCost:** A spreadsheet- and web-based <u>catalyst cost estimation tool</u> to enable rapid and informed cost-based decisions in the research and commercialization of catalysts

- An industrially reviewed and publicly-available catalyst cost estimation tool
- A first-of-its-kind tool for considering costs of novel and precommercial catalysts

## Available free-of-charge at catcost.chemcatbio.org

