

# IDAES Institute for the Design of Advanced Energy Systems

David C. Miller, Ph.D.

Senior Fellow and Technical Director National Energy Technology Laboratory





#### Estimated U.S. Energy Consumption in 2020: 92.9 Quads





43

Source: LLNL March, 2021. Data is based on DOE/EIA MER (2020). If this information or a reproduction of it is used, credit must be given to the Lawrence Livermore National Laboratory and the Department of Energy, under whose auspices the work was performed. Distributed electricity represents only retail electricity sales and does not include self-generation. EIA reports consumption of renewable resources (i.e., hydro, wind, geothermal and solar) for electricity in BTU-equivalent values by assuming a typical fossil fuel plant heat rate. The efficiency of electricity production is calculated as the total retail electricity delivered divided by the primary energy input into electricity generation. End use efficiency is estimated as 65% for the residential sector, 65% for the commercial sector, 21% for the transportation sector and 49% for the industrial sector, which was updated in 2017 to reflect DOE's analysis of manufacturing. Totals may not equal sum of components due to independent rounding. LLNL-MI-410527

# Variability in Electricity Production Requires Flexibility





#### **Decarbonizing & Expanding the U.S. Industrial Sector**

Shell Cracker Nears 'Peak Construction'





#### **Process Intensification & Modularization**

- Intensification smaller, cleaner, and more energy-efficient technology
  - Reactive distillation
  - Dividing wall columns
  - Rotating packed bed
  - Microreactors
- Modular design
  - "Numbering up" instead of scaling up
  - Reduced investment risk
  - Improved time to market
  - Increased flexibility
  - Improved safety
  - Reduced on-site construction



Figure from Rawlings et al., 2019





#### Estimated U.S. Carbon Dioxide Emissions in 2018: ~5,268 Million Metric Tons





Source: LLNL July, 2019. Data is based on DOE/EIA MER (2018). If this information or a reproduction of it is used, credit must be given to the Lawrence Livermore National Laboratory and the Department of Energy, under whose auspices the work was performed. Carbon emissions are attributed to their physical source, and are not allocated to end use for electricity consumption in the residental, commercial, industrial and transportation sectors. Petroleum consumption in the electric power sector includes the non-renewable portion of municipal solid waste. Combustion of biologically derived fuels is assumed to have zero net carbon emissions - the lifecycle emissions associated with producing biofuels are included in commercial and industrial emissions. Totals may not equal sum of components due to indepedent rounding errors. LLNL-MI-410527

#### **Need for Dispatchable Power for Economic Deep Decarbonization**



Solar, wind

Storage, demand response

• Nuclear, CCS, geothermal

"Firm low-carbon" resources like CCS and nuclear lower the cost of deep decarbonization by 10-62%

Sepulveda, et al., Joule (2018) https://doi.org/10.1016/j.joule.2018.08.006



# **Increasingly Integrated Energy & Process Systems**





## **Energy System Analysis is Often Applied in Isolation**

Process-centric Modeling

**Grid-centric Modeling** 



https://www.netl.doe.gov/research/coal/energy-systems/gasification/gasifipedia/igcc-config

https://icseg.iti.illinois.edu/files/2013/10/IEEE118.png



#### **Multiple Time Scales & Perspectives Across Tools**





#### **Decision Making for Energy and Process Systems**







#### Understanding large, complex systems: Don't Simulate $\rightarrow$ Solve

Derivative-free ("black-box") optimization (DFO) ~ 100-1000 simulations

> **Optimization over** degrees of freedom only min f(u) $\mathcal{U}$  $u^L < u < u^U$  $\mathcal{U}$ Simulator

Equation-oriented (EO) Optimization model embedded as algebraic constraints min f(x, u)x, uh(x, u) = 0 $x^L \le x \le x^U$  $u^L \leq u \leq u^U$ 

Glass-box optimization ~ 1-5 "Simulation Time Equivalents" Leverage exact derivatives, sparse structure

[Adapted from Biegler, 2017]



Biegler, L. T., D. C. Miller and C. O. Okoli (2021). Don't Search - Solve! Process Optimization Modeling with IDAES. Simulation and Optimization 12 in Process Engineering: The Benefit of Mathematical Methods in Applications of the Chemical Industry. N. Asprion and M. Bortz, Elsevier.



### **Examples of IDAES Optimization Approach**

- Process/Grid Coupling
  - Understanding complex interactions across scales
- Carbon Capture System Design
  - Technical Risk Reduction through UQ and Robust Optimization
  - Incorporating flexible operations in design decisions
- Integrated Energy System Design
  - Multi-input, multi-output dynamic energy systems
- Expansion Planning
  - Achieving decarbonization goals while maintaining reliability



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# **Bridging Timescales Enables Unique Analyses & Design of IES**



- 1. Elucidate complex relationships between resource dynamics and market dispatch (with uncertainty, beyond price-taker assumption)
- 2. Predict the economic opportunities and market impacts of emerging technologies (tightly-coupled hybrid energy systems)
- 3. Guide conceptual design & retrofit to meet current and future power grid needs



DISPATCHES

Design Integration and Synth

Platform to Advance Tightly Coupled Hybrid Energy Systems Gao, X., B. Knueven, J. D. Siirola, D. C. Miller and A. W. Dowling (2022). "Multiscale simulation of integrated energy system and electricity market interactions." <u>Applied Energy</u> 316: 119017, <u>https://doi.org/10.1016/j.apenergy.2022.119017</u>.

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#### **Predictive Process Modeling and Optimization** Identifying optimal operational strategies and process designs Model Validation



- Modular, multi-scale, dynamic rate-based
- Film model
  - Multi-component mass & heat transport
  - Simultaneous reaction & transport of molecular & ionic species
- Rigorous properties
  - Modified eNRTL model for mixed solvent systems





#### Parameter Estimation and Uncertainty Quantification

#### **Process Optimization**





#### **Robust Design to Reduce Technical Risk**

#### Inherent uncertainty in process design models

Operational uncertainty: e.g., fluctuations in feed Economic uncertainty: e.g., cost of utilities Epistemic uncertainty: e.g., mass/heat transfer, kinetics





N.M. Isenberg, P. Akula, J.C. Eslick, D. Bhattacharyya, D.C. Miller and C.E. Gounaris (2021). A Generalized Cutting-Set Approach for Nonlinear Robust Optimization in Process Systems Engineering Applications. AIChE Journal, 67(5):e17175, DOI 10.1002/aic.17175

**Deteministic design** 

fails to meet CO<sub>2</sub> capture performance

#### **Reducing the Price of Robustness**

- The PoR provides an upper limit on the \$ worth spending to reduce parameter uncertainty
  - e.g., do more "science" to improve our property models
- Factors to consider when deciding whether to go back to the drawing board:
  - plausibility of reducing uncertainty (e.g., epistemic uncertainty)
  - the cost of conducting additional research to improve uncertainty confidence
  - the time it will take to do so (cost of delaying the investment)
  - the anticipated improvement in the risk-reward trade-off
- Quantifying the improvement:





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#### **Multi-scale Surrogate Modeling**

#### Linking models across length/time-scales with minimal loss of accuracy



Should capture system be built? (i.e., Is it cheaper to pay a carbon tax?)

If yes, what is the optimal size and capture rate?

How do various potential market scenarios impact results?

### **Flexible Operations Scenario with Carbon Capture**



**Optimal Power Schedule** 



**Optimal Operation of the Capture System** 



#### **Example Scenarios: Flexible Capture NPV Optimization**





# **CAPRESE: Control and Adaptation w PREdictive SEnsitivity**)



#### Model-based Estimation and Control: MHE and NMPC





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#### Integrated Energy System For Power and H<sub>2</sub> Production



#### **Optimization of Integrated Energy Systems**

#### **Reforming-based Systems for Low Carbon Power and Hydrogen**



- Integrating gas turbine with SMR improves thermal efficiency
- Shared carbon capture system for power and H<sub>2</sub>.
- Significantly reduces cost of low carbon H<sub>2</sub> under future energy scenarios
- Marginal cost of low carbon electricity production below \$30/MWh
- Highlighted in Hydrogen Energy Earthshot Strategy Vision document





#### **SOFC/SOEC: Optimization of Integrated Energy Systems**



NGCC+SOEC

stitute for the Design of

dvanced Energy System

rSOFC

#### SOFC+SOEC







Hydrogen Price (\$/kg)

30

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#### **Expansion Planning: Co-optimization of Investment + Operation**

#### INPUT

- <u>Generation</u>
  - Investments (overnight capital costs, age and lifetime, life extension costs, fuel prices, locations)
  - Operations (heat rates, nameplate capacity, reserve capacities, generation limits, ramp rates, emissions, start up fuels/costs, fixed and variable O&M costs, pollutant taxes)

<u>Transmission</u>

- Overnight costs, lengths, power loss rates, capacities, existing and candidate lines
- Demand and renewables
  - Representative profiles, annual load forecasts, available capacity of potential wind and solar sites, wind and solar capacity credits

Minimize the total cost of operation, investment, and emissions (net present value)



#### **OUTPUT**

- Installments (generators, transmission lines, storage units)
  - location
  - year
  - type
  - Number and capacity
- Retirements (generators, transmission lines, storage units)
- Year
- Life extension decision
- Operation decisions
- Approximate power flows
- Approximate generation schedules



# **Challenge to Adequately Represent Variability with Clustering**



- Expansion planning with SPP case study
  - Results indicated significant reduction of installed flexible generation
    - Gas turbine, internal combustion turbine units
    - Lower efficiency, higher relative emissions
  - Counter-intuitive result
  - Root cause: "representative" days did not capture
    - High ramp rates (volatility)
    - Low non-dispatchable generation (intermittency)





### **Dispatchable Plants Critical with Increased Renewables**



- "Representative Days Only" underestimates total required capacity
- More dispatchable capacity required with lazy capacity constraints and ramp events
- Extreme ramp integration limits expansion of renewable capacity



### Software Development & Release Management

0

IDA

#### Mature Software Development, Test & Release Processes

- **Open-Source Software repository at GitHub** ٠ https://github.com/IDAES/idaes-pse
- Continuous development, testing ٠ & documentation updates
- **Quarterly release schedule** ٠
  - 22 Releases in past 4 years on the 1.X line
- 2.0 Release schedule for November 2022 •
  - Major organizational and API improvements
  - As learned over the past years of development
- February's 1.13 release last of the 1.X line ٠
  - May & August will each have 2.0.0 alpha releases to ease migration

Search or jump to	Pull requests Issues Marketplac	e Explore	\$ +• \$	
IDAES/idaes-pse Public	0	≳ Edit Pins = ⊙Unwatch 22 =	Y Fork 135 🌟 Starred 103 +	
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eslickj Option: Warnings and/or	Deprecation Warnings Rais 📖 🗴 Sabeb3b	10 hours ago 🔞 8,885 commits	The IDAES Process Systems Engineering Framework	
.github	Re-enable "Build Sphinx docs" Ci check (#777	) 25 days ago	∂ idaes-pse.readthedocs.io/	
.pylint	Fixing import path in pylint config	last month	chemical-engineering process-modeling	
data	Improve interface to tabular data for Data Man	agement Fra 2 months ago	process-systems-engineering	
docker	Merge branch 'master' into remove_old_ui	2 years ago	Readme	
docs	Option: Warnings and/or Deprecation Warnings	Raise Runti 10 hours ago	☆ 103 stars	
docs_archive/transformations	Add config doc page back	IDAES	Institute for the Desig	n of Advanced Energy
🛅 idaes	Option: Warnings and/or Deprecation Warnin		Institute for the Desig	in or Auvanceu Energy
scripts	Removing old workshop files (#556)	<u> (11)</u>	Systems (IDAES)	
Coveragerc	fix coverage config (#549)		Project Goals	
D .gitignore	adding VSCode settings files to .gitignore			
.readthedocs.ymi	Add Partner Logos to Docs Footer (#550)		The Institute for the Design of Advanced I	Energy Systems (IDAES) will be the world's premie
COPYRIGHT.md	fixed dates	Search doca	use of process systems engineering tools a	and approaches. IDAES and its capabilities will be
D Jenkinsfile	Added custom email template for Jenkins (#8		applicable to the development of the full r	ange of advanced fossil energy systems, including
LICENSE.md	fixed dates	Getting started (Tutonais)	chemical looping and other transformation with other new technologies such as supe	hal CO <sub>2</sub> capture technologies, as well as integratio rcritical CO <sub>2</sub> .
README.md	Add Python 3.10 to CI checks (#726)	Explanations		
addheader.yml	based on recommendations from LBL legal.	Reference Guides	For a more detailed overview of the IDAES	S integrated platform, see this page.
Codecox.yml	Configure Codecov to improve when report u		Contents	
failed-test-email.template	Added custom email template for Jenkins (#			
🗅 file_header.txt	based on recommendations from LBL legal.		Getting Started (Tutorials)	How-To Guides
D pytest-dev.ini	Replace Sphinx makefiles (#737)		Installing IDAES for users Installing IDAES for developers IDAES Examples & Tutorials	Setting up IDAES Models Developing Custom Models Using IDAES Flowsheet Visualizer Using the Data Management Framewor
			Explanations	Reference Guides
ion to 2.0			Why IDAES Concepts Concepts Conventions Conventions Modeling Extensions Related Packages FAQ License Copyright	IDAES Model Libraries IDAES Command-line interface tools Command-line interface tools Configuring IDAES Logging Processing & Outputs Developing for IDAES
			Collaborating institutions	
		P Read the Docs v	The IDAES team is comprised of collabora	tors from the following institutions:



ed energy systems through the

### **Open Source Platform**

Website: https://idaes.org/

GitHub repo: <a href="https://github.com/IDAES/idaes-pse">https://github.com/IDAES/idaes-pse</a>

Support: idaes-support@idaes.org

Ask questions, subscribe to our user and/or stakeholder email lists

Documentation: https://idaes-pse.readthedocs.io

Getting started, install, tutorials & examples

**Overview Video** 

https://youtu.be/28qjcHb4JfQ

Tutorial 1: IDAES 101: Python and Pyomo Basics

https://youtu.be/\_E1H4C-hy14

**Tutorial 2:** IDAES Flash Unit Model and Parameter Estimation (NRTL)

https://youtu.be/H698yy3yu6E

**Tutorial 3:** IDAES Flowsheet Simulation and Optimization; Visualization Demo

https://youtu.be/v9HyCiP0LHg





### Summary

- Trends Requiring Innovation in Decision Support Tools Multi-scale optimization
  - Evolving energy ecosystem requires greater flexibility
  - Expanding and decarbonizing U.S. industry
  - Process intensification & modularization
  - Integrated energy systems (Hybrid approaches)
  - Tighter coupling across temporal and spatial scales/domains
- Need for Advanced, Optimization-Based Modeling Platform
  - Decision support for nonlinear, interacting dynamic systems
  - Multi-Scale from molecular to process/plant to enterprise
  - Leverage 30 years of progress in algorithms, hardware, modeling
- Examples of IDAES Optimization Approach
  - Process/Grid Coupling
  - Technical risk reduction for scaling up and deploying new technologies
  - Flexible Carbon Capture System Design
  - Integrated Energy System Design
  - Expansion Planning





#### Acknowledges support from the U.S. Department of Energy, Office of Fossil Energy and Carbon Management's Simulation-Based Engineering/Crosscutting Research, SOFC, TPG Programs

National Energy Technology Laboratory: David Miller, Tony Burgard, John Eslick, Andrew Lee, Miguel Zamarripa, Jinliang Ma, Dale Keairns, Jaffer Ghouse, Ben Omell, Chinedu Okoli, Richard Newby, Maojian Wang, Arun Iyengar, Anca Ostace, Steve Zitney, Anuja Deshpande, Alex Noring, Naresh Susarla, Radhakrishna Gooty, Doug Allen, Ryan Hughes, Andres Calderon, Brandon Paul, Alex Noring, Adam Atia, Alex Zoelle, John Brewer, Nadejda Victor, Peng Liu

Sandia National Laboratories: John Siirola, Bethany Nicholson, Carl Laird, Katherine Klise, Dena Vigil, Michael Bynum, Edna Rawlings, Jordan Jalving

Lawrence Berkeley National Laboratory: Deb Agarwal, Dan Gunter, Keith Beattie, John Shinn, Hamdy Elgammal, Joshua Boverhof, Karen Whitenack, Oluwamayowa Amusat

Carnegie Mellon University: Larry Biegler, Chrysanthos Gounaris, Ignacio Grossmann, Owais Sarwar, Natalie Isenberg, Chris Hanselman, Marissa Engle, Qi Chen, Cristiana Lara, Robert Parker, Ben Sauk, Vibhav Dabadghao, Can Li, David Molina Thierry

West Virginia University: Debangsu Bhattacharyya, Paul Akula, Anca Ostace, Quang-Minh Le, Nishant Giridhar

University of Notre Dame: Alexander Dowling, Xian Gao, Nicole Cortes

Georgia Tech: Nick Sahinidis, Yijiang Li



#### DISPATCHES

Acknowledges support from the Grid Modernization Laboratory Consortium through FE, NE, & EERE

National Energy Technology Laboratory: David Miller, Andrew Lee, Jaffer Ghouse, Andres Calderon, Naresh Susarla, Radhakrishna Gooty Sandia National Laboratories: John Siirola, Michael Bynum, Edna Rawlings, Jordan Jalving Idaho National Laboratory: Cristian Rabiti, Andrea Alfonsi, Konor Frick, Jason Hansen **National Renewable Energy Laboratory:** Wes Jones, Darice Guittet, Jordan Jalving, Ben Kneuven, Abinet Eseve, Ignas Satkauskas Lawrence Berkeley National Laboratory: Dan Gunter, Keith Beattie, Oluwamayowa Amusat **University of Notre Dame:** Alexander Dowling, Xian Gao

#### We also acknowledge support from AMO/NAWI and ARPA-E

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