# Design and Optimization Infrastructure for Tightly Coupled Hybrid Systems

**Topic: Generation** Sub-Topic: Hybrid Systems

DOE 2019 Grid Modernization Lab Call



### DISPATCHES

Design Integration and Synthesis Platform to Advance Tightly Coupled Hybrid Energy Systems

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# Agenda

- Overview
- Core DISPATCHES capabilities: optimization workflows, library of models
- Market surrogates capability: Power and hydrogen co-production systems
  - Generic nuclear case study
  - Generic renewable case study
- Multiscale market simulation capability: wind farm integrated with storage
- Market-informed design of thermal energy storage systems
- Industrial partnerships
  - Partner in nuclear industry
  - Arizona G&T

#### ► Software release





# **Evolving Grid Increasingly Requires Flexibility**



#### **Electric Reliability Council of Texas (ERCOT)**

Source: https://www.ercot.com/gridinfo/generation





# Integrated Energy Systems (IES) Provide Dynamic Flexibility

IESs provide **greater operational flexibility** by optimally coordinating material flows and energy conversions, **multiple value streams** 



Challenge: How to co-optimize IES design and operation consider dynamic market interactions?



Figure: Arent, Bragg-Sitton, Miller, Tarka, Engel-Cox, Boardman, Balash, Ruth, Cox, and Garfield. (2020). Joule.



# **Developing Optimization Environments for Scale-bridging**







Break Barriers & Move Beyond Price Taker: Multiscale Process/Grid Simulation Enabling Capability



IDAES integrates detailed process models (b, ii) into the daily (a, c) and hourly (i, iii) grid operations workflows



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>.

# **Design & Optimization Infrastructure for Tightly Coupled Hybrid Systems**



Sandia

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Design Integration and Synthesis Platform to Advance Tightly Coupled Hybrid Energy Systems

#### 07/2020 to 06/2023

### **Value Proposition**

- Conceptual design of novel hybrid systems in a way that enables rigorous exploration of the design space
- Values the output of the hybrid system within the context of the grid and region it is deployed

### **Project Objectives**

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- **Open, multi-lab computational platform** to support the design, optimization, and analysis of tightly coupled hybrid systems.
- Demonstrate and quantify the benefits of potential hybrid systems based on case studies
- **Build on DOE investments** in modeling and simulation capabilities to support a resilient, reliable, and cost-effective bulk power system.



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# **DISPATCHES Optimization Workflows**

**Coupled Hybrid Energy Systems** 





# **DISPATCHES Modeling Library Enables Diverse Case Studies**

Low fidelity submodels for rapid analysis

Nuclear (baseload) + PEM electrolyzer + H<sub>2</sub> turbine + H<sub>2</sub> storage



Solar or Wind + PEM electrolyzer + battery + H<sub>2</sub> turbine + H<sub>2</sub> storage



High fidelity submodels for rigorous design



Ultra-Supercritical Power Plant (USCPP)



Thermal Energy Storage (TES)



Modular modeling enables easy customization to analyze many IES configurations

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# **Power and Hydrogen Co-production Systems**

- Increasing renewables  $\rightarrow$  volatile grid conditions
  - Nuclear generators cannot respond
  - Curtailment of renewable power
- Participate in alternate markets, e.g., H<sub>2</sub>
   Increases profitability, efficiency, flexibility of
   Decarbonize other sectors
- Need to co-optimize design and operating decisions of IES due to dynamic markets
- Need to consider how IES influence markets, e.g., change electricity prices
- $H_2$  markets are in their infancy
  - Assume unconstrained H<sub>2</sub> demand
  - Assume time-invariant H<sub>2</sub> price, perform sensitivity analysis





Nuclear Case Study Summary (Flexibility from Co-Products)

### **Problem Statement**

How to improve the flexibility and economics of baseload nuclear generators?

What is the optimal electrolyzer size and minimum  $H_2$  selling price?

Co-optimize design and operation

# **Key Findings**

Hybridizing nuclear with PEM to produce hydrogen increases flexibility and profitability

Price-taker overestimates the breakeven  $H_2$  price

Market surrogates accurately capture iterations

### Method

Compare two modeling approaches:

**Price-taker**: assumes no impact on market behavior, de facto standard

**Market surrogates**: accounts for changes in market behavior, novel contribution

# Impact

Method applies to other baseload generators, e.g., large coal or gas-fired generators with carbon capture

Easy to adapt to other electrolysis technologies – solid oxide electrolyzer cell (SOEC)





# **Electricity Prices Vary with the Size of Electrolyzer and H<sub>2</sub> Price**

 Base case (400 MW baseload nuclear generator without an electrolyzer)



Retrofitted case (400 MW nuclear generatory equipped with a 200 MW electrolyzer – H<sub>2</sub> sold at \$1/kg)



**Real-time Prices** 



# Price-taker (PT) Approach vs Market Surrogates (MS) Approach



► **PT1:** Generate LMP data (PCM or historical)



 PT2: Formulate and solve the price-taker problem MS1: Generate training data



► MS2: Train neural network surrogate model



 MS3: Formulate and solve the design problem by embedding market surrogates



# Nuclear Case Study Results: Price-taker vs Market Surrogates

0.35

0.45

Difference in the **net present value** and breakeven H<sub>2</sub> price: 1.8/kg vs ~1.4/kg



#### **Price-taker overestimates the breakeven H**<sub>2</sub> **price**

Difference in electricity revenue ►



#### Electricity revenue depend on H<sub>2</sub> vs electricity production schedule – nuanced interactions

DISPATCHES Platform to Advance Tightly Coupled Hybrid Energy System

# **Optimization Results with Market Surrogates are More Accurate**

**Coupled Hybrid Energy Systems** 



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# **RE Case Study: Retrofit Existing Wind + PEM**



Challenge for wind generation in RTS-GLMC:

- Significant curtailment in RTS-GMLC
- Revenues are inadequate to recover operating costs

How does hybridization with PEM to co-produce  $H_2$ :

- Improve economics and flexibility
- Reduce curtailment

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Fundamental difference from nuclear case: renewables (wind) adds uncertainty.

#### Different assumptions than nuclear case:

- Shortfall price was \$1000/MWh (instead of \$500/MWh)
- RT market only, to avoid penalties from missed DA promises
- No depreciation nor corporate tax
- Objective value was 30-year NPV (instead of annualized)

# Wind-Electrolyzer Case Study Summary (Flexibility from Co-Products)



### **Problem Statement**

- How to hybridize an existing wind farm to produce  $H_2$  to:
- Increase flexibility for the grid
- Increase profitability ٠
- Decrease curtailment ٠
- Manage uncertainty ٠

Co-optimize design and operation

### **Key Findings**

Hybridization dramatically improves wind farm economics and curtailment

Market surrogate bridge gap between PCM enumeration and the price-taker optimization

# **Method**

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Compare and validate the three DISPATCHES workflows: Price-taker optimization PCM enumeration • Market surrogate optimization

Validation with PCM ٠

### Impact

 $H_2$  via electrolysis provides flexibility to integrate renewables into the electric grid

Extend methods to other renewable systems (e.g., solar thermal, PV) and other hybridization pathways (e.g., chemicals such as NH<sub>3</sub>)



# **RE Case Study: Optimal Design with Price-Taker**



#### **Optimal PEM Designs**

H <sub>2</sub> Price	PEM Size	Ann. NPV
[\$/kg]	[MW]	[\$mil]
2.00	65	-10
2.25	123	-7.1
2.50	204	-3.3
2.75	262	1.4
3.00	322	7.0
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**Coupled Hybrid Energy Systems** 

The optimal NPVs are positive for  $2.75/kg H_2$  or higher. The revenue from this design was primarily from the hydrogen market.

\$3/kg scenario was selected for comparison with the market surrogate approach (next)



# **RE Case Study: Market Surrogates Validation (\$3/kg)**



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Compare and validate the three DISPATCHES workflows: • Price-taker optimization

- PCM enumeration
- Market surrogate optimization
- Validation with PCM

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#### Software release





# Wind-Battery Case Study Summary (Flexibility from Time-Shifting)



### **Problem Statement**

- How to retrofit an existing **wind farm** with **battery energy storage** to:
- Increase flexibility for the grid
- Increase profitability
- Decrease curtailment?

Co-optimize design and operation

#### Methods

Compare two modeling approach:

- **Price-taker optimization**: neglect IES impact on market outcomes interaction with the market.
- Multiscale IES-PCM simulation: IES bids into market, quantify IES/market interaction.

### **Key Findings**

Participating only in the electrical energy market is not profitable because of high capital and OM costs

The price-taker optimization overestimates the IES economic value.

The IES/market interaction changes the LMP.

#### Impact

Approach is applicable all IES including other renewable sources (e.g., solar thermal, PV) and energy storage technologies (e.g., thermal, compressed air, chemical)

Opportunity to generalize the market surrogates approach (previous case studies) to consider energy storage



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Optimal design and integration of a thermal energy storage (TES) with a fossil-based thermal power plant

# Motivation:

Base load plants are required to operate flexibly under high variable renewable integration



# Determine:

- Optimal integration points considering rigorous process level models
- Optimal size of energy storage considering dynamic electricity market

# Key challenges

- Computational tractability when using non-linear first-principles models
- Combinatorial complexity presented by the integral choices

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Fossil + Thermal Storage Case Study (Flexibility from Time-Shifting)



### **Problem Statement**

Optimal design and integration of thermal energy storage (TES) with ultra supercritical steam cycle while considering time-varying electricity prices and **large**scale process model

Determine:

- **Discrete design** decisions (71 integration options!)
- Continuous design capacity variables

### **Key Findings**

Systematic evaluation of 71 multiple flowsheet configurations within one model

Designing considering time-varying electricity prices prevents under- or over-sizing storage

#### Method

Two-step approach:

- Step 1: GDP to determine storage material and points of integration of TES.
- Step 2: Multi-period to calculate optimal size and operational conditions of integrated USCPP with time-varying electricity prices.

#### Impact

Method is applicable NGCC & biomass gasification for co-producing  $H_2$  & electricity with  $CO_2$  capture, and nuclear or solar generators with TES.

Analysis method supports analyzing historical electricity prices or market surrogates



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### **Nuclear + H<sub>2</sub> Industrial Partner Case Study: Problem Statement**



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Platform to Advance Tightly

Coupled Hybrid Energy System

Is a nuclear +  $H_2$  peaker with storage economically viable in the NYISO market?

#### **Revenues:**

- Electricity sales (historical dynamic prices)
- H<sub>2</sub> sales (assume constant price)
- Hydrogen Production Tax Credit (HPTC; 45V in IRA)
- Capacity payments (CP), requires 4 hours of fuel on-site

#### **Design Decisions**:

- Storage tank size
- Fuel cell capacity

#### **Operating Decisions:**

- H<sub>2</sub> production schedule
- H<sub>2</sub> consumption schedule
- H<sub>2</sub> Storage level (bounded)



**Nuclear + H<sub>2</sub> Industrial Partner Case Study (Flexibility from Time-Shifting)** 



### **Problem Statement**

Co-optimize design and operation of a  $H_2$  + nuclear peaking power plant with  $H_2$  storage



### Method

**Price Taker Optimization**: valid since the capacity of the peaker is very small

Additional revenues from hydrogen production tax credit (45V in IRA) and capacity market

# **Key Findings**

Capacity payments need to be an order of magnitude higher (~\$15) than present day (~\$2.50) to reach multi-million net present value.

Hydrogen Production Tax Credit improves economics. If it is not extended after 10 years, build decision may still be marginally profitable.



### Impact

Quantify necessary market conditions for carbonneutral technologies to be economically viable

E.g.: Identified capacity payment value for which the overall economics are favorable.

Easily extendable to other systems, utility/industry goals

# Arizona G&T Case Study: Problem Statement

**Goal**: Co-optimize an IES with PV, PEM electrolysis, battery storage, and a flexible gas turbine that combusts  $H_2$  and natural gas blends to:

- Meet load of existing baseload steam turbine
- Provide reserves via curtailed PV power, turbine headroom, PEM footroom, stored battery power
- Replace original 181 MW of capacity
- Benefit from exchange with CAISO
- Benefit from hydrogen market
- Reduce emissions





Source: C.K. Woo, et al. "Carbon trading's impact on California's real-time electricity market prices"

#### **Analysis Questions:**

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Coupled Hybrid Energy Systems

- 1. What are the PV and storage sizes? Are they realistic on-site?
- 2. How expensive to replace steam plant with a new flexible gas turbine (up to 100%  $H_2$ )?
- 3. What are the impacts on carbon emissions?

# Arizona G&T Case Study (Flexibility from Time-Shifting)

#### GRID MODERNIZATION LABORATORY CONSORTIUM US. Department of Energy

#### **Problem Statement**

How to co-optimize design and operation of a PV plant hybridized with PEM electrolysis, battery storage, and a flexible gas turbine?

What are the impacts of minimum limits of  $H_2$  in turbine fuel?

# **Key Findings**

Enforcing  $H_2$  in turbine fuel reduces the benefits of the turbine in the winter

Building out PV + Battery alone requires a large battery capacity

### Method

Price-taker optimization enables analysis of historical data from CAISO

Co-optimize design and operation for different IES configuration options

### Impact

Workflow is highly customizable for diverse technologies and partner analysis goals

Opportunity to extend workflow to consider other market products (e.g., ancillary services) and surrogate to go beyond price taker



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#### ► Software release





# **DISPATCHES: Software Documentation, Releases &** Source Code

Search docs

Unit Models

Properties

- Documentation (starting point):
  - https://dispatches.readthedocs.io
- Software Releases:
  - https://github.com/gmlcdispatches/dispatches/releases
- ► Source code:
  - https://github.com/gmlcdispatches/dispatches/

Open-source development statistics:

- 10+ software releases
- 100+ scheduled developer calls
- 18+ code contributors
- 140+ code contributions (Pull Requests, PRs)





# **Summary and Discussion**

- DISPATCHES developed
  - Models and workflows supporting the conceptual design of novel hybrid systems in a way that enables rigorous exploration of the design space
  - Design optimization techniques that explicitly value the output of the hybrid system within the context of the grid and region it is deployed
- Applied workflows to four "generic" case studies
  - Power and hydrogen co-production systems
    - Nuclear case study
    - Renewable case study
  - Multiscale market simulation capability: wind farm integrated with storage
  - Market-informed design of thermal energy storage systems
- Applying workflows to solve industry-specific problems
  - Arizona G&T: Fossil + Renewables + Storage
  - Other Industry Partner: NE + PEM + Fuel Cell
- ► Future opportunities







# DISPATCHES

Design Integration and Synthesis Platform to Advance Tightly Coupled Hybrid Energy Systems



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National Energy Technology Laboratory: <u>David Miller</u>, Radhakrishna Gooty, Andrew Lee, Naresh Susarla, (Jaffer Ghouse)
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