

BYU, UT



# Optimization of Integrated Energy Systems

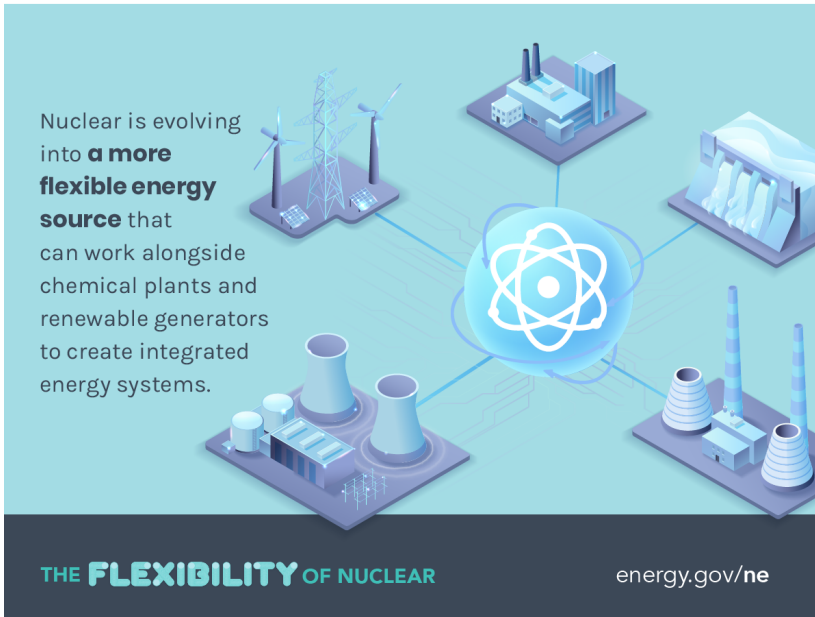
10 November 2022

**Daniel Garrett, PhD**  
Integrated Energy Systems  
Nuclear Science & Technology Directorate  
[daniel.garrett@inl.gov](mailto:daniel.garrett@inl.gov)

 Idaho National Laboratory

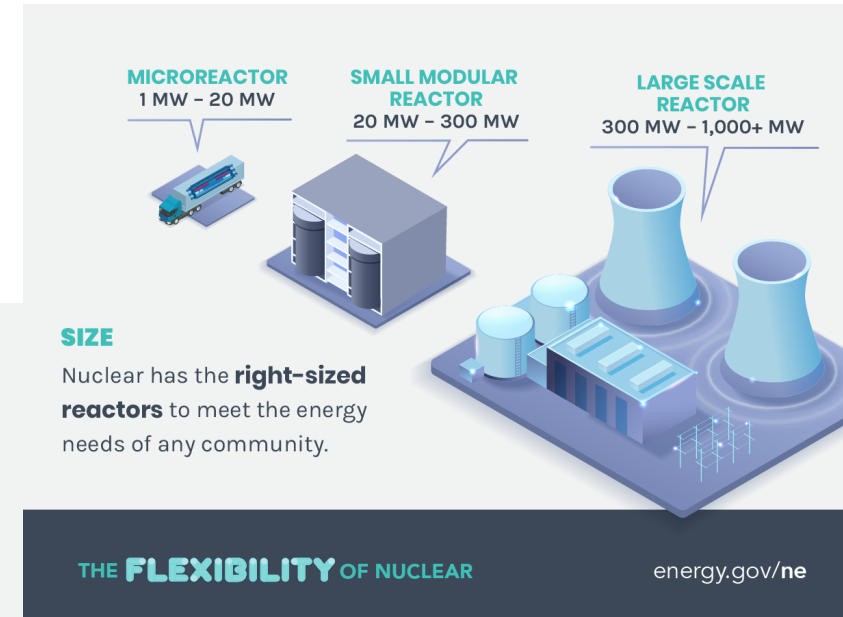
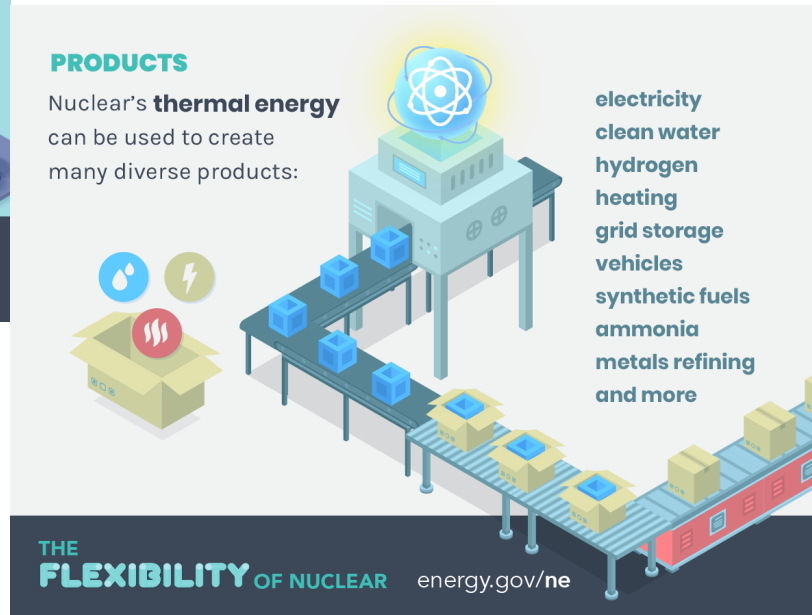
INL/MIS-22-70068

# New operational paradigms—nuclear energy flexibility



- **Operational flexibility**
- **Product flexibility**
- **Deployment flexibility**

*Nuclear flexibility can be key to enabling deployment of other clean energy generators.*



U.S. DEPARTMENT OF  
**ENERGY**

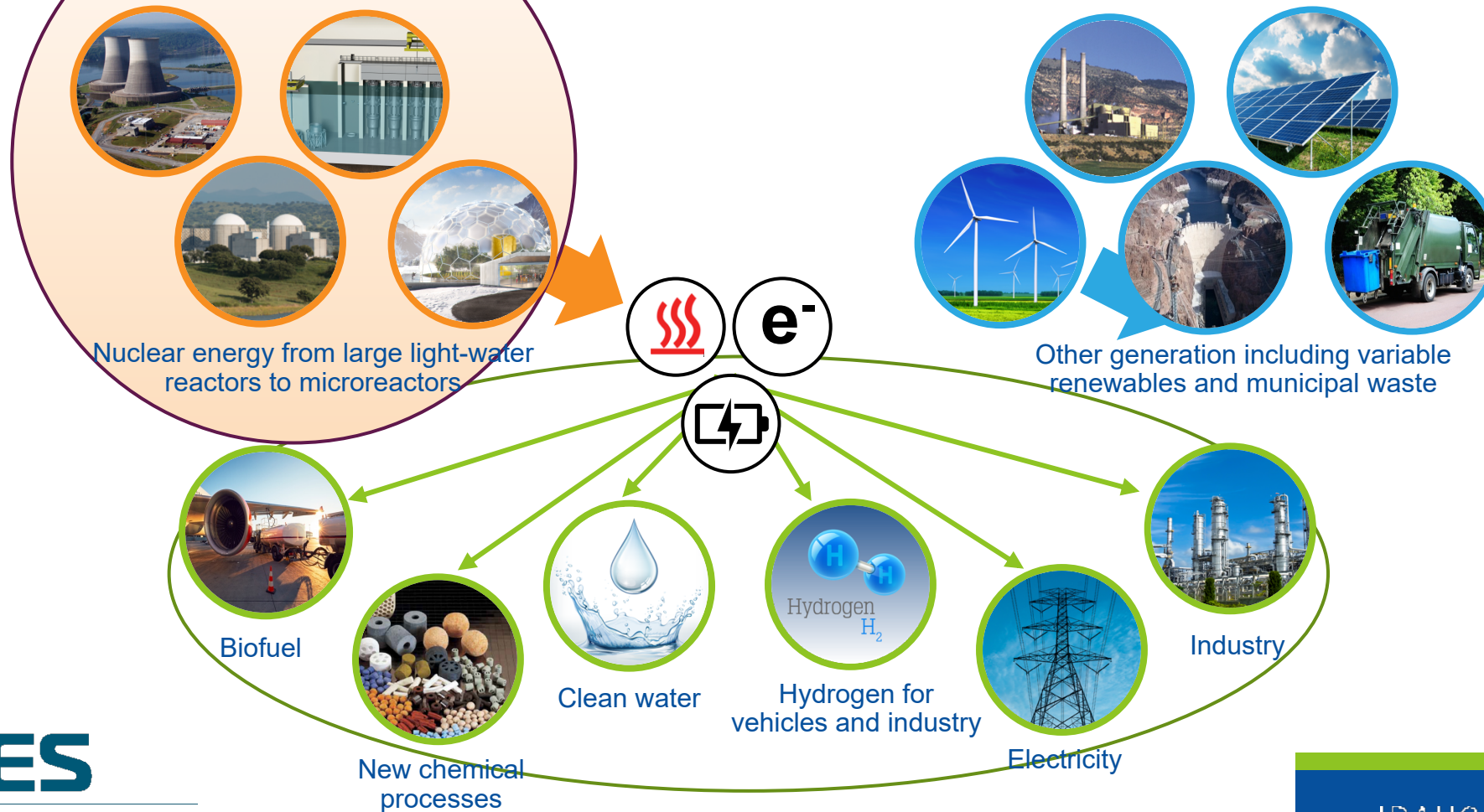
Office of  
**NUCLEAR ENERGY**



# Cross-sectoral energy solutions for a resilient net-zero future

## Future Energy System: Transforming the Paradigm

Integrated systems leverage contributions from all low emission energy generation options to support decarbonization of electricity, industry, and transportation



## Goals

- Maximize energy utilization and generator profitability
- Minimize environmental impacts
- Maintain affordability, grid reliability and resilience



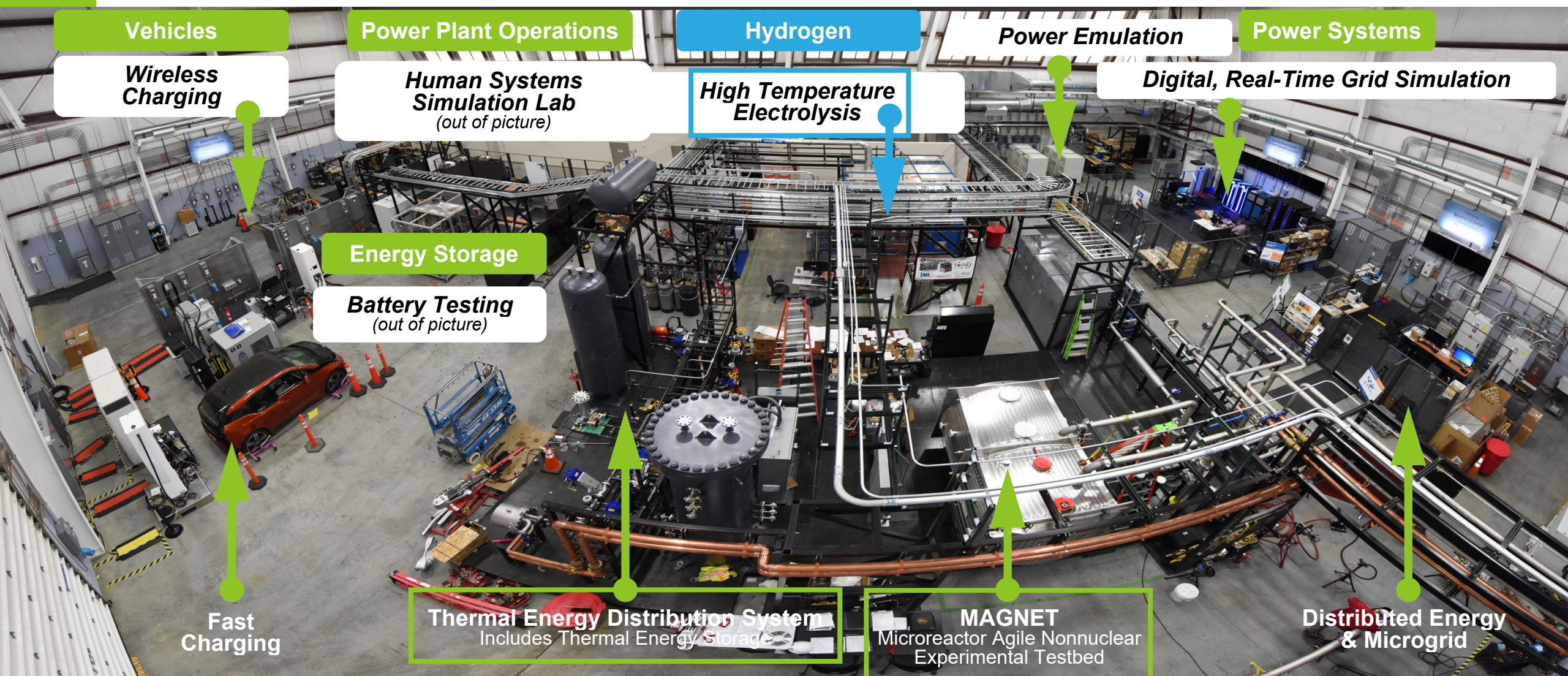
**IES**

Integrated Energy Systems

IDAHO NATIONAL LABORATORY



# DETAIL – Dynamic Energy Transport and Integration Laboratory





# IES Optimization at INL

- HERON
  - <https://github.com/idaholab/HERON>
  - RAVEN plugin
    - <https://github.com/idaholab/RAVEN>
  - Optimize capacity/component sizing
    - Dispatch optimization
- ORCA
  - Optimization of Real-time Capacity Allocation
  - Under development
  - Real-time economic optimization



# HERON

- Bringing FORCE together for Technoeconomic Analyses



## RAVEN

- Stochastic Analysis
- Synthetic Histories



## TEAL

- Economic Metrics
- Cash Flows

## FARM

- Process Analysis
- AI Training, Control

## HYBRID

- Process Models
- API Framework



## HERON

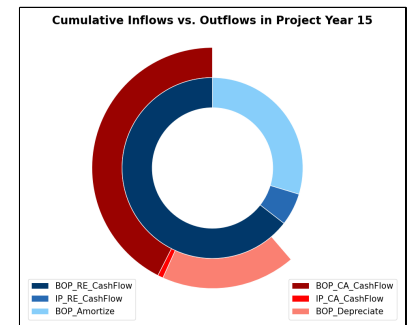
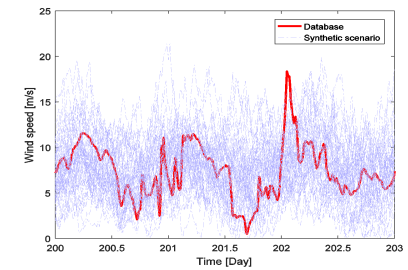
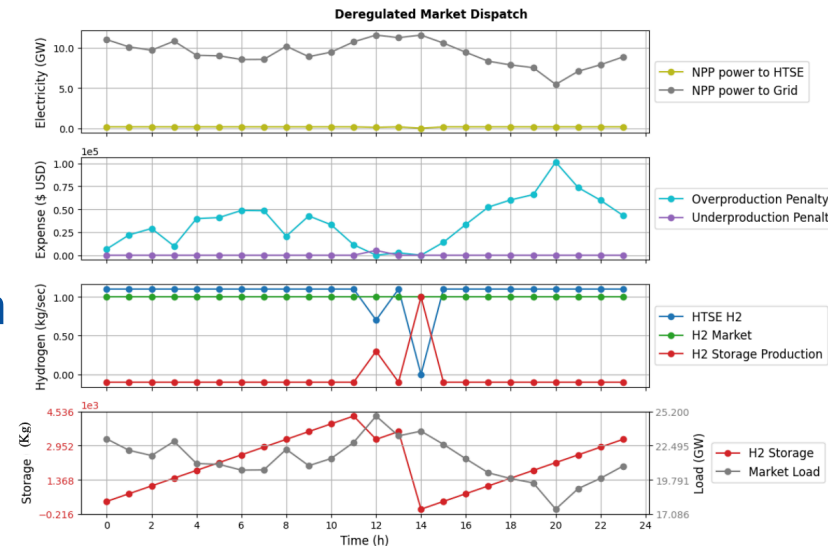
- Stochastic Technoeconomic Analysis
- Component Sizing Optimization
- Dispatch Optimization



# Macro Technoeconomic Analysis



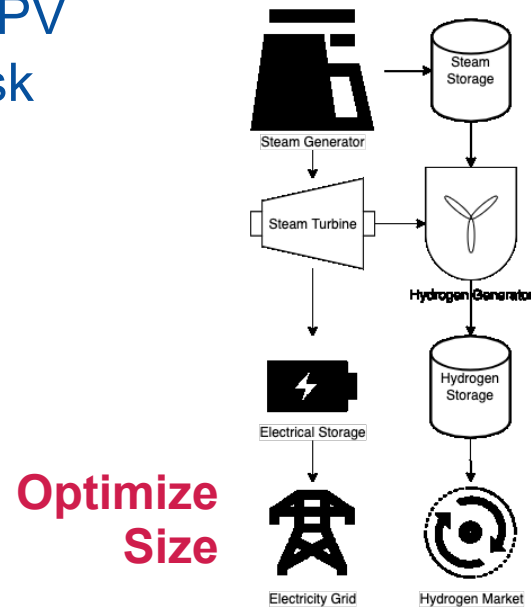
- Holistic Energy Resource Optimization Network
- Solve:
  - Optimal size for IES systems (generators, storage, industrial processes)
- Such that:
  - Respect technical limitations
  - Evaluate continuous-time responses
  - Optimize component dispatch
  - Maximize expected profitability
    - Requires uncertainty quantification
  - Weight expected profit by risk
    - Value at Risk, risk assessment



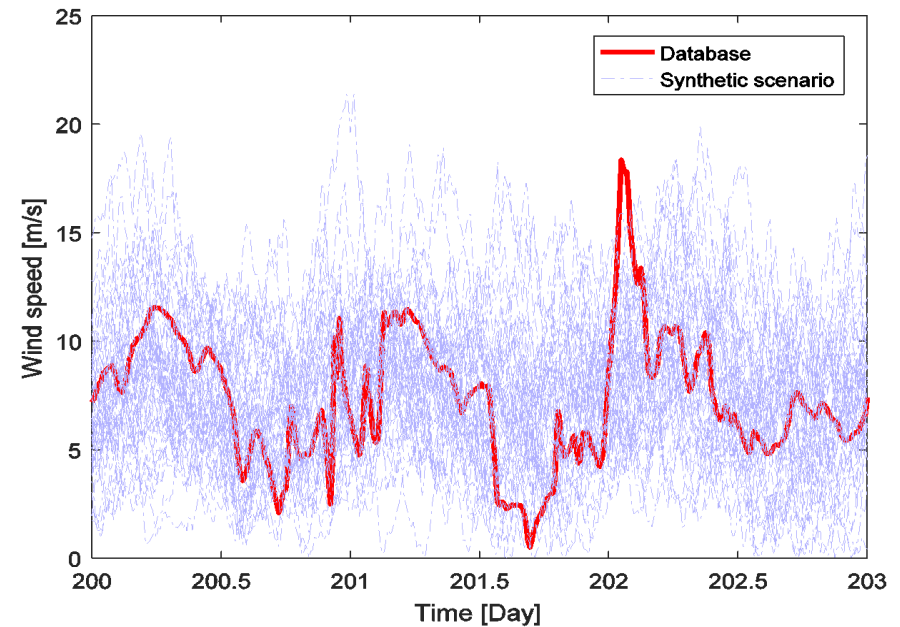


# Risk-Informed Optimization

- Stochasticity
  - Consider more than one projected future
  - Statistically consider hundreds or thousands
- Optimize system size for expected benefit
  - Expected NPV
  - Value at Risk



## Many Potential 30-year Outlooks



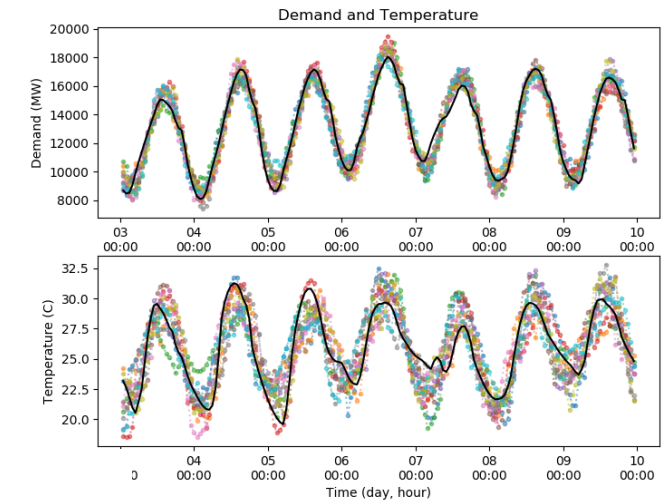
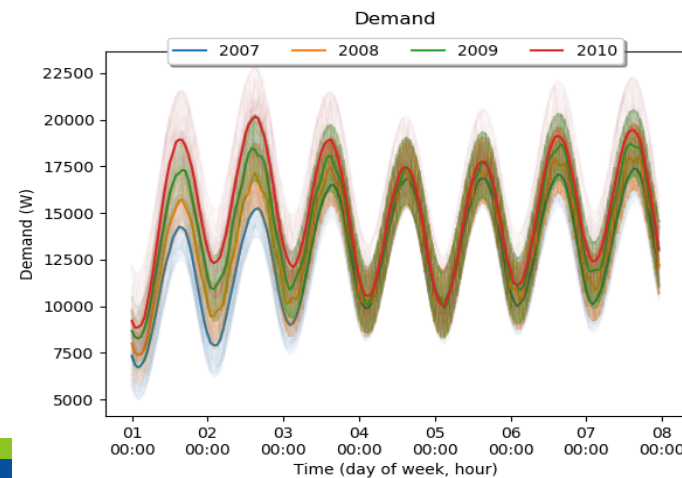
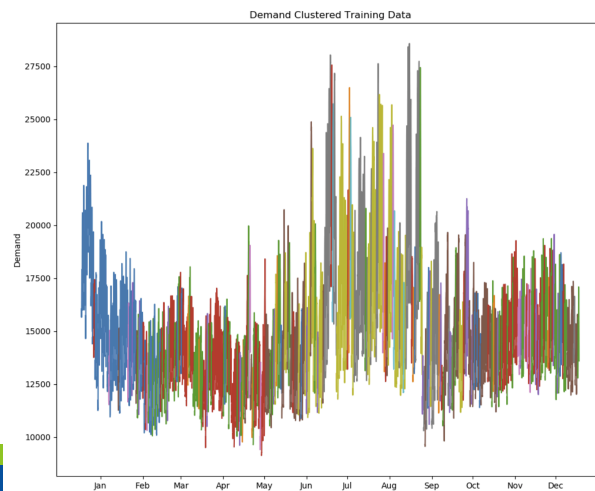


# Synthetic Histories

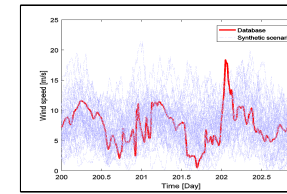


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- Synthetic Histories allow exploring many possible futures
- Train on historical or projected data
  - Capture short, long-term deterministic effects
  - Characterize residual uncertainty
- Sample new histories
  - Each independent, identically-distributed
  - Same characteristics as training, new behavior
  - Clustering, correlation, multiyear evolution



# HERON Two-Loop Optimization



solar

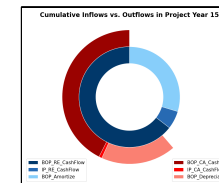
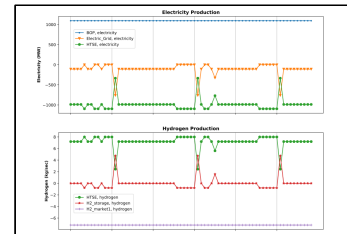
demand

wind

markets

Repeat for  
Many Histories

Statistical  
Economic  
Metrics



New  
System

Component  
Sizing

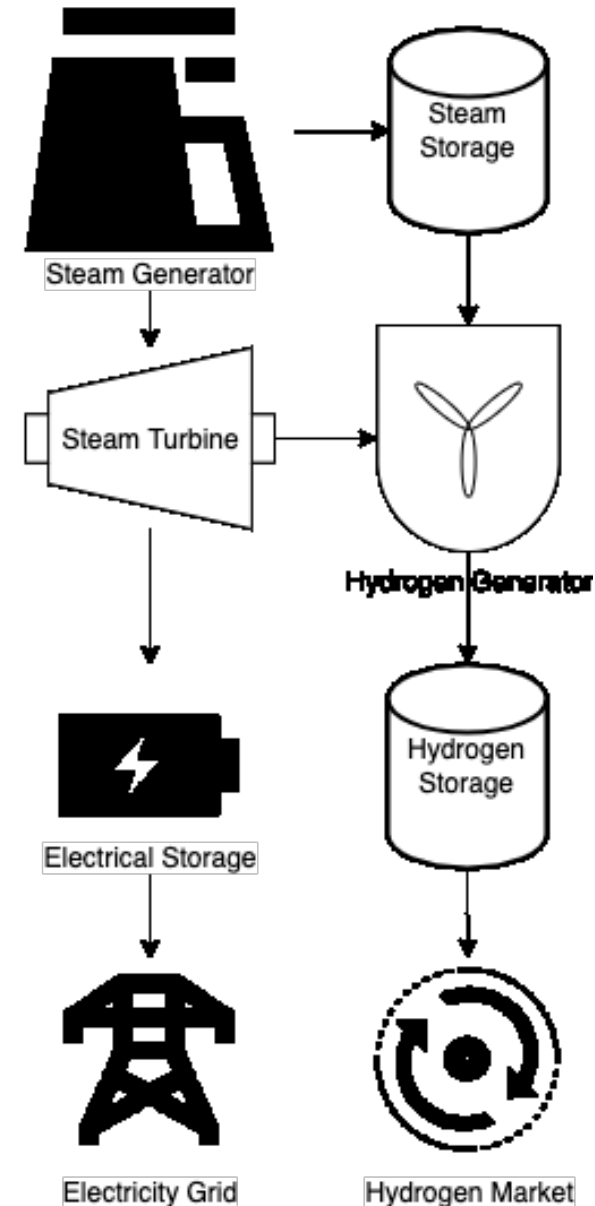


# “Outer” Optimization Components and Markets

- Nuclear Power Plant
  - Core (Steam Generator)
  - Turbine (Steam to Electricity)
- Hydrogen Generator
- Hydrogen Storage
- Battery Storage
- Thermal Energy Storage
- Electricity Market
  - Real Time, Day Ahead
- Hydrogen Market
- See <https://github.com/idaholab/FORCE> for examples

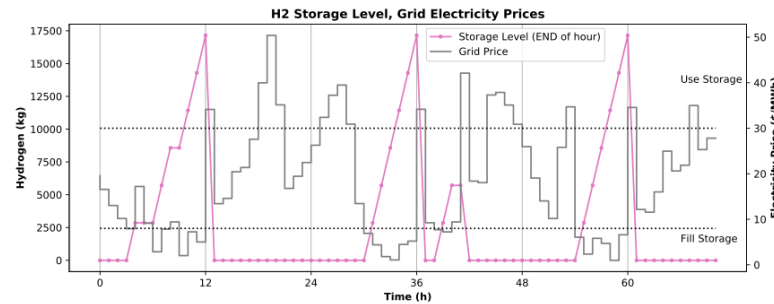
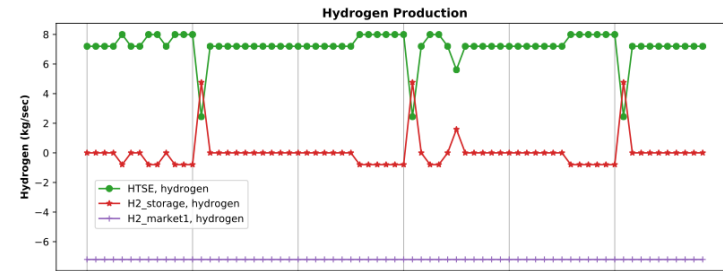
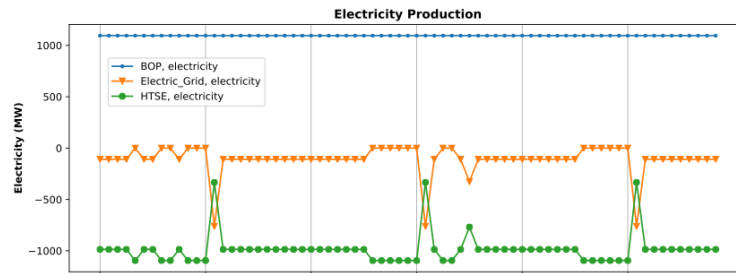
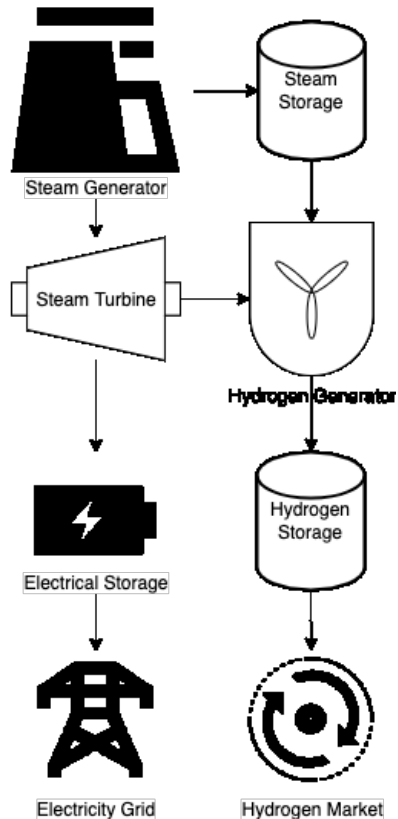
**Optimize**

- **Size**
- **Dispatch**



# “Inner” Optimization – Dispatch

Optimize  
Size



Optimize Dispatch, Commitment  
30-year projection

Continuous Time  
Flexible Economic Drivers  
Multiple Commodities  
Arbitrary Policies  
Signal Response  
Storage Flex



# ORCA – IES Real-Time Economic Optimization

- IES optimization occurs at multiple time scales
  - “Real-Time” = days, hours, minutes, etc.
- Operation optimization of IES
  - Integration of IES with digital twin
    - RTO sits between M&S and operations
  - How do we operate optimally?
    - Maximize profits
    - Production scheduling
    - Arbitrage
- Why RTO?
  - \$\$\$

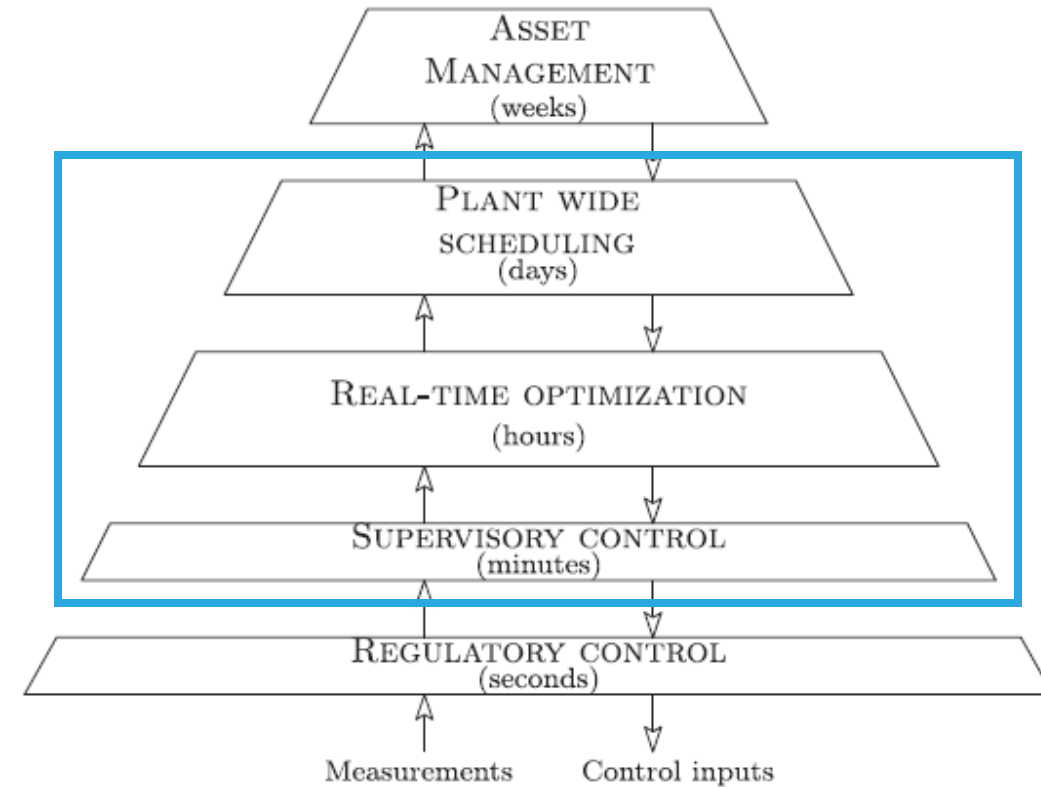
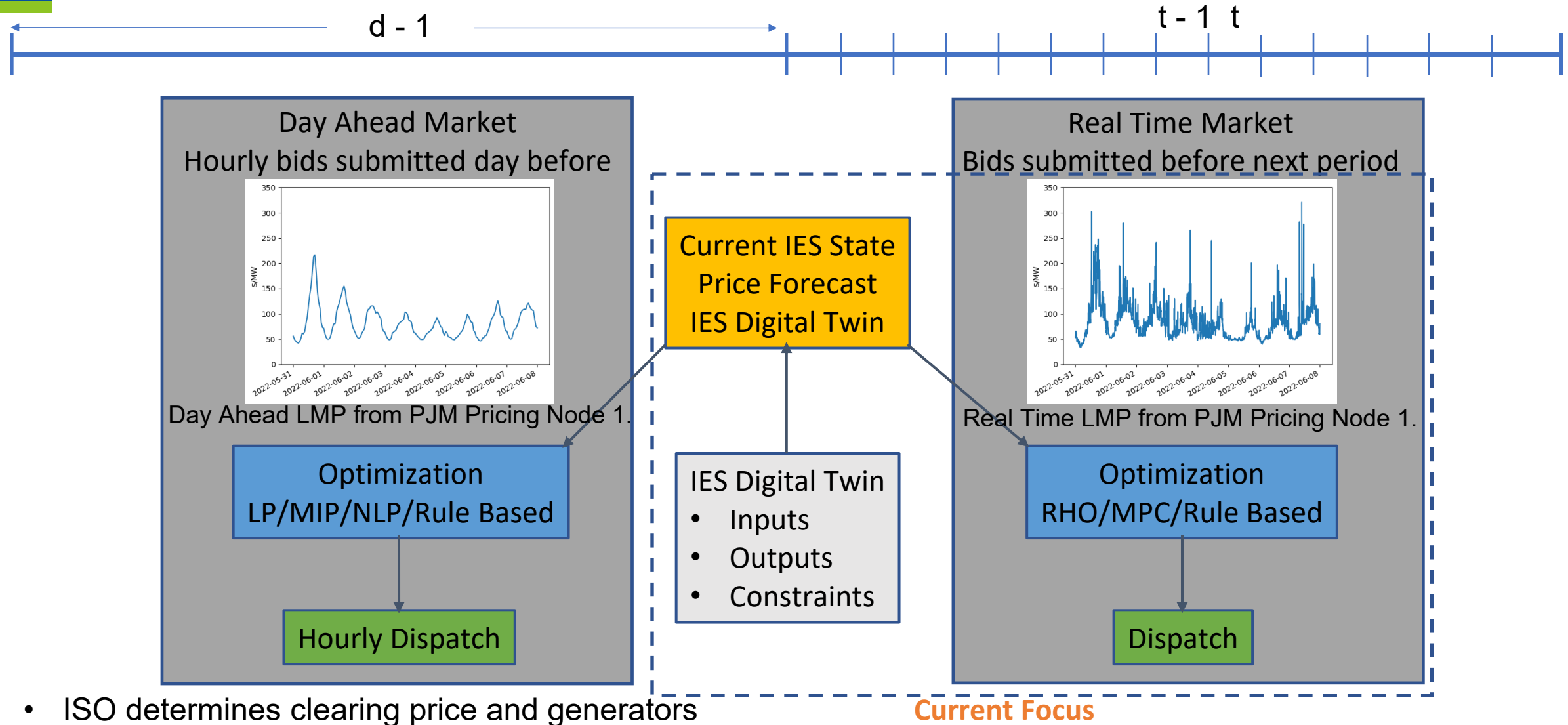


Fig. 1. Typical control hierarchy in process control.  
Krishnamoorthy et al. 2018

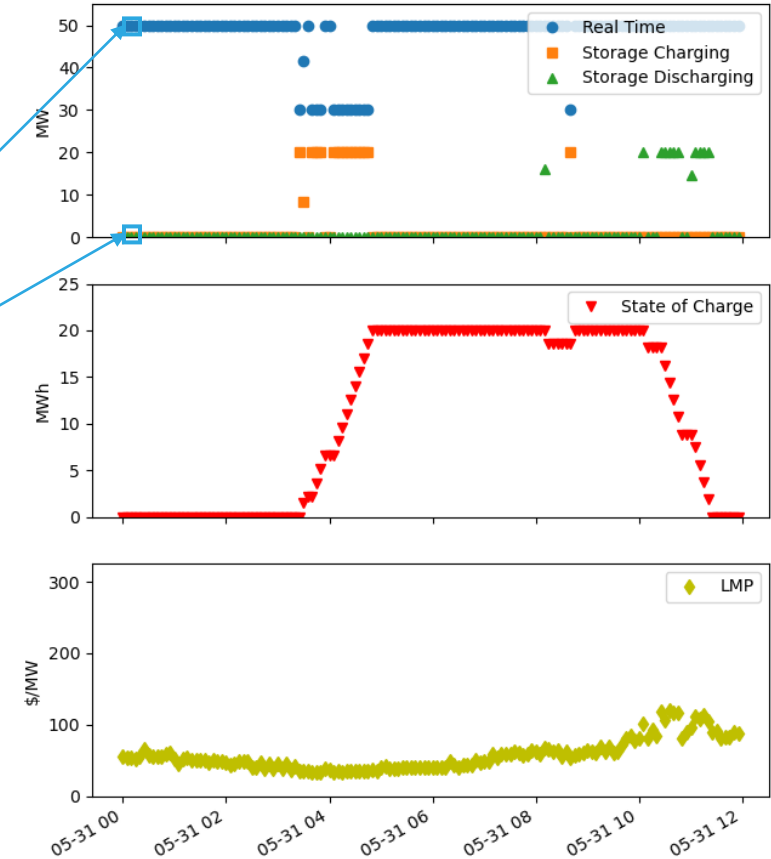
# Deregulated Electricity Market RTO





# ORCA – Dispatch Optimization

- Economic Model Predictive Control/Receding Horizon Optimization
  - Forecast LMP forward in time (i.e., 12 hours)
  - Use model to predict IES performance
  - Optimize dispatch for maximum revenue
  - Use dispatch for next time step only
    - Implement as setpoints/control actions
  - , repeat



# IES Mathematical Model Example

- NPP + Electrical Storage
  - NPP supplies constant capacity
  - Electrical storage for arbitrage
    - : state of charge at time (MWh)
    - : round trip efficiency (0,1)
    - : charging at time (MW)
    - : discharging at time (MW)
    - : time step (minutes)
    - : LMP at time (\$/MW)
    - : NPP capacity (MW)
  - Objective function: maximize revenue

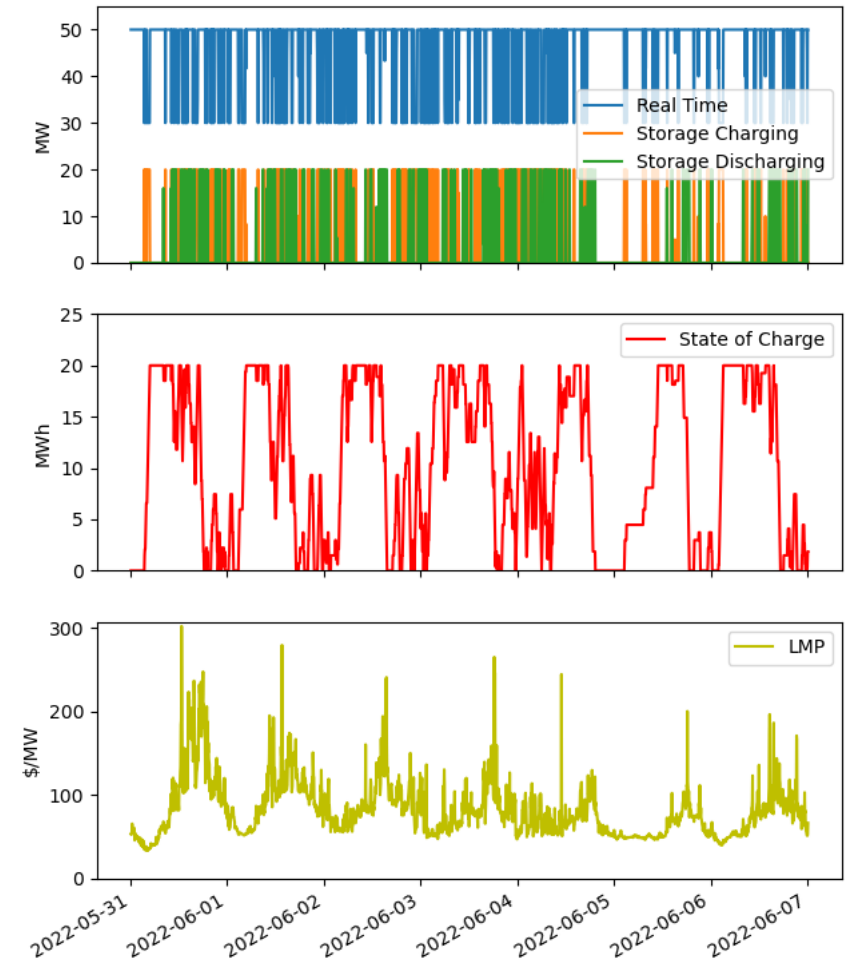
# ORCA Example

- 05-31-2022 to 06-07-2022
- PJM Pricing Node 1 (5-minute real time market)
- Perfect knowledge LMP forecast

Parameter	Value
	5 minutes
	0.8
	50 MW
	20 MWh
	0 MWh
	20 MW
	20 MW

	1 Week Revenue
IES	\$8,511,996.26
NPP only	\$8,265,764.33
<b>Revenue Increase</b>	<b>\$246,231.93</b>

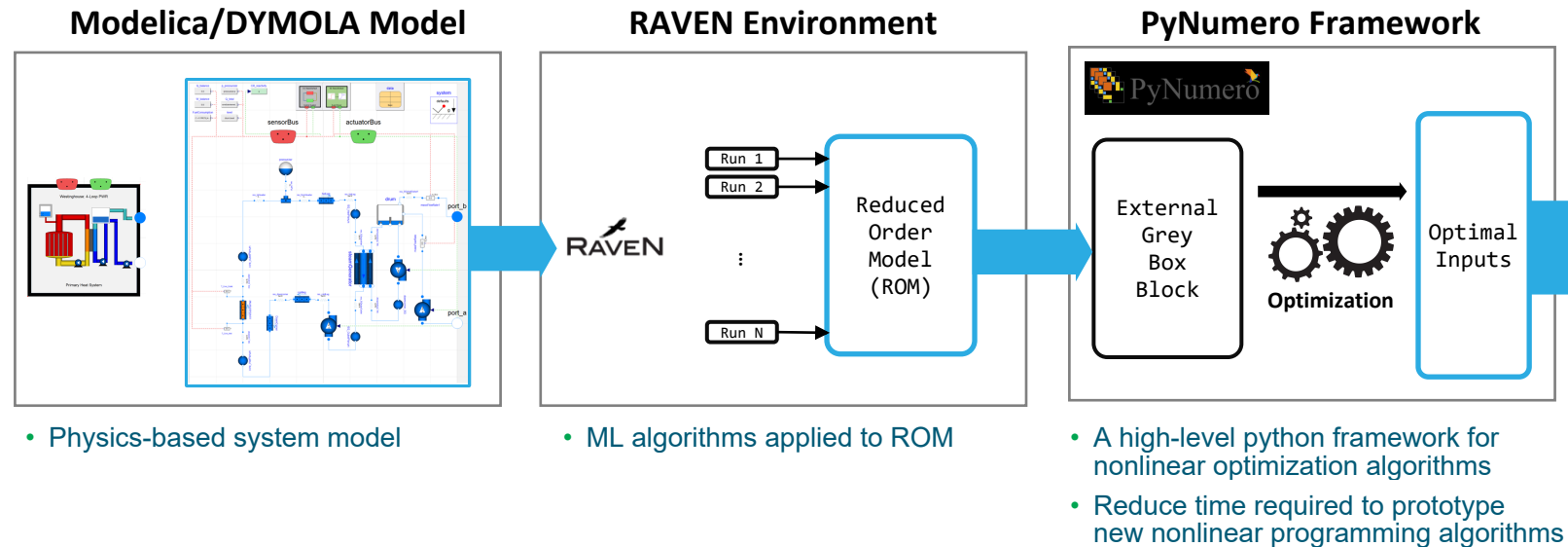
## Dispatch



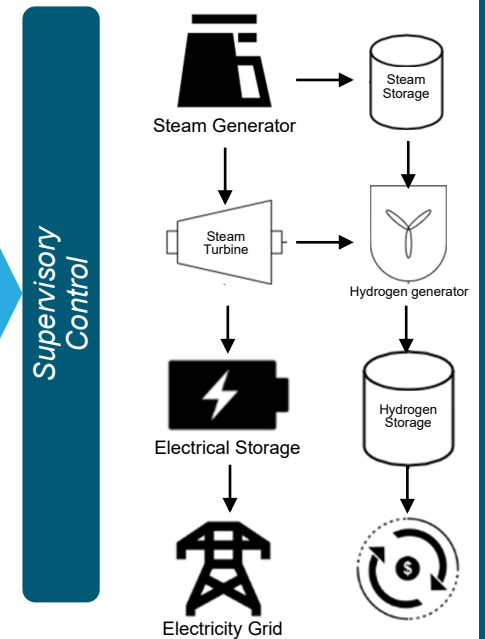


# ORCA – Digital Twin □ Physical System Control

## Workflow in Digital Twin Framework



## Physical Systems



## System State Update

- Black box – no information: only inputs □ outputs
- Grey box – some information: inputs □ outputs, derivatives (Jacobians, Hessians, etc.)

# ORCA – Current Work

- Build Python package to perform dispatch optimization
  - Provide tools for use in building workflows, not THE workflow
  - Given a model, perform optimization
- EMPC-based dispatch optimization
  - Current mathematical model:
    - Automatically generate Pyomo expressions for model, constraints, objective function
- Prepare for virtual demonstration of real-time economic optimization
  - Virtual model in Modelica/Dymola to emulate physical IES
  - Deep Lynx data warehouse to communicate between virtual model and optimization
  - Digital twin development for ORCA to use in economic dispatch

# ORCA – Future Work

- Demonstrate real-time economic optimization on physical IES
  - DETAIL IES at INL
  - Deep Lynx data warehouse to communicate between IES and optimization
  - Digital twin development for ORCA to use in economic dispatch
- Open source ORCA
- Expand ORCA package
  - Additional optimization methods beyond EMPC
  - Integrate with other tools at INL or open-source community

# Summary



- IES can make nuclear more flexible, economical
- Optimization of IES at INL
  - HERON
    - Optimal sizing for IES components
  - ORCA
    - Real-time economic dispatch optimization
- [ies.inl.gov](http://ies.inl.gov)
  - [daniel.garrett@inl.gov](mailto:daniel.garrett@inl.gov)





Idaho National Laboratory