



# ASSESSING UTILITY SCALE ENERGY STORAGE ECONOMICS CONSIDERING GENERATION ADEQUACY SERVICES

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# Overview

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- Introduction
- Modeling Approach & Assumptions
- Results – North Carolina Case
- Impacts of Storage in Dispatch Costs - Brazil
- Final Comments

# Introduction

# Energy Storage Options for North Carolina

**Favorable conditions for energy storage technologies to assist in managing the grid operation**



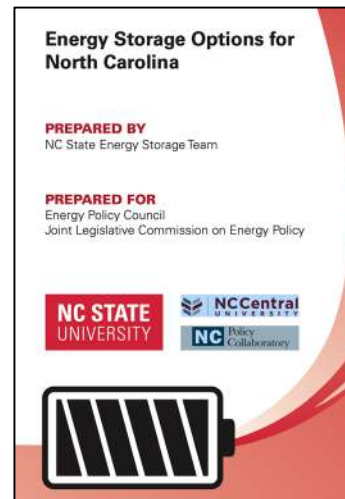
**Public utilities commission started efforts to analyze energy storage systems in the North Carolina (NC)**



**State Congressional Order HB589** of 2017 for carvouts of Solar Generation in NC



**Technical study** to determine the value of energy storage systems to NC consumers



**Energy storage capacity greater than 1 GW** would be economically viable considering prices in 2030



Recently Utilities started to include energy storage in their integrated investment plans

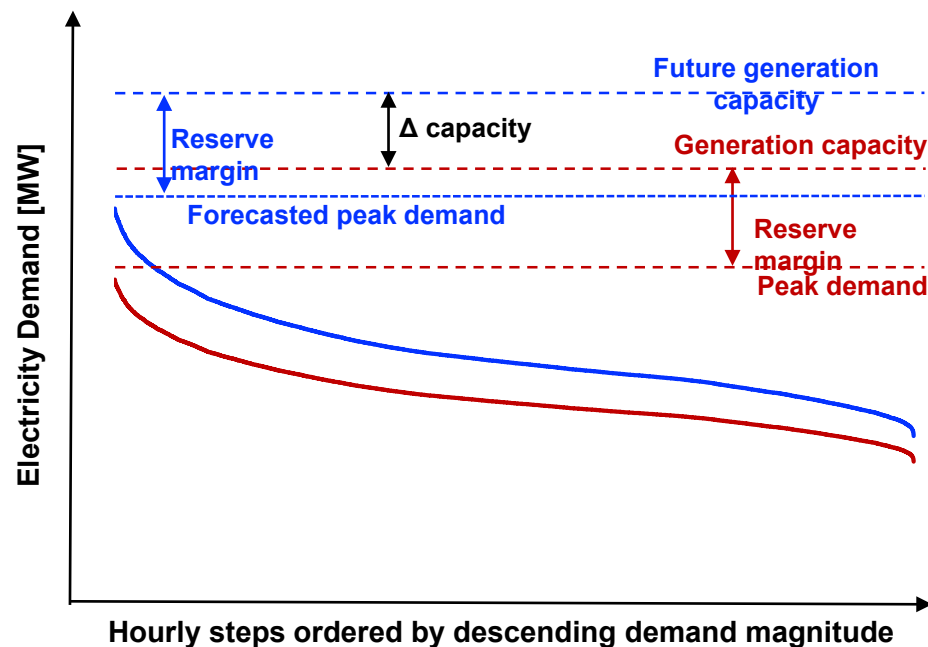


**As of 08/2020** the state's largest Li-ion battery system was deployed in Asheville 9 MW (\$15 million)

**There is still no significant state incentive for energy storage**

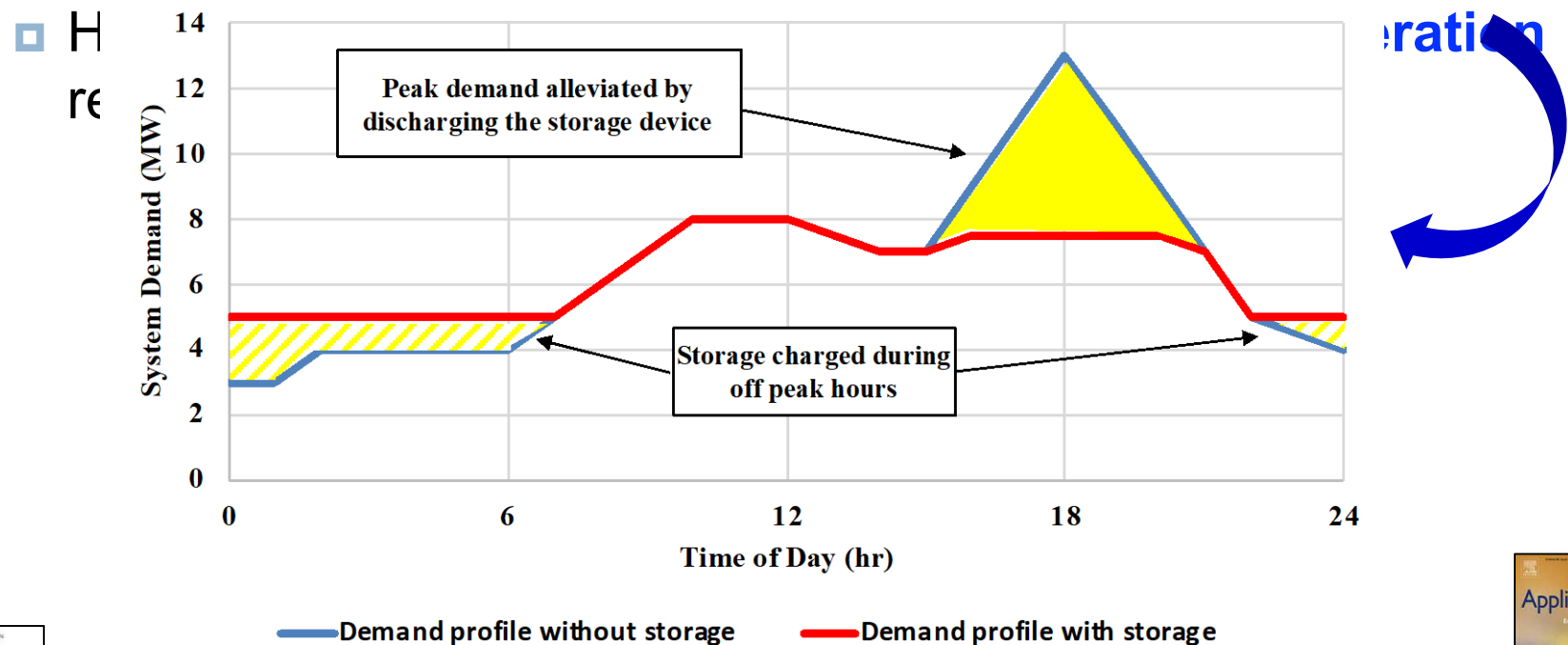
# Peak Capacity Deferral

- It refers to the practice of delaying the construction or installation of new generation capacity until it is necessary to meet peak electricity
- How storage can contribute to **postpone investments in generation**



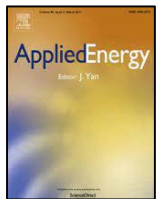
# Bulk Energy Time Shifting

- Practice of shifting the delivery of large amounts of energy from one period to another. Take advantage of differences in demand & prices



Hafiz, F., de Queiroz, A.R., Fajri, P., Husain, I., (2019) Energy management and optimal storage sizing for a shared community: A multi-stage stochastic programming approach, Applied Energy, 236: 42-54

Hafiz, F., Awal, M.A., de Queiroz, A.R., Husain, I., (2020) Real-time Stochastic Optimization of Energy Storage Management using Deep Learning based Forecasts for Residential PV Applications, IEEE Transactions on Industry Applications, 56(3): 2216 – 2226



## Modeling Approach & Assumptions

# Optimization Model Overview

- Energy system optimization model (**Temoa**) used for two purposes:



**The TEMOA Project**

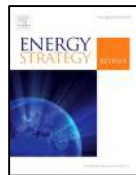
Tools for Energy Model Optimization and Analysis

<https://github.com/TemoaProject>

- **Capacity expansion planning (CEP)**

<http://temoaproject.org>

for the area in analysis under different scenario configurations

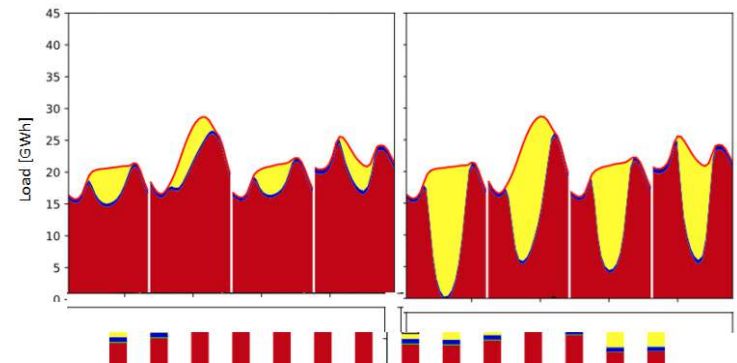
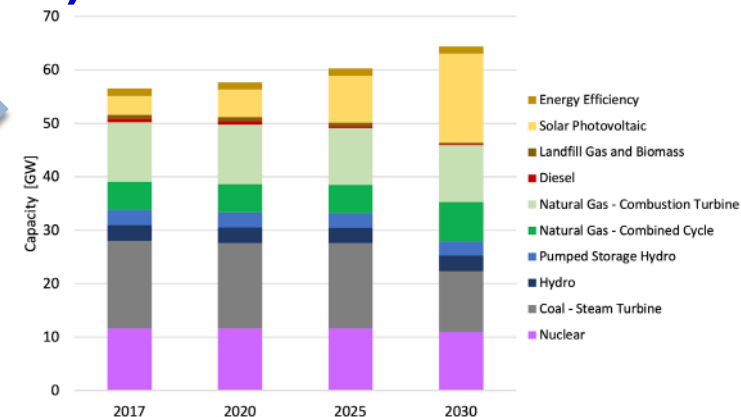


Patankar, N., Eshraghi, H., de Queiroz, A. R., & DeCarolís, J. F. (2022). Using robust optimization to inform US deep decarbonization planning. *Energy Strategy Reviews*, 42, 100892

- **Operational dispatch** considering system configurations from CEP and different deployment of storage technologies



de Queiroz, A. R., Mulcahy, D., Sankarasubramanian, A., Deane, J. P., Mahinthakumar, G., Lu, N., & DeCarolís, J. F. (2019) Repurposing an energy system optimization model for seasonal power generation planning. *Energy*, 181, 1321-1330





# Approach, Data and Assumptions

Analysis scenarios

**Temoa run  
(Capacity Expansion)**

**Build out  
plans for the  
system**

**Introduce  
Energy  
Storage**

\*Assume a fixed duration (energy to power ratio) and efficiency

\*No energy storage is considered in the initial operational dispatch runs

**Total dispatch  
cost  
Hourly  
generation  
dispatches**

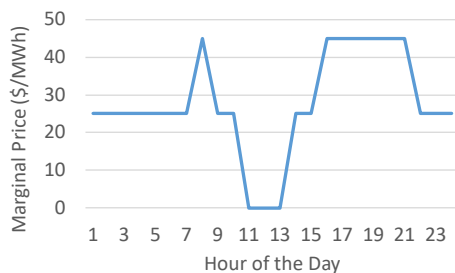
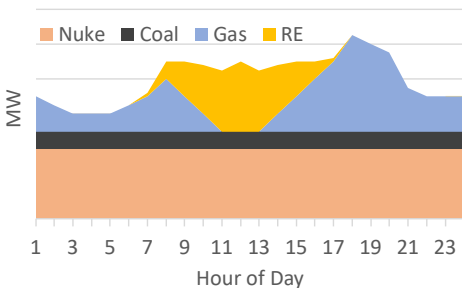
**Temoa run  
(Operational  
Dispatch)  
8760 hours in 2030**

**Minimize operational  
costs with storage  
Calculate change in  
production costs  
[\$/year]**

**Run different  
storage-size  
configurations  
Determine cost-  
optimal build plan  
for storage**

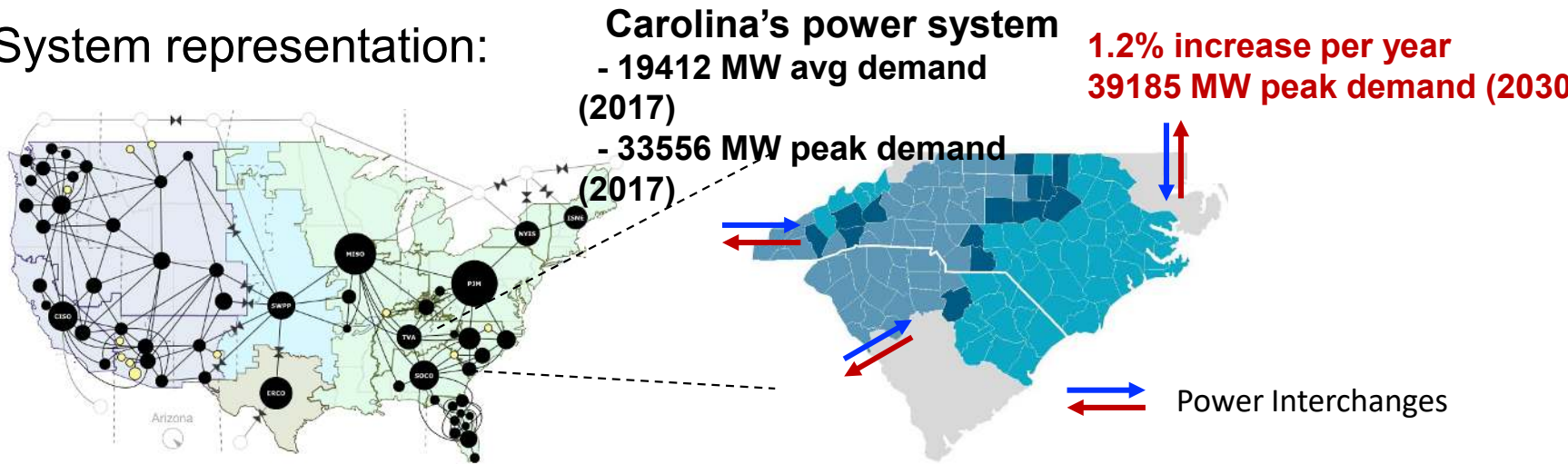
**Run sensitivities**

- Storage technologies
- Storage costs
- Storage efficiency




# Data & Assumptions

- System representation:



- **Existing power generators** represented as individual power plants
- **Future generators** grouped by their respective generation class

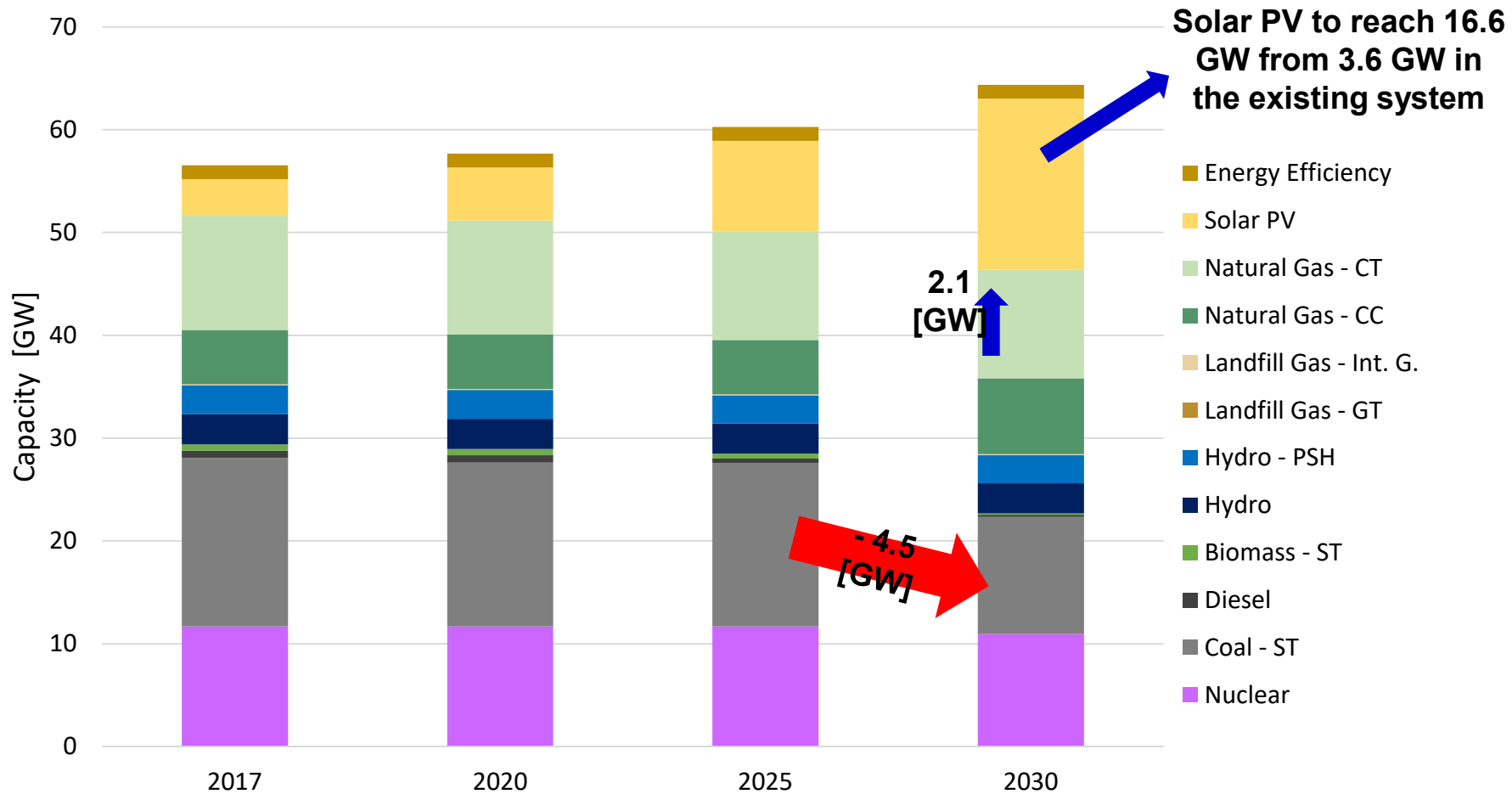
- Sources: 
  - EIA Annual Electric Generator data, form [EIA-860](#)
  - EIA electric utility data survey, form [EIA-923](#)
  - [EIA's U.S. Electric System Operating Data Tool](#)
  - NREL Annual Technology Baseline - [ATB](#)
  - NREL Solar and Wind Energy Resource Assessment - [SWERA](#)

# Analysis Scenarios

1. Base case →
  - 2017 Carolinas Power generation system
  - HB589 solar PV deployments (5.9 GW by 2022)
2. Duke IRP →
  - Fixed representation of the exchanges
  - Scenario matches the build-outs proposed by Duke's 2017 IRP
3. Expanded RPS →
  - RPS expanded to 2030 with a target of 40% for renewables (solar, wind, biomass, small hydro)
4. Clean Energy Standard →
  - 60% target of clean energy sources by 2030
5. Carbon Cap →
  - Duke's 2017 Climate Report to Shareholders: 40% reduction in 2005 CO<sub>2</sub> emissions levels by 2030
6. Natural Gas Prices → High Projection from EIA AEO 2018
7. Deployment of Plug-in Electric Vehicles

## Results – North Carolina Case

# Base Case – Installed Capacity



**Example of a  
charging profile  
for a LI-  
1GW/4GWh  
during the  
course of 8760  
hours in the  
operational  
model run**



# Operational Model Runs

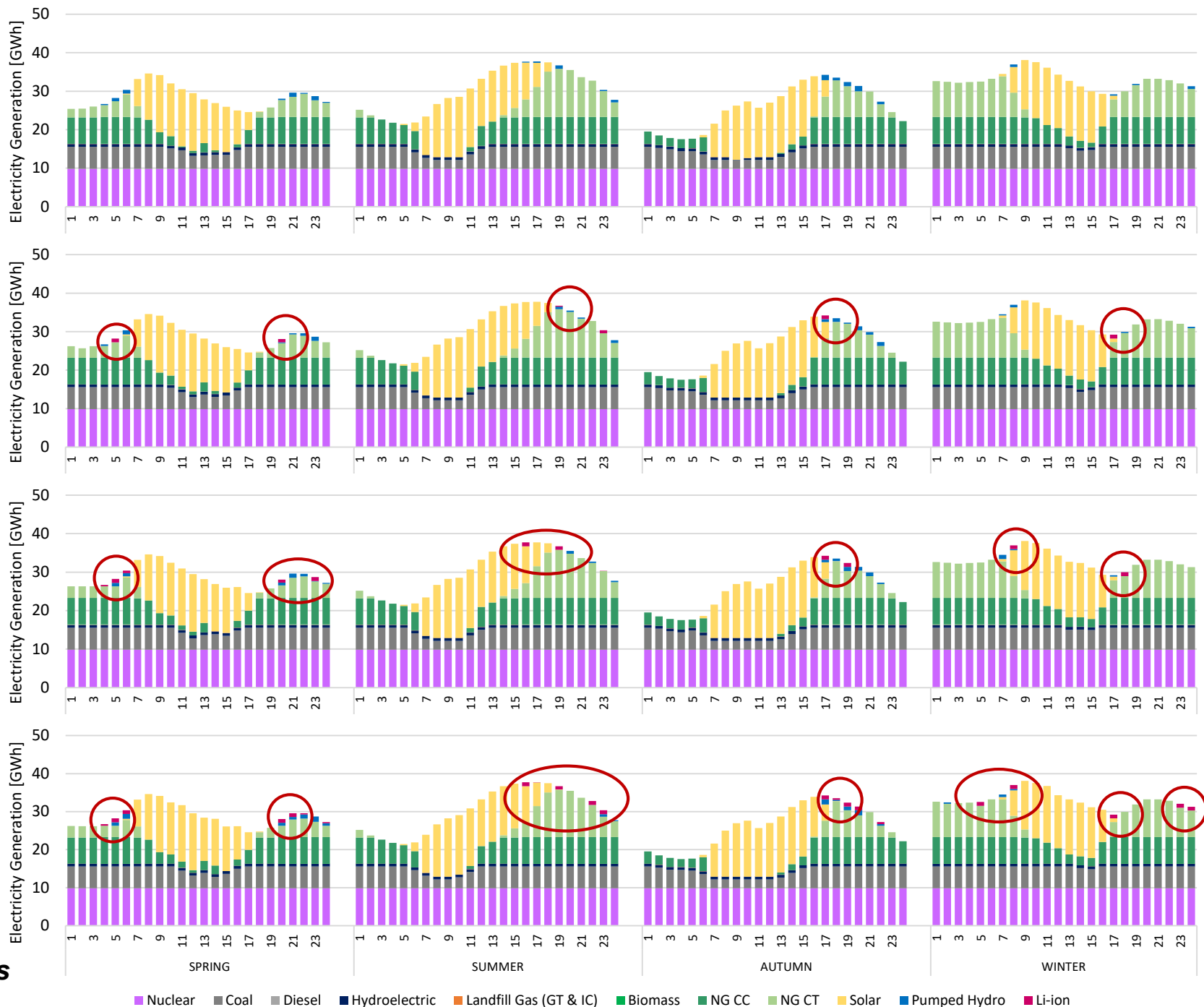
*\*Peak days results shown*

LI-1GW/4GWh

LI-1GW/2GWh

LI-1GW/1GWh

No Storage



# Operational Model Runs

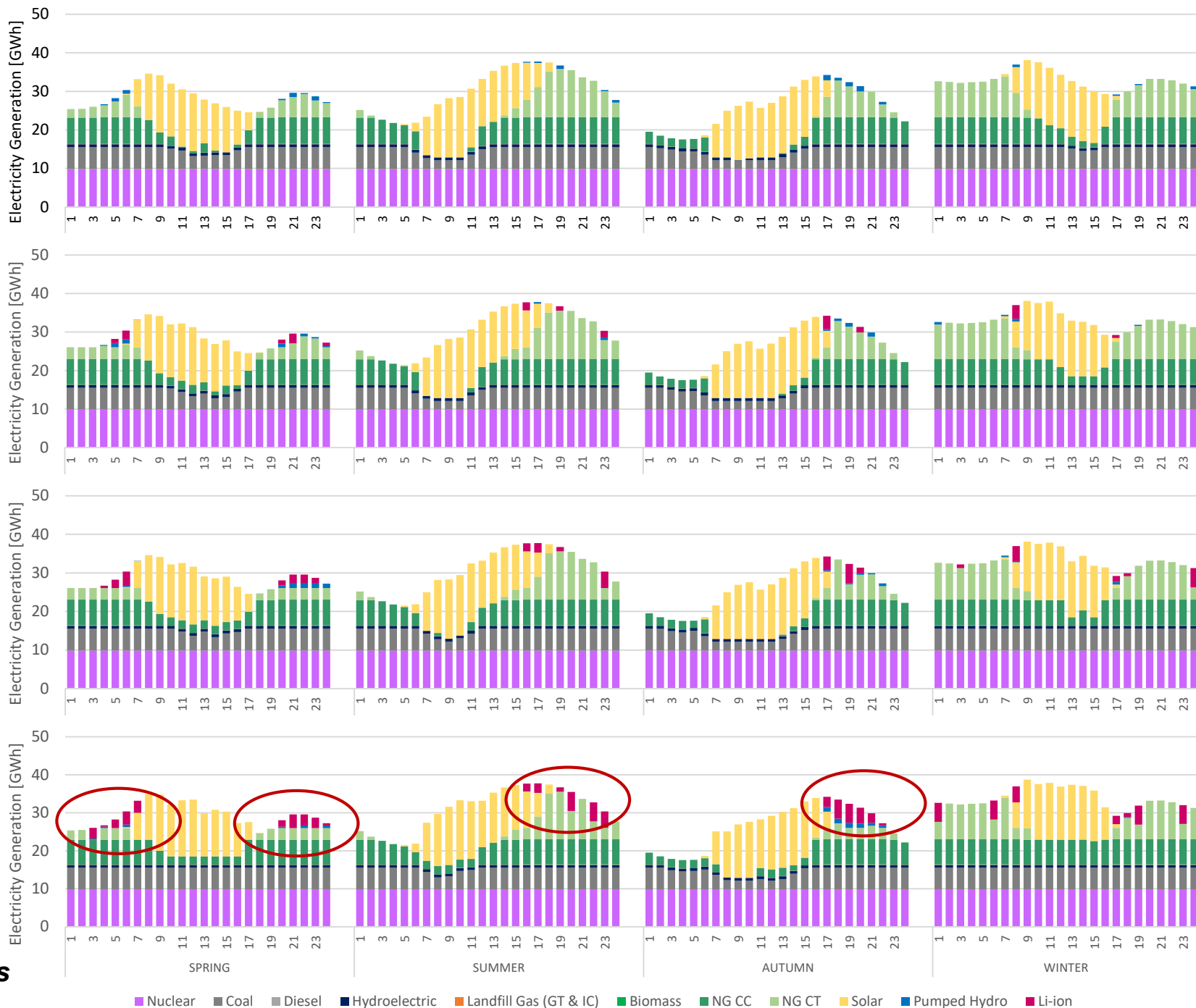
*\*Peak days results shown*

No Storage

LI-5GW/5GWh

LI-5GW/15GWh

LI-5GW/20GWh





# Cost-Benefits Assessment

- Energy Savings → Operational dispatch costs with storage

$$ES_i^k = TC_{NS} - TC_i \quad \forall i \in I_k, \forall k \in K$$

- Capacity Value → Operational dispatch costs without storage

$$CV_i^k = (ECP_i \times P_i) CONE \quad \forall i \in I_k, \forall k \in K$$

- Total Benefits → Capacity credit (%)

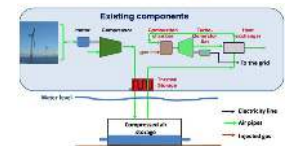
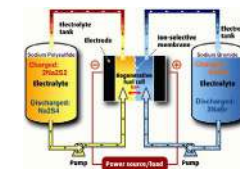
$$SB_i^k = ES_i^k + CV_i^k \quad \forall i \in I_k, \forall k \in K$$

- Finding the best storage configuration

$$\operatorname{argmax}_P \{ SB_i^k - (P_i \times RR_i^k) \}$$

→ Storage revenue requirement (\$/kW-year)

\*CONE for a Gas CT estimated at 113 (\$/kW-year)



Total net benefits (\$/kWyr) of lithium-ion batteries and pumped hydro for **shifting energy** over time and **deferring new investments** in generation

	duration	PSH			
	(h)	0.3GW	1GW	3GW	5GW
Base Case	8	53	47	30	14
Duke IRP	8	64	48	29	12
Expanded REPS	8	110	94	75	61
Clean Energy Standard	8	67	60	45	30
Carbon Cap	8	73	67	52	38
High Natural Gas Price	8	111	83	56	34
Electric Vehicles	8	26	27	12	-1

<https://energy.ncsu.edu/storage/>

## Impacts of Storage in Dispatch Costs - Brazil

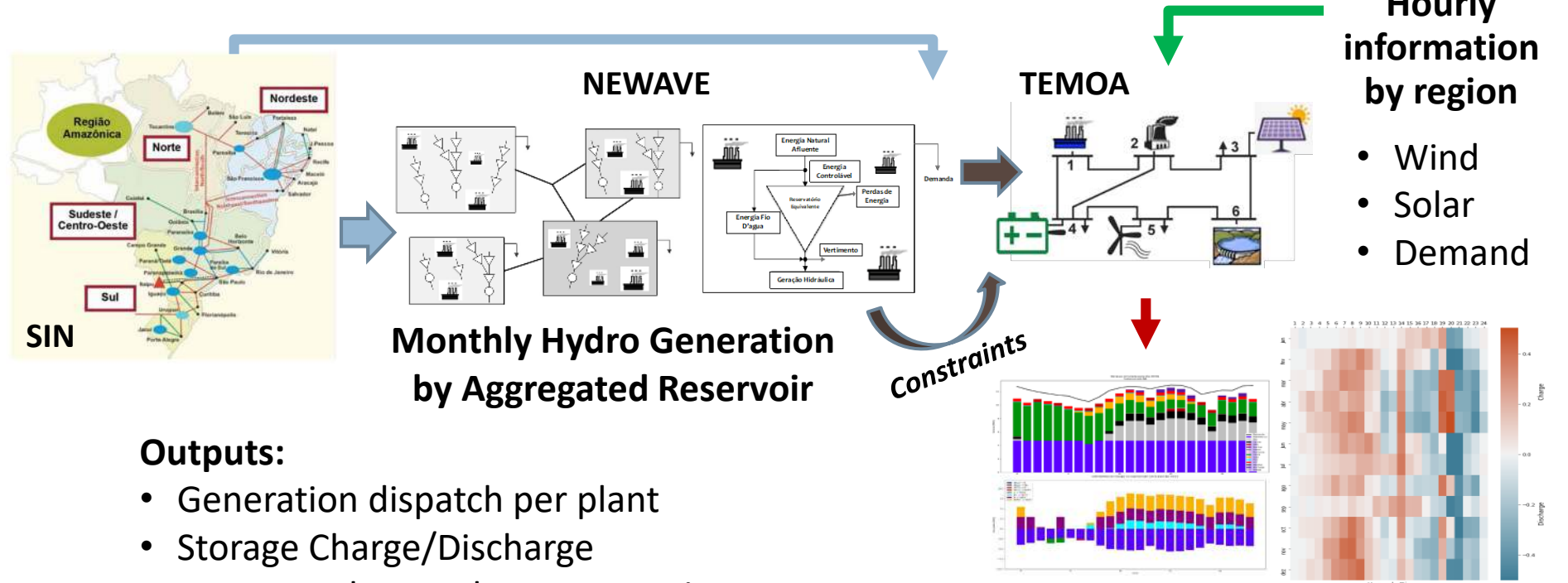
# Modeling Framework – Brazilian System

- **Hydro-dominant Power System** (~70% of production of 65GWavg)
- Individual Hydro and Thermal Plants Representation
- **Interconnection between Regions**
- De-rating factor, efficiency, capacity factor, and transmission losses



**Hourly information by region**

- Wind
- Solar
- Demand



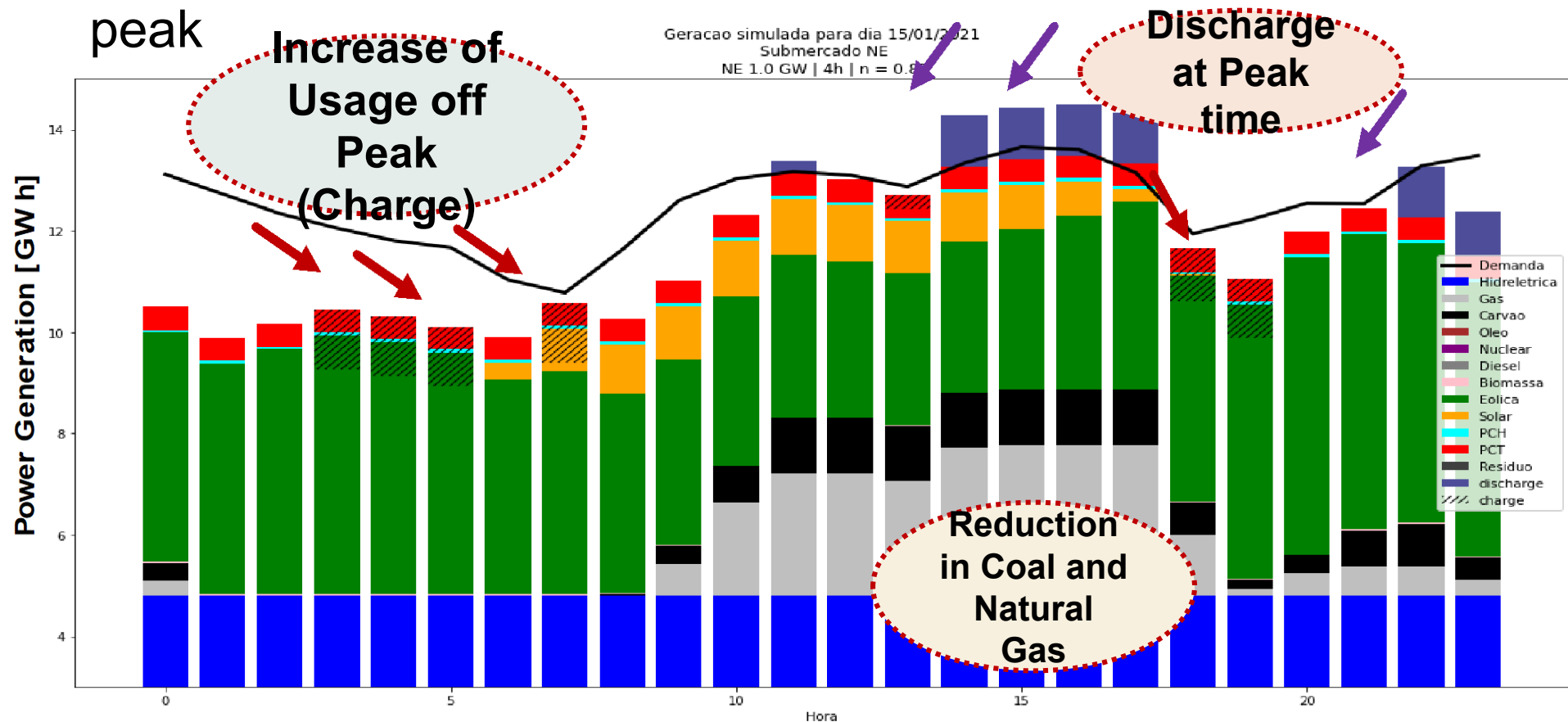
## Outputs:

- Generation dispatch per plant
- Storage Charge/Discharge
- Energy Exchanges between Regions
- Total Operational Costs

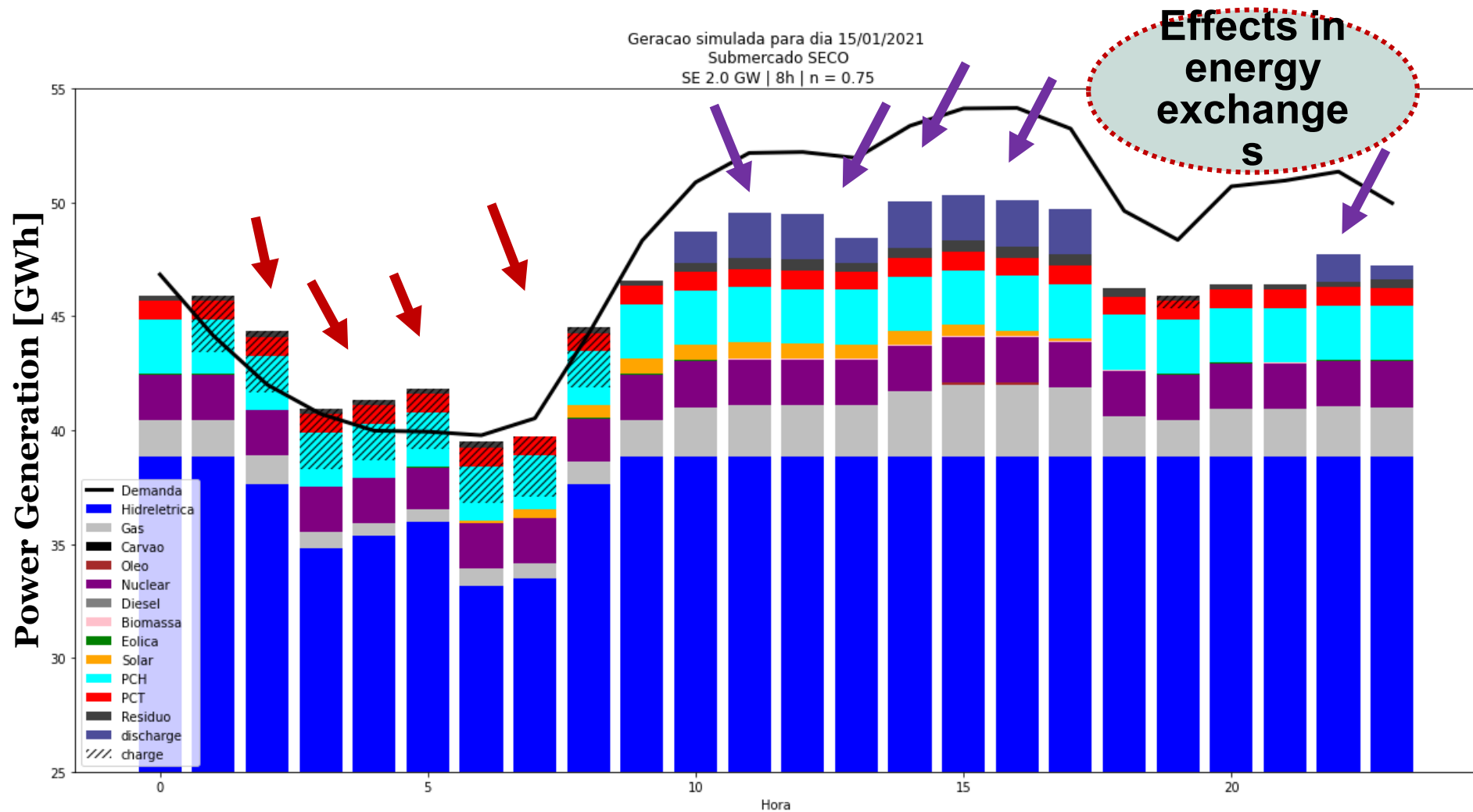
# Results – 1GW/4h Deployed in the Northeast

Optimization model decides to charge energy storage off peak and discharge at peak

## Case: Deployment of 1GW/4h NE



# Results – 2GW/8h Deployed in the Southeast



# Impacts in Total Operational Dispatch Costs

		Operational Costs	Yearly #	% #
PMO JAN 2021	Caso Base	R\$ 3,095,735,478.81	-	-
	0.5GW/4h NE	R\$ 3,027,438,253.09	R\$ 68,297,225.72	2.21%
	1GW/4h NE	R\$ 2,968,356,135.78	R\$ 127,379,343.03	4.11%
	2GW/4h NE	R\$ 2,873,845,056.25	R\$ 221,890,422.56	7.17%
	4GW/24h NE	R\$ 2,802,850,998.80	R\$ 292,884,480.01	9.46%
	2GW/8h SE	R\$ 2,721,487,681.82	R\$ 374,247,796.99	12.09%
PDE 2030	Caso Base	R\$ 12,062,398,526.10	-	-
	0.5GW/4h NE	R\$ 11,986,997,334.80	R\$ 75,401,191.30	0.63%
	1GW/4h NE	R\$ 11,921,727,024.20	R\$ 140,671,501.90	1.17%
	2GW/4h NE	R\$ 11,812,433,223.20	R\$ 249,965,302.90	2.07%
	4GW/24h NE	R\$ 11,821,421,457.50	R\$ 240,977,068.60	2.00%
	2GW/8h SE	R\$ 11,754,140,482.30	R\$ 308,258,043.80	2.56%

**Significant reductions** in terms of total operational dispatch costs, **reaching 12%** in a case with **2GW/8h of pumped hydro storage** placed in the Southeast region of the country



# Final Comments

- This is the **first comprehensive** open-source modeling effort to develop projections for the **Carolinas power system**
- It can be used to **assess economic, technical, and policy futures** and provide valuable insights to decision makers
- Model and analyze other scenarios, e.g.:
  - ▣ Bidirectional capabilities for EVs
  - ▣ 100% of clean energy
  - ▣ Wider range of future fuel prices and policies
- Framework adapted to investigate energy storage in **Brazil**
- Collaboration with Polytechnic de Torino to look at **Italy and European** cases





# Thank You !

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