



Massachusetts
Institute of
Technology



Electricity Market Design with Variable Renewable Generation: A U.S. Perspective

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Outline

- Current Status in the United States
 - Renewable Energy Expansion
 - Impacts on Market Prices
 - Electricity Market Design
- Flexibility Solutions for Electricity Markets with Higher Shares of Renewable Energy
 - Dynamic operating reserves
 - Renewables providing reserves
 - Energy storage
 - Nuclear flexibility
- Concluding Remarks

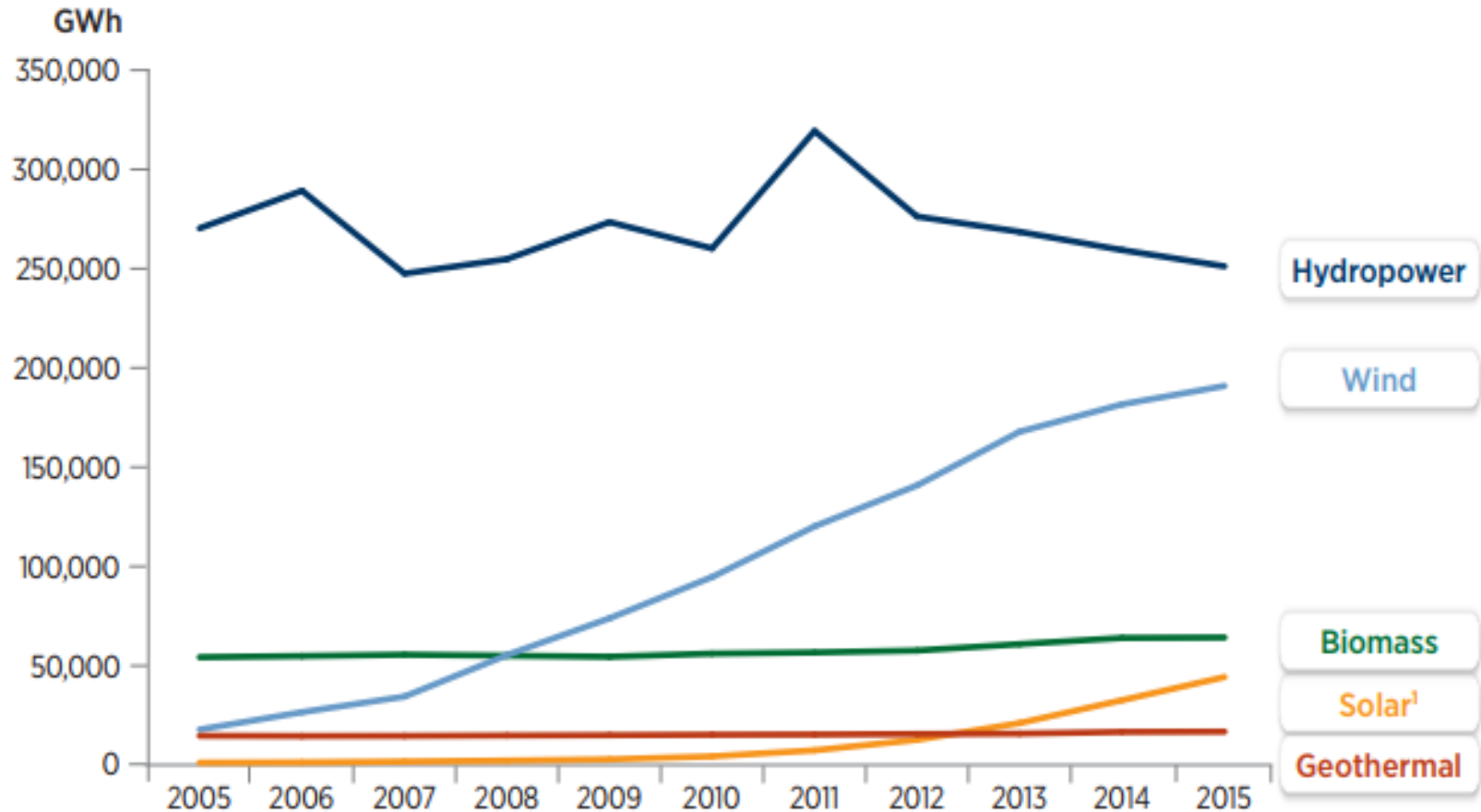
A Changing Fuel Mix

U.S. Electricity Generation by Source

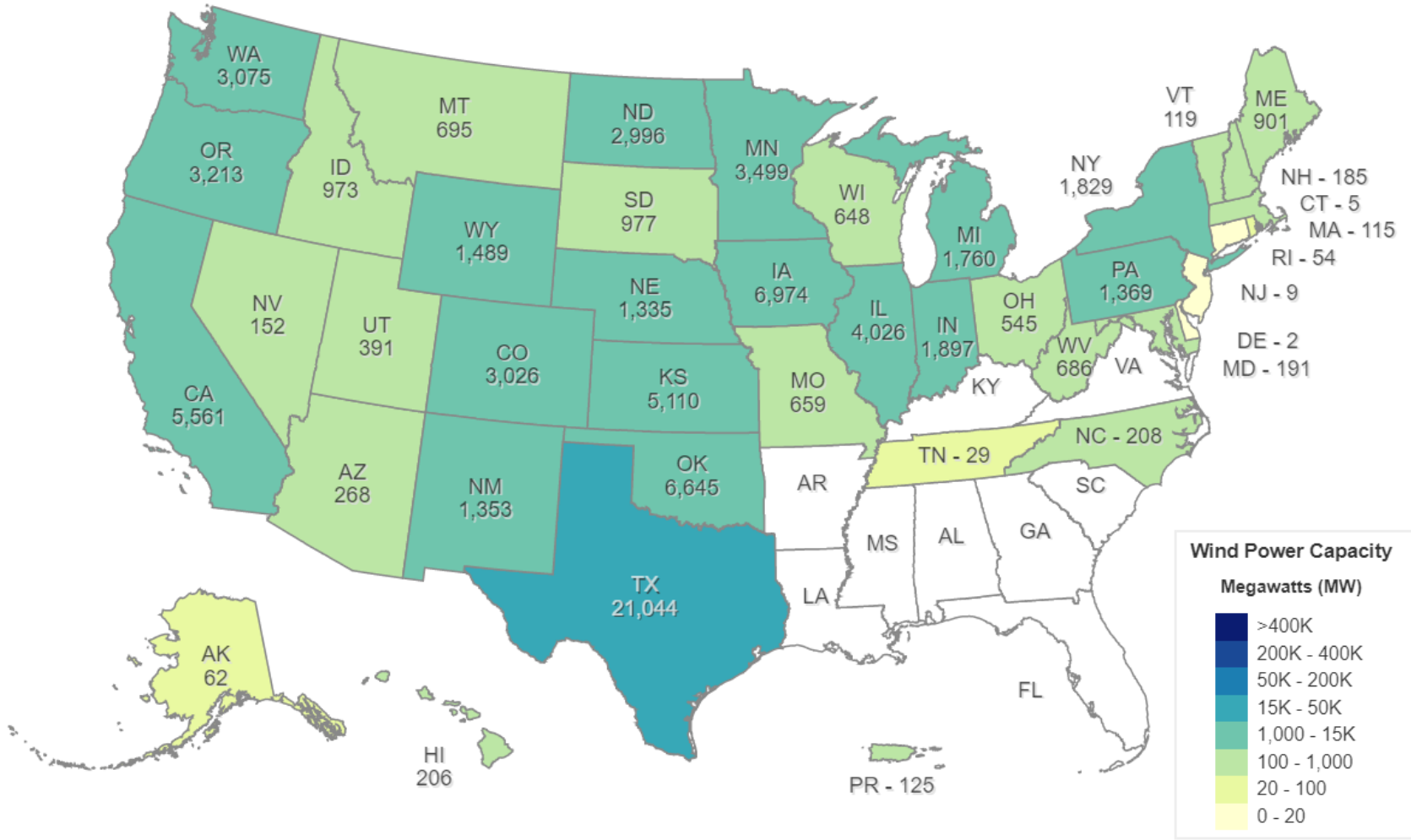
	Coal	Petroleum Liquids	Petroleum Coke	Natural Gas	Other Gases	Nuclear	Renewables ¹	Other	Total Generation (GWh)
2005	49.5%	2.5%	0.6%	18.7%	0.3%	19.2%	8.8%	0.3%	4,062,573
2006	48.9%	1.1%	0.5%	20.0%	0.3%	19.3%	9.5%	0.3%	4,072,064
2007	48.4%	1.2%	0.4%	21.5%	0.3%	19.4%	8.5%	0.3%	4,164,734
2008	48.1%	0.8%	0.3%	21.4%	0.3%	19.5%	9.3%	0.3%	4,126,985
2009	44.4%	0.7%	0.3%	23.3%	0.3%	20.2%	10.6%	0.3%	3,956,872
2010	44.7%	0.6%	0.3%	23.9%	0.3%	19.5%	10.4%	0.3%	4,133,667
2011	42.2%	0.4%	0.3%	24.7%	0.3%	19.2%	12.6%	0.3%	4,112,099
2012	37.3%	0.3%	0.2%	30.2%	0.3%	18.9%	12.4%	0.3%	4,061,061
2013	38.7%	0.3%	0.3%	27.6%	0.3%	19.3%	13.1%	0.3%	4,082,687
2014	38.4%	0.4%	0.3%	27.4%	0.3%	19.4%	13.5%	0.3%	4,115,446
2015	33.0%	0.4%	0.3%	32.5%	0.3%	19.4%	13.8%	0.3%	4,110,296

Growth In Wind and Solar Generation

U.S. Renewable Electricity Generation by Technology



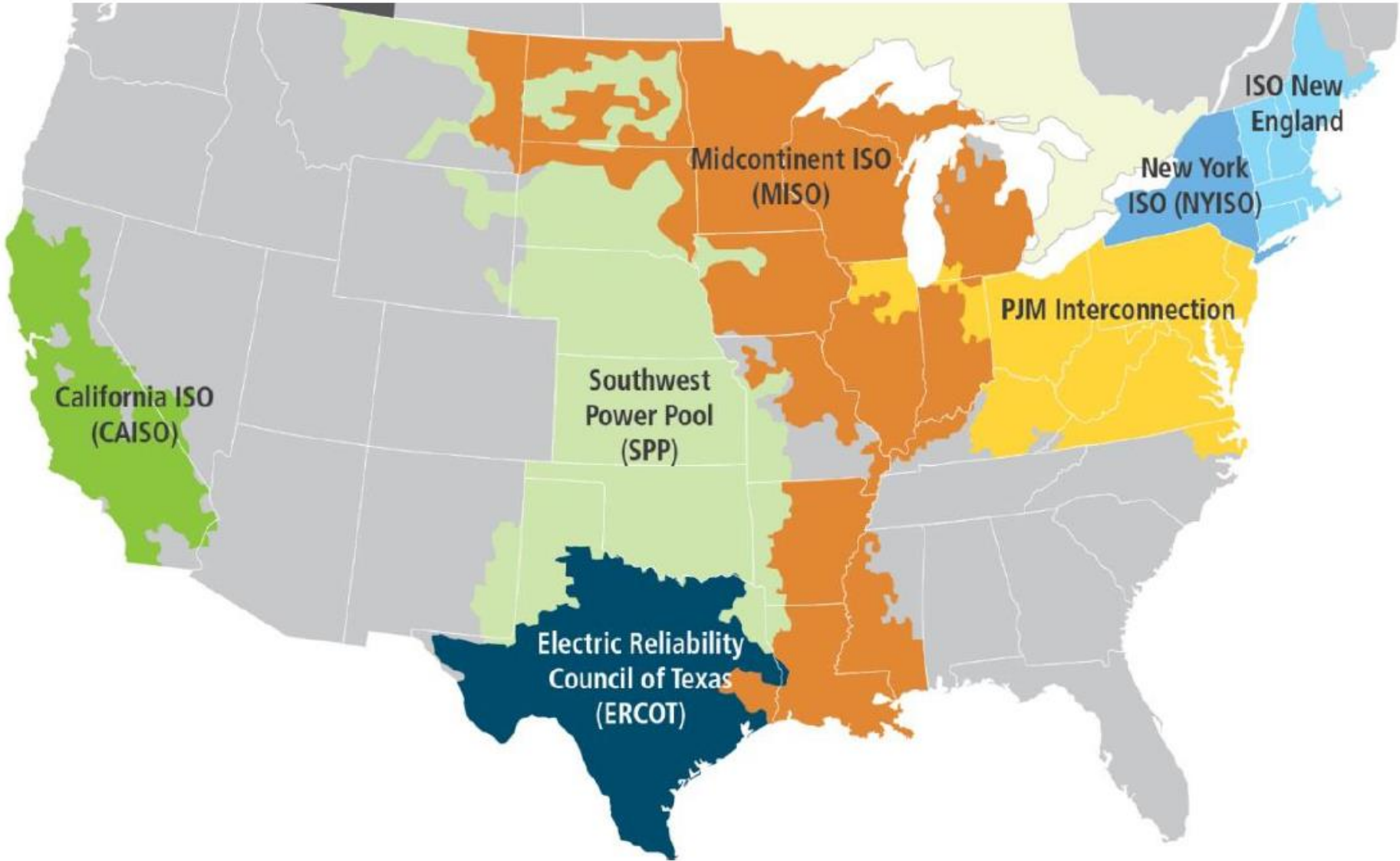
Installed Wind Power Capacity by State (Q2 2017)



Total Installed Wind Capacity: 84,407 MW

Source: American Wind Energy Association Market Report

Electricity Markets in the United States



Electricity Markets and Reliability

- Report requested by DOE Secretary
 - Electricity market evolution
 - Resource compensation and system resilience
 - Regulatory burdens; premature retirements of baseload plants
- Main findings
 - Wholesale markets are functioning
 - System reliability is maintained
 - Higher need for system flexibility
 - Some attributes not compensated
 - Resilience, jobs, pollution
 - Electricity markets must evolve
 - Price formation
 - Base load retirements
 - Mainly due to low natural gas prices

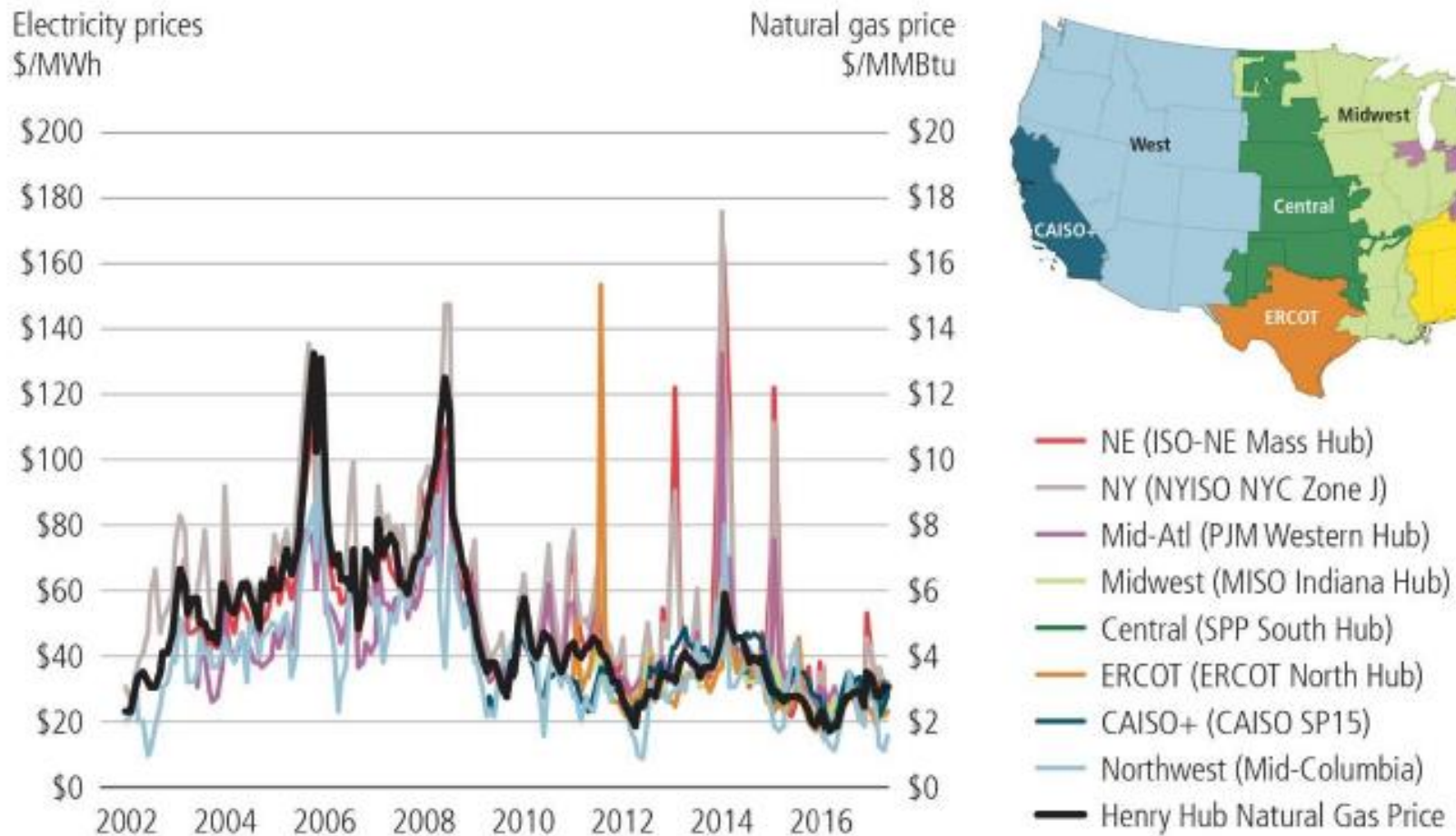
**Staff Report to the Secretary on
Electricity Markets and Reliability**



August 2017

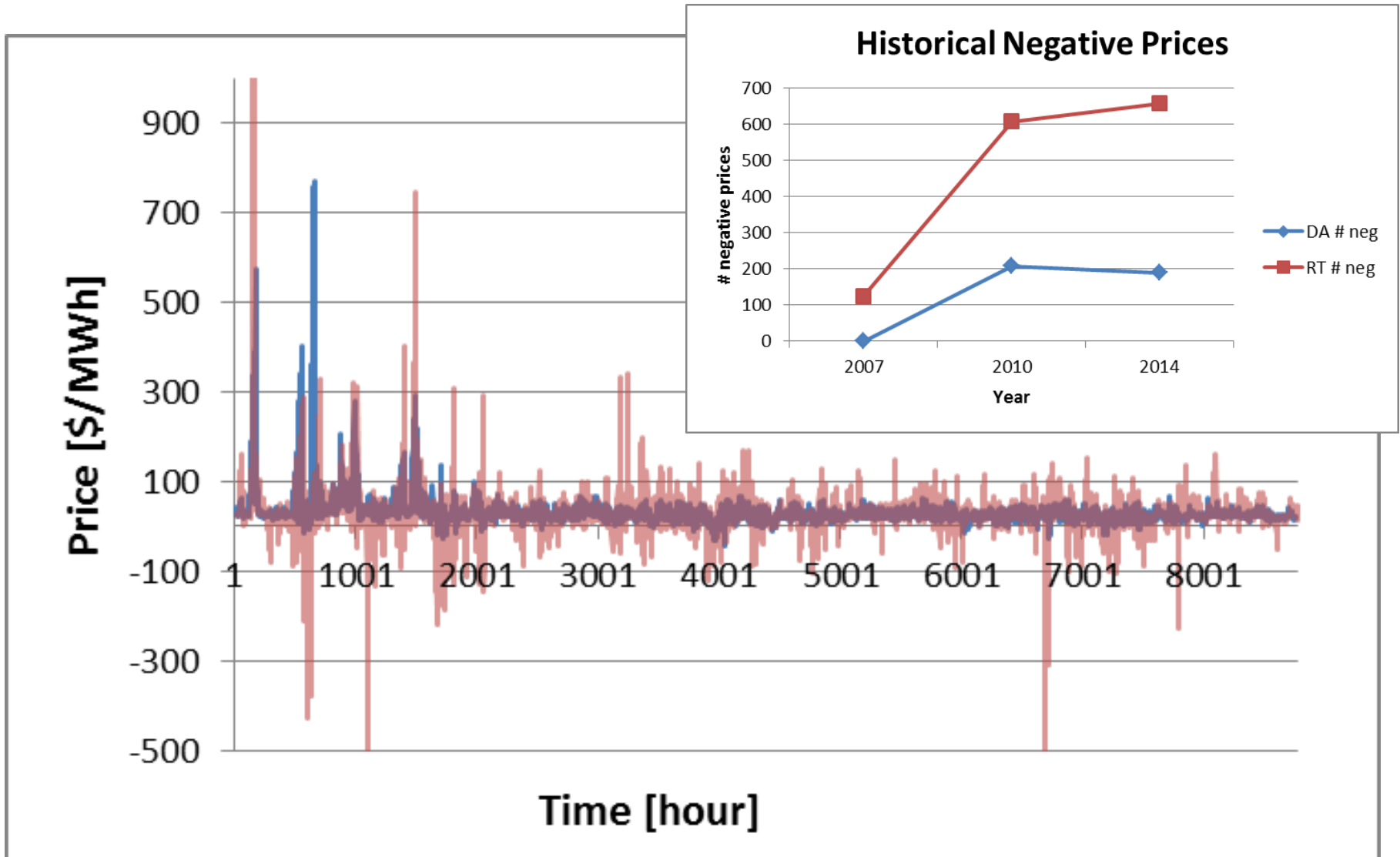
Electricity and Natural Gas Prices

Figure 3.18. Wholesale Day-Ahead Electricity Prices vs. Henry Hub Natural Gas Price (Monthly Average)¹⁰⁶



- NE (ISO-NE Mass Hub)
- NY (NYISO NYC Zone J)
- Mid-Atl (PJM Western Hub)
- Midwest (MISO Indiana Hub)
- Central (SPP South Hub)
- ERCOT (ERCOT North Hub)
- CAISO+ (CAISO SP15)
- Northwest (Mid-Columbia)
- Henry Hub Natural Gas Price

Wind Power and Electricity Market Prices



2014 Prices in Illinois PJM Node: 4 QUAD C18 KV QC-1

Electricity Market Design – US vs Europe

■ United States

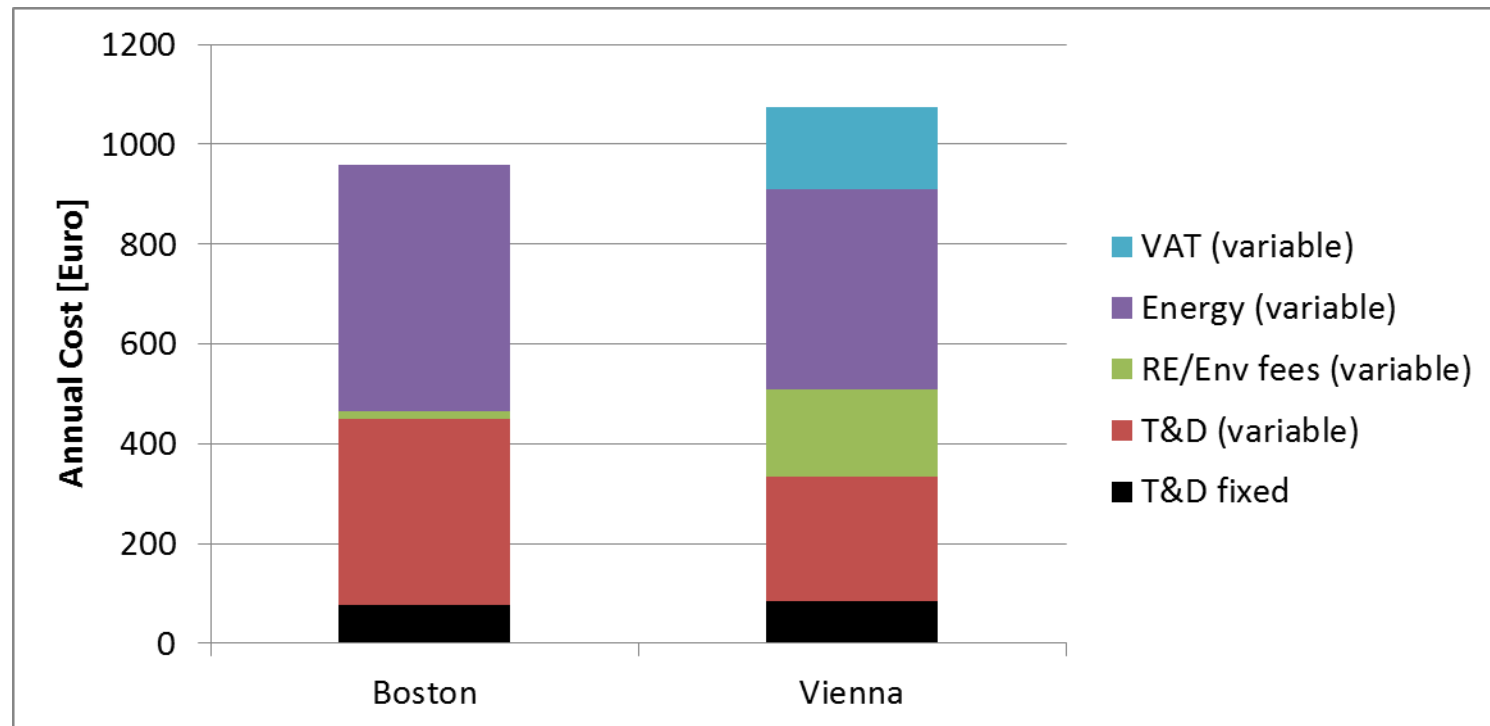
- Build into existing system operators (ISOs)
 - Emphasize physics of the power system
 - Short-term system operation
 - ISOs do not own transmission system
- Short-term market operations
 - Day-ahead market (ISO - hourly)
 - Real-time market (ISO - 5 min)
 - Complex bids/ISO UC
 - Locational marginal prices
 - Co-optimization of energy and reserves
- Variable Renewable Energy (VER)
 - Tax credits, renewable portfolio standards
 - “Dispatchable” VER
- Resource Adequacy
 - Energy only markets
 - Capacity markets/obligations
 - Integrated resource planning

■ Europe

- Introduced new power exchanges (PXs)
 - Emphasize markets and economics
 - Includes long-term contracts
 - TSOs typically own transmission system
- Short-term market operations
 - Day-ahead and intraday markets (PX)
 - Real-time balancing (TSO)
 - Simple bids/generator UC
 - Zonal pricing/market coupling
 - Sequential reserve and energy markets
- Variable renewable energy (VER)
 - Feed-in tariffs, tenders/auctions
 - VER as “must-take”
- Resource Adequacy
 - Energy only markets
 - Capacity payments/markets
 - Strategic reserves

Distributed Generation and End-Use Tariffs

- “Net metering” a very hotly debated topic
- Example: Residential customer bills in Boston and Vienna
 - Annual consumption: 5000 kWh



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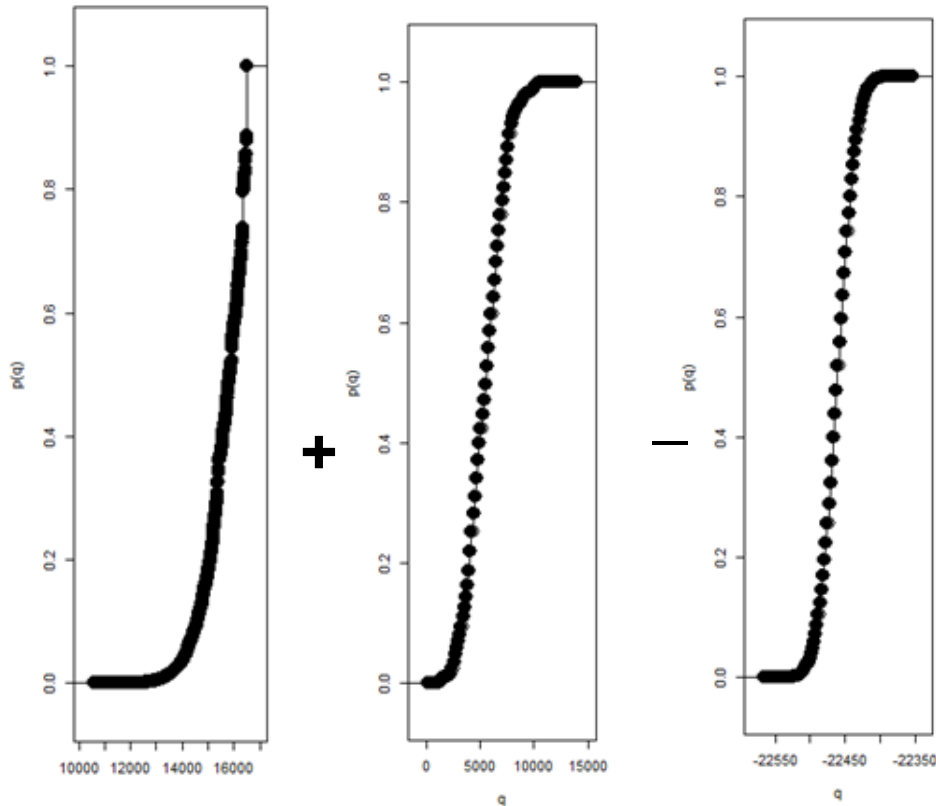
A Dynamic Operating Reserve Demand Curve (ORDC)

- Consider the uncertainties from load and supply
 - Probabilistic wind power forecast based on Kernel Density Estimation (Bessa et al. 2012)
- Estimate the risk of supply shortage for system
- Link the expected cost of this risk to the price to pay for reserves (Hogan 2005)

Thermal generators

Wind power

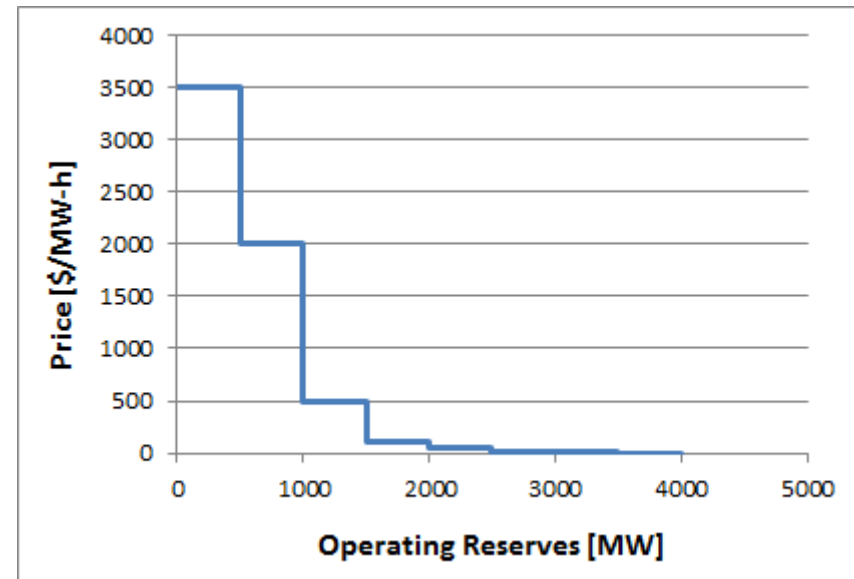
Load



Loss of Load
Probability

x

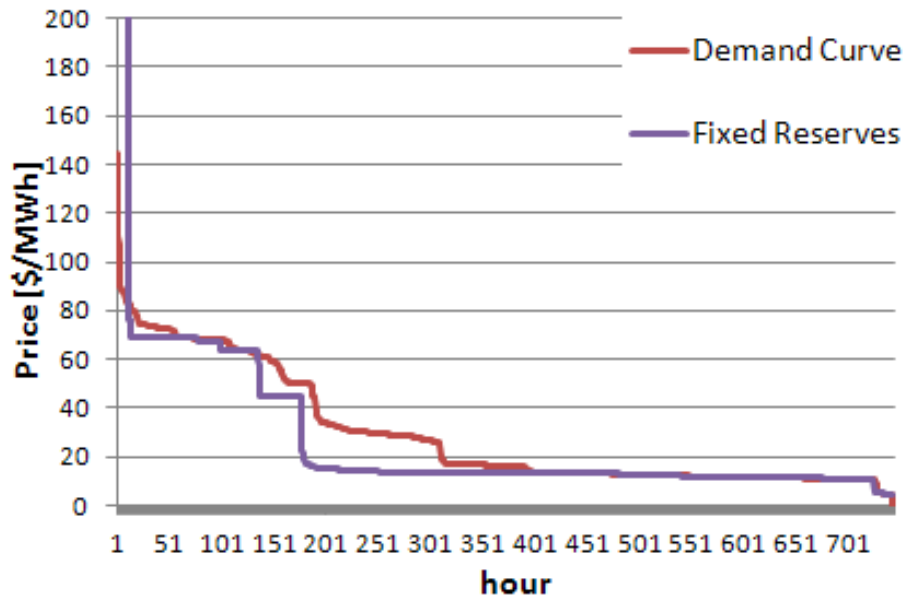
Value of
Lost Load



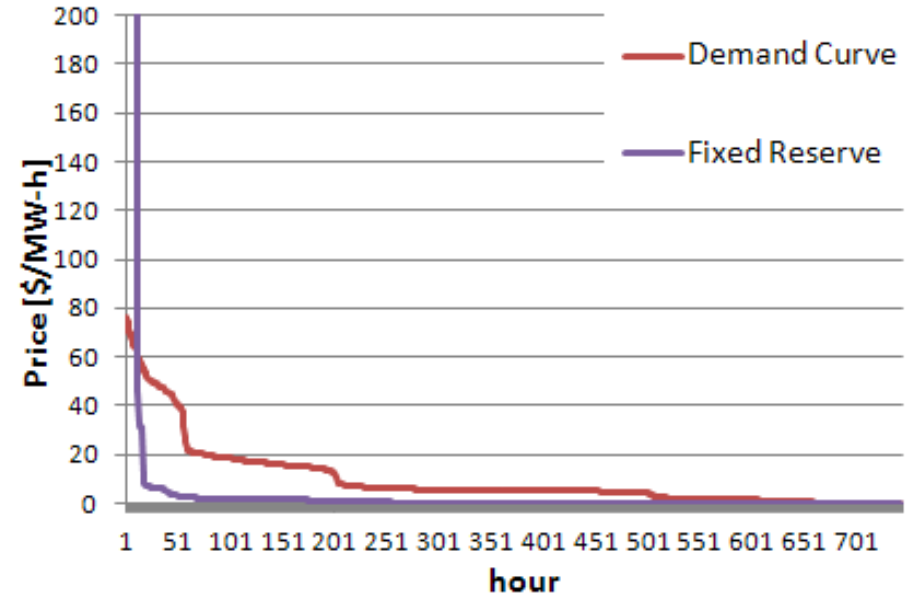
Benefits of Operating Reserve Demand Curves

- Results from simulation of co-optimized electricity market (Illinois case, 20% wind)

Energy price distribution (July)



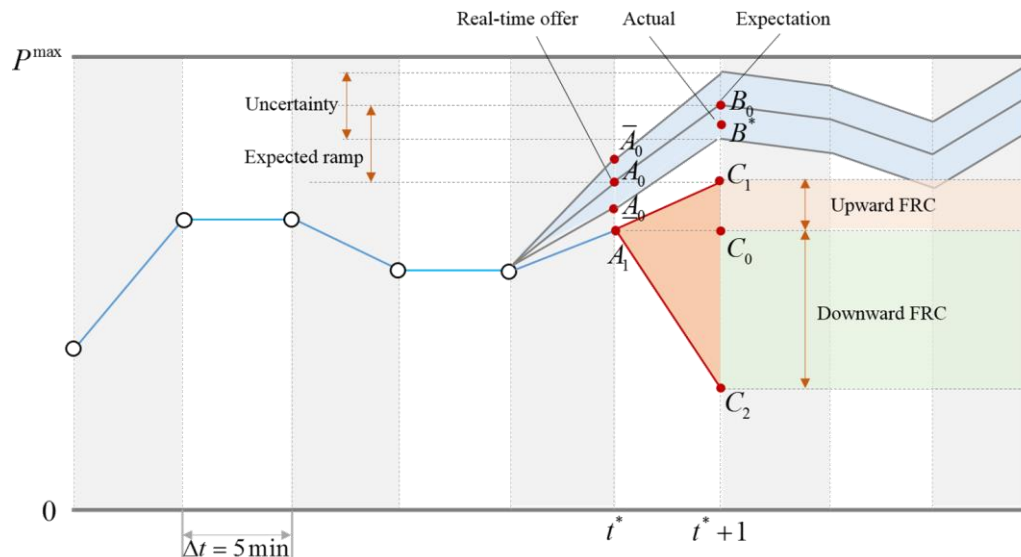
Reserves price distribution (July)



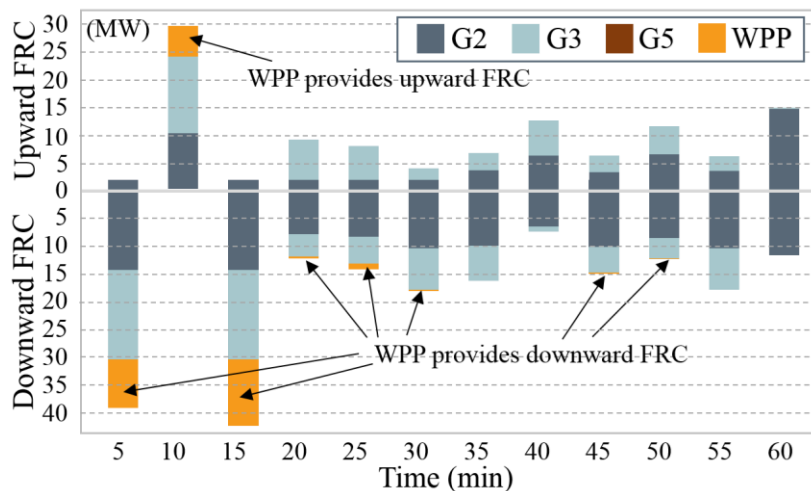
- Multiple benefits of a dynamic demand curve for operating reserves
 - Adds demand-side flexibility to system scheduling and dispatch
 - Better reflects wind power forecast uncertainty in prices
 - Gives higher prices for energy and reserves in most hours, fewer extreme price spikes
 - Stabilizes revenues for generators, addresses missing money (Levin and Botterud, 2015)
 - “Static” ORDCs implemented in ERCOT/Texas market in 2014, considered in Belgium

Wind Power Providing Flexi-Ramp Capacity (FRC)

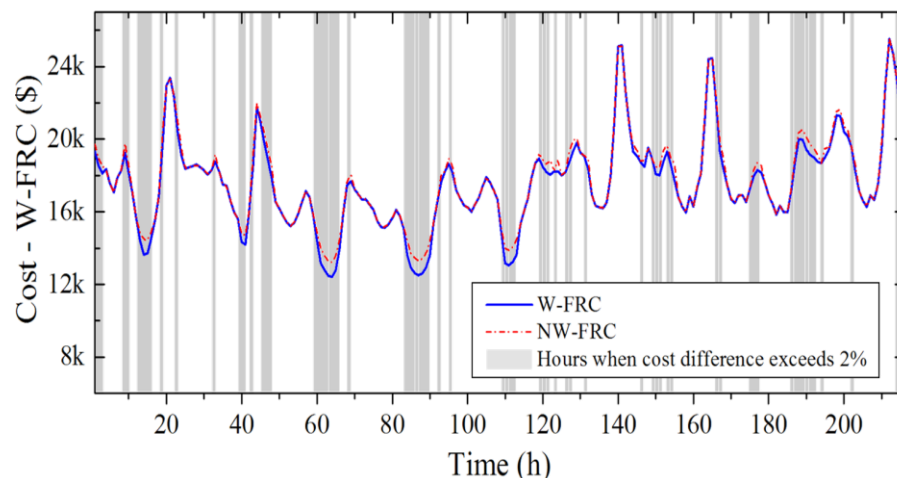
- Wind turbines are capable adjusting their active power output at the rate of 0.05-0.25 p.u./s.
- By operating below available capacity, the wind power producers (WPPs) are capable of offering ramping service.
- Though the WPPs' opportunity cost of providing FRC is high, it is economic if frequent commitment of fast-start unit can be avoided.



WPP providing FRC: G5 is not committed

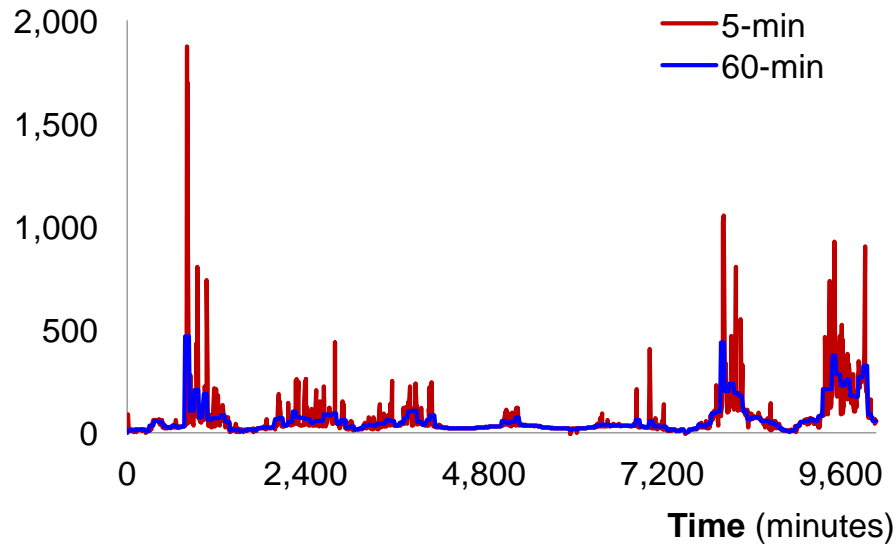


System cost is reduced for most of the cases



Price Resolution and Energy Storage Arbitrage

Real-time price (from a MISO node)
\$/MWh



Battery models – Increasing technical resolution

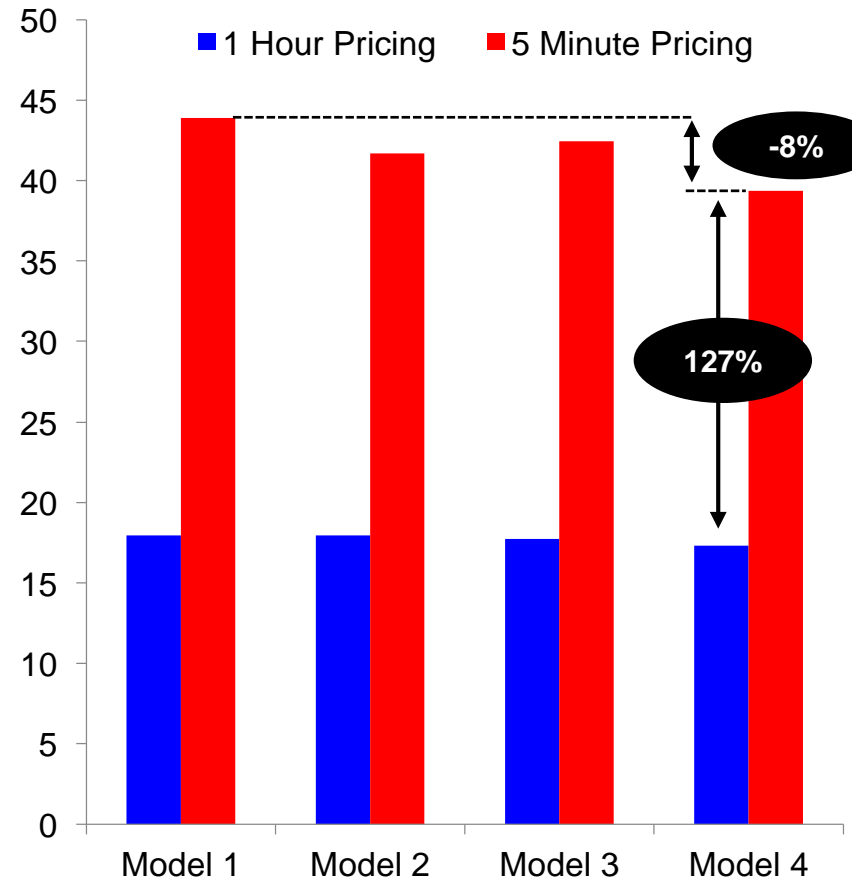
Model 1: Fixed power limits, fixed efficiency.

Model 2: SOC dependent power limits, fixed efficiency.

Model 3: Fixed power limits, efficiency as a function of power.

Model 4: SOC dependent power limits, efficiency as a function of power and SOC.

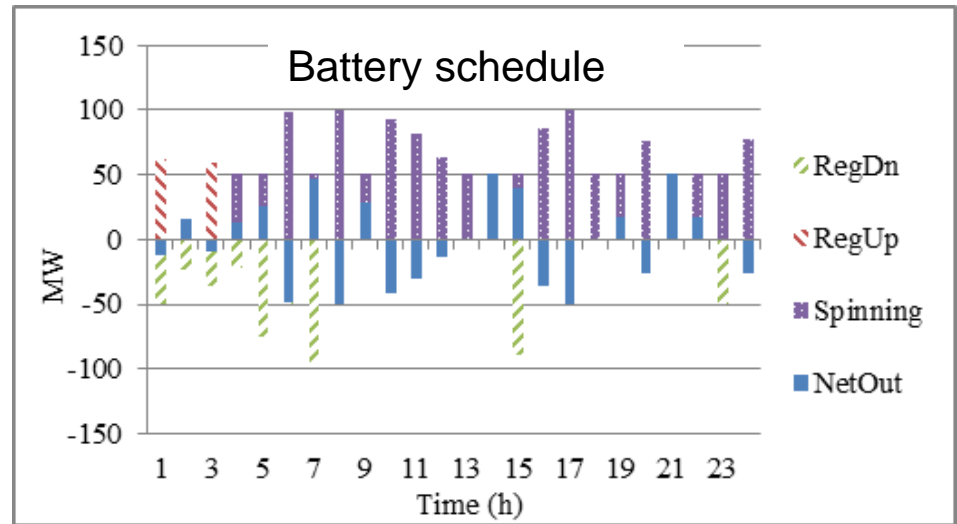
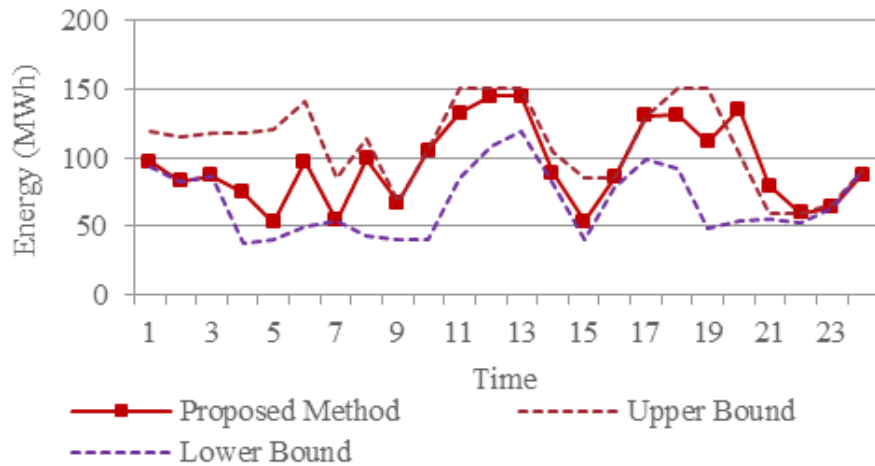
Net revenue for 10MWh Li-ion storage system
\$/week



Moving from hourly to 5-min price resolution more than doubles energy arbitrage revenue (required by FERC order 825)

Short-term System Benefits of Energy Storage

- A stochastic day-ahead unit commitment model with energy storage and wind power
 - IEEE RTS system: 2656 MW load, 15%-30% wind power (345-690 MW)
 - Battery: 50MW/150MWh (3 hours), 10% loss in each direction



Average day-ahead cost savings from battery:

Wind %	Total Cost with Battery (\$)	Total Cost without Battery (\$)	Cost Savings (\$)	Cost Savings (%)
15%	806,287	930,440	124,154	13.3%
20%	765,307	887,480	122,173	13.8%
25%	733,779	849,963	116,184	13.7%
30%	712,808	827,570	114,762	13.9%

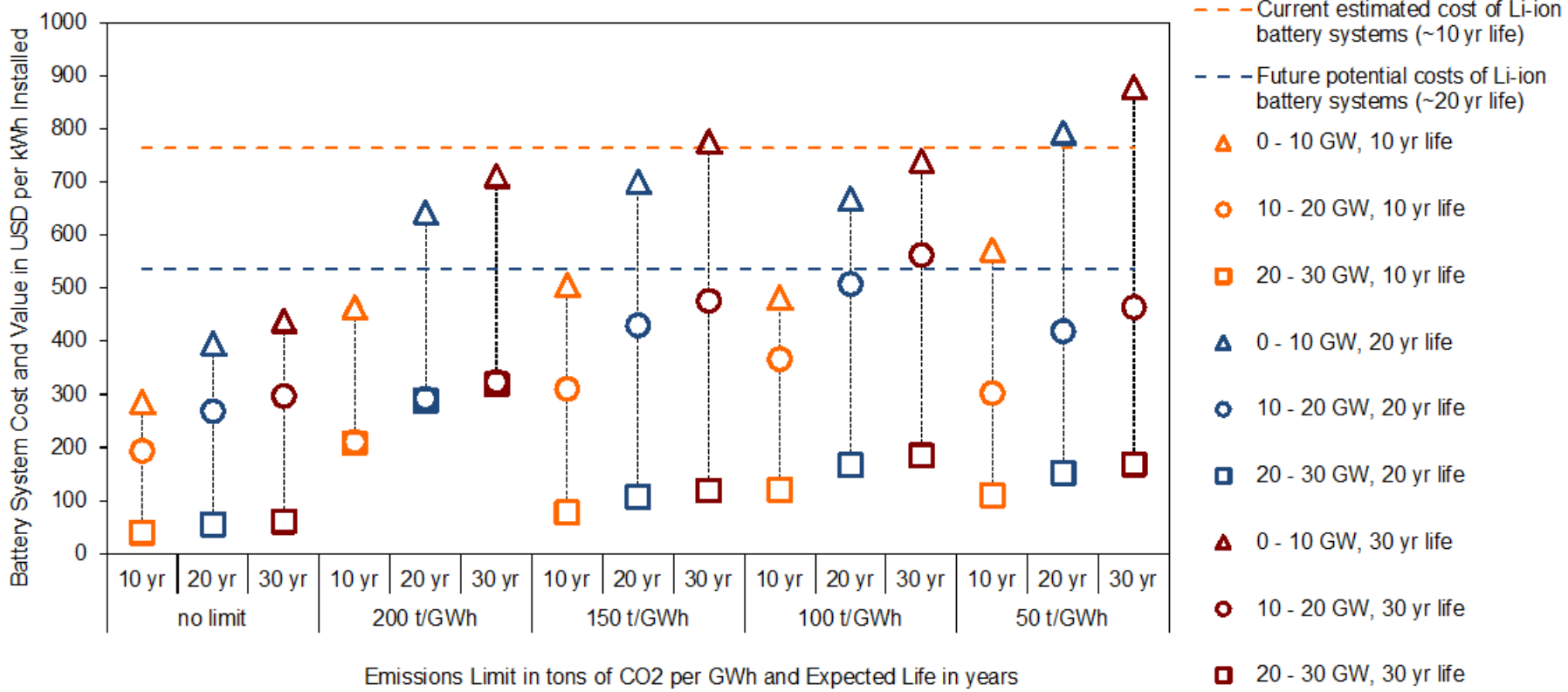
NPV of cost savings from battery at 25% wind: **\$1200/kWh-capacity** (@5500 cycles/5 year lifetime, 8% interest)

Note: small, high cost system.

What is the Value of Energy Storage to the Future Grid?

- Optimal generation expansion with emissions targets (IMRES model)
 - Wind, solar, and load data for ERCOT/Texas for 2035, greenfield expansion
 - Increasingly stringent emissions targets (today 600 tCO₂/GWh)
 - Different energy storage levels (2 hr storage, 20% roundtrip losses, 10% interest)

Estimated benefits (avoided generation costs) and costs of energy storage



Nuclear Power as a Flexible Resource

- More interest in nuclear flexibility with increasing renewable penetration levels
 - United States: Nuclear energy is currently baseload
 - Europe: Flexible nuclear operations (e.g. France, Germany)
- Unique operational constraints of nuclear power
 - After ramp-down, must wait to ramp back up (xenon poisoning)
 - Function of power history, time in fuel cycle
- Simulating impacts of nuclear flexibility (representative data from Southwest U.S. w/22% solar/wind, 25% nuclear)
 - 1.3-1.6% reduction system operating cost
 - 2.0-4.7% increase in nuclear gross operating margin
 - 43-58% reduction curtailment of renewables

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Concluding Remarks

- Electricity markets and renewable energy
 - Fundamental challenges: uncertainty, variability, low marginal cost
 - U.S. electricity markets stood the test so far, but there are challenges ahead
- Solutions to renewable integration challenges
 - Supply flexibility, demand response, energy storage
 - Forecasting, operational practices, market design
 - Most cost effective solutions should prevail
 - Lessons can be learned from Europe and U.S.
 - Intraday markets, long-term markets (Europe -> United States)
 - Co-optimization energy and reserves, locational high-frequency pricing, dispatchable renewables (United States -> Europe)



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■ Collaborators

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- Nan Li Arizona State University
- Ricardo Bessa INESC TEC, Portugal
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- Argonne National Laboratory

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Electricity Markets and Reliability

- In April 2017, the DOE Secretary requested a report to explore three issues
- Market Evolution
 - Are energy and capacity markets adequately compensating attributes that strengthen grid resilience (e.g. on-site fuel supply)?
 - If not, how might this affect grid reliability and resilience in the future?
- Resource Compensation and System Resilience
 - How are policy interventions and changing resource mixes impacting the original policy assumptions that shaped the creation of current electricity markets?
- Regulatory Burdens
 - Have regulatory burdens, mandates, taxes and subsidies, led to the premature retirement of baseload power plants?

Electricity Market Design with Renewables

- Review of current and proposed market designs
 - How to achieve capacity adequacy and revenue sufficiency in the long-run?
 - How to ensure and incentivize flexibility in short-run operations?



Evolution of Wholesale Electricity Market Design with Increasing Levels of Renewable Generation

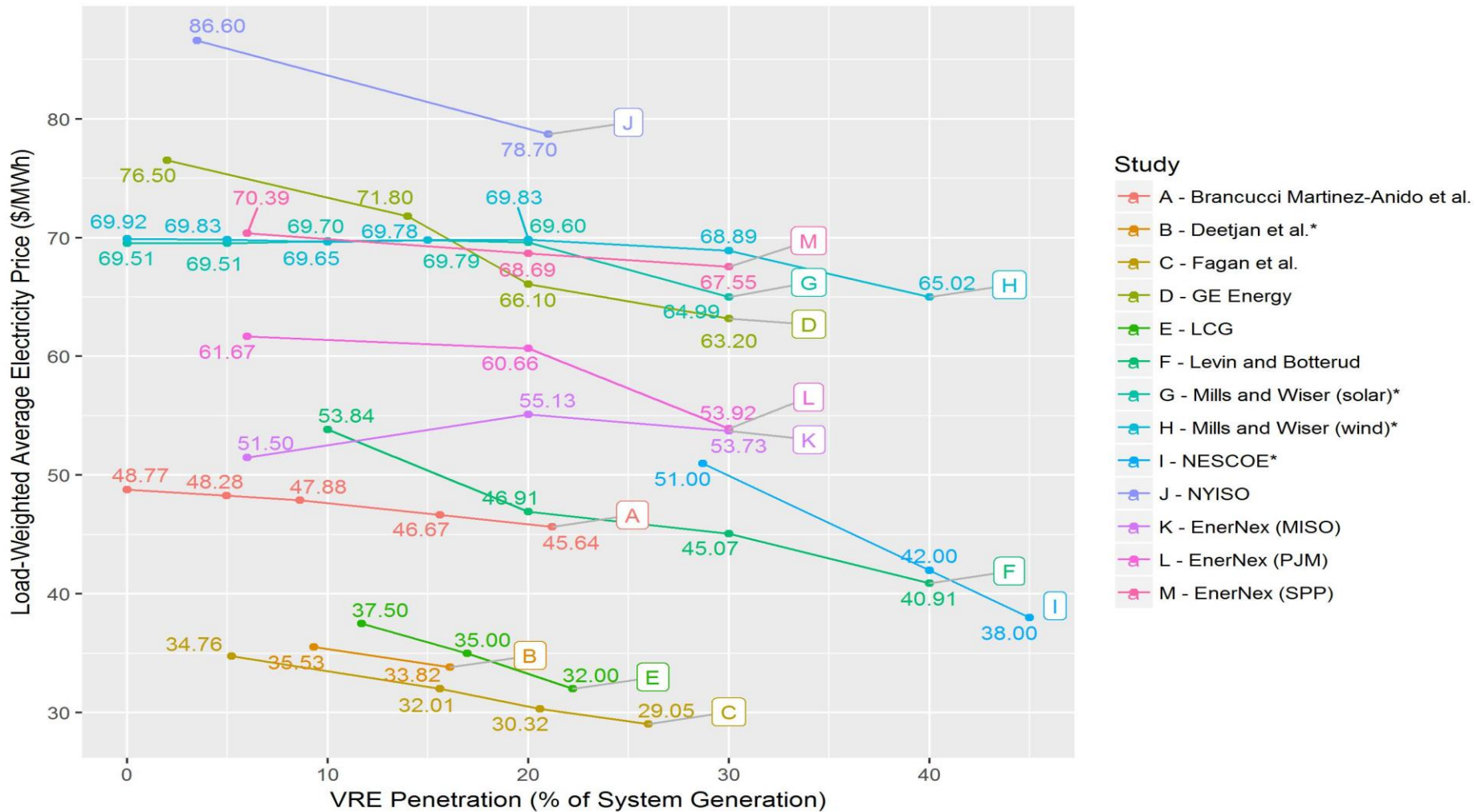
E. Ela,¹ M. Milligan,¹ A. Bloom,¹ A. Botterud,²
A. Townsend,¹ and T. Levin²

¹ *National Renewable Energy Laboratory*

² *Argonne National Laboratory*

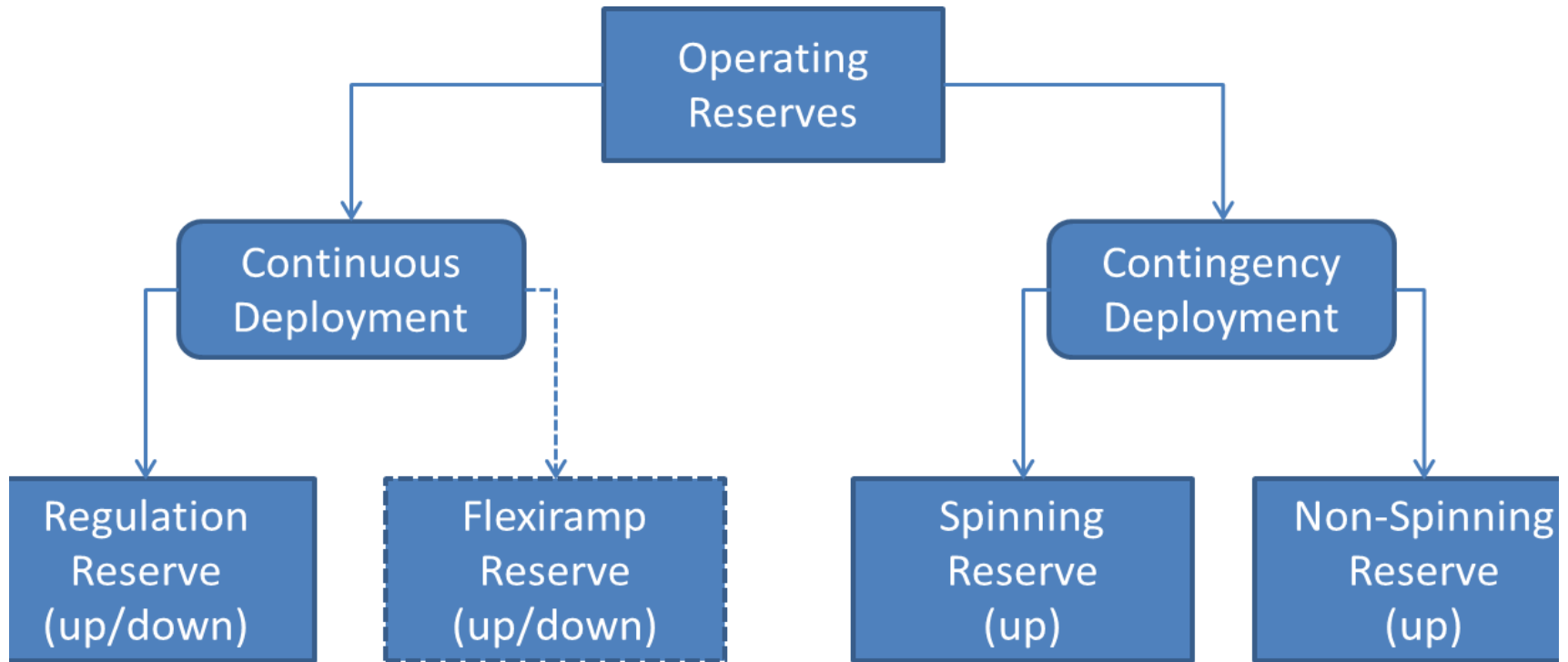
Technical Report NREL/TP-5D00-61765, Sept. 2014.

Prediction of Future Price Impacts of Renewables



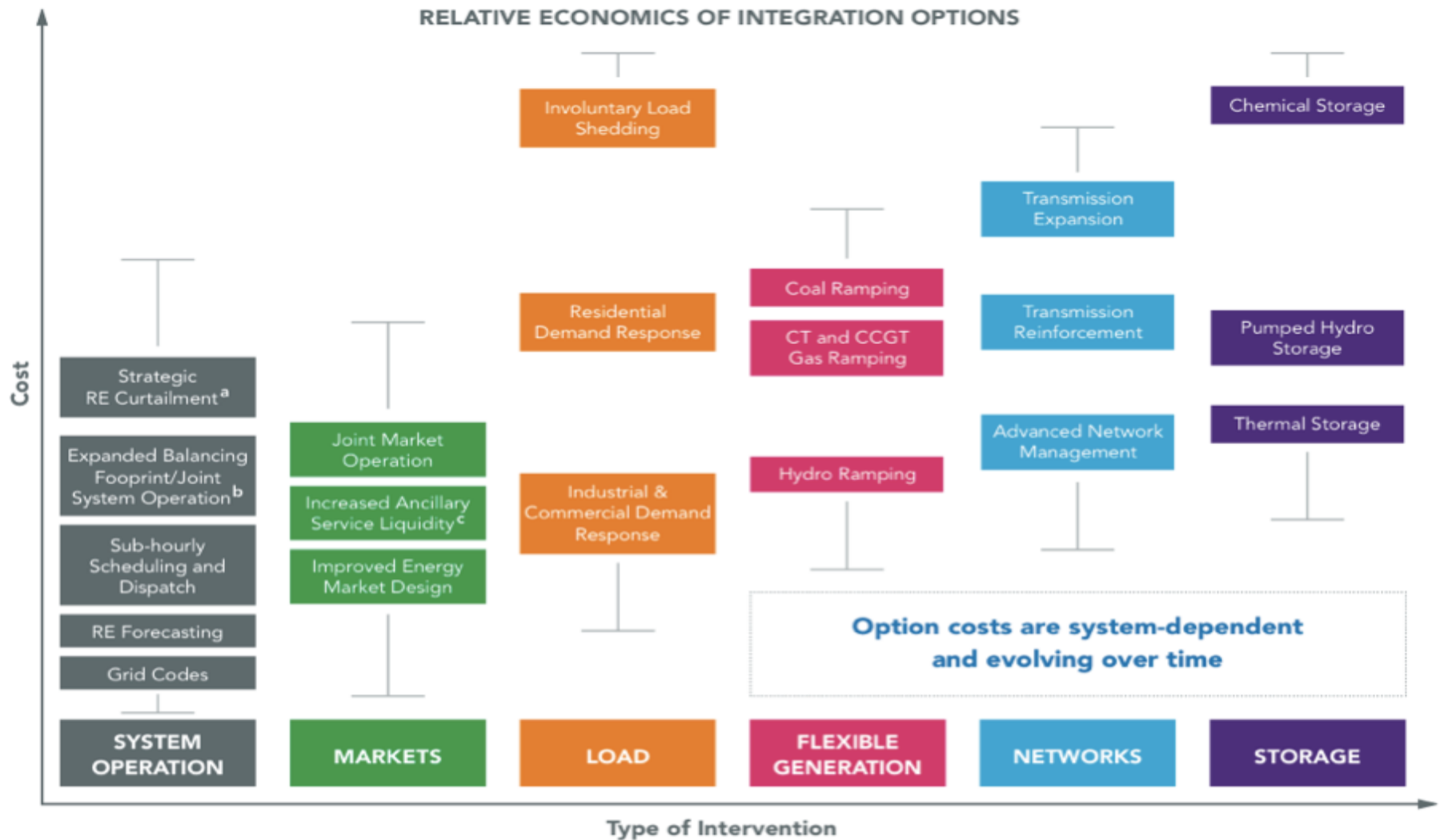
Most studies predict lower prices with more renewables

Evolving Markets for Operating Reserves



- Regulation reserve: Pay for performance
- More dynamic assessment of reserve requirements
- “Flexi-ramp reserves” to ensure sufficient ramping capability available in real-time
 - California ISO (CAISO)
 - Midcontinent ISO (MISO)

Many Solutions for Integrating Renewables



ORDC and system expansion?

- Quote from recent capacity adequacy study