

# Decarbonizing the electricity system: technologies and strategies 'Building the Elements'

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Open Modelling Platform for Electrification and Deep Decarbonisation Studies

Building the  
elements  
– elements that  
contribute to a  
larger platform  
&  
decarbonization  
objective

## Six technologies & strategies:

Demand response

Electric vehicles

System flexibility

VRE characterization

Remuneration mechanism

Market participation

# SILVER or PLEXOS Model

Production cost model with mixed-integer linear formulation

- Unit commitment, economic dispatch, and optimal power flow

Grid operators scale

- Spatially – one balancing area (e.g. Ontario)
- Electricity only – other energy carriers can be indirectly quantified
- Temporal resolution – hourly

Analysis: annual electricity system dispatch

- Flexibility requirements
- Production costs
- GHG emissions



# Demand response

# Demand Response

*Changes in end use electricity consumption from their normal consumption patterns in response to changes in electricity price, incentive payments, or system reliability events (FERC)*

Net electricity consumption is not changed

Timing of electricity consumption can be shifted

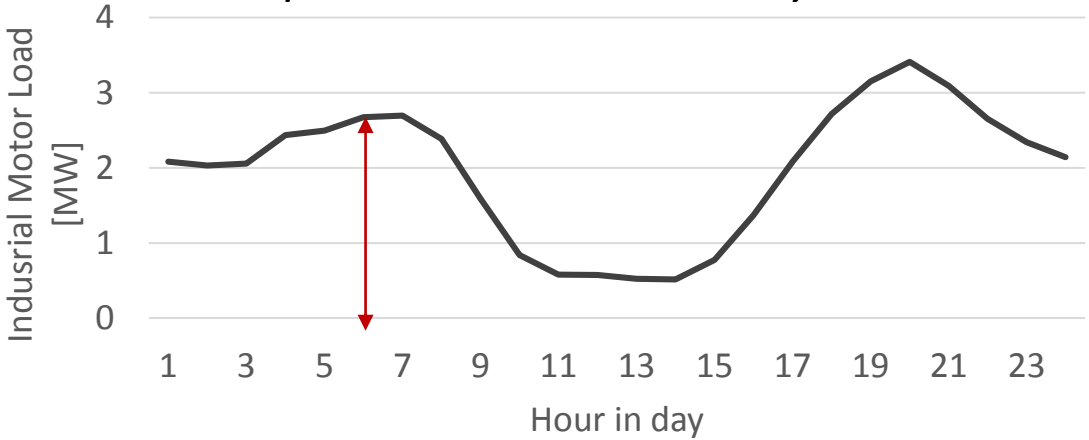
- Must adhere to relatively restrictive constraints, which differ depending on the end-uses

Modeled as 'storage' asset:

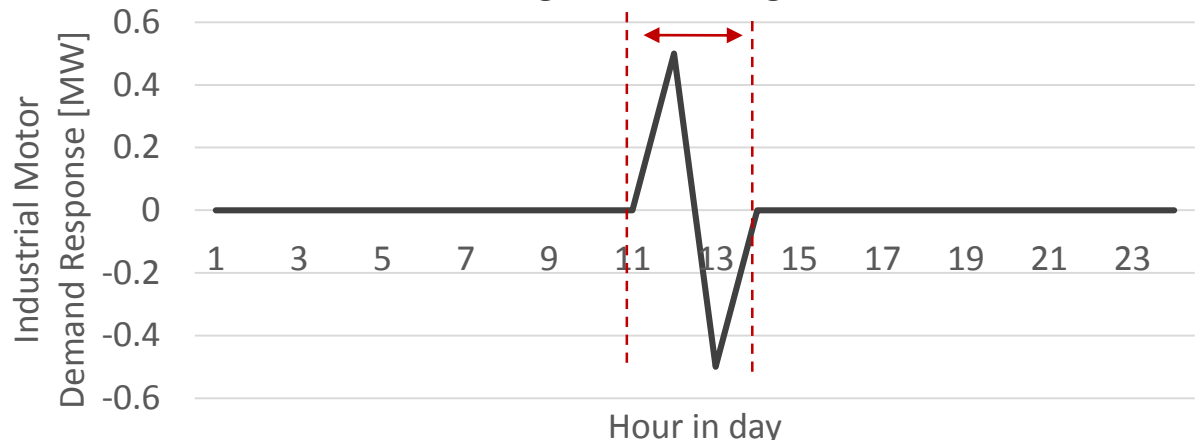
- 'Pump' – increase load compared to baseline
- 'Generate' – decrease load compared to baseline ('inject' power by not using power)

# Demand response – constraints

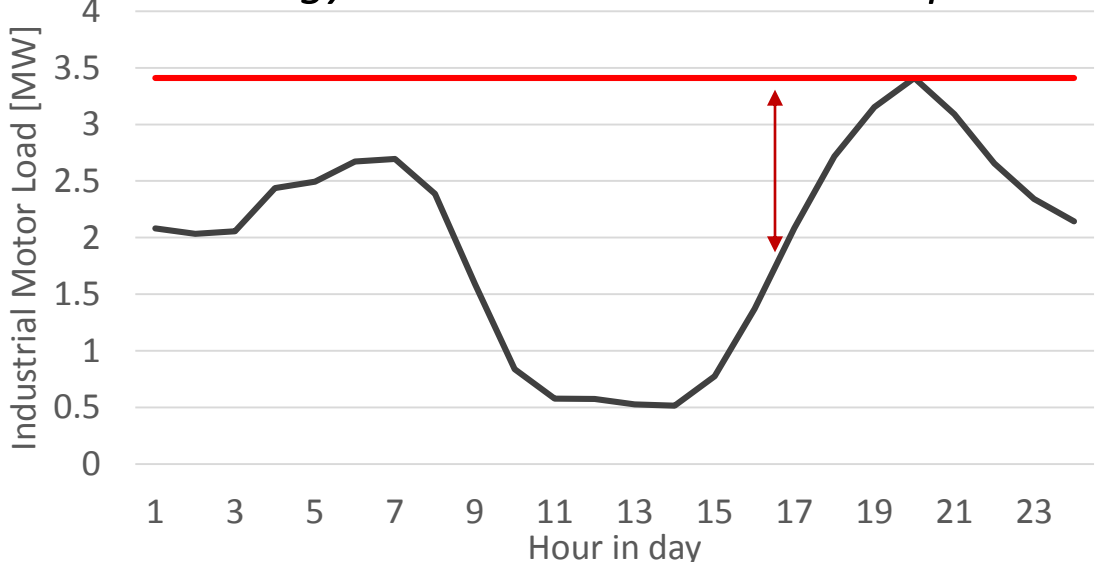
*How much power is available in any hour?*



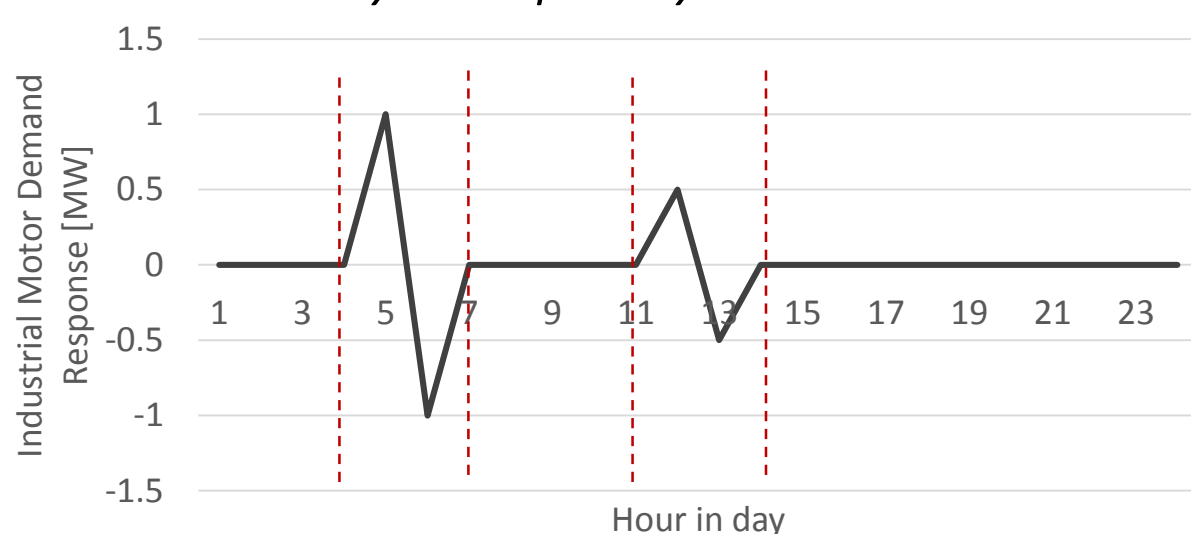
*How long can a single DR event last?*



*How much energy can be recovered in subsequent hours?*



*How many times per day can the DR be used?*



# End-Uses – example consumer tolerance assumptions

Sector	End-Use	Recovery Time [hours]	Min Up Time [hours]	Max Use Time [time/use]	Max Starts [per day]
Residential	AC	4 hours		15 min	2
	Refrigerator	4 hours		15 min	2
Commercial	Kitchen appliances	4 hours		1 hour	2
	Space cooling	4 hours		15 min	2
Industrial	Motors	2 hours		15 min	2
	Air conditioning	4 hours		15 min	2
Agriculture	Agriculture	24 hours	3 hours	7 hours	1

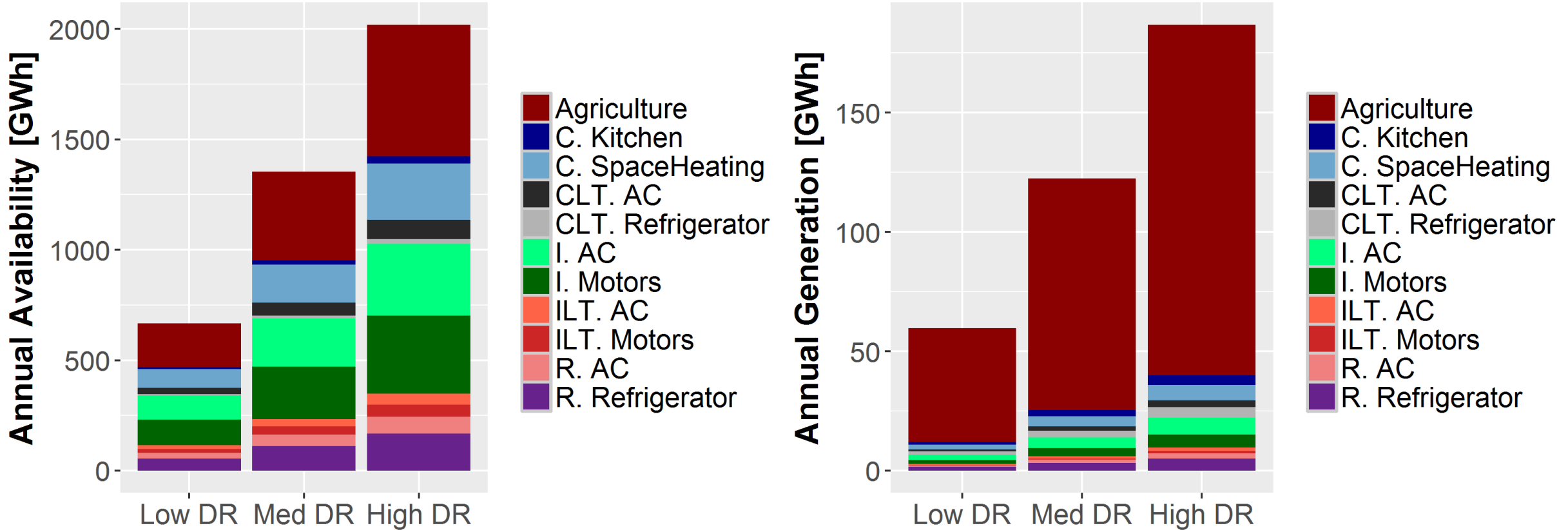
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# Demand Response – key observation

Intraday constraints materially impact DR utilization



# Building the elements – next steps

Ensure complete representation of DR constraints (intraday)

-> they have a material impact



# Electric vehicles

# Electric Vehicles

Net electricity consumption

Analysis: timing of electricity consumption is shifted

Mobility patterns are held constant – journey departure, travel, arrival time

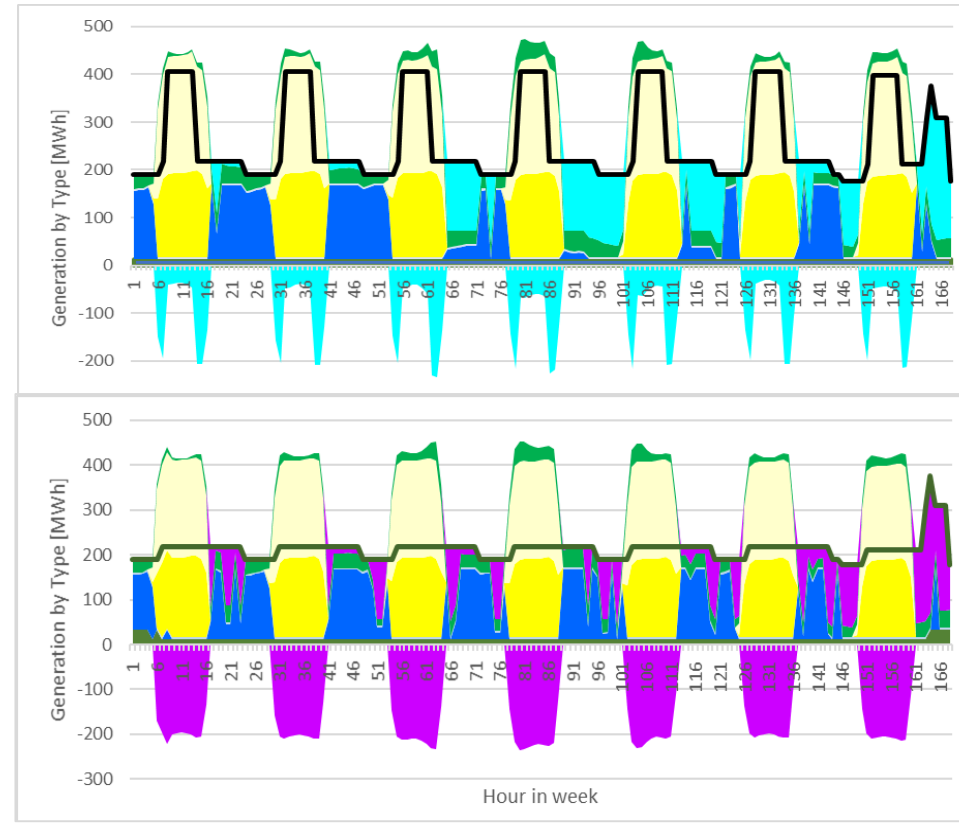
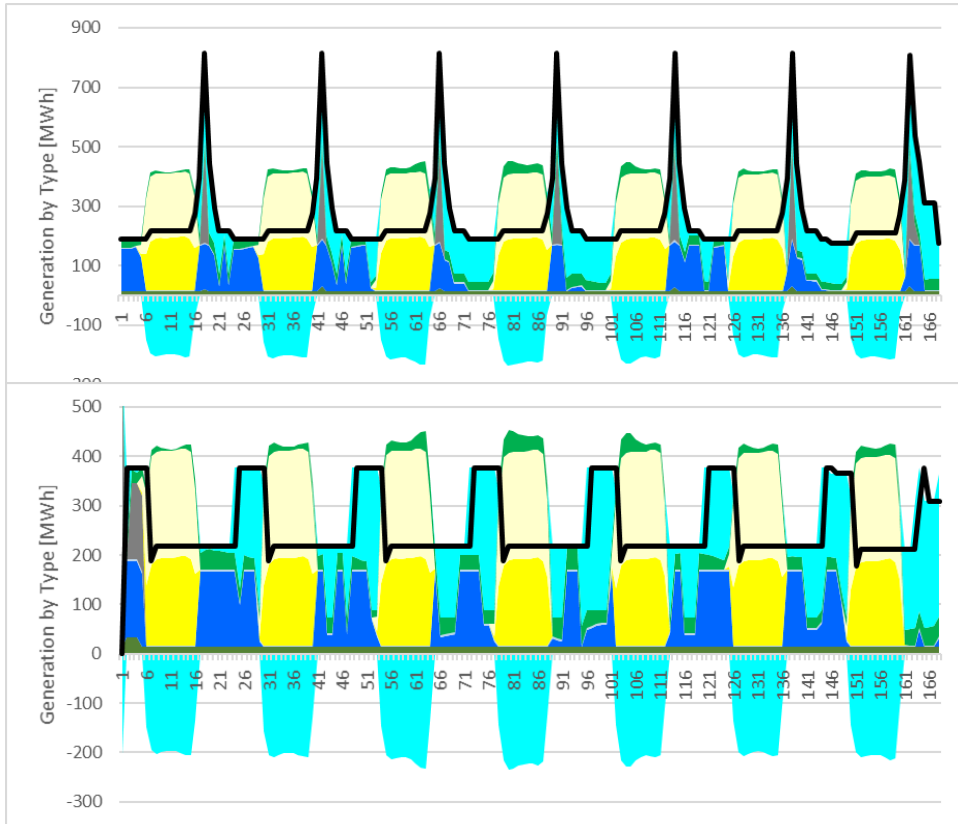
Different charging assumptions

V2G Modeled as ‘storage’ asset:

‘Pump’ – consuming electricity from the grid

‘Generate’ – injecting electricity onto the grid

# EV charging profiles – charging schedule dispatch



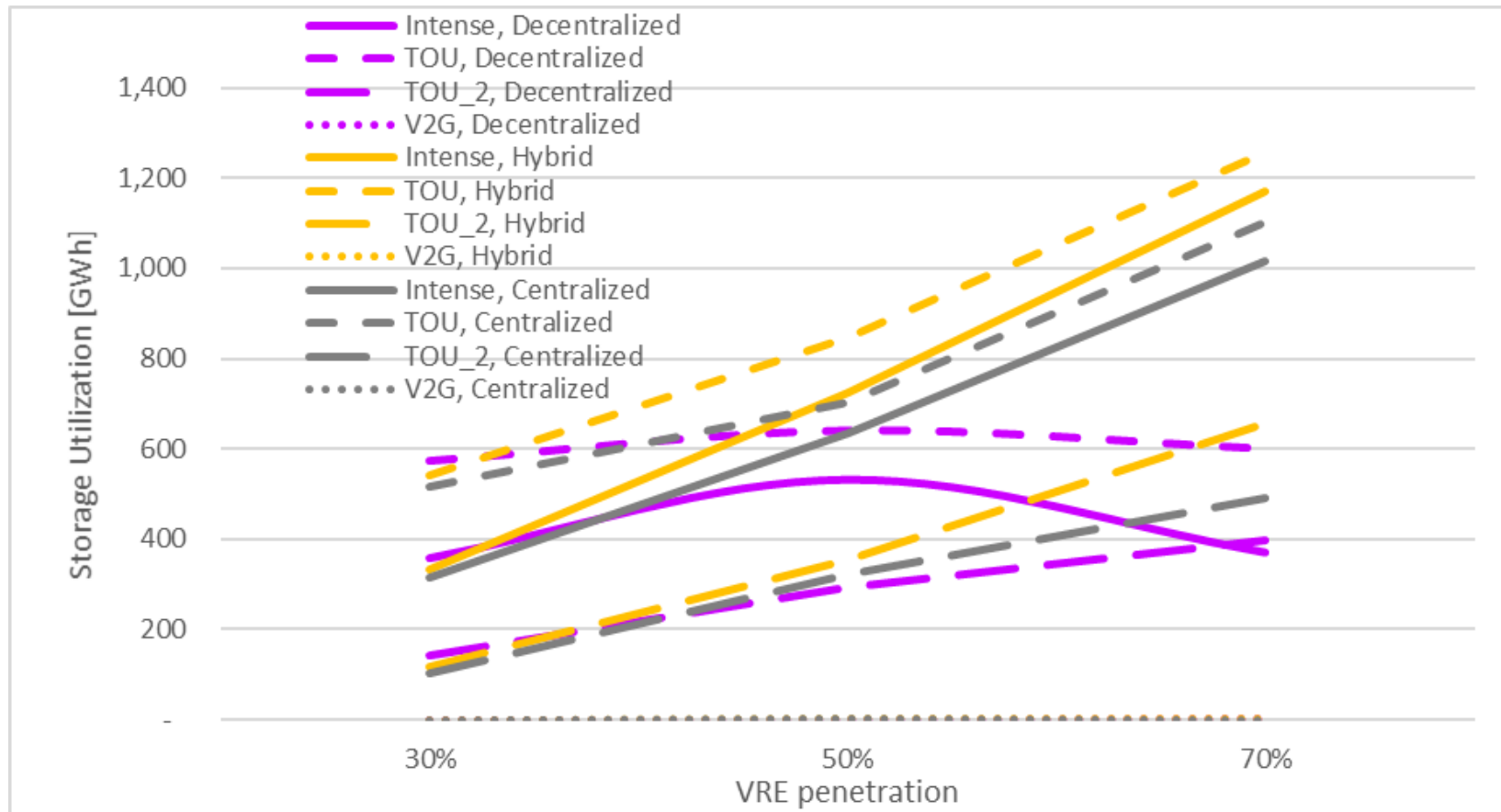
“Intense”: all EVs are charged upon arrival home

“TOU”: EV charging offsets baseline demand

“TOU\_2”: EV charging matches solar generation

“V2G”: EV charging is optimized by system operator for any hours in which EV is not in transit

# EV charging – key observations



Storage system requirements & utilization is highly sensitive to EV charging schedule...

- *Storage utilization drops to zero with V2G*

... and solar PV configuration:

- Decentralized; non-export
- Centralized; utility-scale & transmission connected
- Hybrid: 50-50 combination

*Storage utilization rates under increasing VRE penetrations, alternative degrees of system centralization, and alternative EV charging schedules*

# Building the elements – next steps

Ensure complete representation of DR constraints (intraday)

-> they have a material impact

System design that is robust against potential EV charging scenarios

-> interdependencies: EV charging and system configuration (e.g. PV)



# System flexibility

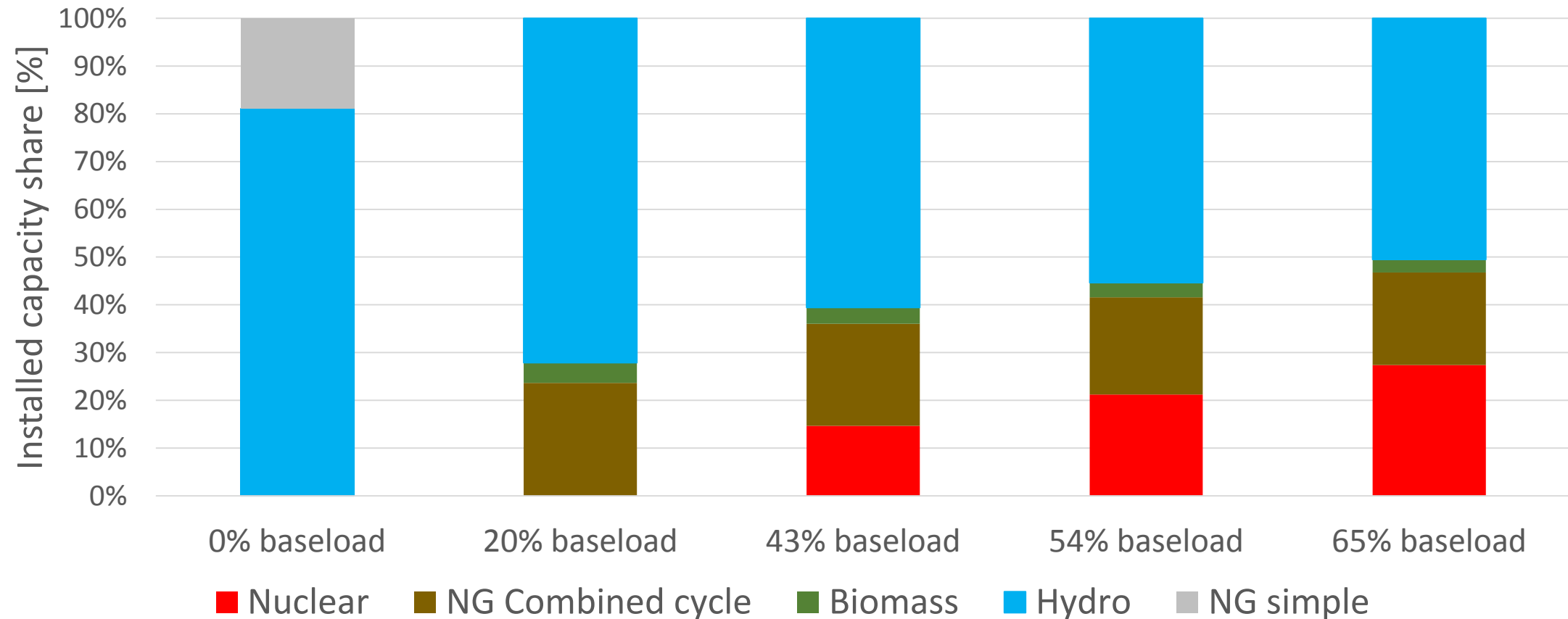


# System flexibility

## ***Percentage of must-run baseload generation***

*Low start up costs and no/short minimum up/down times >> flexible asset*

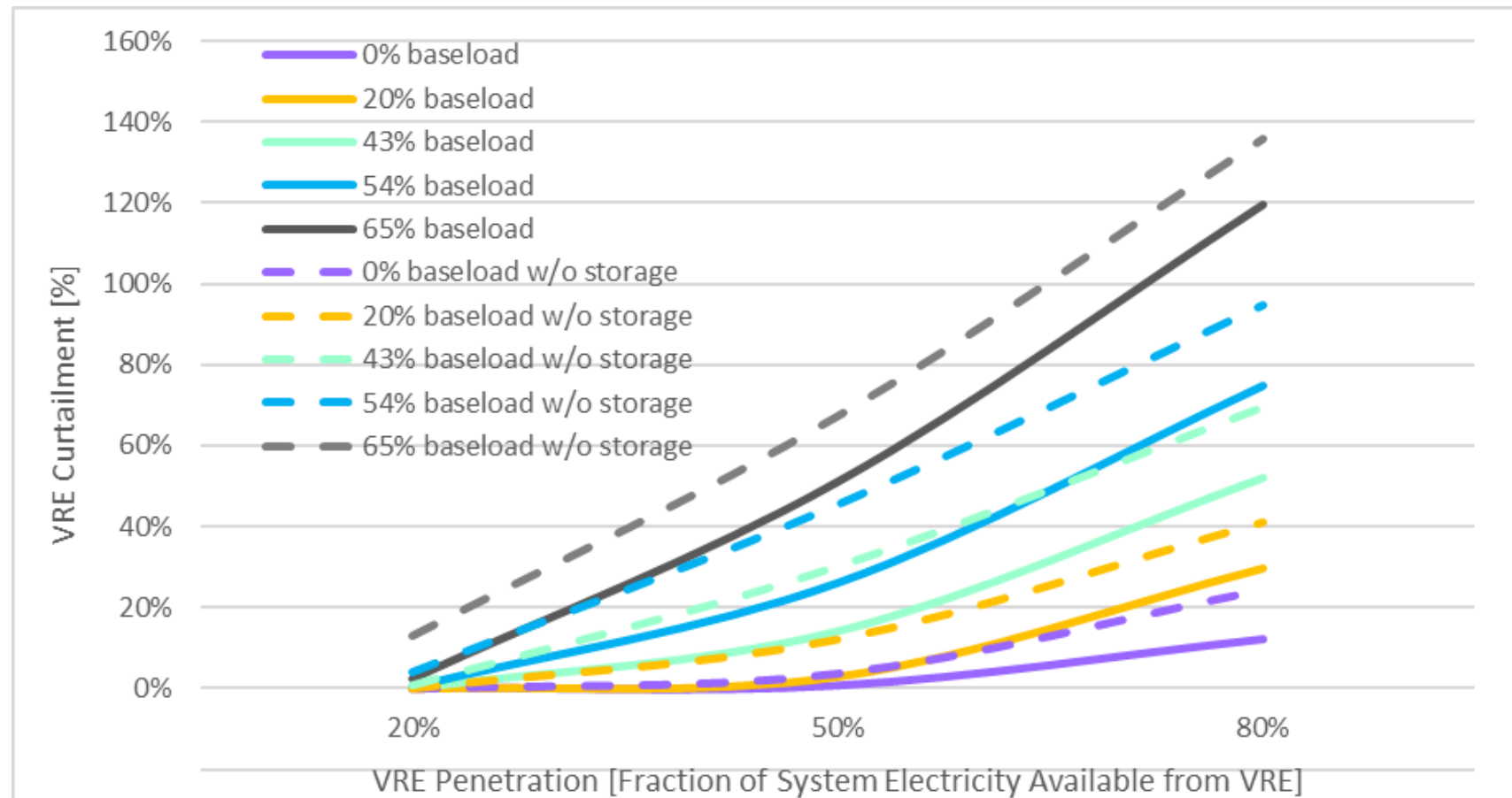
*High start-up costs plus long minimum off times >> must-run baseload*



# System flexibility – key observation

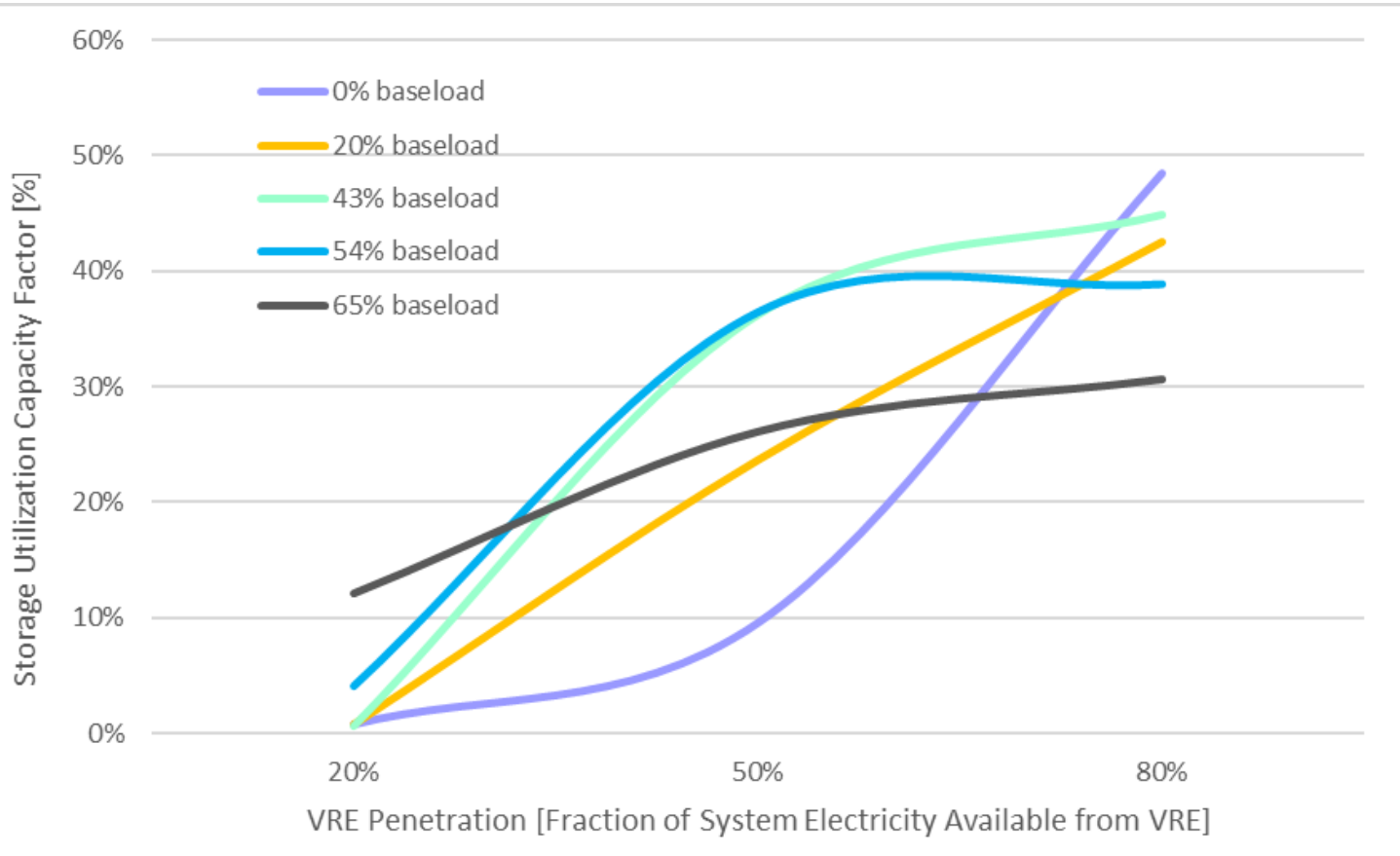
*Pairing high VRE penetrations with flexible non-VRE generators emerges as one of the most significant design priorities*

Phasing in variable renewables needs to be accompanied by phasing out inflexible baseload generators



# System flexibility

## *What about utilizing storage to add flexibility?*



Storage has limited ability to add flexibility to high-VRE, high-baseload systems

Flexible system: storage is utilized to mitigate VRE variability

Inflexible system: storage utilization plateaus at high VRE penetration

- Energy perspective: PHS Storage assets can't mitigate annual over-generation
- Cost perspective: Storage can't reduce costs by dispatching low-marginal cost (VRE generation) because of high-marginal cost assets are must-run

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Ensure complete representation of DR constraints (intraday)

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Maximize system flexibility (limited daily storage impact in inflexible system)

-> one of the key drivers of curtailment rates

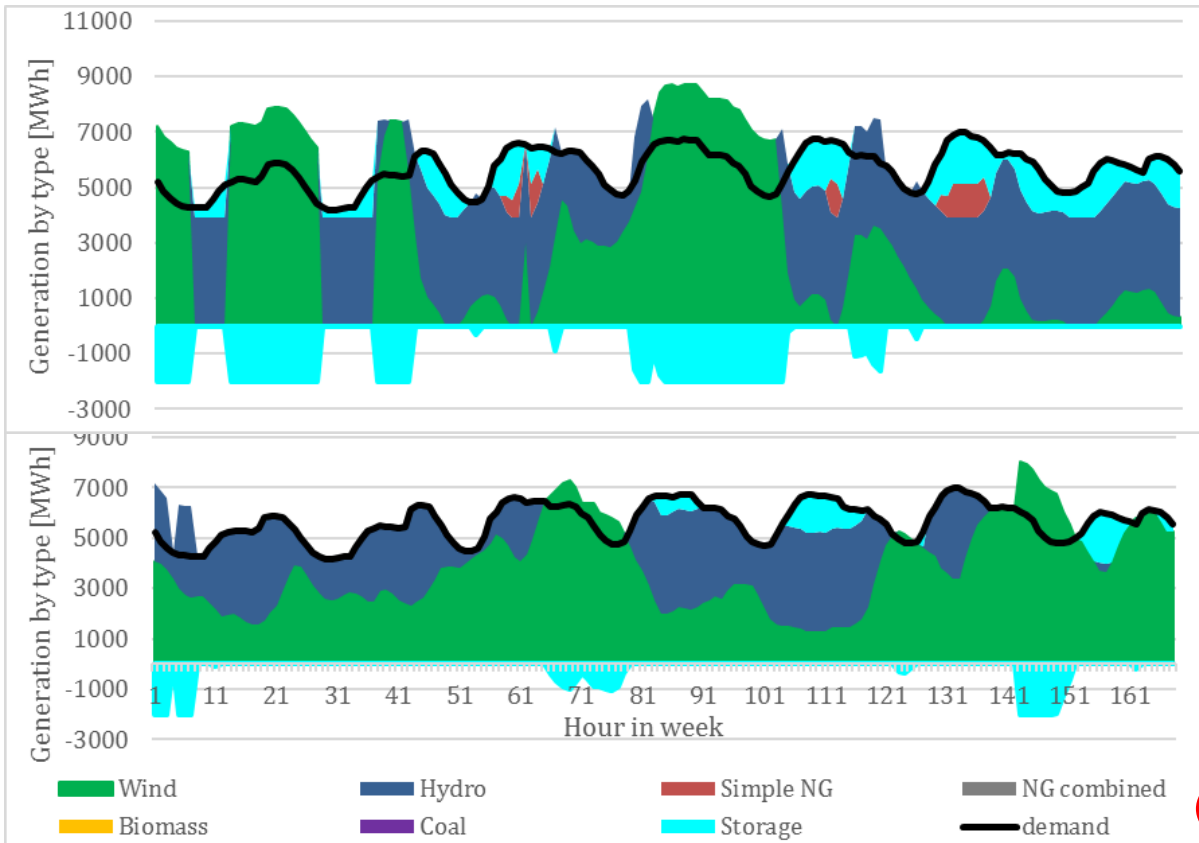


# VRE Characterization

# VRE characterization: integration hypothesis

Characterization Metric	Metric Formulation	Corresponding integration strategy
Variability over hourly timescale	Hourly ramp events frequency and magnitude $E_{MARV} = \frac{\sum  v_i - v_{i-1} }{n - 1}$	Daily storage technologies, curtailment, and system flexibility
Variability over weekly-seasonal timescale	Relative frequency distribution curve $E_{MRF} = \frac{\max_{0 < i \leq 23} y_i}{n}$	Seasonal storage technologies, and system firm capacity
Inter-annual variability	Annual average capacity factor distribution $E_{IAV} = \frac{\sum_{n=1}^{35} (y_i - \mu)^2}{35}$	Long-term storage technologies, sector integration, and backup generation
Correlation with demand profile	Average resource in high demand hours $E_{DR} = y_1 + 2 * y_2 + 3 * y_3 + 4 * y_4$	Demand response initiatives
Geographic coincidence factor	Coincidence of an geographic area $E_{CF} = \frac{\max_{1 \leq hr \leq 24} \{\sum_{n=1}^N \widehat{y}_n\}}{\sum_{hr=1}^{24} (\max_{1 \leq n \leq N} \widehat{y}_n)}$	Transmission capacity expansion with neighboring areas
Inter-resource coincidence factor	Correlation between wind and solar resources $E_{IRC} = \sum_{n=1} \chi_n$ $\chi_n = \begin{cases} 1 & \psi_{n,w} = \psi_{n,s} \\ 0 & \psi_{n,w} \neq \psi_{n,s} \end{cases}$ $\psi_n = \begin{cases} 1 & y_n > \overline{y}_n \\ -1 & \text{otherwise} \end{cases}$	The respective share of wind versus solar resources

# VRE characterization: hourly variability

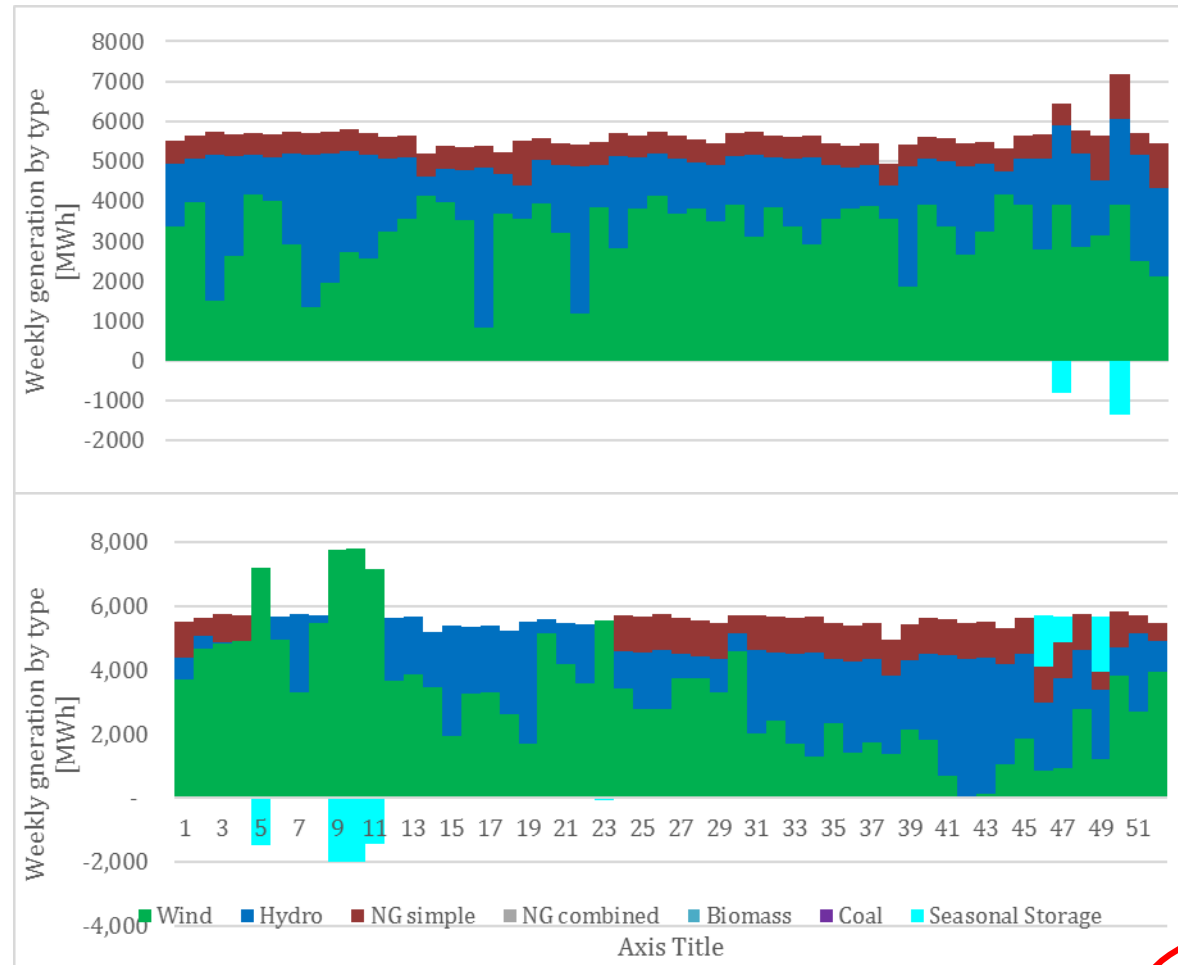


Impacts (annual) of integrating an hourly-variable resource compared to an hourly-stable resource:

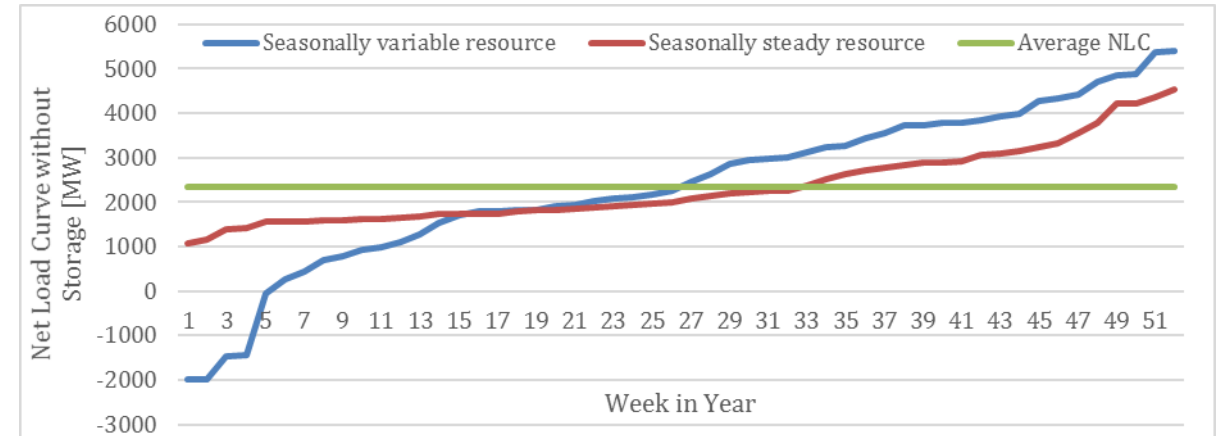
Ramping events:	48% increase
System marginal cost:	52% increase
GHG emissions:	61% increase
Storage utilization:	82% increase
Marginal cost variability:	118% increase
Wind curtailment:	330% increase

*Weekly dispatch integrating a highly variable wind resource (top) versus a steady wind resource (bottom)*

# VRE characterization: seasonal variability



*Net load curve of a seasonally-variable versus seasonally-steady wind resource*



Impacts (annual) of integrating an seasonally-variable resource compared to an seasonally-stable resource:

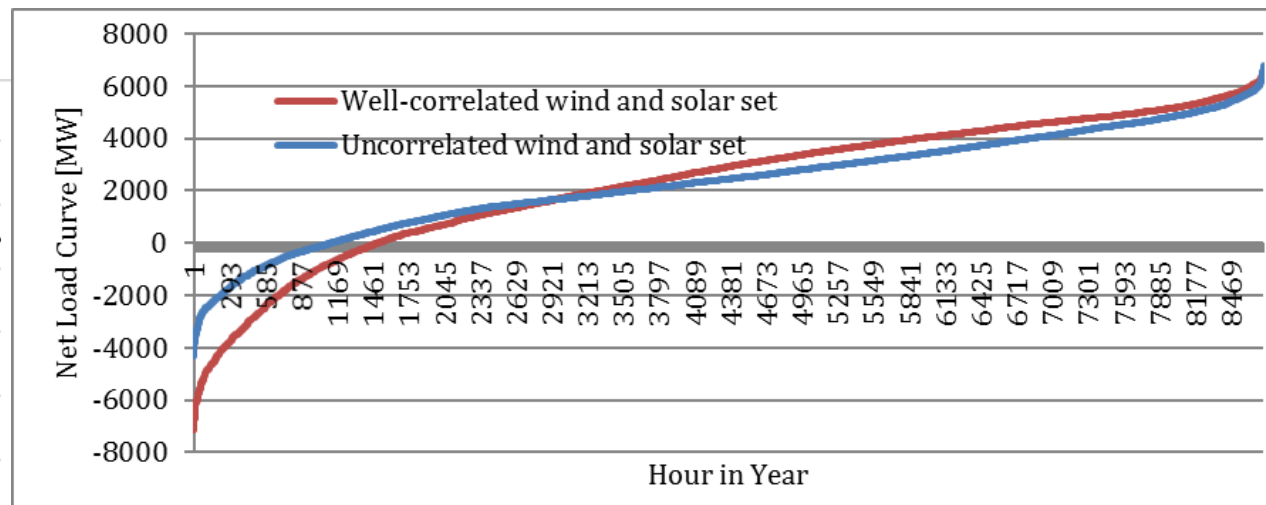
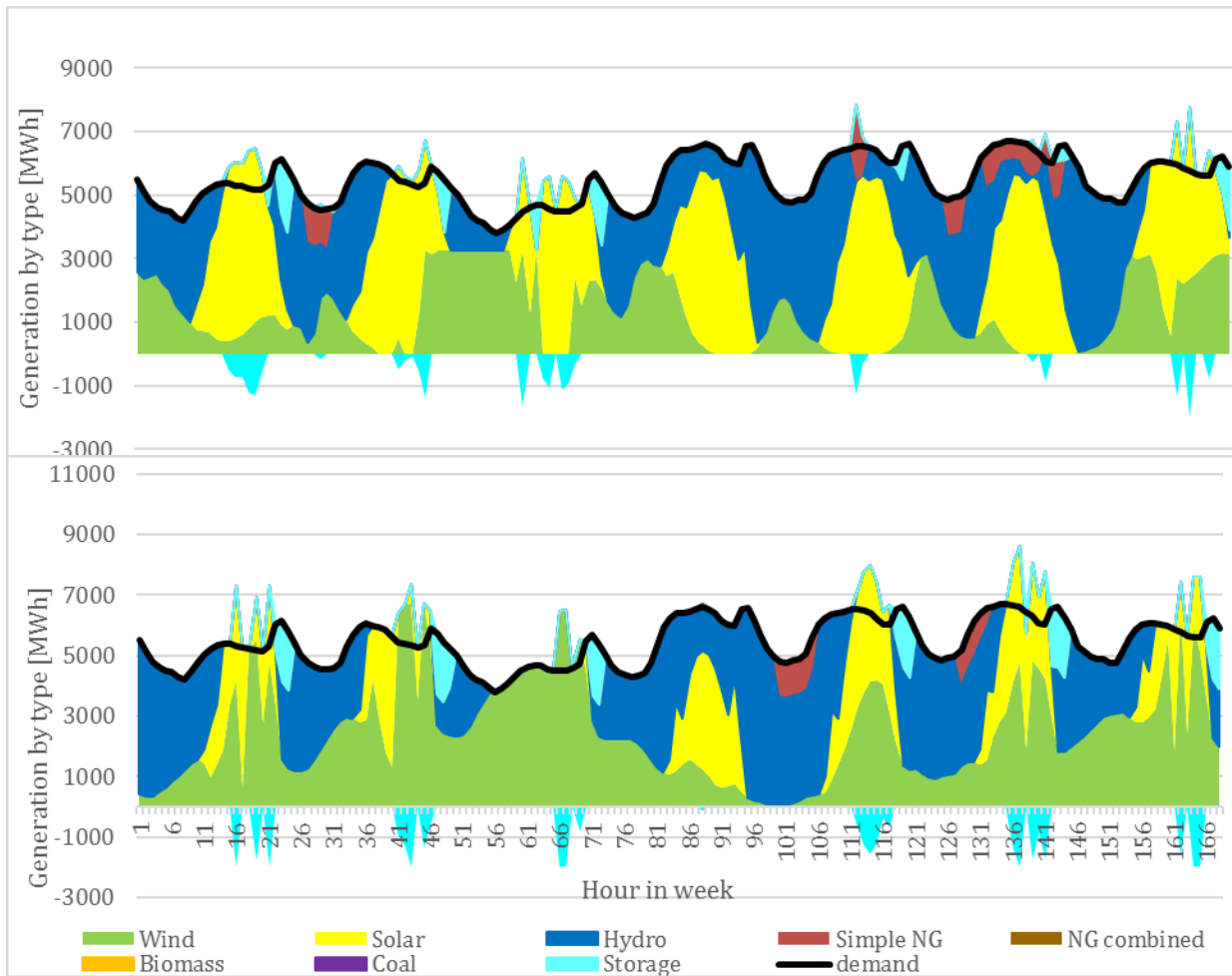
Wind curtailment:	< 1% w/ storage
GHG emissions:	6% increase
System marginal cost:	6% increase
Ramping events:	26% increase
Storage (energy) utilization:	410% increase
Storage (capacity) utilization:	211% increase

*Dispatch integrating a seasonally steady resource (top) versus a seasonally variable resource (bottom)*



# VRE characterization: wind/solar correlation

## Net load curve for two well-correlated and two uncorrelated wind-solar grid point pairs



Impacts of integrating a well-correlated vs. uncorrelated wind/solar pair:

Ramping events:	19% increase
GHG emissions:	15% increase
System marginal cost:	20% increase
Marginal cost variability:	37% increase
Storage utilization:	52% increase
Wind curtailment:	180% increase
Solar curtailment:	800% increase

Dispatch for an uncorrelated (top) versus a well-correlated (bottom) wind and solar pair

# Building the elements – next steps

Ensure complete representation of DR constraints (intraday)

-> they have a material impact

System design that is robust against potential EV charging scenarios

-> interdependencies: EV charging and system configuration (e.g. PV)

Maximize system flexibility (limited daily storage impact in inflexible system)

-> one of the key drivers of curtailment rates

VRE characterization is a useful tool for system design

-> combine VRE characterization with appropriate strategy



# Remuneration Mechanism

# Flexibility resources remuneration in Ontario

## Demand response:

- IESO's annual DR auction:
  - determines clearing prices (\$/MW-day) & quantities (MW)
- Paid a fixed price for each unit of electricity (MWh) shifted

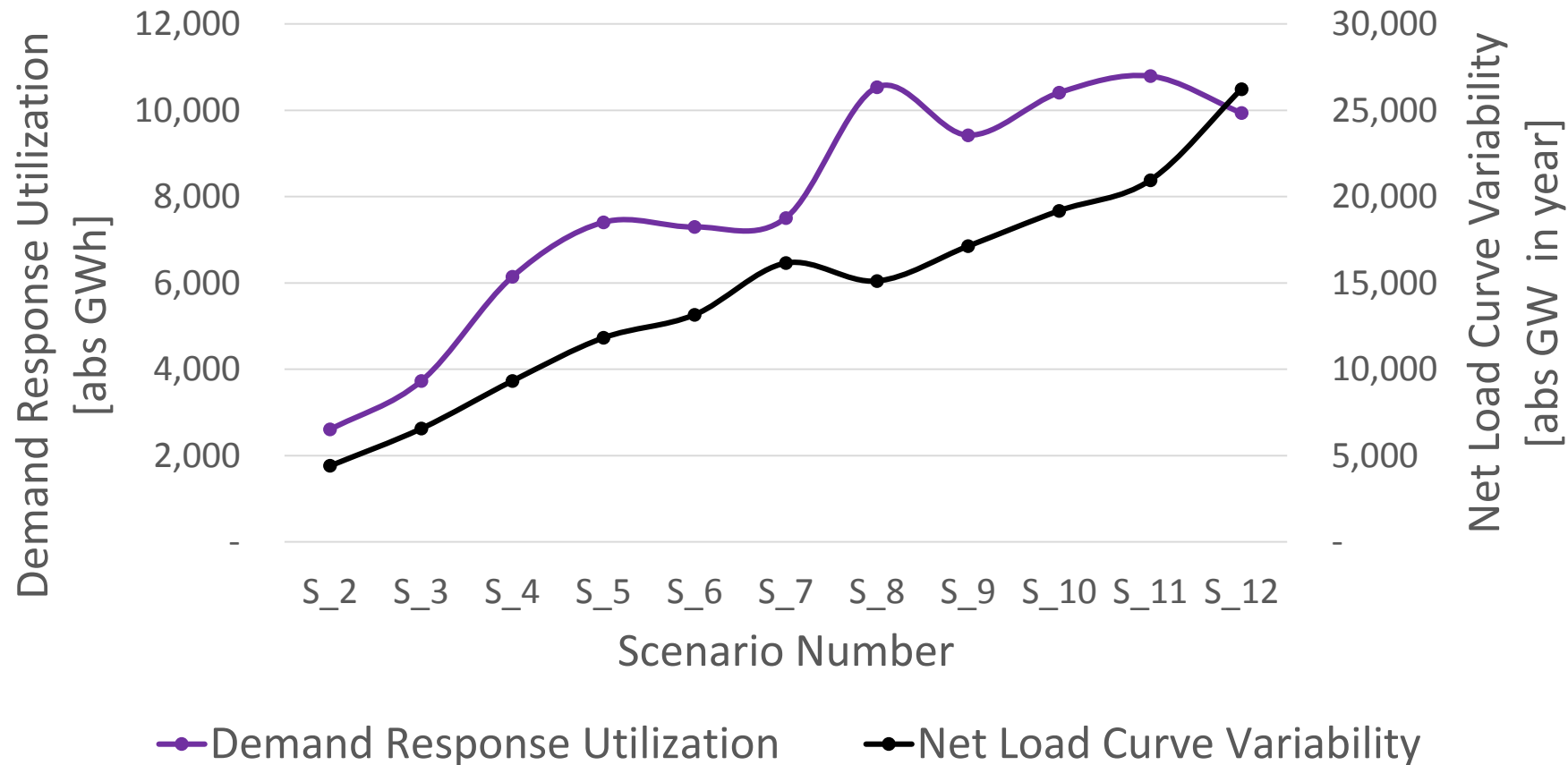
## Utility-scale storage:

- IESO's Phase I Procurement: ancillary services
- IESO's Phase II Procurement: price arbitrage (buy low, sell high)
- 'Fuel' price = price of electricity during hours of pumping

## Key difference:

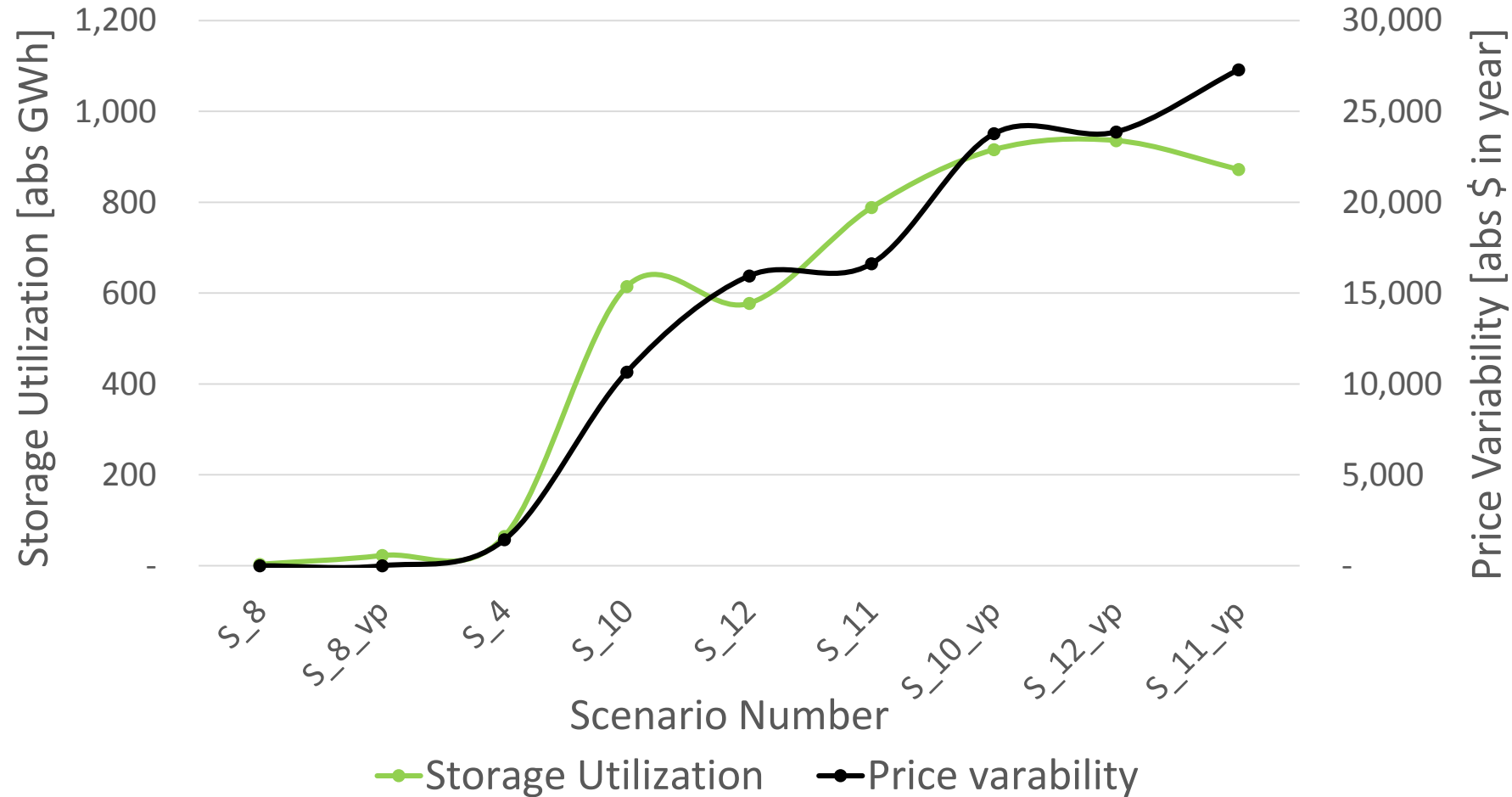
- DR cost is NOT sensitive to hourly market price fluctuations
- Storage 'fuel' cost IS sensitive to hourly market price fluctuations

# Demand response utilization vs. NLC variability



- Net load curve (NLC): demand (baseline) minus VRE generation
- DR utilization increases with variability in the net load curve >> VRE penetration
- Correlation: 0.88

# Storage utilization vs. Price variability

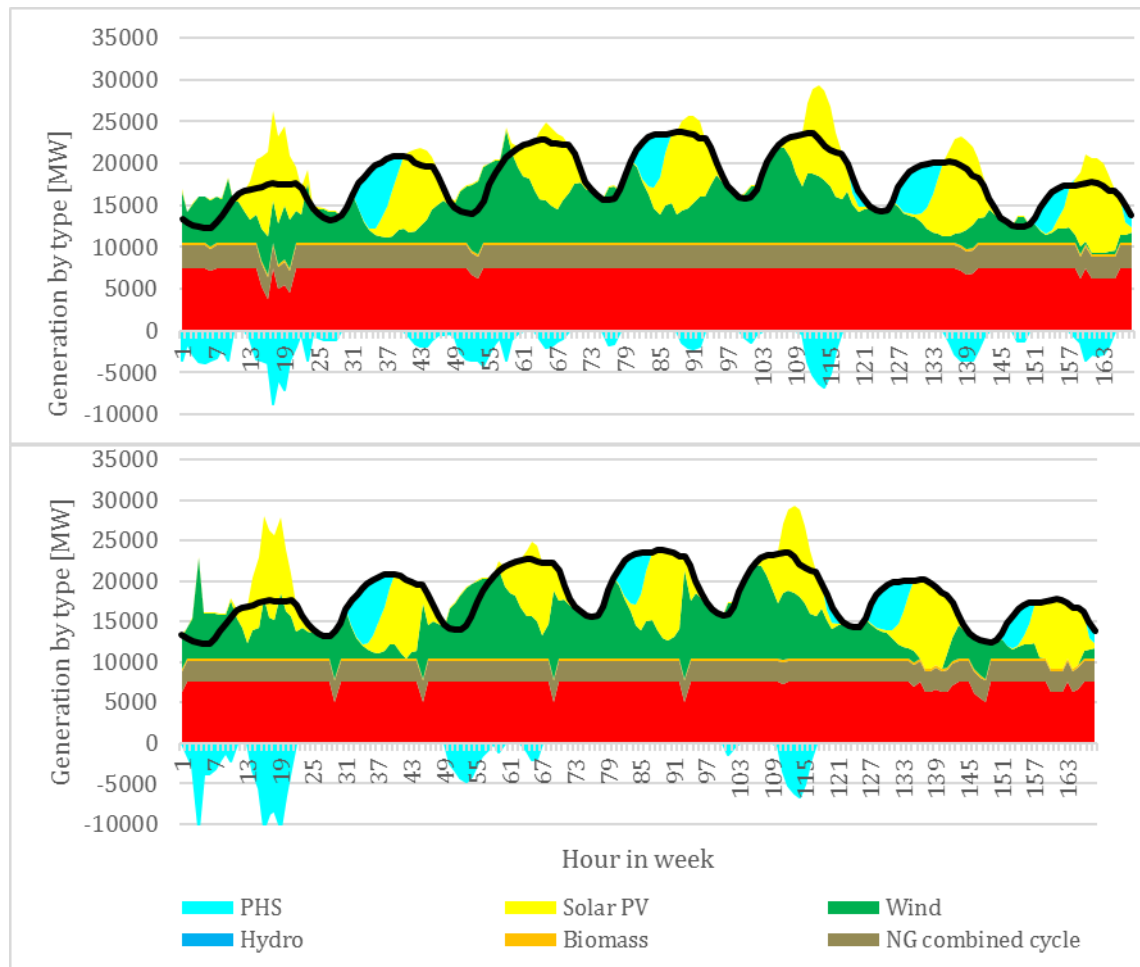


- Storage utilization increases with price variability >> shape of marginal cost curve
- Correlation: 0.97

# Remuneration mechanism:

How are flexibility assets remunerated by the electricity market?

## *Impact on dispatch*



Fixed contract payments:  
generation from storage asset is paid fix price (like a FIT)

Spot market prices:  
storage asset pays hourly market price for pumping

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Remuneration policy drives utility & competitiveness

-> models need to represent remuneration policies properly





# Market Participation

# Storage asset market participation

Storage's bidding strategy is obfuscated by opportunity cost evaluations:

- should the asset generate now, given a known electricity price,
- or later, given an expected electricity price forecast?

(1) should storage assets bid into day-ahead or real-time markets, or redispatch bids in both markets, and

(2) how accurately does forecast information have to be to improve real-time redispatches over the day-ahead schedule?

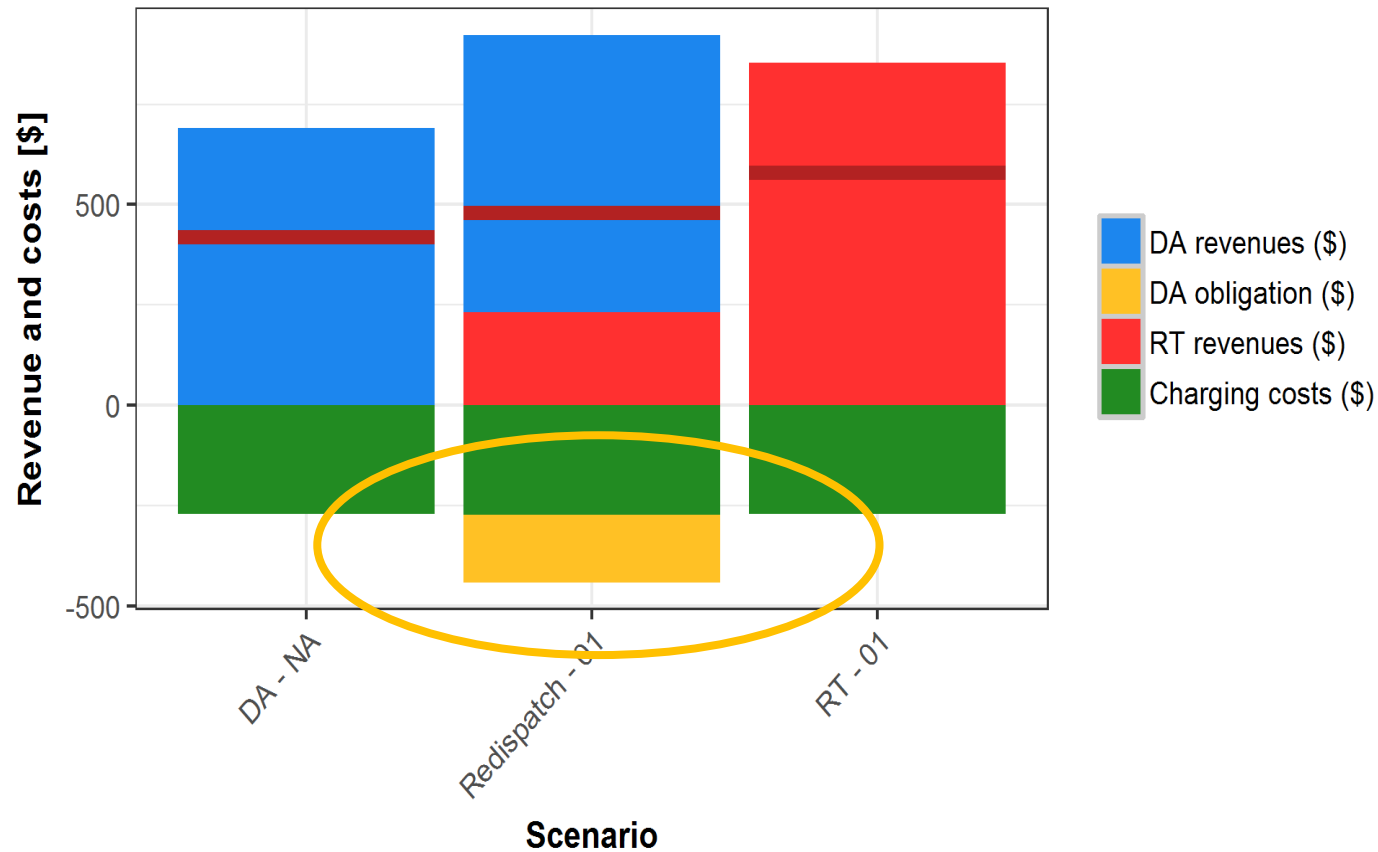
# Market Rules

Must consider market rules in the model formulation:

- Day-ahead financial obligations
- Virtual transactions
- Consumption bids
- Day-ahead and real-time market timing
- Deviation charges

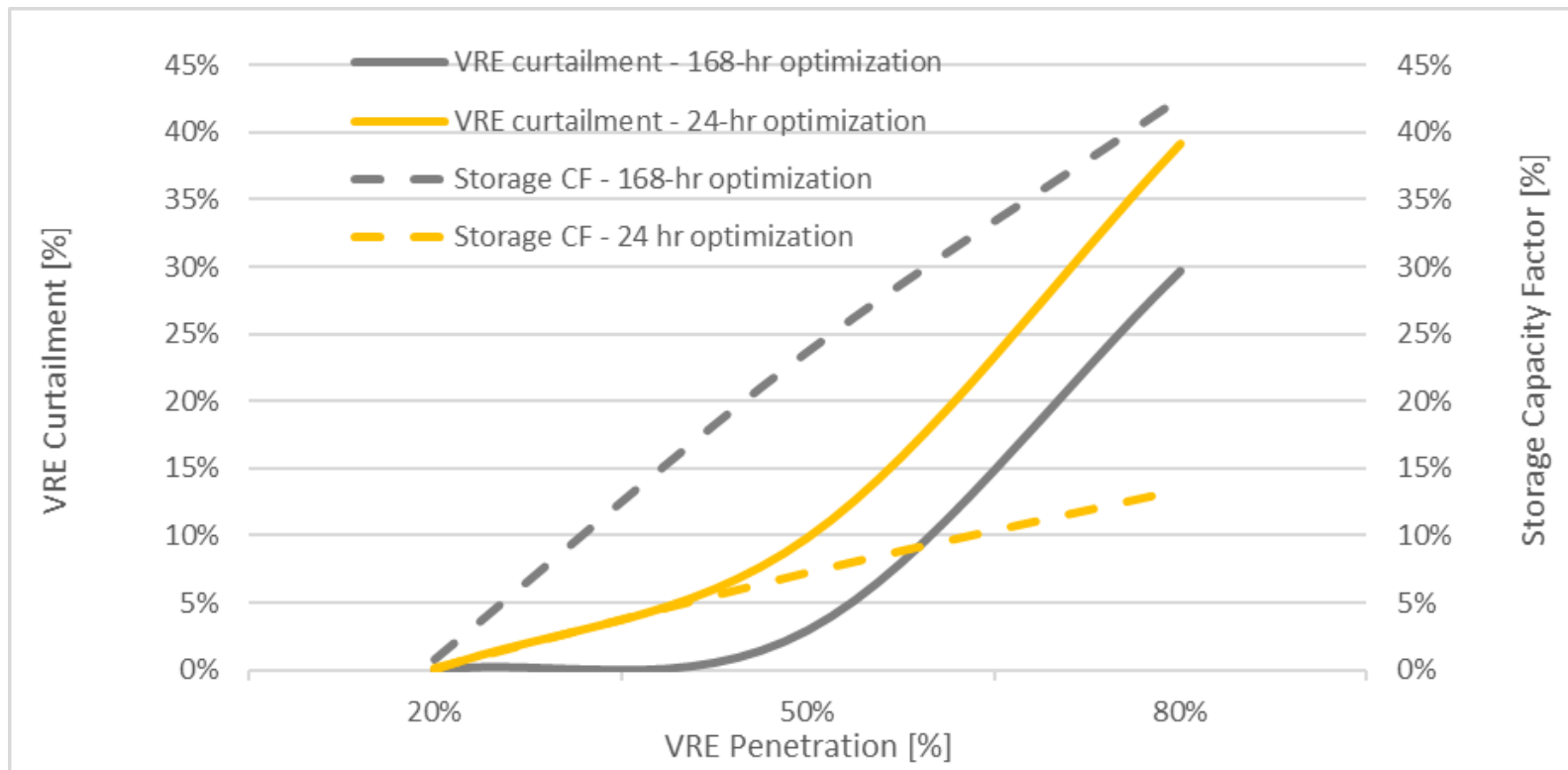
...to inform an accurate representation of storage bidding behavior in competitive day-ahead and real-time electricity markets

# Market rules impact – e.g. DA obligation



*Accounting (or not) for DA obligation changes the storage operator's decision to participate in the RT market only or re-dispatch DA bids in the RT market*

# Market rules impact – e.g. dispatch horizon



*Longer dispatch planning horizon will enable better utilization of flexibility resources that employ time shifting*

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-> models need to represent remuneration policies properly

Restructuring of the electricity market to accommodate storage

-> large implications for the energy system transformation



Next Steps:

ChargedUP

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Application of these integration technologies and strategies to explore pathways to meeting Canada's Paris Agreement

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Capacity expansion & production cost models

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Three-year project

Build on previous work



Thank you

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