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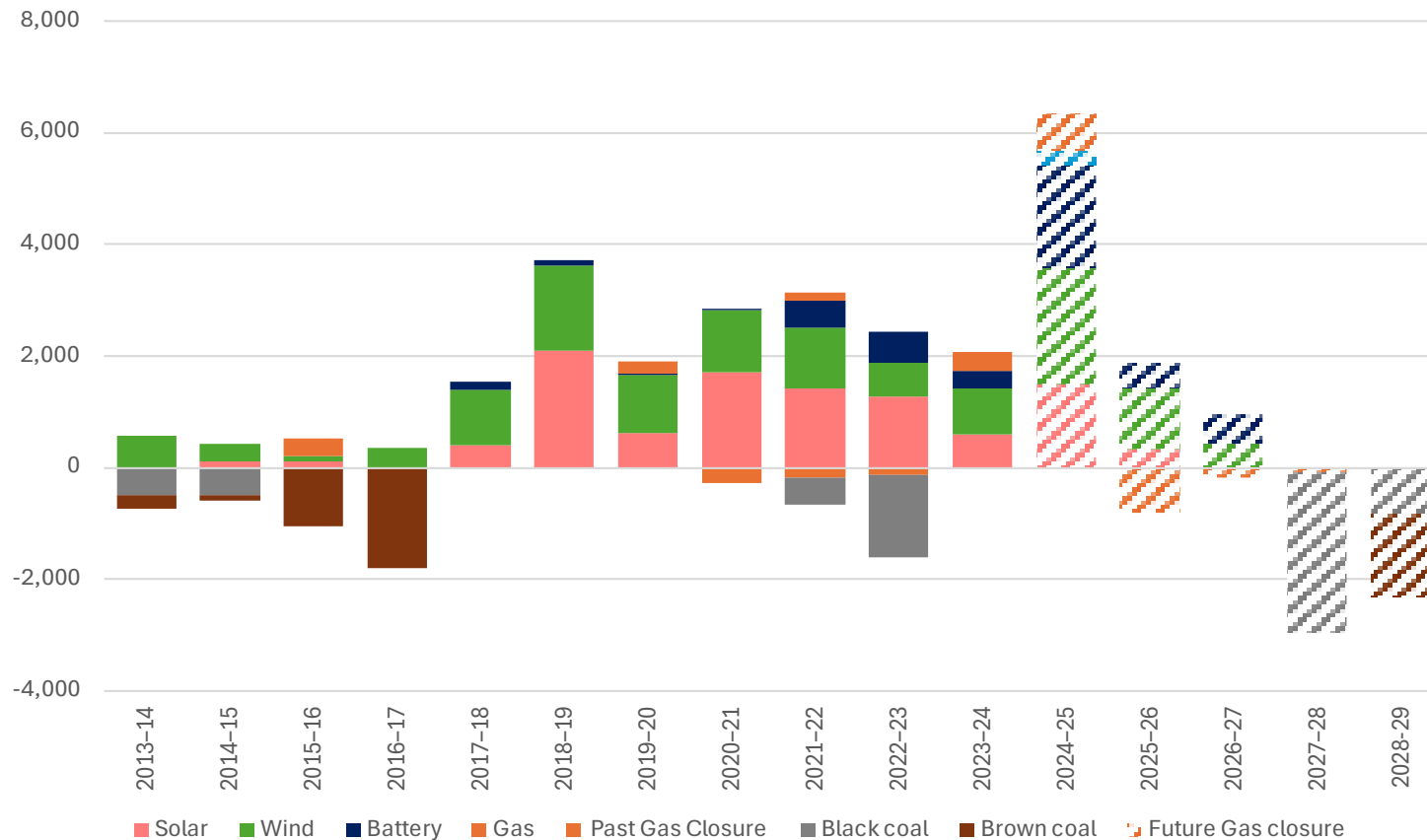
# **The Value of Dispatchability and Earnings-at-Risk of Electricity Generators under Energy Transition**

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**Macquarie University**

**11<sup>th</sup> Energy Finance Christmas Workshop: 12-13 December 2024 , Sydney,  
Australia**

# The Energy Transition

New generation investment and plant withdrawal



SOURCE: AER (2024)

# Motivation

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- Dispatchable generators such as coal and gas fired stations
  - high volatility of VRE production substantially influences wholesale prices and the residual demand for other generators
  - decision-making on entering or exiting the market
  - *“Investment is needed urgently. New generation, storage and firming must be in place before coal power stations retire, and to meet Australia’s growing demand for electricity.” (AEMO, 2024)*
  
- Non-dispatchable VREs
  - evaluating the uncertainty and profitability of new investment
  - appropriate pricing of long-term contracts such as Power Purchase Agreements

# Objectives

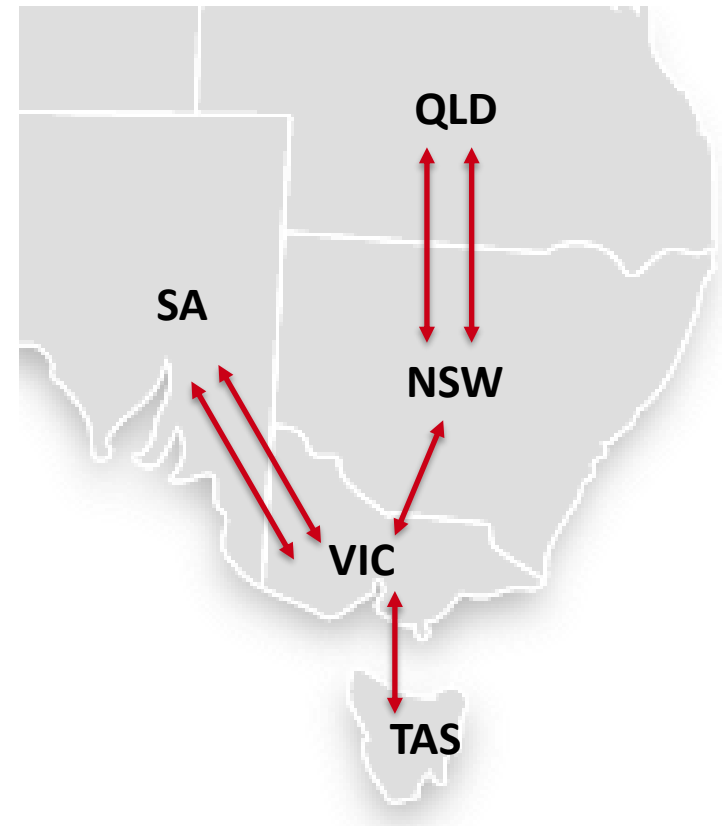
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- This study aims to provide a comprehensive understanding of profitability and risk profiles for different generation assets and technologies
- We evaluate the profitability of each generation technology regarding
  - **dispatch-weighted price (DWP)** it receives
  - the **upside potential of earnings** it can achieve
- We quantify and compare investment risks for different generation technologies
  - **earnings-at-risk (EaR)**: it places an emphasis on measuring the variability in the accumulated revenues obtained by a power plant over a defined time period

# The Australian National Electricity Market (NEM)

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- One of the world's longest interconnected power systems, containing 5 states
- **Trading:** generators **offer** to supply the market with specified amounts of electricity at specified prices for each **5 minutes** and can re-submit the offered amounts at any time.
- **Non-storable nature of electricity:** supply and demand have to be instantaneously balanced 24/7
- **Volatile market:** prices are capped at a maximum of \$17,500/MWh, with a price floor of -\$1,000/MWh.
- **Risk management:** NEM participants typically manage the financial risk associated with the significant degree of spot price volatility by using different financial contracts (exchange-traded or OTC).



## Institutional Background (cont.): Generation technologies in the NEM

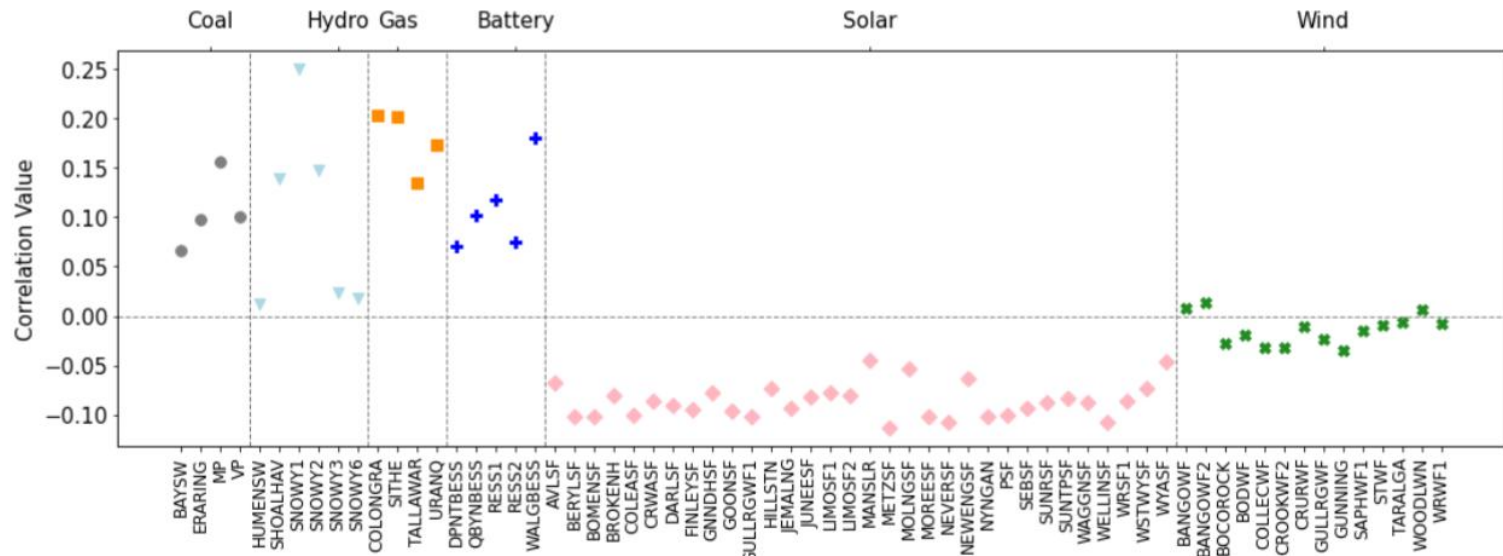


SOURCE: AER (2024)

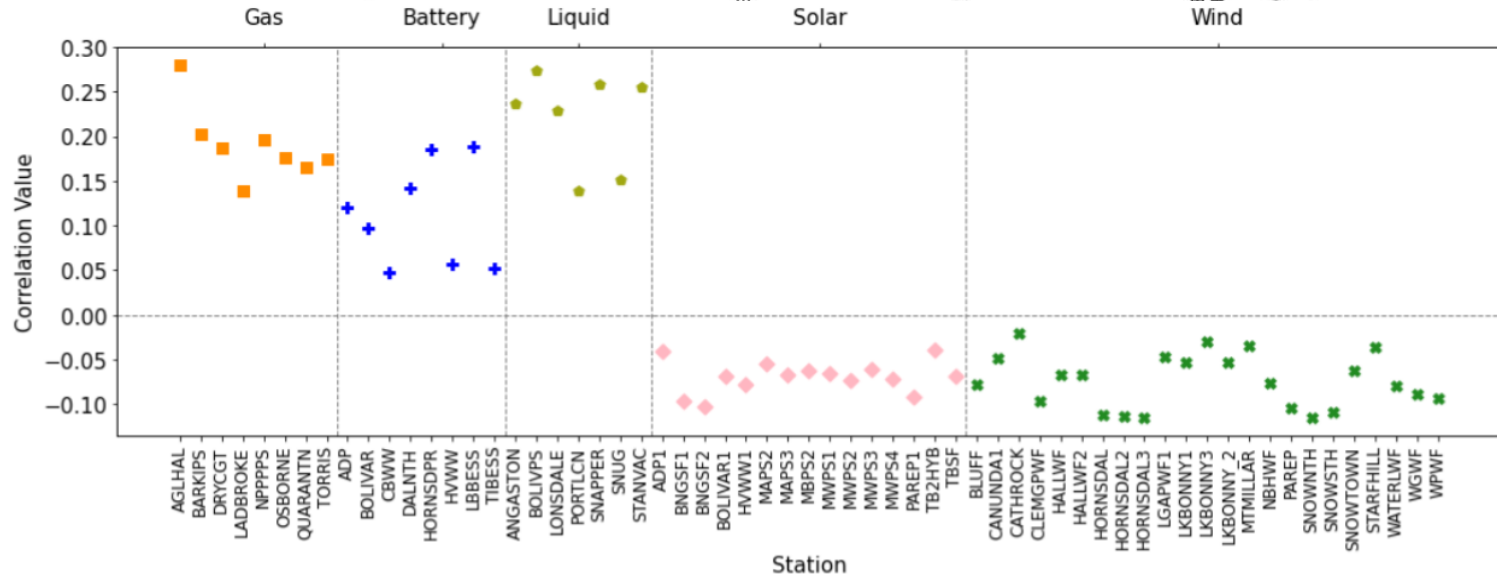


## The Australian National Electricity Market (cont.): Generation technologies – correlation with spot price

(a) NSW

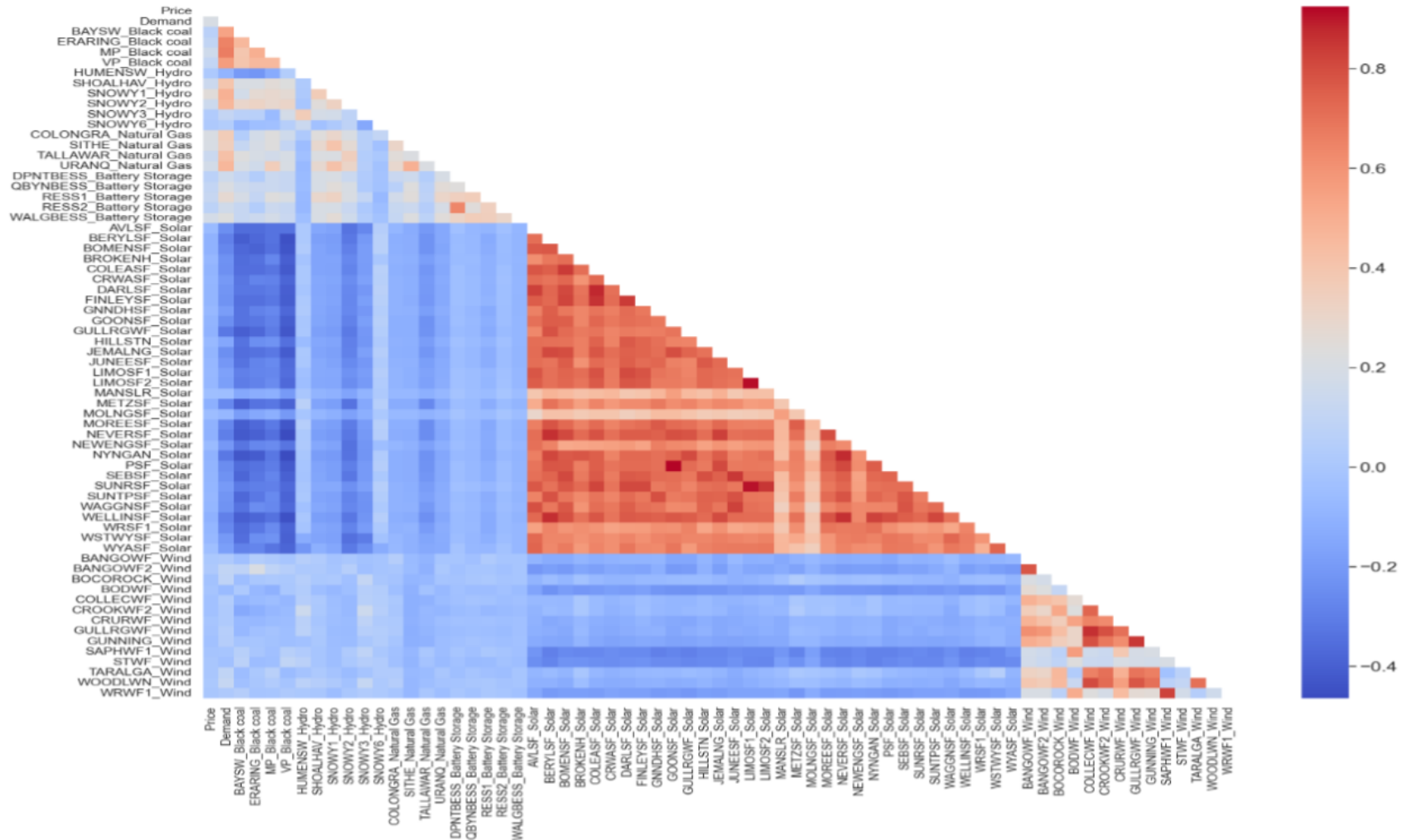


(b) SA





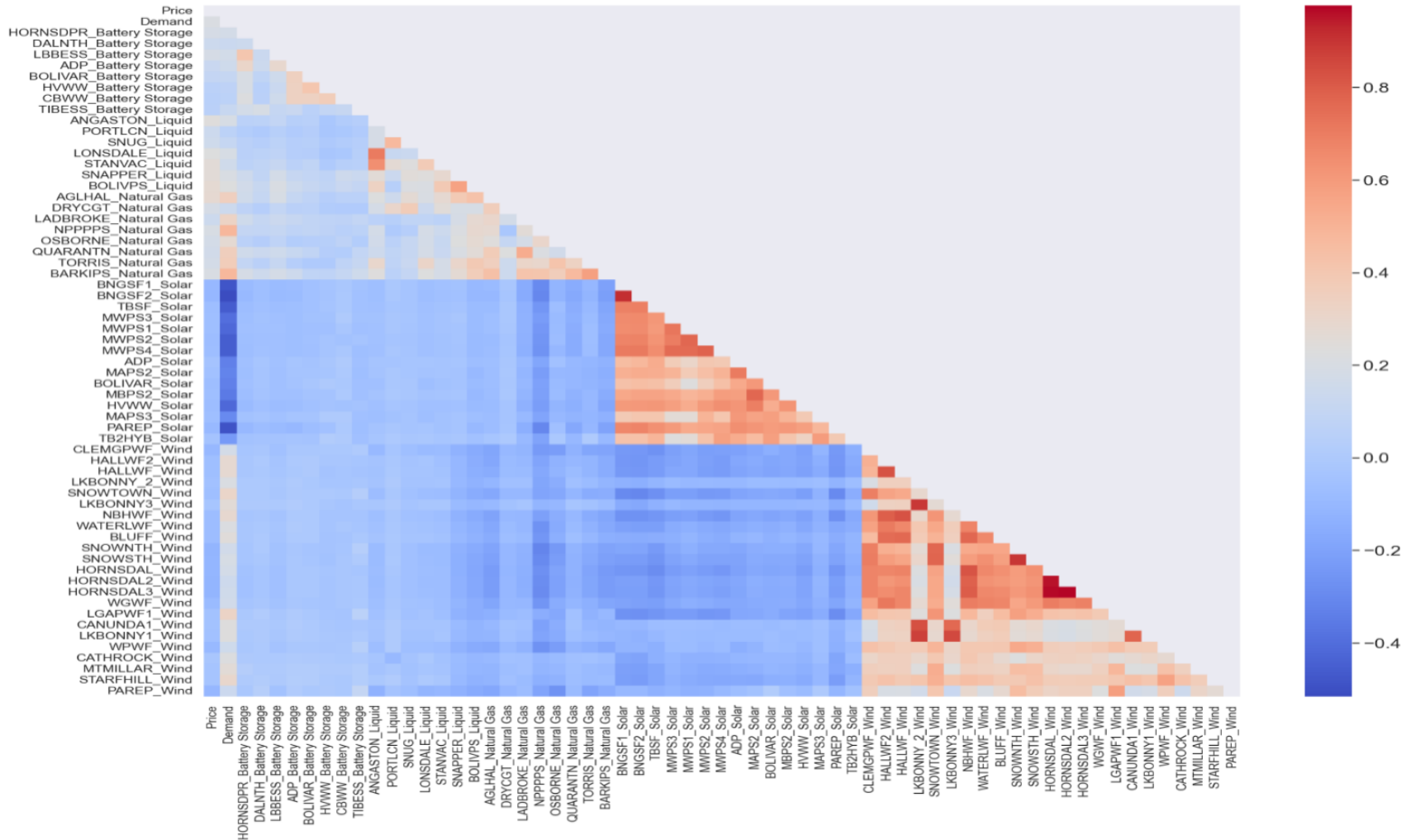
## The Australian National Electricity Market (cont.): Correlation between generators (NSW)







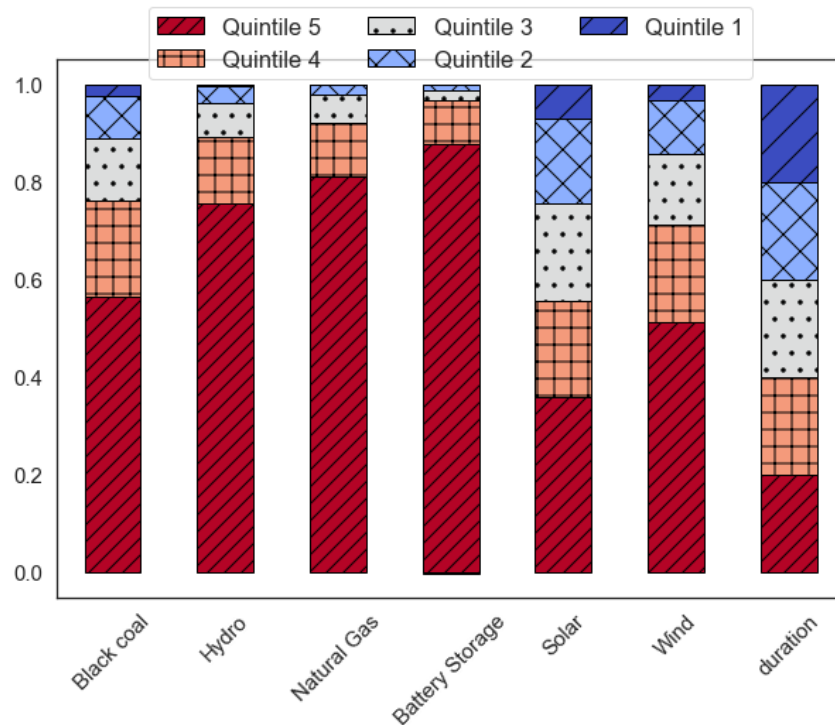
## The Australian National Electricity Market (cont.): Correlation between generators (SA)



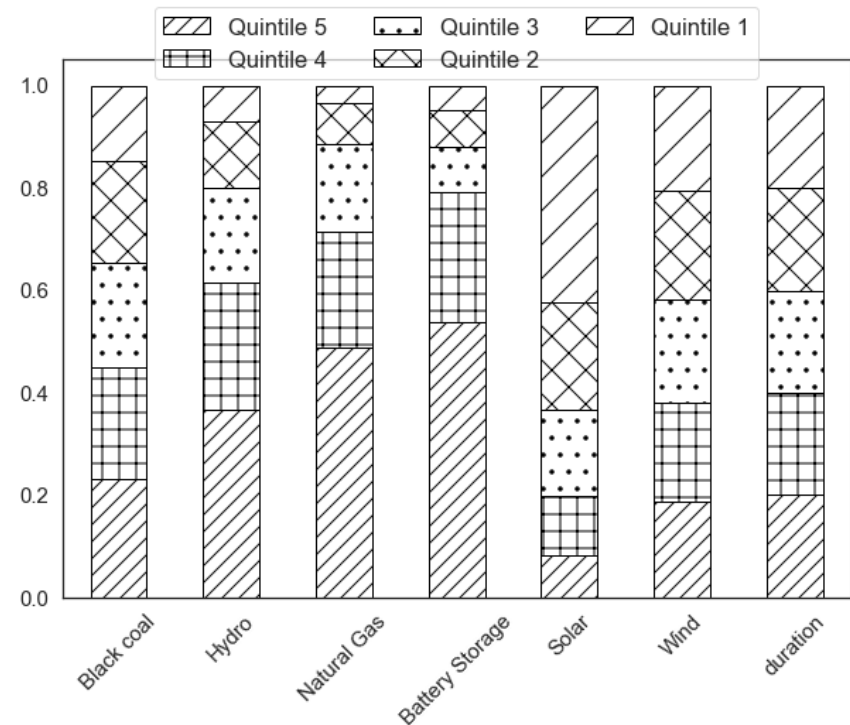
## The Australian National Electricity Market (cont.): Generation technologies – source of earning (NSW)

- Price quintiles: \$53.55 (Q1)    \$72.84 (Q2)    \$100.81 (Q3)    \$158.99 (Q4)  
\$16,600 (Q5)

(a) Earnings at different price levels



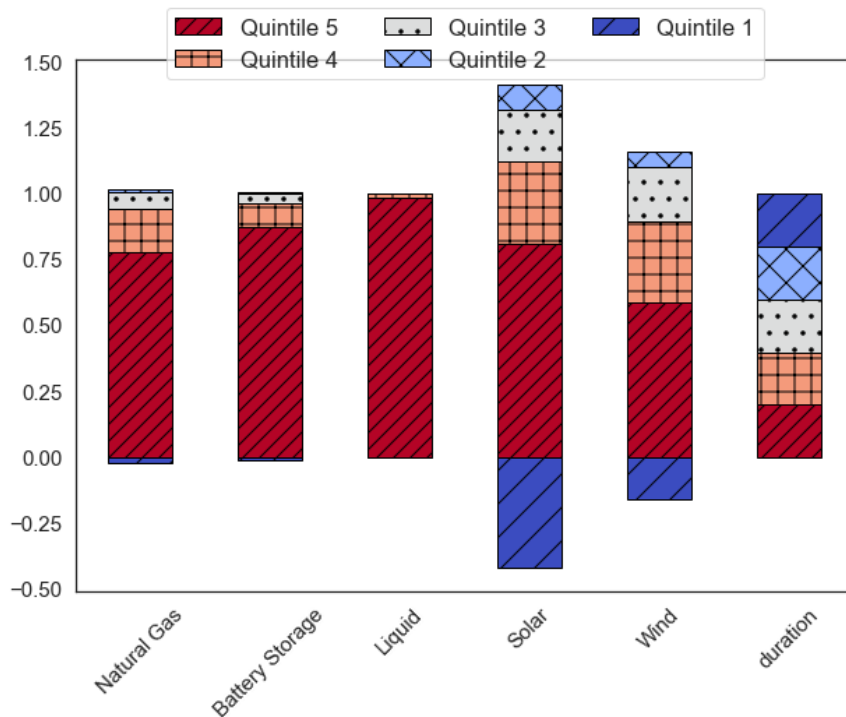
(b) Dispatch at different price levels



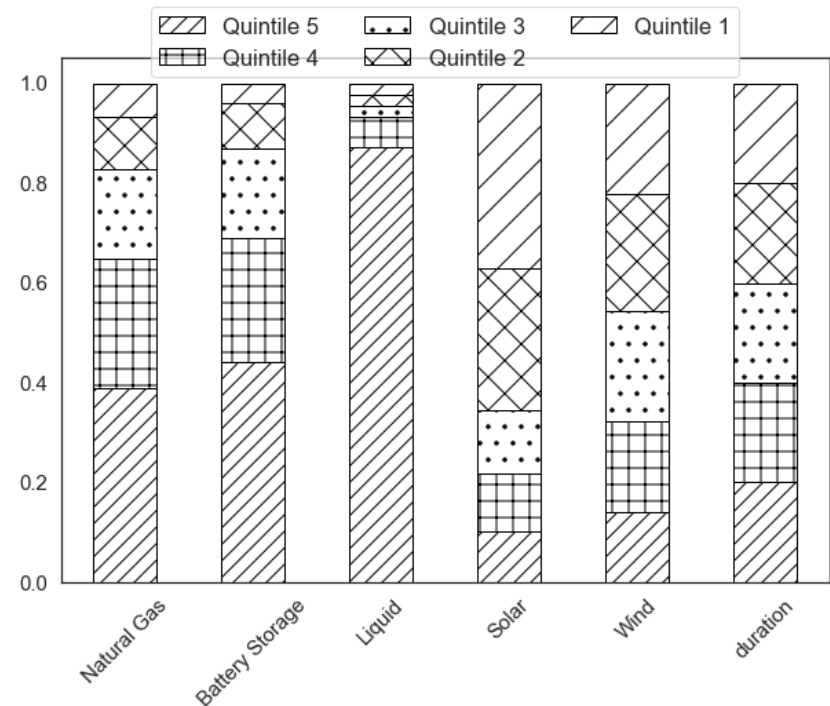
## The Australian National Electricity Market (cont.): Generation technologies – source of earning (SA)

- Price quintiles: -\$7.11 (Q1)    \$47.04 (Q2)    \$92.44 (Q3)    \$168.51 (Q4)  
\$16,600 (Q5)

(a) Earnings at different price levels



(b) Dispatch at different price levels



# Related Literature

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1. NPV, IRR and LCOE estimates for energy investment evaluation
  - Different risk factors are simulated
  - Policy uncertainty (Williges et al. , 2010; Yang et al., 2010; Kitzing, 2014; Kitzing and Weber, 2014; Gatzert and Vogl, 2016)
  - Geographies, weather factors (Kaldellis and Gavras, 2000; Montes and Martín, 2007; Cutler et al., 2011; Biggins et al., 2023)
2. Optimising a portfolio of energy plants (Muñoz et al., 2009; Westner and Madlener, 2010; Arnesano et al., 2012; Lynch et al., 2013; Cucchiella et al., 2017; Zhang et al., 2018; Gallardo et al., 2020)
3. Market value of different types of power plants; impacts on market outcomes
  - Flexibility premium (Hirth, 2013, 2016; Hirth and Radebach, 2016; Eising et al., 2020; Prol et al., 2020; Rai and Nunn, 2020)
  - Cannibalization effect (Prol et al., 2020; Gonçalves and Menezes, 2022; Csereklyei et al., 2023; Reichenberg et al., 2023)

## Methodology - dispatch-weighted price (DWP)

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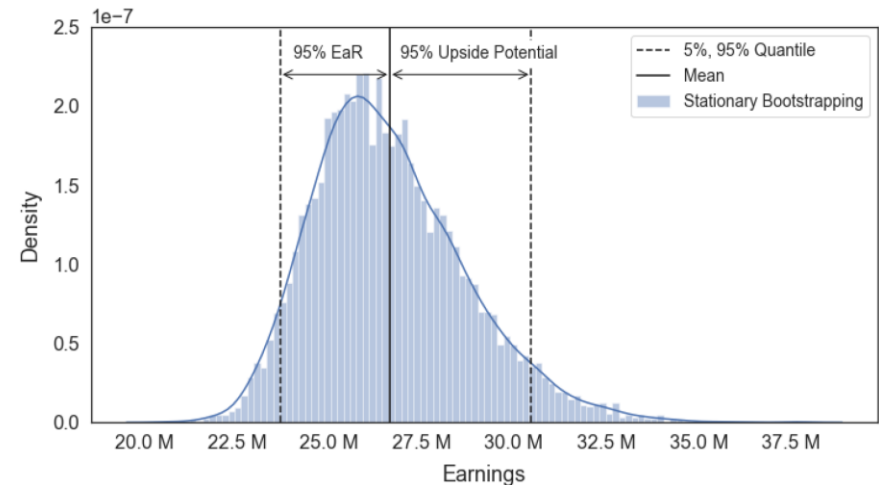
$$DWP_T^s = \frac{\sum_{t=1}^T P_t \times Q_t^s}{\sum_{t=1}^T Q_t^s}$$

- ❑  $DWP_T^s$  denotes the dispatch-weighted price for station  $s$  over time  $T$
- ❑  $P_t$  denotes the regional spot price at time  $t$
- ❑  $Q_t^s$  denotes the dispatched load of station  $s$  at time  $t$

## Methodology - EaR and Upside Potential

$$EaR_T^s = \frac{\mathbb{E}(E_T^s) - q_\alpha^s}{\mathbb{E}(E_T^s)}$$

$$Upside\ Potential_T^s = \frac{q_{1-\alpha}^s - \mathbb{E}(E_T^s)}{\mathbb{E}(E_T^s)}$$



- ❑  $EaR_T^s$  denotes the earning-at-risk for station  $s$  over time  $T$
- ❑  $E_t$  denotes the earnings of station  $s$  over time  $T$
- ❑  $q_\alpha^s$  and  $q_{1-\alpha}^s$  denote the quantiles corresponding to the selected confidence level  $(1 - \alpha)$
- ❑ A stationary bootstrap procedure (Politis and White, 2004; Patton et al., 2009) is applied to simulate the price-load pair

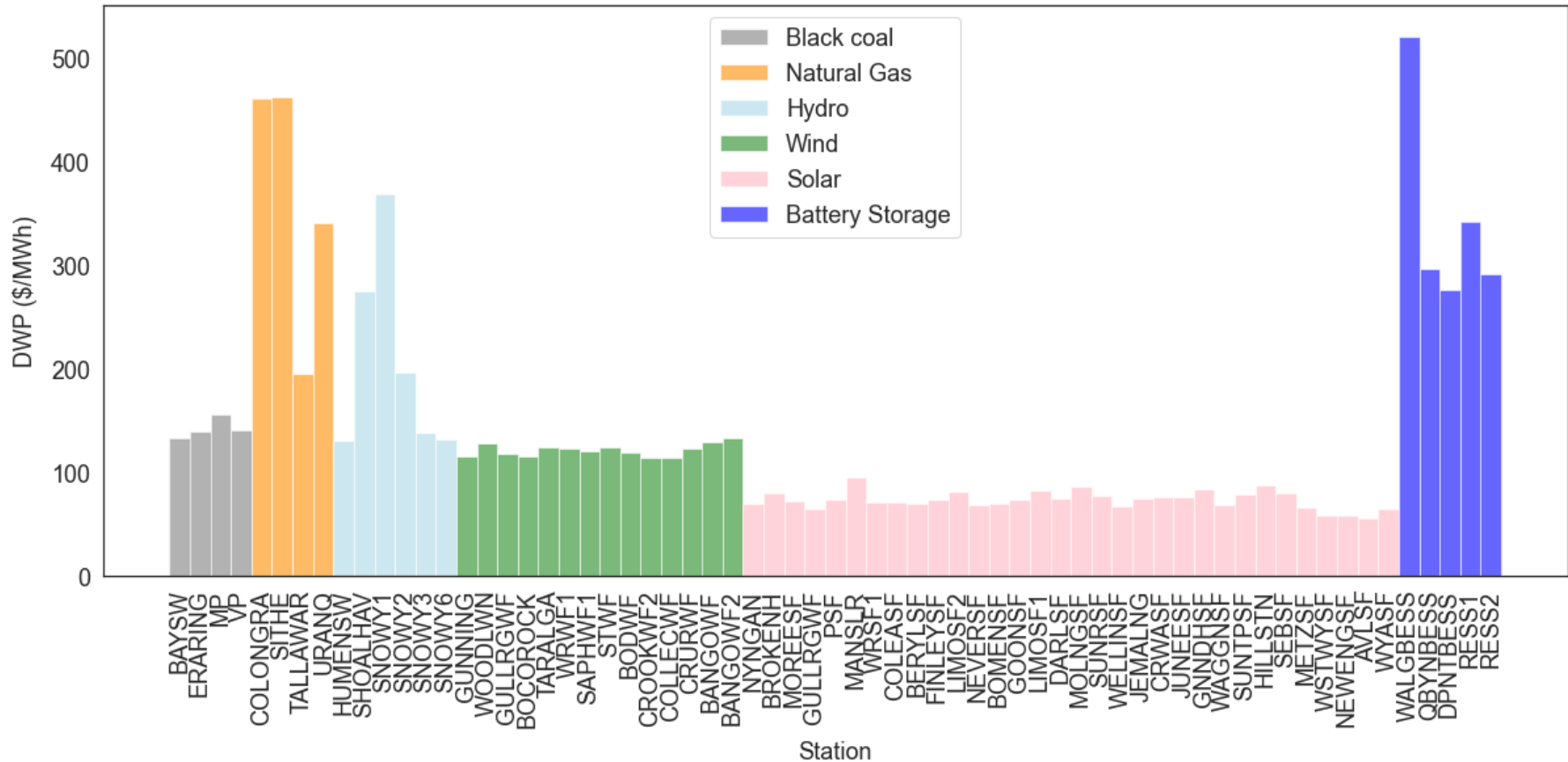
# The Data

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- Intra-day spot prices and dispatched load by station
  - Frequency: 5-Minute
  - Markets: NSW and SA
  - 126 Stations: 65 in NSW and 61 in SA
  - Time period: 01/07/2021 – 30/06/2024
  - Data source: Australian Energy Market Operator (AEMO)
  - We simulate full-year, spring, summer, autumn and winter DWPs and earnings for each station



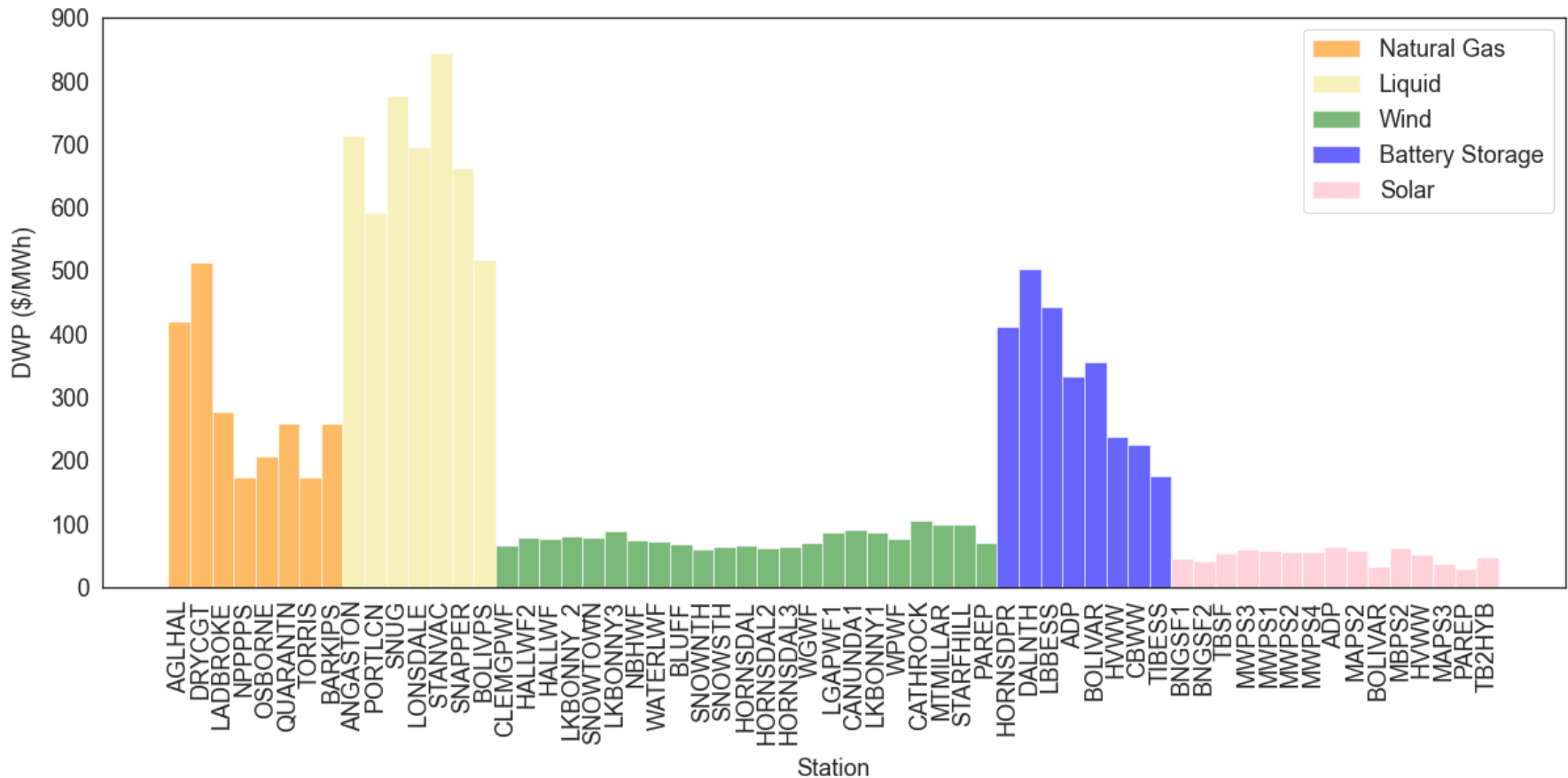
## Empirical results: Actual DWPs for stations in NSW





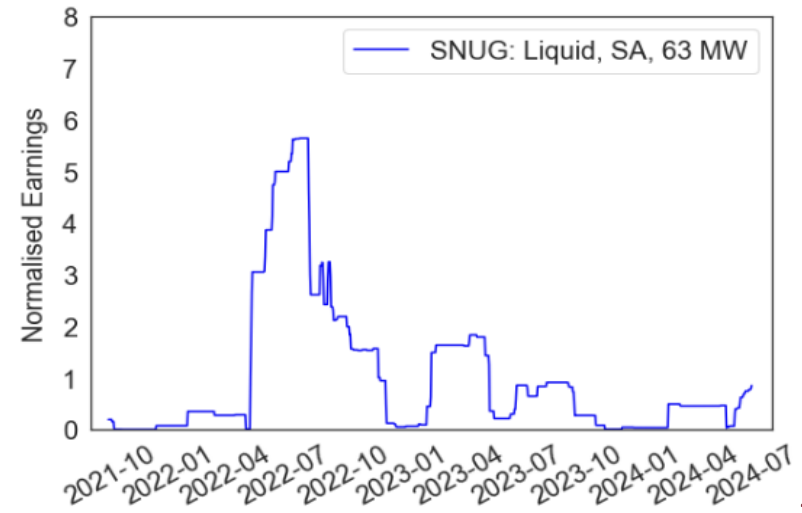
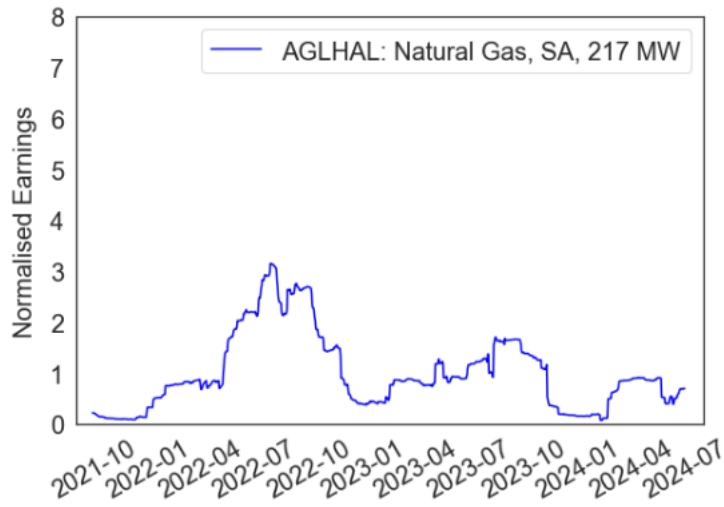
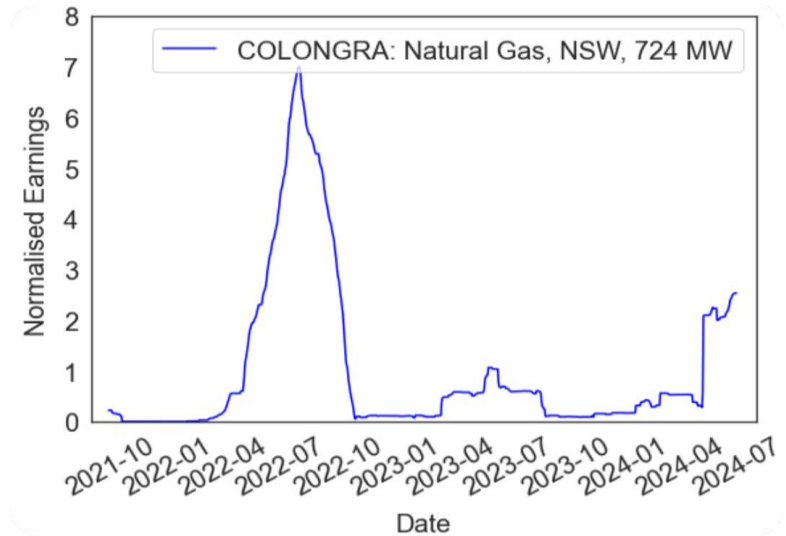
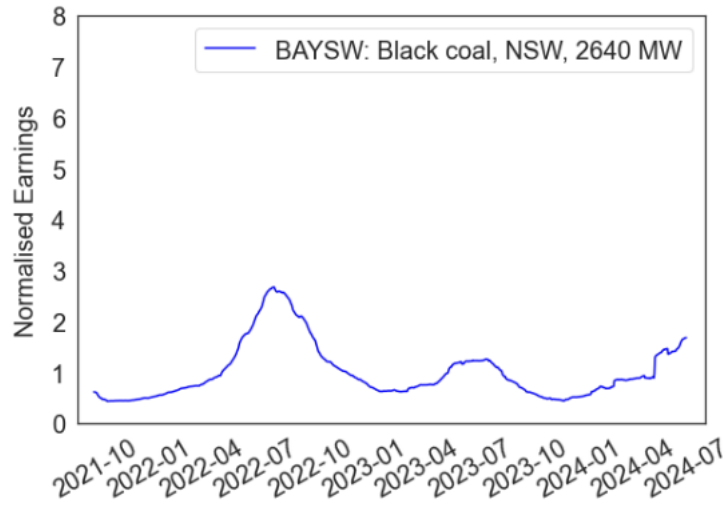


## Empirical results (cont.): Actual DWPs for stations in SA



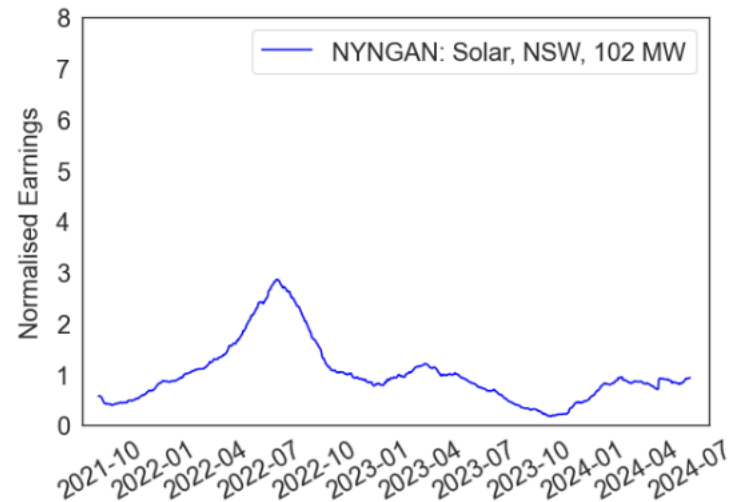
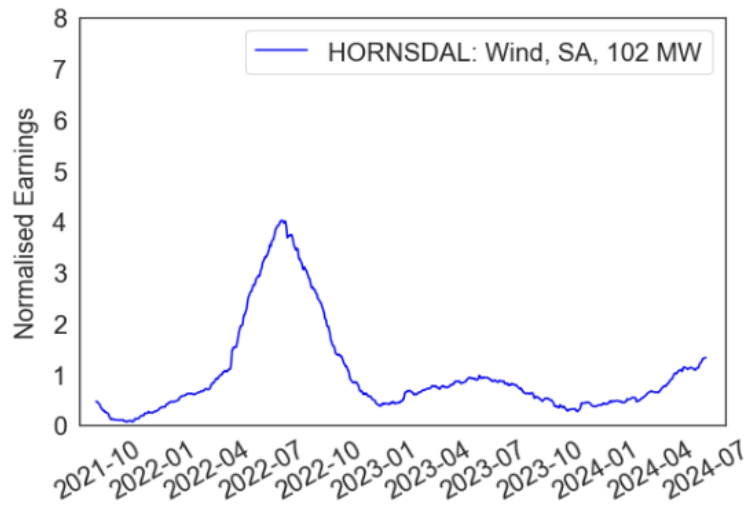
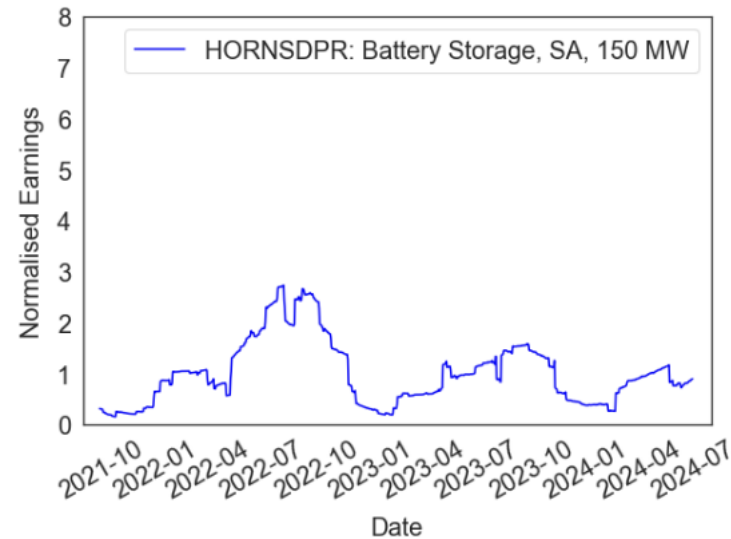
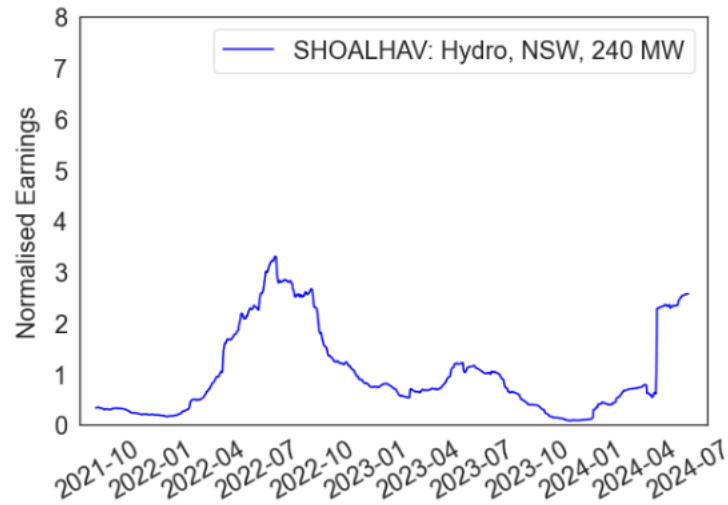


## Empirical results (cont.): Earnings of single stations (3-month rolling)



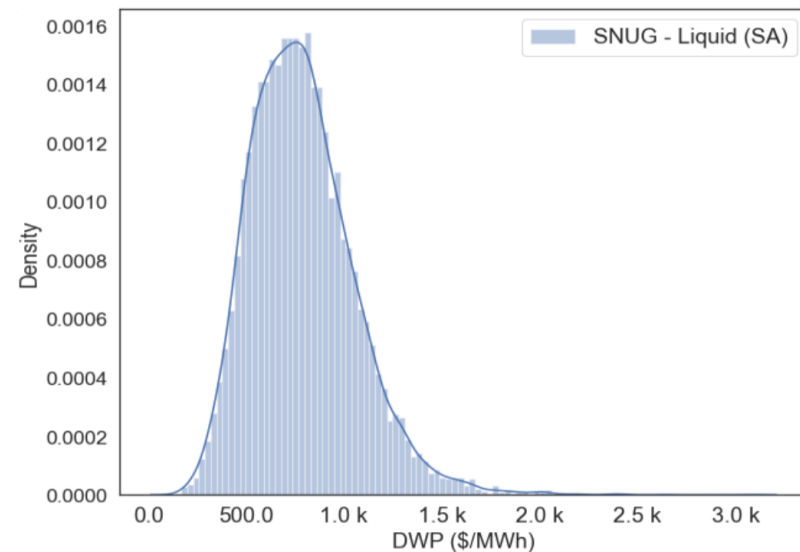
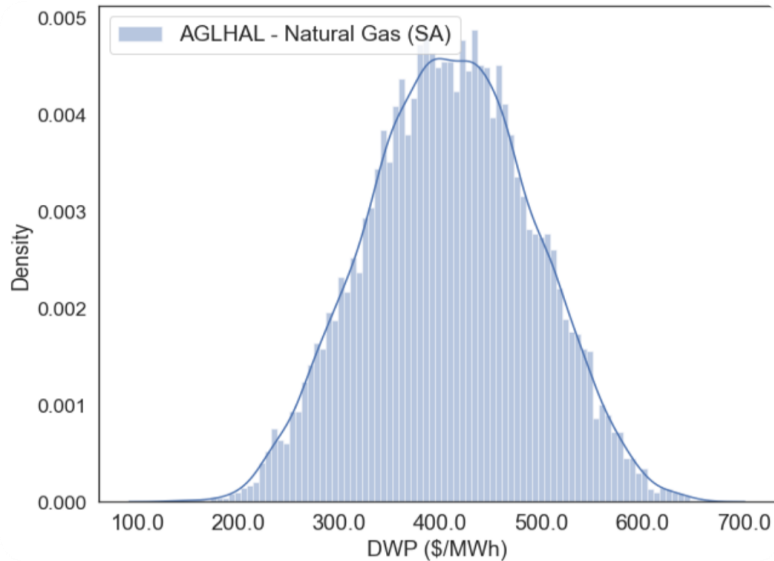
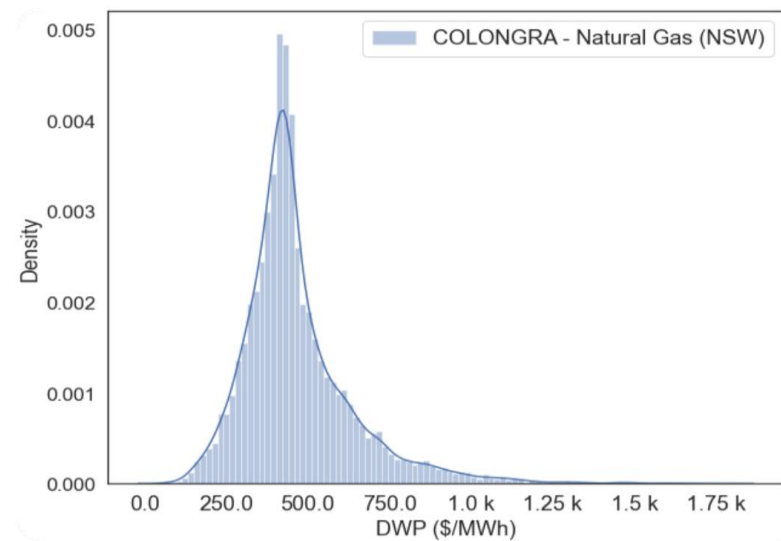
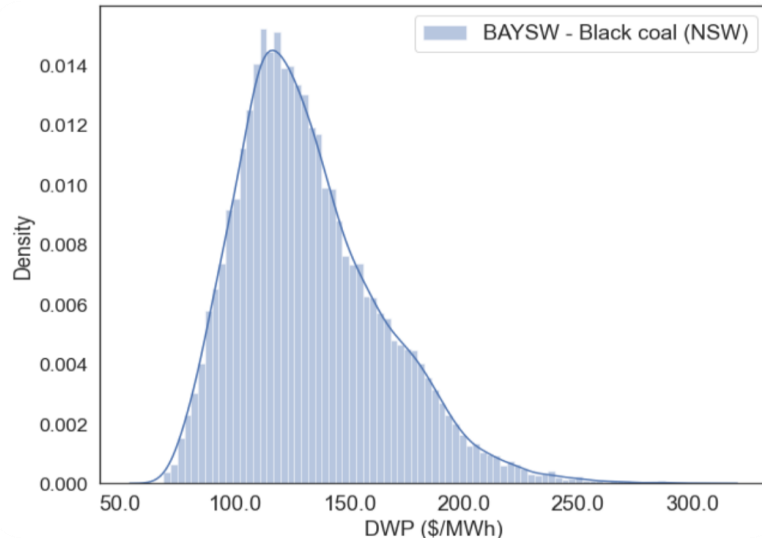


## Empirical results (cont.): Earnings of single stations (3-month rolling)



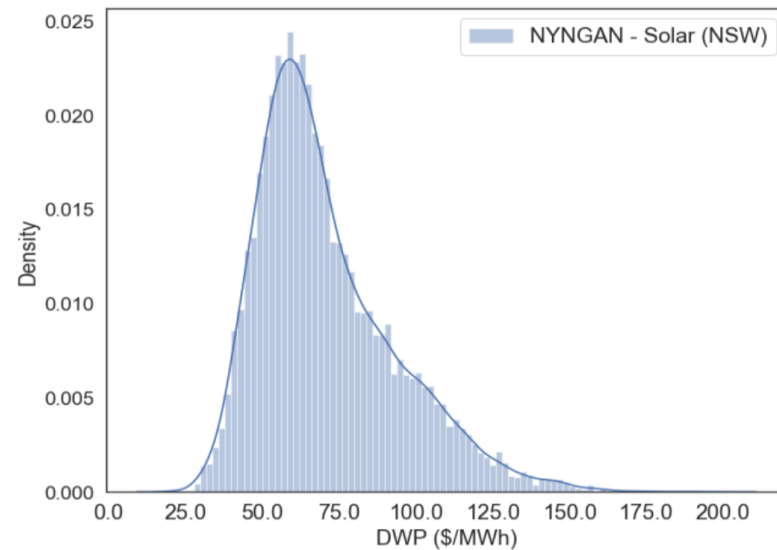
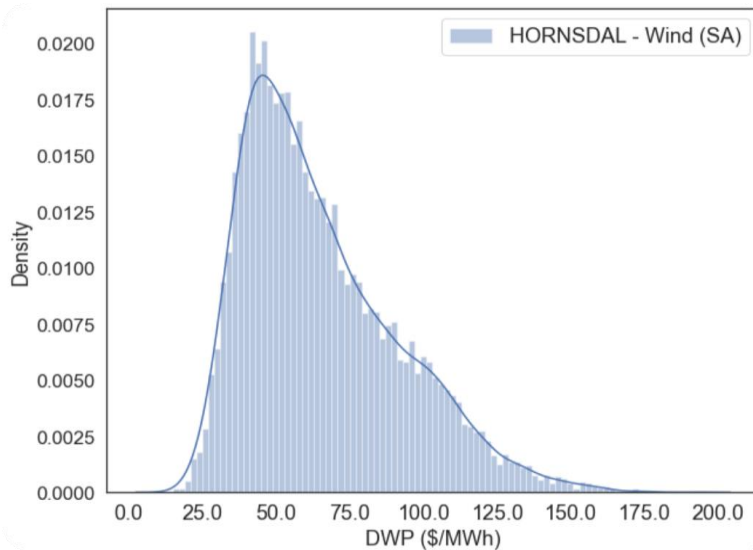
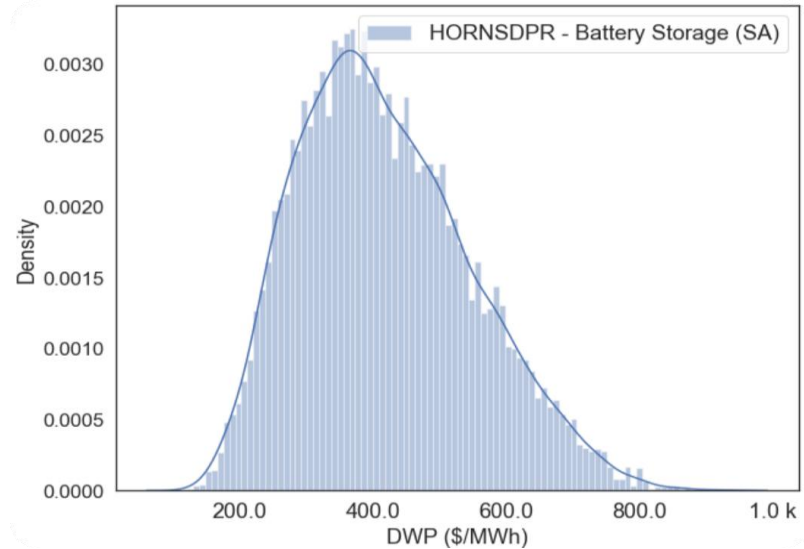
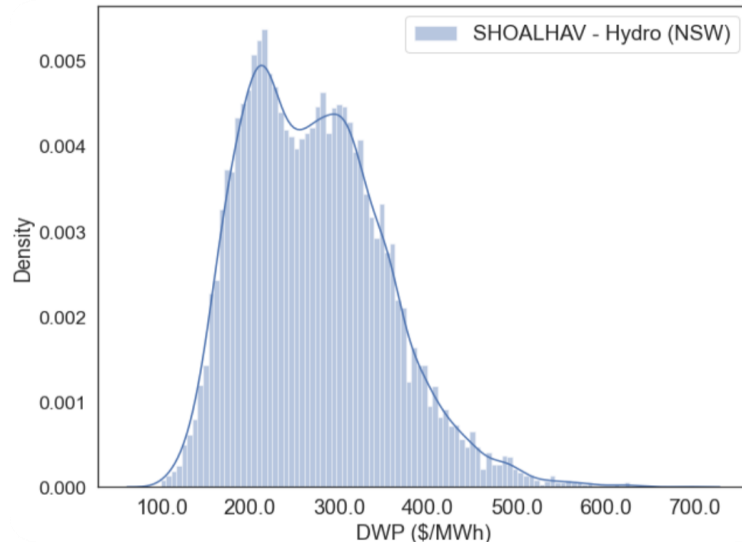


## Empirical results (cont.): Simulated 1-year DWPs for stations





## Empirical results (cont.): Simulated 1-year DWPs for stations



## Empirical results (cont.): Distributional properties of simulated DWPs - NSW

Technology	Mean	Std.	Skew.	Kurt.	Coefficient of variation	Quartile Coefficient of Dispersion
Solar	<b>73.12</b>	18.09	0.865	1.174	0.244	0.1559
Wind	<b>121.03</b>	36.53	0.8854	0.3526	0.3025	0.2134
Black coal	<b>141.91</b>	36.82	0.8529	0.4563	0.2590	0.1777
Hydro	<b>205.15</b>	65.08	0.8161	0.4807	0.3203	0.2315
Battery	<b>332.71</b>	71.75	0.4348	0.0032	0.2123	0.1600
Natural Gas	<b>360.33</b>	112.69	0.9511	1.9415	0.3023	0.1949

1: Coefficient of variation (CV) (Everitt and Skron dal, 2002) is a measure of relative standard deviation which is defined as the ratio of standard deviation to the mean. It reflects the variability of data in relation to the mean value.

2: Quartile Coefficient of Dispersion (Bonett, 2006) measures the dispersion of a distribution using quartiles. It provides similar information to CV and is calculated as  $\frac{Q_3 - Q_1}{Q_3 + Q_1}$ , where  $Q_1, Q_3$  are the first and third quartiles.

## Empirical results (cont.): Distributional properties of simulated DWPs - SA

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Technology	Mean	Std.	Skew.	Kurt.	Coefficient of variation	Quartile Coefficient of Dispersion
Solar	48.85	20.12	0.9071	1.1803	0.4168	0.2749
Wind	73.08	22.56	0.8013	0.3013	0.3136	0.2230
Natural Gas	278.6	67.03	0.3444	-0.2436	0.2508	0.1802
Battery Storage	349.22	118.08	1.5522	13.3377	0.3173	0.1903
Liquid	804.6	339.28	1.0116	1.4919	0.4156	0.2897

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## Empirical results (cont.):

### Simulated earnings, EaRs and upside potentials - NSW

Technology	Skew	Kurt	Coefficient of variation	Quartile Coefficient of Dispersion	99%EaR	95%EaR	95% upside potential	99% upside potential
<b>Solar</b>	0.2116	0.3517	0.0134	0.1455	42.09%	31.82%	37.40%	53.23%
<b>Wind</b>	0.3416	0.9498	0.6792	0.2353	49.88%	41.44%	64.57%	99.53%
<b>Black coal</b>	0.2869	0.8097	0.4553	0.1982	46.04%	37.50%	53.81%	81.58%
<b>Hydro</b>	0.372	0.9281	0.7688	0.2602	55.83%	46.31%	70.59%	107.19%
<b>Battery</b>	0.2558	0.7828	0.8179	0.1816	40.46%	33.74%	47.51%	74.06%
<b>Natural Gas</b>	0.4893	0.9927	0.9826	0.353	70.09%	59.86%	92.33%	144.90%





## Empirical results (cont.):

### Simulated earnings, EaRs and upside potentials - SA

Technology	Skew	Kurt	Coefficient of variation	Quartile Coefficient of Dispersion	99%EaR	95%EaR	95% upside potential	99% upside potential
<b>Solar</b>	0.3830	0.4825	0.0583	0.2694	71.68%	56.12%	69.00%	100.33%
<b>Wind</b>	0.3364	0.8976	0.5891	0.236	48.69%	40.62%	63.92%	96.90%
<b>Natural Gas</b>	0.3969	0.7578	0.457	0.2781	64.43%	53.18%	74.09%	110.99%
<b>Battery</b>	0.2467	0.5029	0.3087	0.1703	47.15%	36.67%	43.95%	65.29%
<b>Liquid</b>	0.5894	0.9781	0.9334	0.4277	76.68%	66.60%	111.13%	178.16%

# Conclusions

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- Flexible generators such as hydro, natural gas, and liquid stations
  - stronger correlation with spot prices
  - higher DWPs
  - higher upside potential of earnings but also high EaRs

## Conclusions (cont.)

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- VRE generations based on wind and solar
  - low DWPs and upside potential of earnings, low EaRs
  - increasing cannibalization effects: higher penetration reduces the value of their own generation
  - opportunity for the combination of VRE generations and other dispatchable renewable energy/storage facility to achieve overall higher market value
- Coal generation
  - low DWPs and upside potential of earnings, low EaRs
  - Additional cheaper renewable generators entering the market could further reduce their profitability



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**Thank you!**