

# How does Rooftop Solar Penetration Affect Generator Efficiency and Market Power?

Gordon Leslie<sup>1</sup> and Akshaya Jha<sup>2</sup>

<sup>1</sup>Monash University, <sup>2</sup>Carnegie Mellon University

29 May 2019

*NBER Economics of Electricity Markets and Regulation Workshop*

# Solar panel penetration has been linked to higher electricity prices

- Retail electricity prices
  - Recovery of feed-in-tariffs and subsidies (ACCC 2018; Nelson et al. 2011)
  - Distribution network upgrades (Wolak 2018)
  - Pass-through of REC costs from Renewable Portfolio Standards (Greenstone et al. 2019)
- Wholesale electricity prices?
  - Lower prices in daylight hours, higher prices at sunrise/sunset? (Bushnell and Novan 2018)

## Objective + primary finding

This paper: How changing system demand patterns from mass-solar adoption are impacting **costs** and **competition** in wholesale electricity generation?

- Setting, Western Australia: Rooftop solar now covers  $\approx 25\%$  of daylight load
- Using estimates of generator costs and gross margins, we find that over the recent rooftop solar boom in WA:
  - Payments to thermal generators increased 3%
  - Fuel costs incurred by thermal generators decreased 9%
  - Gross margins to thermal generators increased 19%
- These changes driven by changing shape of daytime to sunset load patterns (Bushnell and Novan 2018)
- Results emphasize benefits of a multi-settlement market design

1 Introduction

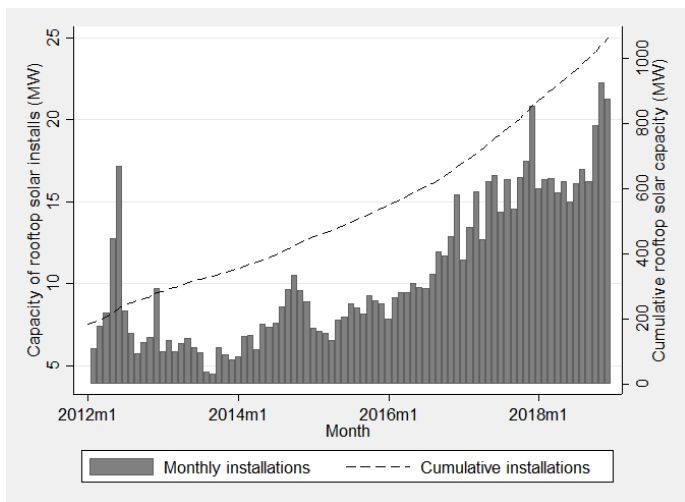
**2** Background and setting

3 Conceptual framework

4 Analysis

5 Conclusion

# The growth in rooftop solar: Western Australia



- >5-fold increase in rooftop solar capacity in 7 years
- Regularly covered 20-25% of daylight load in 2018

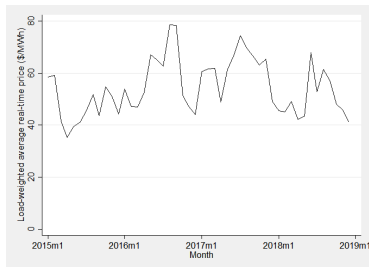
# What we can learn from the WA wholesale market (SWIS)

Since 2015:

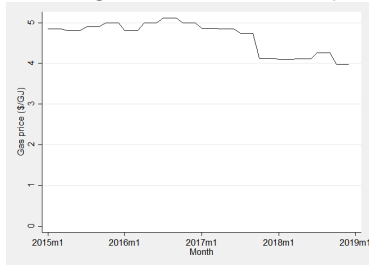
- Large rooftop solar penetration, utility-scale renewable capacity almost negligible
- No major entry / exit of thermal plants
- Aside from rooftop solar impact, system demand similar
- Uniform price market with no interconnections

⇒ Great conditions to study the impacts from mass rooftop solar adoption on wholesale market prices, costs and competition

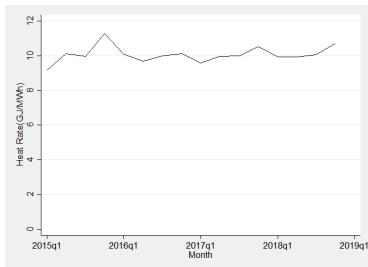
# Trends in electricity price, fuel prices and heat rates



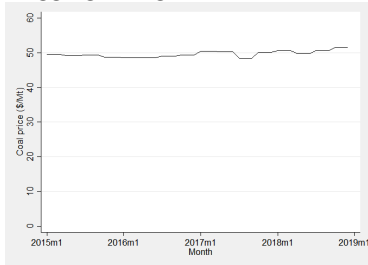
Load-weighted real-time elec. price



Gas prices



Aggregated gas-fleet heat rate



Coal prices

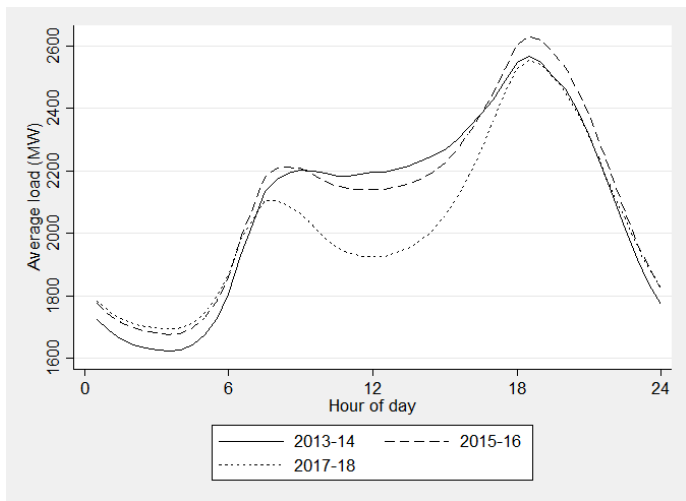
# Trends in electricity price, fuel prices and solar

January 2015 to December 2018:

- Wholesale electricity prices  $\uparrow$  6%
  - \$47.4/MWh to \$50.2/MWh Annual load-weighted average balancing market price
- Aggregate gas-fired generating fleet heat rate  $\uparrow$  1%
  - Calendar year 2015 versus 2018
- Natural Gas prices  $\downarrow$  17%
  - Natural gas accounts for  $\approx$  41% of system demand
- Coal prices  $\uparrow$  5%
  - Coal accounts for  $\approx$  50% of system demand
- Rooftop solar generating capacity  $\uparrow$  133%
  - 448 MW to 1,045 MW (from  $\approx$  10% of middle-of-day load to 20-25%)
- Why isn't the growth in rooftop solar adoption resulting in lower wholesale electricity prices?

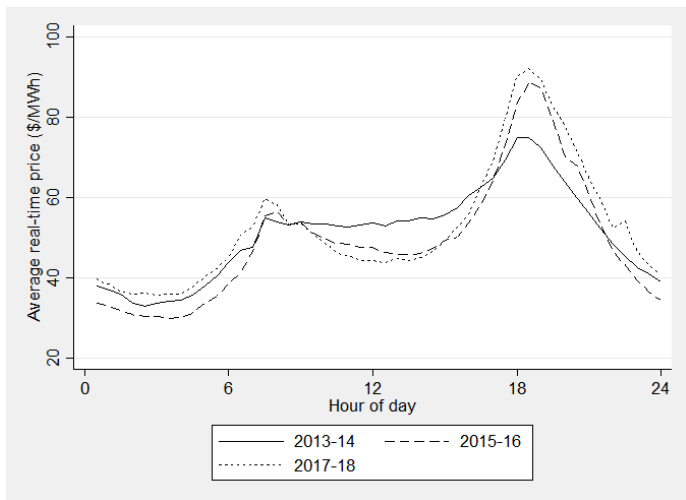


# Is it the “duck curve?” (or WA’s “black swan?”)



- System demand: Middle of day dip, but end of day ramp has increased

# Is it the “duck curve?” (or WA’s “black swan?”)



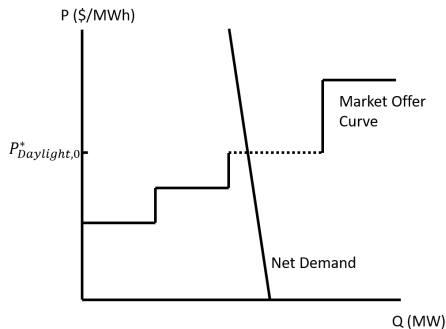
- Prices: Middle of day now cheaper, but sunrise / sunset more expensive

# Is it the “duck curve?” (or WA’s “black swan?”)

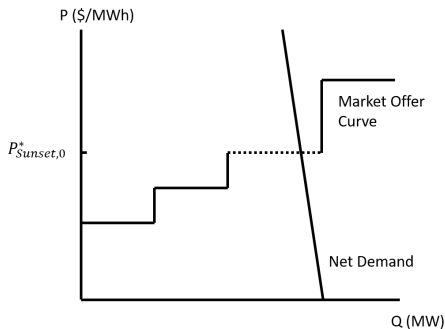
- Can envisage two reasons why mass rooftop solar adoption could result in higher wholesale prices:
  - 1 Costs: Base load generation (high start-up costs, low marginal costs) becomes less viable and is replaced by peaking generation (lower start-up costs, higher marginal costs)
  - 2 Competition: Less generating units are capable to ramp up for peaks. Those left operating face less competition and therefore might be able to exercise market power to capture more rents
- The analysis considers these two factors
  - Construct variable fuel cost and gross margin measures (BBW 2002); supply function semi-elasticity (McRae & Wolak 2014)
  - Study changes in these measures with the adoption of rooftop solar across hours of the day (Bushnell and Novan 2018)

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- 2 Background and setting
- 3 Conceptual framework**
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# Pre-solar penetration market outcomes



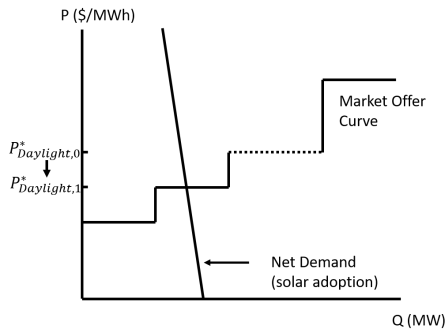
Daylight hours



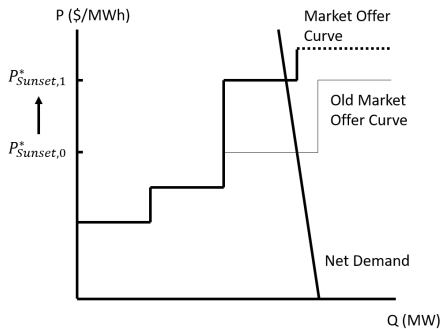
Sunset hours (daily demand peak)

- Third generator has start-up costs, recovers them over both intervals
- Same clearing price daylight and sunset

# Post-solar penetration market outcomes



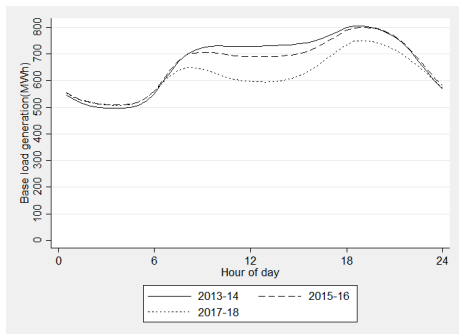
Daylight hours (r'top solar demand shift)



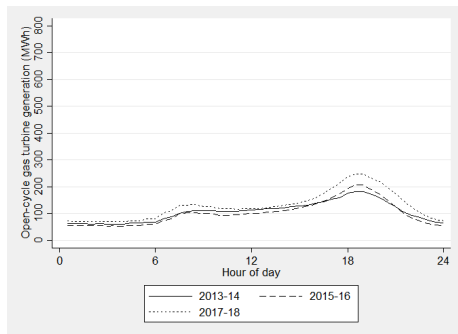
Sunset hours (daily demand peak)

- Third generator not running in daylight, increases bid price at sunset  
Observed behaviour
- Prices fall in daylight, rise in the evening

# Base load and peaker substitution



Coal + CCGT generation (base load)



OCGT generation (peakers)

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# Changes in costs and competition over time

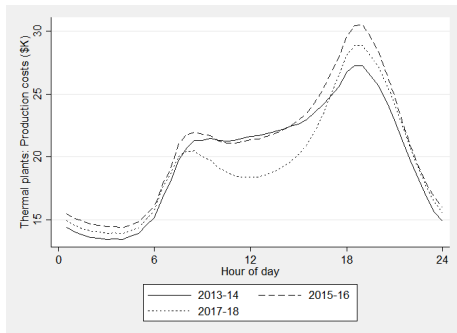
Similar to BBW (2002), examine changes in variable fuel costs and gross margins for thermal generators over time

- Variable fuel costs estimated using heat rate estimates, fuel costs and output
- Gross margins is the difference in total revenues (assuming real-time price applies to all output) and variable fuel costs

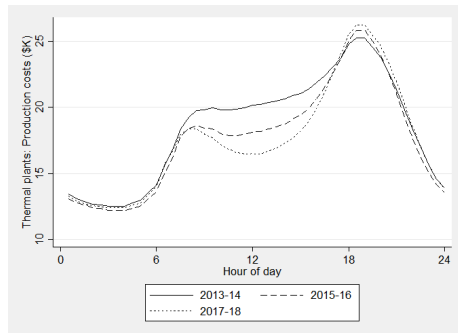
(Preliminary, but indicative)

- Half hour electricity market data, daily gas feeder data. Not utilising this gas data in the presented analysis
- Day-ahead prices not yet studied

# Variable fuel costs for fleet of thermal units



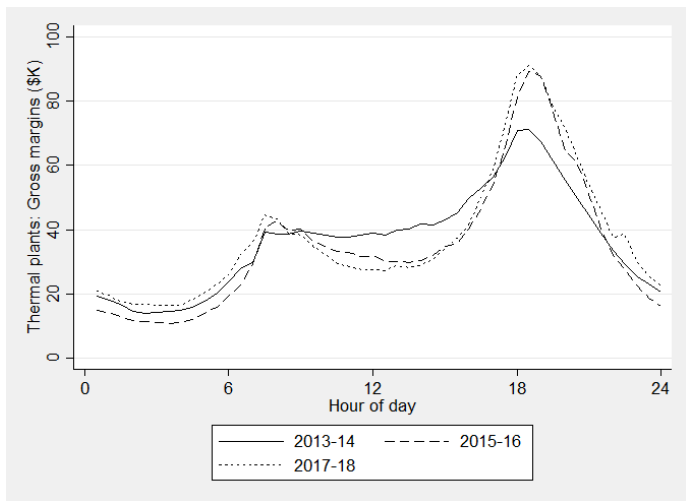
Average fuel costs for thermal fleet



Average fuel costs for thermal fleet,  
fixing fuel prices to 2013 levels

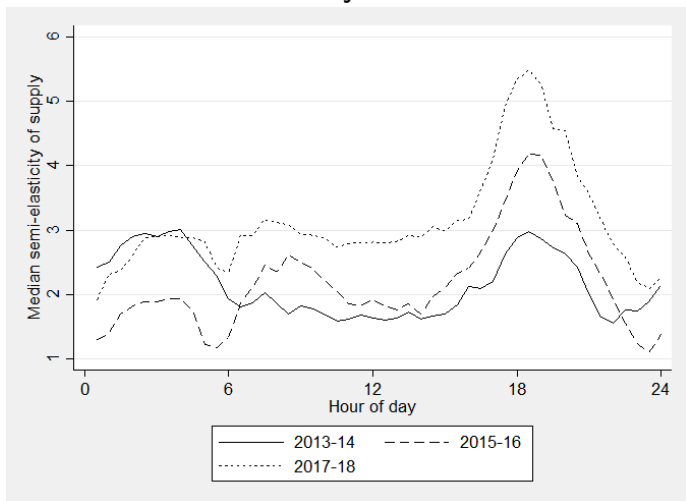
- Costs at sunset peak have risen over time (when holding fuel prices fixed)

## Gross margins for fleet of thermal units



- Profitability at sunset (and sunrise) is improving, daytime diminishing

## Supply function semi-elasticity



- Reports the median \$/MWh change from a 1% increase in net load
- Increased ability for firms to raise prices over time (esp. at sunset)

## Summary: Competition + costs over time

- Comparing 2015 to 2018, under the constant HR assumption for estimating costs and assuming that load pays the real-time price for all energy:
  - Total payments to thermal generators increased \$32m (3%)
  - Total fuel costs incurred by thermal generators decreased \$21m (-9%)
  - Total gross margins to thermal generators increased \$53m (19%)
    - Gross margins to coal increased \$9m (3%)
    - Gross margins to CCGT gas increased \$18m (290%)
    - Gross margins to OCGT gas increased \$26m (260%)
  - Peakers (but also inframarginal generators that operated) have profited from the diminished competition at sunset
  - Despite the cost-of-generation decrease, load / consumers have not received lower prices (and are unable to respond to new dynamics)

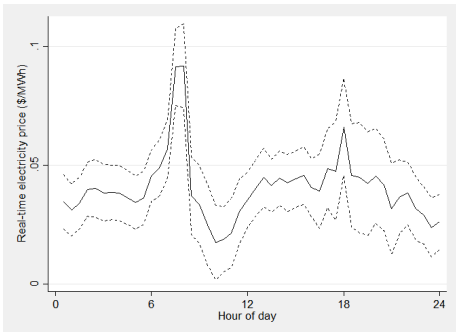
# Impact of rooftop solar growth on the wholesale market

For each half-hour of day sample, estimate  $\beta$ :

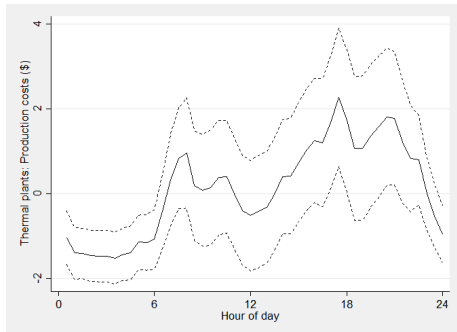
$$y_t = \alpha_{m(t)} + \beta.RSC_t + \theta.X_t + \epsilon_t \quad (1)$$

- $t$  indexes the day (with  $\alpha_{m(t)}$  a month-of-year fixed effect).
- $RSC_t$ : Rooftop solar capacity in MW
  - Not an output measure as in Bushnell and Novan
- Controls  $X_t$ : load, output from dispatchable thermal generating plants, coal prices and natural gas prices. [Summary Statistics](#)
- Static world with no start-up/ramping cost dynamics:  $\beta = 0$ .
- Reality:  $RSC$  can affect non-daylight outcomes via impact on shape of system demand throughout day.

# Predicted change in wholesale market outcomes per additional MW of rooftop solar capacity



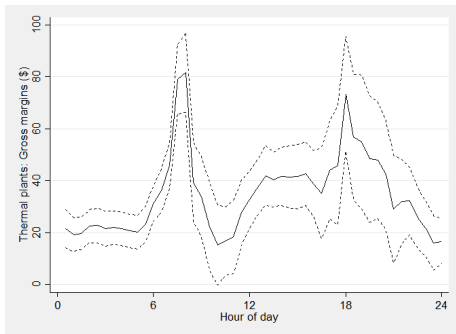
Real-time electricity price



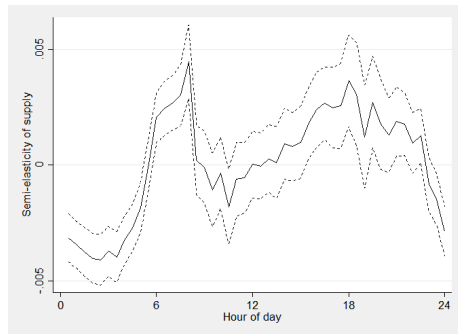
Average fuel costs for thermal fleet

- Prices: 100MW increase in RSC predicted to raise prices by \$6/MWh at sunset (average sunset load  $\approx$  2400MW)
- Fuel costs: Noisy, but sunset point estimate for 1MW  $\uparrow$  in RSC  $\approx$  substitution of 0.2MW CCGT to OCGT

# Predicted change in wholesale market outcomes per additional MW of rooftop solar capacity



Gross margins for thermal fleet

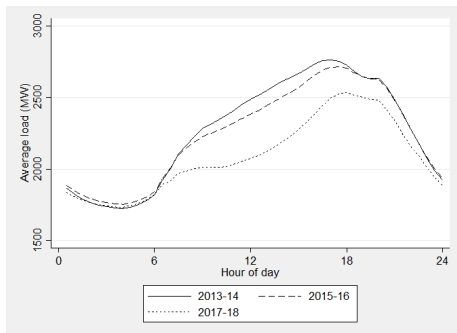


Semi-elasticity of the market supply curve

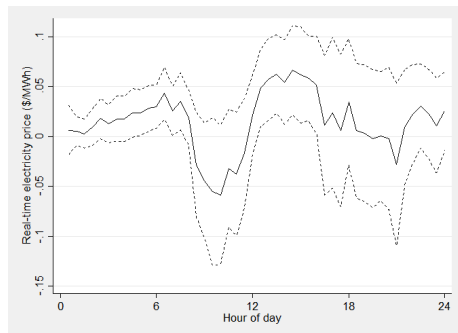
- Gross margins and slope of the supply curve most responsive to solar additions for sunrise and sunset hours



# Summer



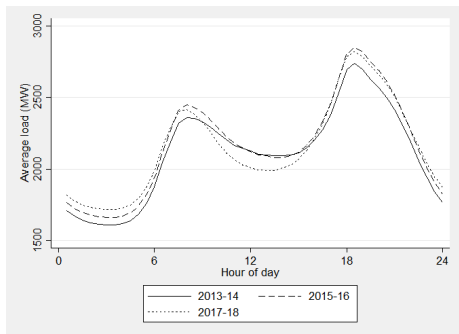
Average system demand by hour-of-day



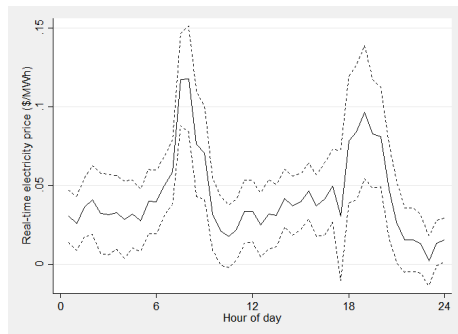
Predicted change in wholesale prices per additional MW of rooftop solar capacity

- Solar output is somewhat load-following: Demand and price peaks and troughs not exacerbated

# Winter



Average system demand by hour-of-day



Predicted change in wholesale prices per additional MW of rooftop solar capacity

- Solar output amplifies trough/peak in system demand and price

# Market design implications

- The impact of changing system demand (or generating behind the meter) is not isolated to the contemporaneous period
- Efficient market design will pay / charge participants based on the impact of their actions on as-bid total system cost across the day
  - Need day-ahead / multi-settlement market to do this (Australia's NEM, are you listening?)

# Conclusion (1)

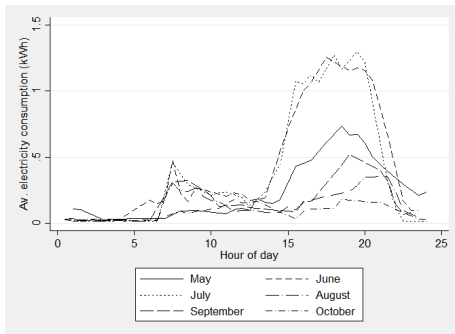
Alongside the WA rooftop solar boom:

- There has been an composition shift in generating technologies that output
- A decrease in middle-of-day fuel costs and an increase in sunset fuel costs has netted out to a 9% decrease in thermal fuel costs
- But thermal generators received a 3% increase in payments and 19% increase in gross margins
  - No price relief for non-solar owners
  - WA customers face a fixed retail price: No ability to self-manage within-day timing of consumption to respond to new wholesale conditions

## Conclusion (2)

### Implications:

- Wholesale market price dynamics will incentivise a transition toward more flexible technologies as solar penetration increases
  - The marginal value of solar installations is diminishing, and the marginal value of storage / peakers is increasing
  - Impact from solar tied to whether it attenuates or exacerbates the size of the trough to peak ramp
- Single settlement markets could unlock efficiency gains by moving to multi-settlement
- Currently, inframarginal units that remain operating are also benefiting



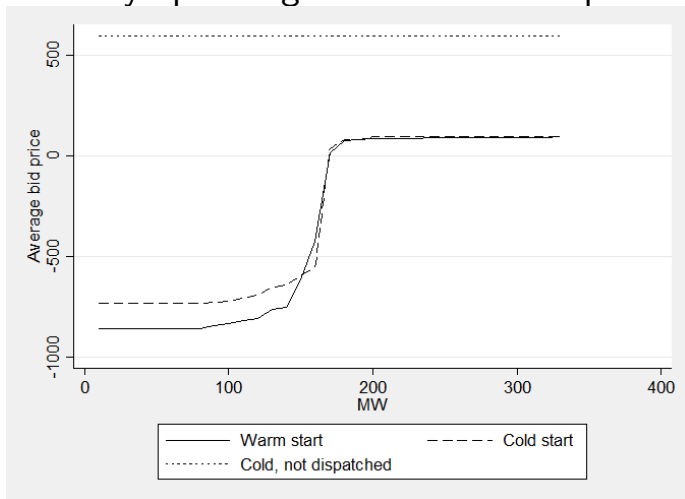
Does the Leslie household have a duck curve? Looks like they feel the cold in Winter...  
 (Wouldn't it be great if Victoria's smart meter data was available to researchers? Retailers sure don't utilise it)

`gordon.leslie@monash.edu`

`https://sites.google.com/site/gwleslie/`

# Bid functions by operating state for Neerabup OCGT

Back



- Mostly price ceiling bids if cold
- If warm (or wants to start) then large negative bid up to minimum operating capacity

# Summary Statistics [Back](#)

Variable	Hours-of-day	2015	2016	2017	2018
System demand (MWh)	All hours	1051	1063	1029	1004
	Day (9am-5pm)	1112	1099	1044	989
	S'set (5pm-9pm)	1254	1286	1241	1224
Thermal generation (MWh)	All hours	745	784	760	720
	Day (9am-5pm)	804	827	784	713
	S'set (5pm-9pm)	934	992	966	927
Wholesale price (\$/MWh) (unweighted)	All hours	44.13	54.10	58.41	46.84
	Day (9am-5pm)	47.38	52.54	57.81	41.39
	S'set (5pm-9pm)	65.30	87.24	90.16	71.80
Rooftop solar capacity (MW)		494	603	763	961
Coal price (\$/Mt)		1.68	1.67	1.70	1.73
Natural gas price (\$/GJ)		4.89	4.98	4.64	4.11
Number of observations	All hours	17520	17568	17520	17520