

# A partial-equilibrium model of the electricity market

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June 1, 2021

# Introduction I

## Background

- Variable Renewable Electricity (VRE) changes in response to wind and sun radiation
- 'Dispatchable' Supply (DS; e.g hydro) is more controllable
- The intermittence of VRE is detrimental to its economic value
- Electricity prices at times when the VREs are supplying power in large quantities, are essential

# Introduction II

## Purpose

- We analyze the above issues in (an original) microeconomic model
- It takes a middle ground between small ‘static’ models and large numerical models:
  - Provides a higher transparency than larger and more realistic models
  - Lays out more details about all sectors of the industry, not just the marginal conditions (in simpler models)

# Introduction III

## Our approach

- DS consists of a merit order, reflecting their different marginal costs
- VRE has lower marginal costs and is thus delivering first
- We analyze a large number of fictive equilibria numerically
- Use them to examine the welfare effects of the increasing share of VRE
- Focus on variability in VRE and demand (and the correlation between them)

# Electricity demand I

## Utility and constraint

- $I$  consumers use electricity over  $T$  hours
- Utility ('benefit') is a function of electricity consumption,  $x$ , and money for other goods,  $y$ .
- For individual  $i$  at time  $t$ :

$$F_i(x_{it}, y_{it}) = \theta_{it} u_i(x_{it} - \gamma_{it}) + \mu_i y_{it}.$$

The function  $u_i$  is strictly concave, with  $\lim_{x_{it} \rightarrow \gamma_{it}} u_i' = \infty$ .

- The **subsistence consumption level of electricity** is  $\gamma_{it}$
- ( $\mu_i = \theta_{it} = 1$  from here???????)

# Electricity demand II

## Utility and constraint (cont'd)

- Summing over all the  $T = 8760$  hours of a year:

$$U_i = \sum_{t=1}^T [\theta_{it} u_i(x_{it} - \gamma_{it}) + \mu_i y_{it}]. \quad (1)$$

- Consumer  $i$  has the budget constraint

$$\sum_{t=1}^T p_t x_{it} + \sum_{t=1}^T y_{it} = m_i,$$

where  $p_t$  is the price of electricity and  $m_i$  is the income

## Electricity demand III

### Optimal demand

- The Lagrangean of individual  $i$

$$\mathcal{L}_i = \sum_{t=1}^T (\theta_{it} u_i(x_{it} - \gamma_{it}) + \mu_i y_{it})$$

$$- \lambda_i \left( \sum_{t=1}^T p_t x_{it} + \sum_{t=1}^T y_{it} - m_i \right)$$

- An optimal solution satisfies

$$\theta_{it} u'_i(x_{it} - \gamma_{it}) = \mu_i p_t, \quad t = 1, 2, \dots, T.$$

## Electricity demand IV

### Optimal demand (cont'd)

- Solve for the demand function

$$x_{it} = d_i (\mu_i p_t / \theta_{it}) + \gamma_{it}, \quad (2)$$

where we define  $d_i = (u')^{-1}$ , with  $d'_i < 0$ .

- Demand is low if its price is high or if the marginal utility of money for other goods is high
- A high  $\theta_{it}$  implies a higher electricity consumption
- Consumption is positive even if  $p \rightarrow \infty$ , because  $\gamma_{it} > 0$  is always necessary



# Electricity demand V

## Market demand

- Market demand at time  $t$  is the sum of the demands from all consumers:

$$D_t = \sum_{i=1}^I x_{it} = \sum_{i=1}^I d_i (\mu_i p_t / \theta_{it}) + \gamma_t,$$

where  $\gamma_t \equiv \sum_{i=1}^I \gamma_{it}$  is the total amount of subsistence consumption at time  $t$ .

- Note that  $\gamma_t$  appears as a simple additive term. It is a central stochastic variable

## Electricity demand VI

### Specification of utility function

- We will use the utility function

$$u_i(x_{it} - \gamma_{it}) = \frac{(x_{it} - \gamma_{it})^{1 - \frac{1}{\alpha}} - 1}{1 - \frac{1}{\alpha}} \quad (3)$$

- Thus

$$u'_i(x_{it} - \gamma_{it}) = (x_{it} - \gamma_{it})^{-\frac{1}{\alpha}}$$

and the demand function (2) becomes

$$x_{it} = \left( \frac{\theta_{it}}{\mu_i p_t} \right)^\alpha + \gamma_{it}. \quad (4)$$

## Electricity demand VII

### Specification of utility function (cont'd)

- Now market demand is

$$D_t = p_t^{-\alpha} \sum_{i=1}^I \left( \frac{\theta_{it}}{\mu_i} \right)^\alpha + \gamma_t. \quad (5)$$

- Inverse market demand:

$$p_t = \left( \frac{\sum_{i=1}^I (\theta_{it}/\mu_i)^\alpha}{D_t - \gamma_t} \right)^{\frac{1}{\alpha}}. \quad (6)$$

# Electricity supply I

## Dispatchable supply (DS)

- DS is described by 'stair cases' indicating different marginal costs
- Baseload ( $b$ ), intermediate ( $i$ ) and peak ( $p$ ) generators ('hydro', 'nuclear' and 'thermic')
- We assume perfect competition, ignoring market power considerations
- Marginal costs:  $c_b$ ,  $c_i$  and  $c_p$  (\$/MWh).

# Electricity supply II

## VRE supply

- Supply of VRE:  $V_t$  (MWh)  
A (stochastic) function of 'weather'
- Mean output:  $\bar{V}$  (MW)
- We focus on the market impact of the variability in  $V_t$  and  $\gamma_t$ ,  
and the correlation between them,  $\rho$
- Marginal cost is typically very low.  
We put it equal to zero

# Equilibrium I

## Quantities and Prices

- We define

$$\tilde{D}_t(p_t) = p_t^{-\alpha} \sum_{i=1}^I \left( \frac{\theta_{it}}{\mu_i} \right)^\alpha,$$

so that

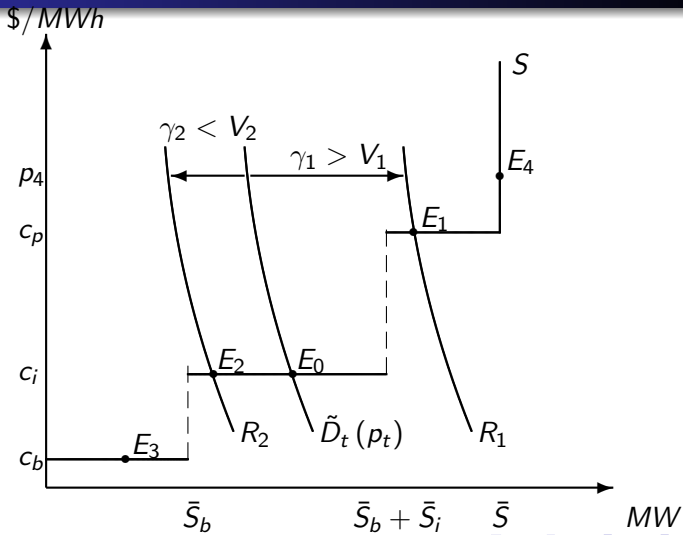
$$D_t = \tilde{D}_t(p_t) + \gamma_t$$

- **Residual demand** is  $R_t = D_t - V_t$ , or

$$R_t = \tilde{D}_t + \gamma_t - V_t.$$

This part of demand is directed toward the dispatchable supply

# Equilibrium II



## Equilibrium III

### Quantities and Prices (cont'd)

- In the Figure above the  $\tilde{D}_t(p_t)$  curve stays put
- It coincides with  $R_t$  if  $\gamma_t = V_t$ , leading to  $E_0$
- Deviations from  $\tilde{D}_t$  are determined by  $\gamma_t - V_t$ , which varies (stochastically) by the hour
- For  $\gamma_1 > V_1$ :  $R_1 > \tilde{D}_t \Rightarrow E_1$
- For  $\gamma_2 < V_2$ :  $R_2 < \tilde{D}_t \Rightarrow E_2$ .
- For an even higher  $V_t$ :  $E_3$ .  
A high  $V_t$  pushes  $p$  down ('self-cannibalism')
- Alternatively, equilibrium at a vertical segment of the supply curve, e.g.  $E_4$



## Equilibrium IV

### Value factors

- A value factor consists of two price 'indexes':
  - 1 The average electricity price:

$$\bar{p} = \frac{\sum_{t=1}^T p_t}{T},$$

- 2 The average revenue of VRE

$$p^V = \frac{\sum_{t=1}^T p_t V_t}{\sum_{t=1}^T V_t}.$$

# Equilibrium V

## Value factors (cont'd)

- The VRE *value factor* is then

$$v^V = \frac{p^V}{\bar{p}}.$$

It is high if VRE produces much when  $p$  is high

- It is beneficial for  $V_t$  to be positively correlated with  $\gamma_t$
- Otherwise, it often shifts the equilibrium down the merit-order curve and thereby lowers the price and its own 'value'.

## Equilibrium VI

### Value factors (cont'd)

- A common conjecture in the literature:  
 $v^V$  falls monotonically with higher VRE penetration ( $\bar{V} \uparrow$ )
- We get a cyclical pattern
- This is because  $v^V$  is an indicator of relative prices:  
as  $p$  declines (due to  $\bar{V} \uparrow$ ),  $p^V$  and  $\bar{p}$  follow each other downwards, although not perfectly because of the stairs and  $\rho$

## Equilibrium VII

### Producer surplus

- Producer surplus:

$$PS = \text{Revenue} - \text{Variable Costs}$$

- Profit:

$$\pi = PS - \text{Fixed Costs}$$

- With zero marginal (variable) cost, the producer surplus of the VRE producers at time  $t$  is  $p_t V_t$ .
- To see profitability, we compare PS with (hypothetical) annualized fixed costs

## Equilibrium VIII

### Indirect utility

- As VRE lowers the price, it increase indirect utility

$$U = \sum_{i=1}^I U_i = \sum_{i=1}^I \mu_i m_i + \frac{\alpha}{1-\alpha} \sum_{i=1}^I \sum_{t=1}^T \theta_{it}$$

$$- \frac{1}{1-\alpha} \sum_{i=1}^I \sum_{t=1}^T \mu_i^{1-\alpha} \theta_{it}^{\alpha} p_t^{1-\alpha} - \sum_{i=1}^I \sum_{t=1}^T \mu_i p_t^{\gamma} \theta_{it}$$

# Numerical simulations I

- For one simulation round we draw 8760 observations (one for each hour of a year) of  $V_t$  and  $\gamma_t$  from a jointly normal probability distribution
- One equilibrium point from each draw
- From that we compute (yearly)  $v^V$ , PS and CS
- This is repeated in 101 rounds, with different  $\rho$  and  $\bar{V}$
- Then  $v^V$ , PS and CS are compared between the rounds, to see the effects of changing  $\rho$  and  $\bar{V}$

## Numerical simulations II

### Basic example

- Dispatchable supply curve (benchmark):  
 $c_b = 10$ ,  $c_i = 20$ ,  $c_p = 30$ ,  
 $\bar{S}_b = 20$ ,  $\bar{S}_i = 20$  and  $\bar{S}_p = 40$ .
- Assume that  $\mu_i = \theta_{it} = 1$ ,  $I = 60$  and  $\alpha = 0.06$
- The default values of  $\sigma_V$  and  $\sigma_\gamma$  are both equal to 5.

## Numerical simulations III

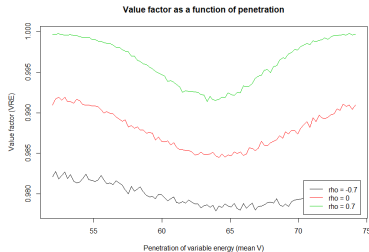
### Basic example (cont'd)

Four cases:

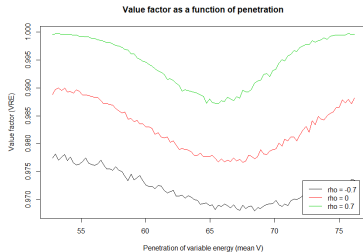
- (a) Benchmark
- (b) Higher stairs
- (c)  $\sigma_\gamma$  doubled
- (d) Both changes



## Numerical simulations IV



(a) Benchmark



(b) Higher stairs

## Numerical simulations V

### Value factor

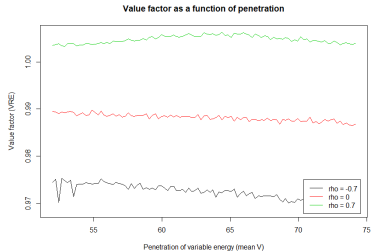
- In the literature  $v^V$  is often monotonously decreasing as  $\bar{V} \uparrow$
- We get waves
- Downward part: more VRE capacity pushes more equilibria down to the next stair, reducing VRE revenue
- Even further penetration: most equilibria at the lower level
- $\Rightarrow$  smaller difference between the mean price of VRE electricity and the price in general
- $\Rightarrow v^V \uparrow$

# Numerical simulations VI

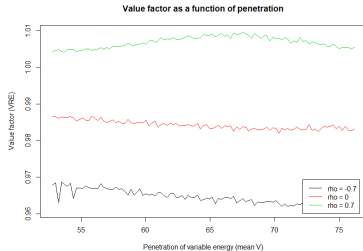
## Value factor

- The value factor decreases as the **correlation** between  $V$  and  $\gamma$  gets lower.  
(Lower curve)
- High correlation: VRE output often large when demand is high.  
Renewable electricity is then often sold at high prices
- **Stairs higher** (Figure (b)):  $v^V$  levels lower
- Larger price reduction when much VRE pushes  $p$  down to the next stair

## Numerical simulations VII



(c)  $\sigma_\gamma$  doubled



(d) Both Changes

## Numerical simulations VIII

### Value factor

- **Increasing the spread** of  $\gamma$  (Figure (c)): the wave patterns (almost) disappear
- It matters less whether the mean  $R$  is close to the next stair or not, when the equilibria are spread over more stairs
- The curve for  $\rho > 0$  is moving up (above 1), while the curve for  $\rho < 0$  is moving down
- If  $\rho > 0$ , the VRE is more often sold at a high price. This explains why  $v^V$  climbs above 1.

## Numerical simulations IX

### Value factor (cont'd)

- In panel (d) the effect of the wider spread from panel (c) is reinforced by the higher steps.
- If  $\rho > 0$  it is more likely to get a very high price when VRE produces much, thus pushing the value factor a bit higher.
- If  $\rho < 0$  VRE often produces much when demand is low, thereby pushing the bottom curve down

# Numerical simulations X

## Indirect utility

- Consumers clearly benefit from the entrance of more VRE firms that produce electricity at low (zero) marginal cost.
- At higher stairs utility starts lower, because the price level is generally higher.

# Numerical simulations XI

## Producer surplus

- Producer surplus fall monotonously as more VRE generators enter the market
- Since the latter have lower marginal costs, they tend to reduce the prices (as well as quantities) for all suppliers, thus reducing profitability in the dispatchable sectors.
- The fall in profits is quite remarkable in percentage terms.