

# Does Natural Gas Generation Buildout Cause Carbon Lock-In?

## **A Social Planner's Perspective for Grid Optimization Using PJM Data**

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May 9, 2018

Energy Economics and Finance Seminar

Kleinman Center, University of Pennsylvania

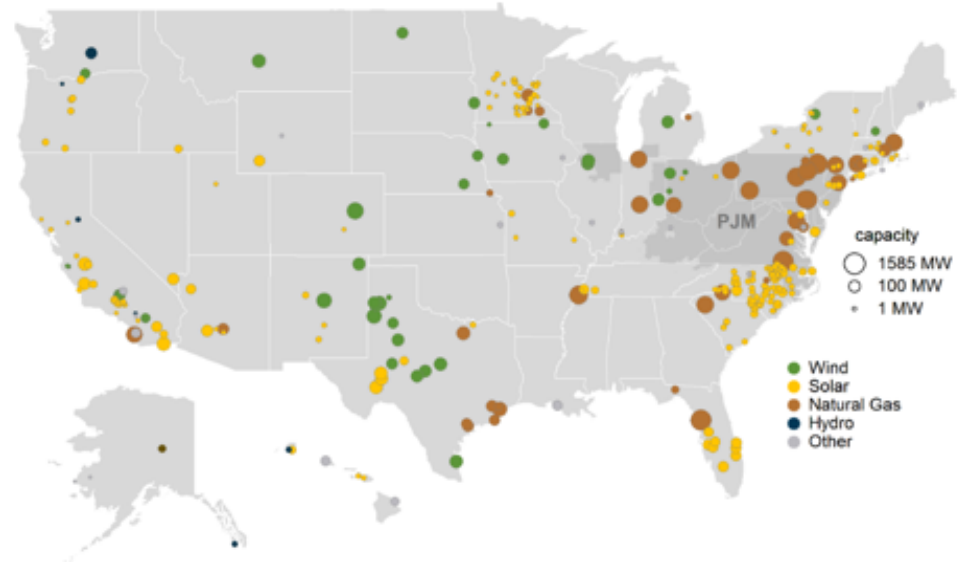
Based on Senior Capstone Submitted December 10, 2017

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# Motivation

- Social cost of carbon is not fully included.
  - RGGI: **\$3.79 / short ton** (2018 March 14 auction)
  - What is priced in?
- Natural gas combined-cycle generation buildout
  - **~15 GW** constructed for 2017-18
  - Another **~22 GW** under development
  - PJM total installed capacity ~200 GW

Distribution of power plants additions expected in March-December 2018 (as of March 2018)



**Question:** Does new gas generation capacity “lock out” or “crowd out” new renewables investment, even if/when a fuller carbon price is introduced later?

Dumoulin-Smith, Julien, Jeremiah Booream, Mark Piorkowski. 2017. “US Electric Utilities & IPPs: Where’s All The Gas Build Coming From?” UBS Global Research. February 3, 2017. <https://neo.ubs.com/shared/d1QlBB5rMNXCdOf/>.

The Regional Greenhouse Gas Initiative. “Auction Results.” Accessed May 4, 2018. <https://www.rggi.org/auctions/auction-results>  
<https://www.eia.gov/todayinenergy/detail.php?id=36092#tab2>

# Outline

- **Main conclusion:** New natural gas capacity investment in PJM is consistent with a \$50 / ton carbon price. For the current grid system with existing capacities, the potential for carbon lock-in based purely on sunk costs is minimal.
- Prior work
- Limits of carbon lock-in potential
  - LCOE: carbon price range
  - Load intermittency
  - Renewables intermittency
- Numerical results
  - Greenfield
  - Existing capacities

Summary of Average PJM Emissions by Scenario (kg CO2 equivalent / MWh)		
No carbon price	Delayed carbon price	Full pricing now
<b>396</b> (119% higher)	<b>181</b> (0.2% higher)	<b>181</b>

# Prior work

- Arthur 1989: path dependence from increasing returns, network effects
  - E.g. QWERTY, 29.97 frames per second
- Liebowitz & Margolis 1995: “third-degree” path dependence – “ex ante path inefficient”
- Unruh 2000: “carbon lock-in”
- Erickson et al. 2015: carbon price where new renewable energy source is competitive with existing conventional source
- Mignone et al. 2017: natural gas combined cycle investments are robust to rising carbon prices

Arthur, W. Brian. 1989. “Competing Technologies, Increasing Returns, and Lock-In by Historical Events.” *The Economic Journal* 99 (March): 116-131. Royal Economic Society.

Dixit, Avinash. 1989. “Entry and Exit Decisions under Uncertainty.” *Journal of Political Economy* 97 (June): 620-638. The University of Chicago Press.

Liebowitz, Stan J., Stephen E. Margolis. 1995. “Path Dependence, Lock-In, and History.” *Journal of Law, Economics and Organization* 11 (1995): 205-226. SSRN.

Unruh, Gregory C. 2000. “Understanding carbon lock-in.” *Energy policy* 28, no. 12 (October): 817-830.

Erickson, Peter, Sivan Kartha, Michael Lazarus, Kevin Tempest. 2015. “Assessing carbon lock-in.” *Environmental Research Letters* 10, no. 8 (August): 1-7.

Mignone, Bryan K., Sharon Showalter, Frances Wood, Haewon McJeon, Daniel Steinberg. 2017. “Sensitivity of natural gas deployment in the US power sector to future carbon policy expectations.” *Energy Policy* 110 (November): 518-524.

# Regret function: carbon lock-in

- Some vector of pre-existing capacities  $x^0$
- A full carbon price  $C$ 
  - Optimal capacities  $\rightarrow x^{*full} = opt(x^0, C^{full})$
- A delayed carbon price trajectory: first 0, then  $C$ 
  - Initial “optimal” capacities  $\rightarrow x^{*myopic} = opt(x^0, 0)$
  - After carbon price included  $\rightarrow x^{*delay} = opt(x^{*myopic}, C)$
- Regret =  $emissions(x^{*delay}) - emissions(x^{*full})$

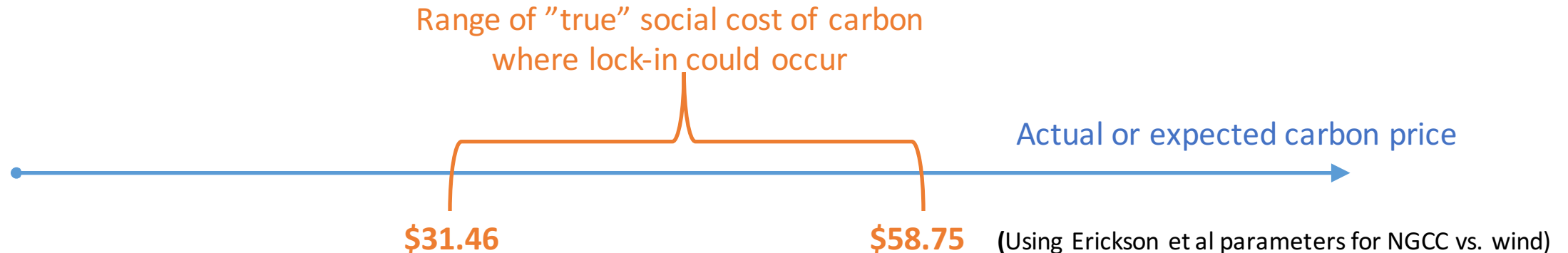
# Impact of delaying a carbon price vs. cap

Externality Policy	Carbon Price	Carbon Cap
Initial period without full policy	<ul style="list-style-type: none"><li>• <b>Higher emissions</b></li><li>• Possibly overbuild capacity that will be unnecessary later</li></ul>	<ul style="list-style-type: none"><li>• <b>Higher emissions</b></li><li>• Possibly overbuild capacity that will be unnecessary later</li></ul>
After full policy is included	<ul style="list-style-type: none"><li>• <b>Higher emissions locked-in</b></li></ul>	<ul style="list-style-type: none"><li>• <b>No carbon lock-in by construction</b></li><li>• Need higher carbon price vs. no delay</li></ul>

- Dual problems (equivalent carbon price is optimal dual variable for carbon cap constraint)
- Focus on carbon price as benchmark

# Sunk cost lock-in occurs over carbon price *range*

- For lock-in to exist, carbon price:
  - Can't be too high → otherwise alternatives are competitive (Erickson et al.)
  - Can't be too low → otherwise counterfactual would not have any alternatives



$$\left[ \frac{K_{new} \cdot a_{new} + F_{new}}{h \cdot P_{new}} - \left( \frac{K_{old} \cdot a_{old} + F_{old}}{h \cdot P_{old}} + V_{old} \right) \right] / E_{old} < C < \left[ \frac{K_{new} \cdot a_{new} + F_{new}}{h \cdot P_{new}} - \left( \frac{F_{old}}{h \cdot P_{old}} + V_{old} \right) \right] / E_{old}$$

# Load intermittency reduces lock-in potential

- Assume load duration curve, 2 perfectly dispatchable resources
- How much capacity of each type is optimal?
  - FOC  $\rightarrow$  higher variable cost resource should run for hours

$$h^* = \frac{k_2 - k_1 \quad (\$/\text{MW})}{v_1 - v_2 \quad (\$/\text{MWh})}$$

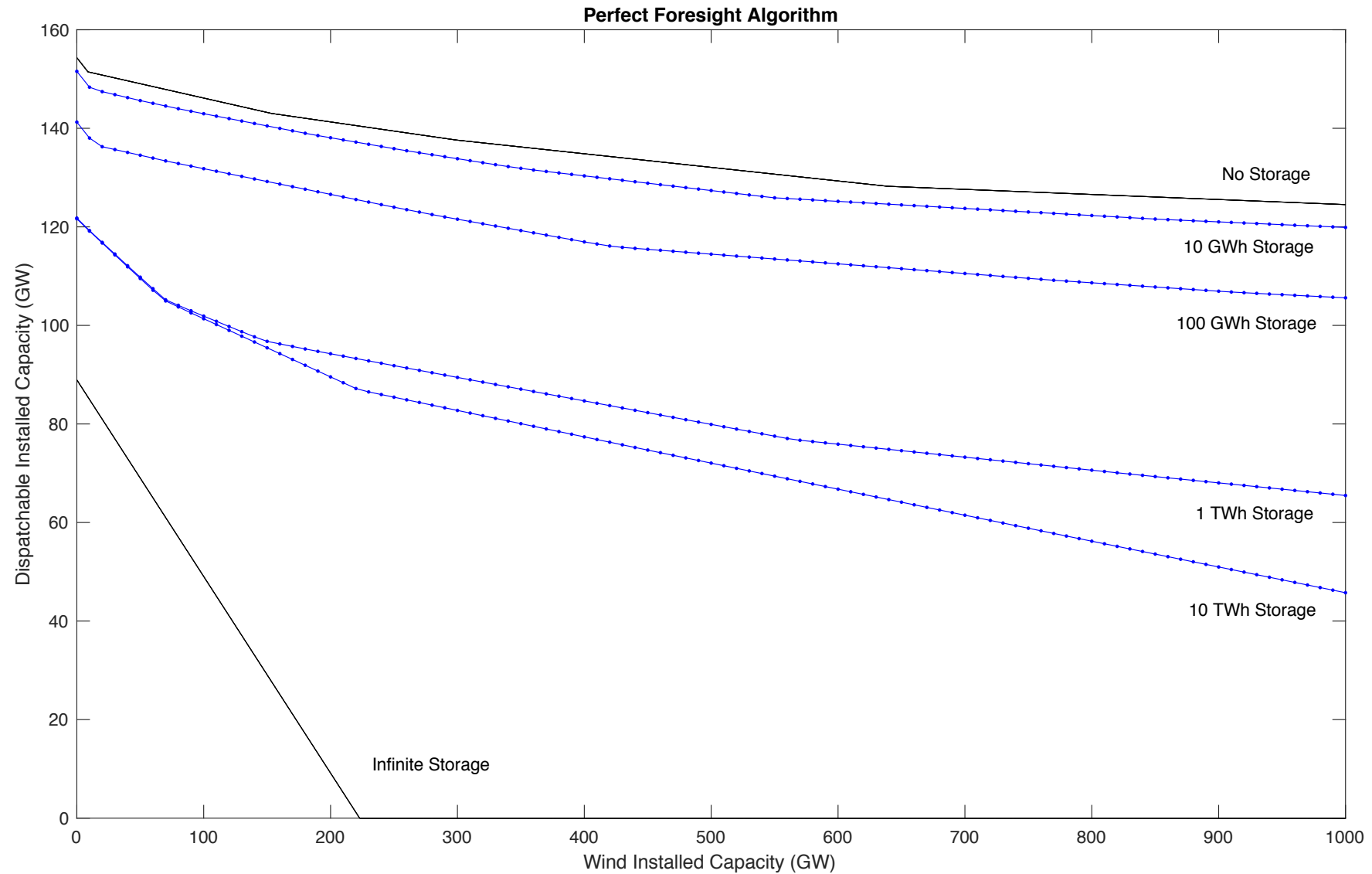
- If “a lot” of higher variable cost resource already built

$$h^{*path} = \frac{k_2 \quad (\$/\text{MW})}{v_1 - v_2 \quad (\$/\text{MWh})} > x^*$$

- For lock-in to exist, need to build more than the optimal amount under the all-in-price scenario



# Renewables intermittency reduces lock-in potential



Numerical results

# LP: Capacity Expansion Optimization

minimize	$C_{cap} + C_{fin} + C_{ext}$	(Objective function)
subject to	$\forall i: X_i = \mathbf{X}_{old,i} + X_{new,i}$	
	$C_{cap} = \sum_i A_{r,n_i} k_i X_{new,i}$	(Capital costs)
	$C_{fin} = \sum_i \left( f_i X_i + \frac{1}{N} v_i \sum_t P_{i,t} \right)$	(Operating monetary costs)
	$C_{ext} = \sum_i \left( \frac{1}{N} s_i \sum_t P_{i,t} \right)$	(Operating externality costs)
	$\forall t: \sum_{i=1}^n P_{i,t} - P_{stor,t}^+ + P_{stor,t}^- \geq L_t$	(Hourly load balance)
	$\forall i, t: P_{i,t} \leq X_i a_{i,t}$	(Generation resource adequacy)
	$\forall i, t: -r_i X_i \leq P_{i,t} - P_{i,t-1} \leq r_i X_i$	(Ramping constraint)
	$Q_0 = 0$	(Zero initial storage charge)
	$0 \leq P_{stor,t}^- \leq \gamma Q_{t-1}$	(Energy available to be discharged)
	$0 \leq P_{stor,t}^+ \leq \sum_{i=1}^n P_{i,t}$	(Energy available to be stored)
	$0 \leq Q_t \leq Q_{max}$	(Finite, positive energy capacity)
	$Q_t = \gamma Q_{t-1} + P_{stor,t}^+ - P_{stor,t}^-$	(Conservation of energy)

Indices	$i$	Resource type: coal, gas (CT and CC), wind, solar, nuclear, hydro
	$t$	Time hour of the year (Size 8760 * N years)

Decision Variables	$X_{new}(i)$	New power capacity to be constructed, in MW
	$P(i, t)$	Dispatch of each resource type for each hour, in MWh

## Cost Parameters

$k(i)$	Capital cost for power capacity, in \$ / kW
$f(i)$	Annual fixed operating and maintenance cost, in \$ / kW
$v(i)$	Variable fuel costs for energy generation, in \$ / MWh
$s(i)$	Variable externality costs for energy generation, in \$ / MWh

$X_{old}(i)$	Existing power nameplate capacity at start of period, in MW
$r(i)$	Ramp rate, in MWh output that can be adjusted up or down in 1 hour per MW capacity (%)
$l(t)$	Load demand (RTO-level metered load) in given hour, in MWh
$a(i, t)$	Physically available capacity value of resource, in dimensionless % (Assumed to be always 1 for resources that are not wind or solar.)

# Starting from 0 existing capacities

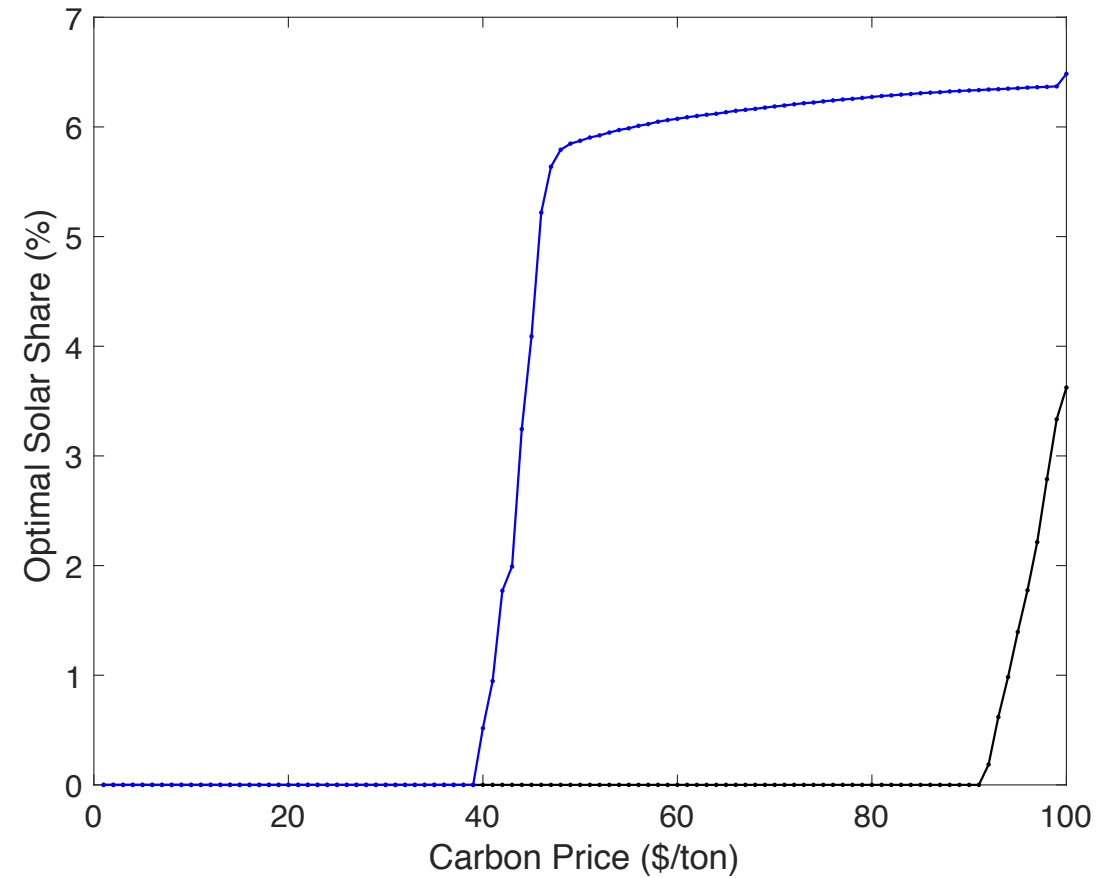
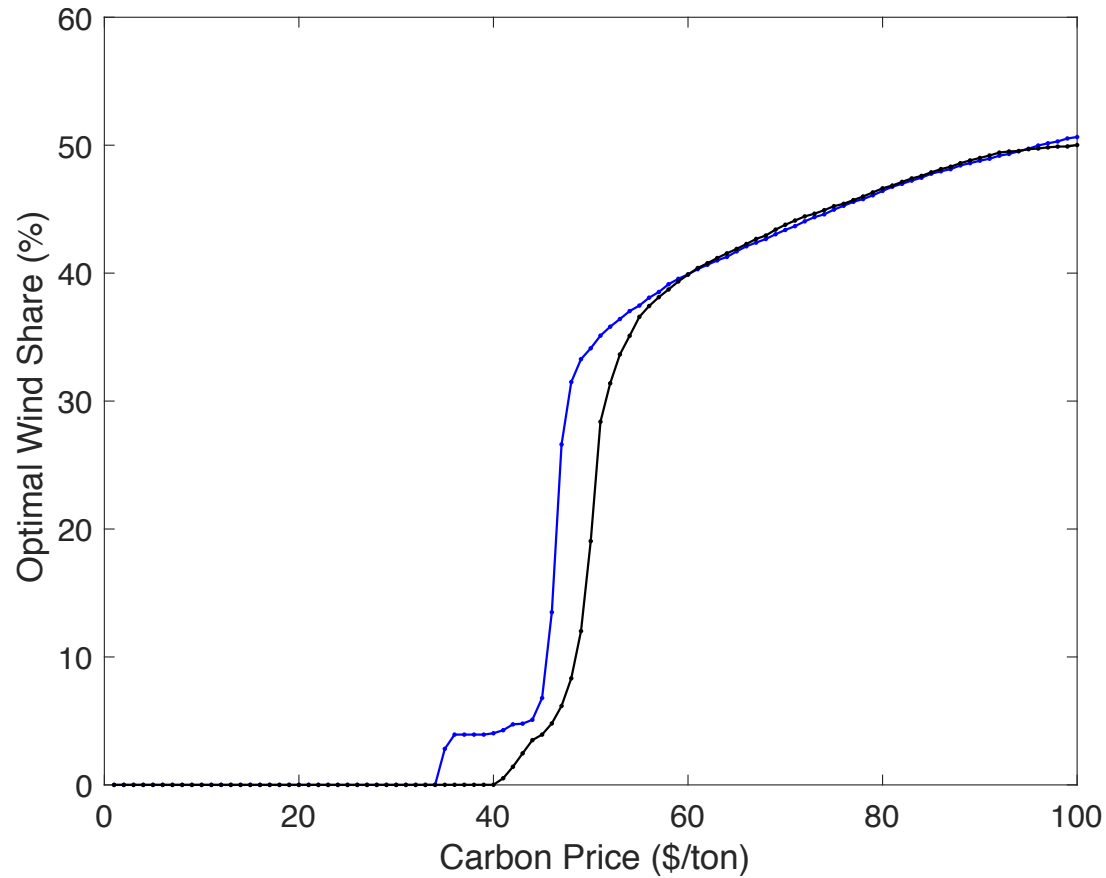
CO <sub>2</sub> Price (\$ / ton)	Capacity (GW)			Energy Share (%)		
	Always 0	First 0, Then 50	Always 50	Always 0	First 0, Then 50	Always 50
CT	57.63	<b>51.87</b>	<b>52.01</b>	3.92	<b>1.77</b>	<b>2.38</b>
CC	98.53	<b>98.53</b>	<b>81.36</b>	96.08	<b>72.63</b>	<b>56.71</b>
Wind	0	<b>57.74</b>	<b>79.02</b>	0	<b>25.60</b>	<b>35.00</b>
Solar	0	<b>0</b>	<b>22.56</b>	0	<b>0</b>	<b>5.90</b>
Average CO2 equivalent (kg / MWh)				449.41	<b>331.61</b>	<b>265.71</b>

➔ Lock-out of wind: 21.3 GW, 9.4% generation

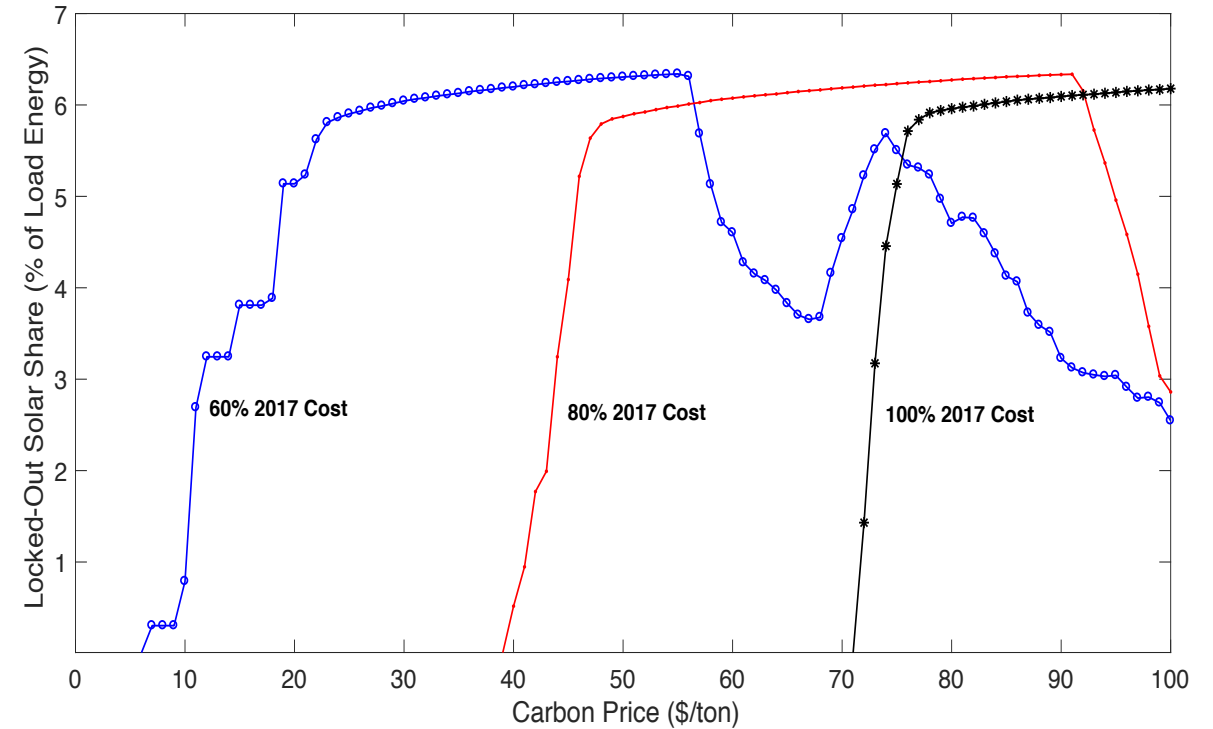
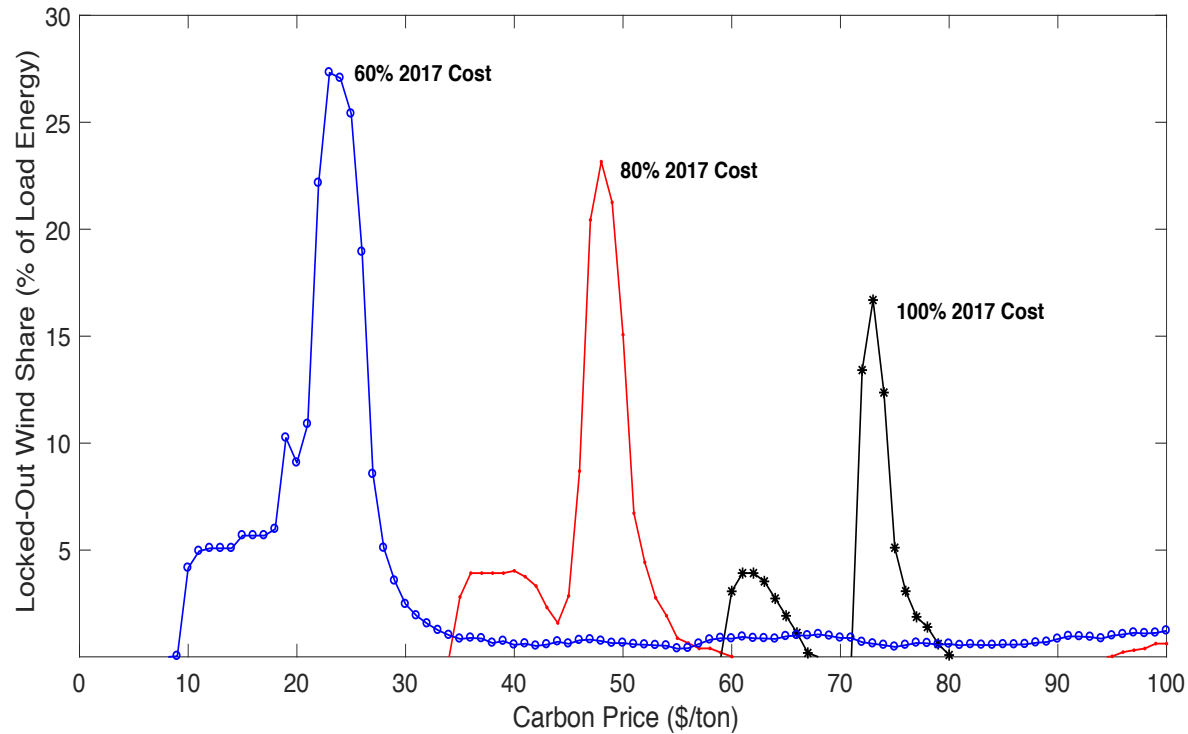
➔ Lock-out of solar: 22.56 GW, 5.9% generation

➔ Carbon lock-in: 65.9 kg CO<sub>2</sub> equivalent / MWh (~25% total)

# What happens at different “true” carbon prices?



# What happens at different carbon prices?



# Starting from existing capacities

*Start with existing – Assume some exogenous retirements of both coal and nuclear*

CO <sub>2</sub> Price (\$ / ton)	Capacity (GW)				Energy Share (%)			
	Existing	Always 0	First 0, Then 50	Always 50	Always 0	First 0, Then 50	Always 50	$\Delta$ from Delay
CC	41.05	48.12	48.12	46.68	29.36	33.16	32.47	<b>+0.69%</b>
Wind	7.92	7.92	56.61	57.63	3.36	24.01	24.44	<b>-0.43%</b>
Solar	0.88	0.88	5.07	5.01	0.22	1.28	1.26	<b>+0.02%</b>
Coal	47.62	47.62	31.14	32.57	29.10	3.56	3.86	<b>-0.30%</b>
Nuclear	25.27	25.27	25.27	25.27	27.07	27.07	27.01	<b>+0.06%</b>
Hydro	9.91	9.91	9.91	9.91	10.62	10.53	10.51	<b>+0.02%</b>
CT	25.25	25.25	25.25	25.25	0.27	0.40	0.39	<b>+0.10%</b>
Average CO <sub>2</sub> equivalent (kg / MWh)					395.83	181.02	180.65	<b>+0.37 kg/MWh</b>

➔ Very minimal lock-out effect (~0.2% of emissions)

➔ First order effect from including carbon price – even if delayed

# Existing capacities assuming higher NGCC

*Optimal Capacity Expansion and Generation Shares for Coal and Renewables, Under Increasing Levels of Initial Gas Combined-Cycle Capacity*

	Starting CC (GW)	48	55	60	70	90	100
$\Delta$ Capacity (GW)	Coal	-16.48	-23.16	-23.39	-35.58	-47.62	-47.62
	Solar	4.19	3.95	0	0	0	0
	Wind	48.69	47.80	47.23	47.23	19.64	0
Energy Share (%)	Coal	3.56	2.30	1.84	0.74	0	0
	Solar	1.28	1.22	0.22	0.22	0.22	0.22
	Wind	24.01	23.63	23.39	23.39	11.70	3.36
Average Emissions (kg CO2 equivalent / MWh)		180.15	176.16	179.46	174.29	222.24	258.94

- New gas displaces old coal immediately
- Solar starts to get displaced – but optimal share was small to start
- Wind gets displaced only after 90 GW – 49 GW existing = ~49GW new gas CC



# Model limitations / extensions

## Factors that affect optimal renewables share:

- Transmission system, power flow
- Scale effects: siting, reserve requirements, etc.
- Inter-annual uncertainty (using 2012 meteorological year)
- Heterogeneity: offtake customers, etc.

## Factors that affect lock-in mechanism:

- Optionality, capital structure: right now discount rate can represent  $r_{WACC}$ , but treated as fixed income annuity
- Strategic investment behavior: not social planner
- Endogenous fuel prices
- Improving alternative technologies in between periods
- Infrastructure network effects (Unruh)

# Takeaway: Don't need to worry about sunk cost lock-in, worry about pricing the externality.

- Theoretical framework diminishes carbon lock-in potential
  - “True” carbon price can't be too low or high versus actual or expected
  - Lock-in can only exist after sunk costs exceed “always full price” optimal
  - Intermittent renewables need capacity backup
- Numerical analysis using LP optimization suggests minimal carbon lock-in in PJM due to NGCC generation buildout, due to pre-existing resource capacity – consistent with Mignone et al.
- First order effect is including externality pricing, even if delayed

Summary of Average PJM Emissions by Scenario (kg CO2 equivalent / MWh)			
Carbon Price	Zero	Delayed	Full
No Existing Resources	<b>449</b> (69% higher)	<b>332</b> (25% higher)	<b>266</b>
Pre-Existing Resources	<b>396</b> (119% higher)	<b>181</b> (0.2% higher)	<b>181</b>

# Appendix

# Mignone et al.

*Table 1: Natural Gas Generation and Capacity in Optimal Solutions Under Capped and Rising Carbon Regulation Scenarios, from Mignone et al.*

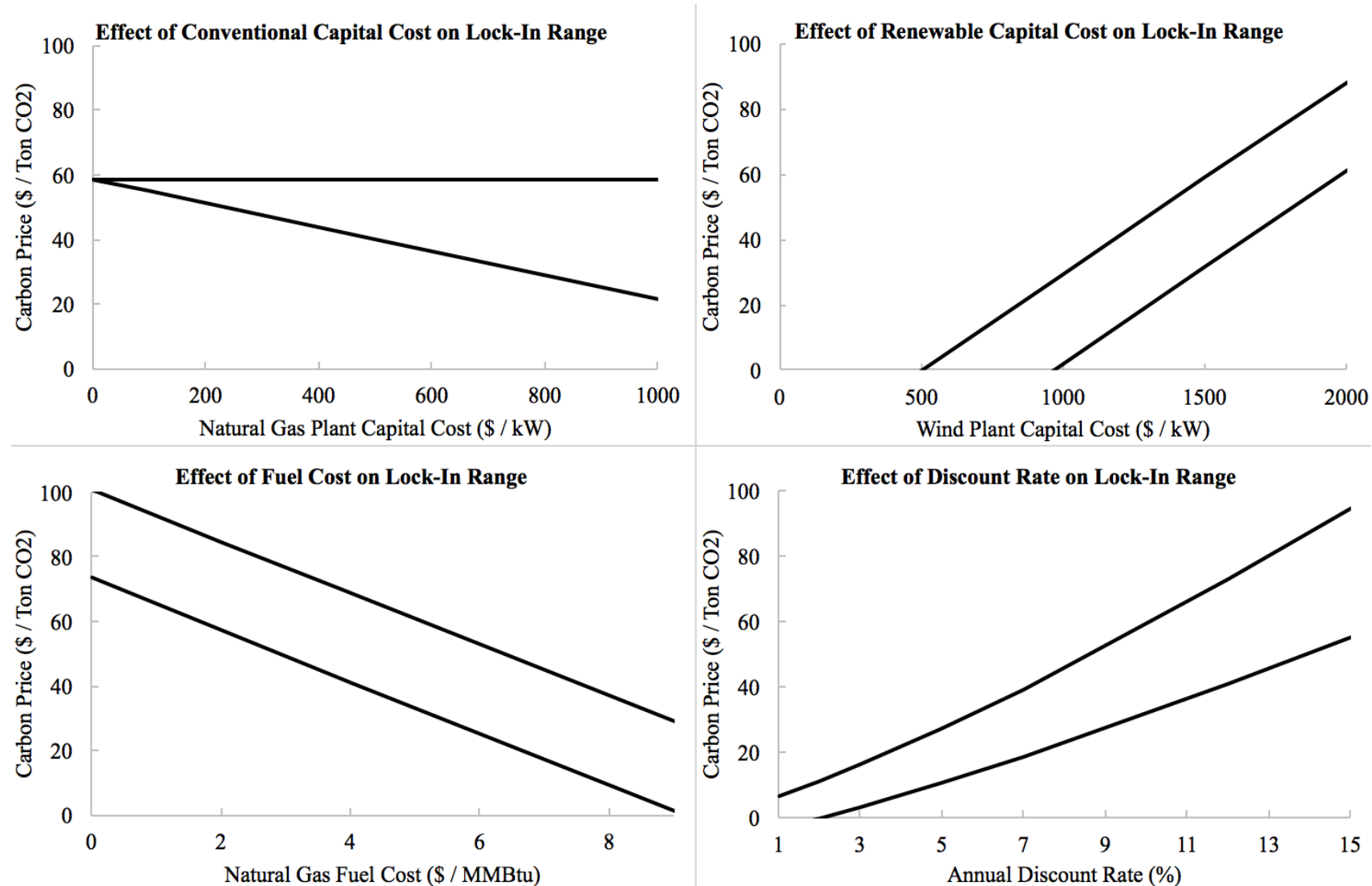
Capped Price	Generation (TWh)			Capacity (GW)			Capacity Factor		
	2015	2030	2050	2015	2030	2050	2015	2030	2050
	1092	1260	1753	226	277	386	55%	52%	52%
Rising Price		1328	1525		299	406		51%	43%

# Carbon lock-in range

$$\left[ \frac{K_{new} \cdot a_{new} + F_{new}}{h \cdot P_{new}} - \left( \frac{K_{old} \cdot a_{old} + F_{old}}{h \cdot P_{old}} + V_{old} \right) \right] / E_{old} < \mathbf{C} < \left[ \frac{K_{new} \cdot a_{new} + F_{new}}{h \cdot P_{new}} - \left( \frac{F_{old}}{h \cdot P_{old}} + V_{old} \right) \right] / E_{old}$$

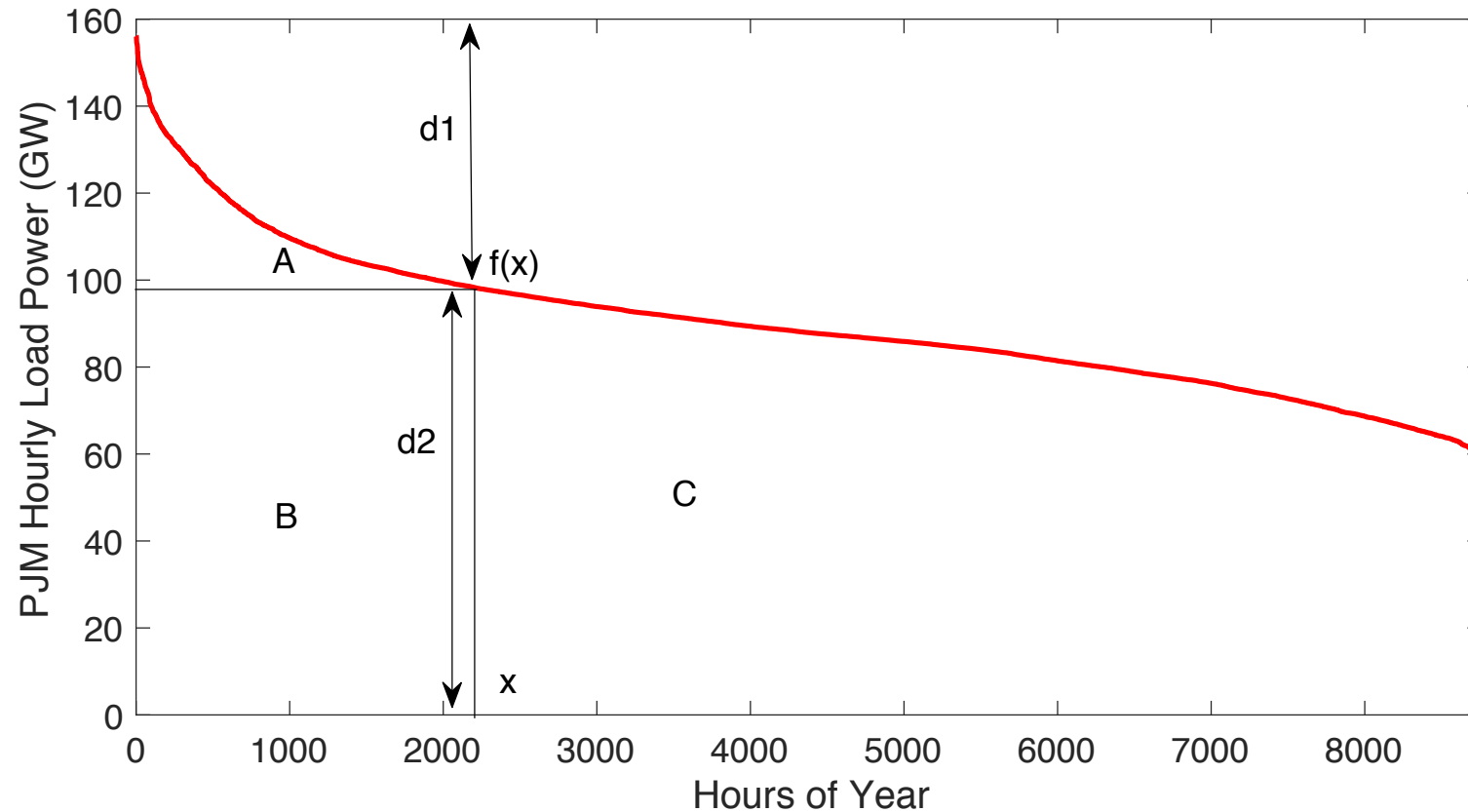
- C = carbon cost (\$ / tons)
- E = emission rate (tons / MWh)
- K = capital cost (\$ / MW)
- F = fixed costs (\$ / MW)
- V = variable costs (\$ / MWh)
- P = capacity factor of power generation (%)
- a = annuity factor =  $\frac{r}{1-(1+r)^{-n}}$
- h = hours in year = 8760 hours

# Conditions for Lock-In (LCOE)



# Conditions for Lock-In (Load Duration)

- Load duration curve for PJM
- Inverse CDF



# Conditions for Lock-In (Load Duration)

Assume 2 resources. Then total costs:

$$\begin{aligned} J &= k_1 d_1 + k_2 d_2 + v_1 A + v_2 (B + C) \\ &= k_1 [f(0) - f(x)] + k_2 f(x) + v_1 \left[ \int_0^x f(s) ds - x f(x) \right] + v_2 \left[ \int_x^{x_{max}} f(s) ds + x f(x) \right] \end{aligned}$$

FOC:

$$\begin{aligned} \frac{\partial J}{\partial x} &= -k_1 \frac{\partial f(x)}{\partial x} + k_2 \frac{\partial f(x)}{\partial x} + v_1 \left[ f(x) - f(x) - x \frac{\partial f(x)}{\partial x} \right] + v_2 \left[ -f(x) + f(x) + x \frac{\partial f(x)}{\partial x} \right] \\ &= (k_2 - k_1) \frac{\partial f(x)}{\partial x} + (v_2 - v_1) x^* \frac{\partial f(x)}{\partial x} = 0 \end{aligned}$$

$$x^* = \frac{k_2 - k_1}{v_1 - v_2}$$



# Conditions for Lock-In (Load Duration)

- What if we have a little existing amounts of resource 1, that does not exceed the “greenfield” optimal?
- $\theta_1 < f(0) - f(x^*)$

$$J_{pre} = k_1[f(0) - f(x) - \theta_1] + k_2f(x) + v_1[\dots] + v_2[\dots]$$

- The derivative does not change.
- **NO LOCK-IN**

# Conditions for Lock-In (Load Duration)

- What if we have **lots of** existing amounts of resource 1, that **does exceed** the “greenfield” optimal?
- $\theta_1 \gg f(0) - f(x^*)$
- No capital cost incurred for resource 1

$$J_{pre} = k_2 f(x) + v_1[\dots] + v_2[\dots]$$

- New optimal

$$x^{*(1)} = \frac{k_2}{v_1 - v_2} > x^*$$

$$d_2^{*(1)} = f(x^{*(1)}) < f(x^*)$$

**LOCK-IN**

# Capacity Value of Renewables

- 1. Zero storage
- Level of wind capacity exactly determines necessary gas capacity

$$P_{var,t} = X_{var} A_t$$

$$P_{disp,t} = NL_t = \max\{0, L_t - P_{var,t}\}$$

$$X_{disp} = \max_t \{NL_t\} \quad (1)$$

# Capacity Value of Renewables

- 2. Finite storage capacity
- Only charge storage if excess renewables

Let  $S_0 = 0$

For time  $t = 1 \dots T$ :

$$P_{stor,t}^+ = \min\{S_{max} - \gamma S_{t-1}, \max\{0, P_{var,t} - L_t\}\} \quad (\text{Store into battery})$$

$$P_{stor,t}^- = \min\{\gamma S_{t-1}, \max\{0, L_t - P_{var,t}\}\} \quad (\text{Discharge from battery})$$

$$S_t = \gamma S_{t-1} + P_{stor,t}^+ - P_{stor,t}^-$$

$$NL_t = L_t - P_{var,t} - P_{stor,t}^- + P_{stor,t}^+$$

# Capacity Value of Renewables

- 3. Finite storage capacity
- Optimize charge – this might end up using more energy

minimize  $X_{disp}$

such that  $S_0 = 0$

(Zero initial charge)

$$0 \leq P_{stor,t}^- \leq \gamma S_{t-1}$$

(Amount of energy available to be discharged)

$$0 \leq P_{stor,t}^+ \leq P_{var,t} + X_{disp}$$

(Amount of energy available to be stored)

$$0 \leq S_t \leq S_{max}$$

(Finite energy capacity)

$$S_t = \gamma S_{t-1} + P_{stor,t}^+ - P_{stor,t}^-$$

(Conservation of energy across time)

$$P_{var,t} + X_{disp} - P_{stor,t}^+ + P_{stor,t}^- \geq L_t$$

(Resource adequacy to cover load)

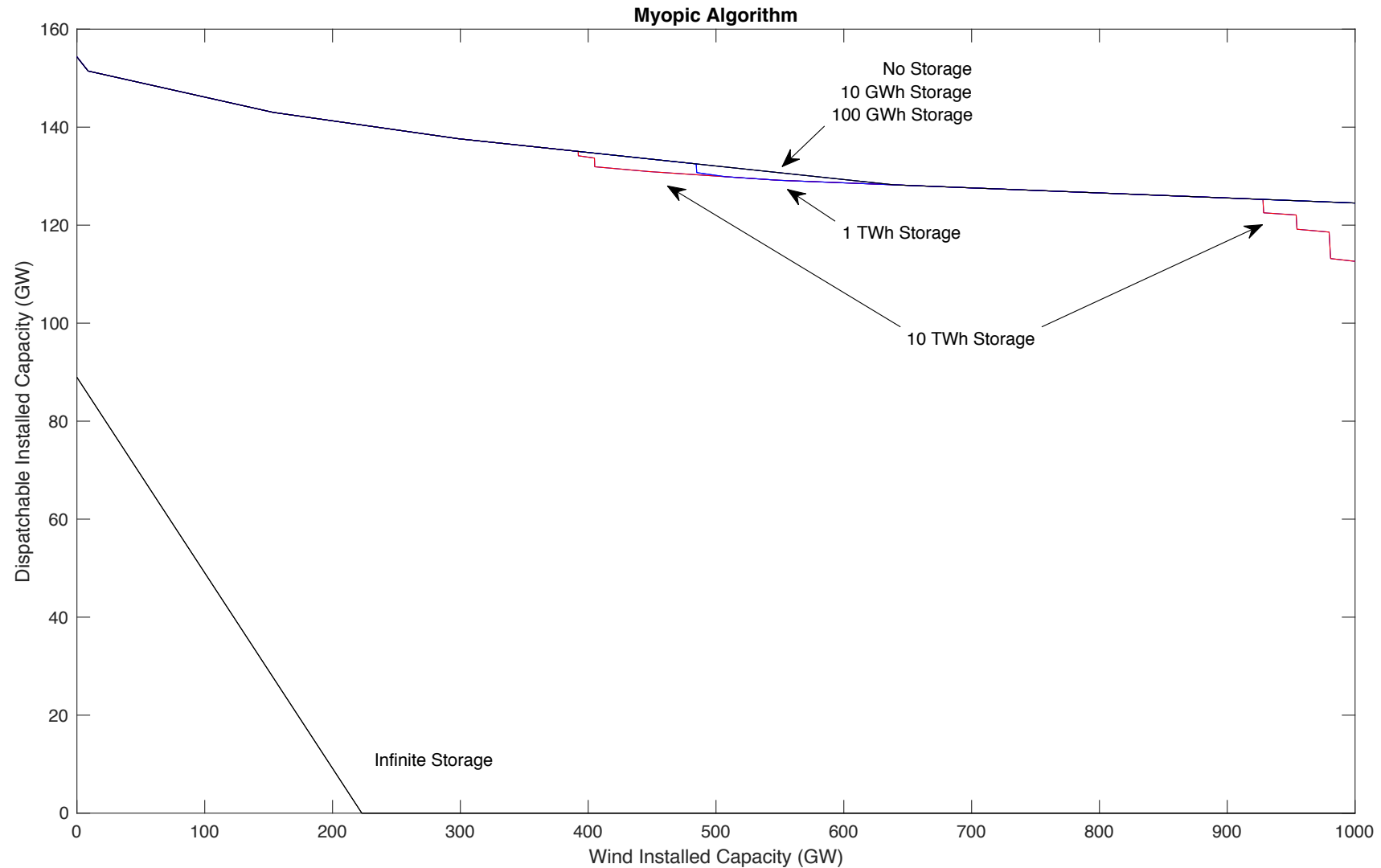
# Capacity Value of Renewables

- 4. Infinite storage capacity
- Stored energy can “time travel” with no decay

$$X_{disp} = \frac{1}{T} \sum_t (L_t - P_{var,t})$$

*\* This is equivalent to the LCOE-only analysis*

# Capacity Value of Renewables



# Cost Parameters for Numerical Analysis

*Table 7: Natural Gas and Coal Variable Cost Assumptions by Chemical Energy Content*

Fuel Type	Natural Gas	Coal
Fuel Price (\$ / MMBtu)	4	2
Combustion Emission Rate (kg CO <sub>2</sub> / MMBtu)	53.07	93.35
Natural Gas Energy Density (kg CH <sub>4</sub> / MMBtu)	$(1 / 53.4)10^3 = 18.73$	NA
Natural Gas Fugitive Emission Rate	1%	
Global Warming Potential Multiplier of CH <sub>4</sub> vs. CO <sub>2</sub>	86	

*Table 8: Cost Assumptions by Resource Types*

Resource Type	Units	Gas CC	Onshore Wind	Solar PV	Gas CT	Coal	Nuclear	Hydro
Overnight Capital	\$/kW	1283	2271	2524	Assume no new buildout			
Assumed Lifetime	years	20	20	30				
Capital Annuity	\$/kW/year	121.11	171.51	162.70				
Fixed O&M	\$/kW/year	9.94	46.71	21.66	6.76	70	100	15
Fixed Cost	\$/kW/year	131	209	180	6.76	70	166	15
Variable O&M	\$/MWh	1.99	0	0	10.63	7.06	2.29	2.66
Heat Rate	MMBtu/MWh	6.3	0	0	9.8	9.75	0	0
Variable Fin. Cost	\$/MWh	27	0	0	50	27	0	0
Variable Carbon Cost	\$/MWh	21.79	0	0	33.91	43.58	0	0
Total Variable Cost	\$/MWh	58	0	0	97	88	2.3	2.7



# Including Energy Storage

*Table 12: Effect of Exogenous Inclusion of Energy Storage Capacity on Lock-In Effect*

	Storage Capacity 10 GWh			262 GWh	
	Carbon Price (\$/ton)	0	FZTF	50	0 50
$\Delta$ Capacity (GW)	Gas CC	4.27	0	0	0 0
	Wind	0	50.64	53.92	0 62.58
	Solar	0	0	0	0 0
Energy Share (%)	Gas CC	28.44	32.58	30.16	27.03 28.68
	Wind	3.36	24.83	26.22	3.36 29.77
	Solar	0.22	0.22	0.22	0.22 0.22

# No Exogenous Nuclear Retirements

*Table 13: Effect of nuclear retirements.*

*Start with existing – Assume exogenous retirements of only coal, but not nuclear*

Carbon Price (\$ / ton)	Capacity (GW)			Energy Share (%)	
	Existing	Always 0	Always 50	Always 0	Always 50
CC	<b>41.05</b>	<b>41.05</b>	41.05	23.24	25.52
Wind	<b>7.92</b>	<b>7.92</b>	54.56	3.36	23.13
Solar	<b>0.88</b>	<b>0.88</b>	4.82	0.22	1.22
Coal	<b>47.62</b>	<b>46.23</b>	30.29	26.16	3.86
Nuclear	<b>33.73</b>	<b>33.73</b>	33.73	36.14	36.12
Hydro	<b>9.91</b>	<b>9.91</b>	9.91	10.62	10.23
CT	<b>25.25</b>	<b>25.25</b>	25.25	0.27	0.39