Carnegie Mellon University MICHIGAN

Negative EV Emissions

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Transportation is the largest source of U.S. GHGs

Most transportation emissions are from cars & light trucks

Transportation and electric power together produce most U.S. GHG emissions



Source: US EPA 2022 US GHG emissions by sector

EVs link the two largest sources

Electrification is the most promising for light-duty vehicles (technologically & economically)

When we electrify vehicles, we reduce tailpipe emissions in the transportation sector but increase demand for electric power

We can assess the net effect with **life cycle assessment** (LCA)



Source: US EPA 2022 US GHG emissions by sector

Two distinct kinds of LCA ask different questions





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Policy assessment needs consequential LCA



Consequential LCA assesses how a change (e.g.: vehicle or policy adoption) will affect emissions

Recommendation 2-2: When a decision-maker wishes to understand the consequences of a proposed decision or action on net GHG emissions, CLCA is appropriate. Modelers should provide transparency, justification, and sensitivity or robustness analysis for modeling choices for the scenarios modeled with and without the proposed decision or action.

NASEM report recommends using consequential LCA to assess policy impact

Recommendation 3-2: Public policy design based on LCA should ensure through regulatory impact assessment that, at a minimum, the consequential life-cycle impact of the proposed policy is likely to reduce net GHG emissions and increase net benefits to society. Regulatory impact assessments should consider changes in production and use of multiple fuel types (e.g., gasoline, electricity, biofuels, hydrogen).

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Literature & terminology

Emissions Estimates Based On

		No change (average)	Marginal change (via regression)	Non-marginal change (via simulation)
Attributional	Average emission rates	Samaras and Meisterling (2008) Michalek et al (2011) Manjuath and Gross (2017) Wong et al (2020)	Incompatible	Incompatible
Consequential	Short run endogenous operations exogenous infrastructure	Incompatible	Samaras and Meisterling (2008) Graff Zivin et al (2014) Tamayao et al (2015) Yuksel et al. (2016) Holland et al (2016, 2020, 2022) Tong and Azevedo (2020) Singh et al (2024)	Weis et al (2016) Sheppard et al (2021) Bruchon et al (2024)
	Long run endogenous operations endogenous infrastructure	Incompatible		Weis et al (2013) Melaina et al (2016) Gagnon and Cole (2022) Holland et al (2022) Jenn (2023) Hanig et al (2025) Chen et al (2025)
Carnegie Mellon University Engineering & Public Policy Most econ studies				

Estimating marginal effects

Holland et al. (2022) use short-run marginal emission factors and find that marginal rates are not falling even as the grid cleans up

They apply these marginal rates to estimate the effect of electrifying 50% of the vehicle fleet

Gagnon et al. (2022) critique that large changes will induce long run infrastructure investment decisions, so long run analysis is needed, resulting in much lower marginal rates

Conflation of three issues

- 1) Marginal vs. non-marginal changes
- 2) Period over which the change takes place
- 3) Short run vs. long run effects

policy		
Stephen P. Holland ^{a,b,1} 0, Matthew J. K	tchen ^{b.c.1,2} , Erin T. Mansur ^{b.d.1} , and Andrew J. Yates ^{e.1}	
*Department of Economics, Bryan School of Busin	is and Economics, University of North Carolina at Greensboro, Greensboro, NC 27402-6170; ⁹ National	
Dartmouth College, Hanover, NH 03755-3514; and	Department of Economics, University of North Carolina at Chapel Hill, Chapel Hill, NC 27599	
Edited by Jose Scheinkman, Department of Econo	ics, Columbia University, New York, NY; received September 17, 2021; accepted January 5, 2022	
Marginal emissions of CO ₂ from the electr for evaluating climate policies that rely demand or supply. This paper provides est emissions from US electricity generation t available and comprehensive data. The est	ty sector are critical over the last decade. Over this time, the US electricity sector h shifts in electricity undergone unprecedented changes that affect CO ₂ emission	as 16,
hour of the day, and year to year over identify an important and somewhat co While average emissions have decreased		Chuck for spokese
last decade (28% nationally), marginal en (7% nationally). We show that underlying t	Short-run marginal emission rates o	mit important impacts
a shift toward greater reliance on coal to tricity use. We apply our estimates to an	of electric-sector interventions	interinportant impacts
administration's target of having electric	of electric-sector interventions	
significant and concurrent changes to the	Pieter J. Gagnon ^{a,1} 0, John E. T. Bistline ^a 0, Marcus H. Alexander ⁴ , and We	sley J. Cole ^a 💿
the emission reductions from having fewe	Holland et al. (1) describe the calculation of a marginal Additi	onally long-run analysis can show diurnal and sea-
hicles on the road. Moreover, using averag emissions to predict the impacts significa	emission rate and advocate for using such metrics when sonal tre	ends that are not captured through short-run appro-
emission benefits. Overall, we find that t	estimating the impacts of electric-sector policies and inter- ventions. Importantly, however, what is being calculated in electrics	ig. 1). Motivated by this, if we assume that the new whicles are mostly charged during the day we see an
policies that decarbonize both average an	their study (1) is a short-run marginal emission rate, meaning even low	er estimate of 200-286 kg/MWh. More flexible or tar-
the electricity sector.	that it characterizes the marginal emissions from a fixed geted ch electricity system, conjecting the impacts of any structural states.	arging strategies could achieve even lower emission
electricity emissions climate policy	change that may be induced by the intervention. with a ne	gative emission rate, for example. Long-run marginal
Electricity generation accounts for 22	Why does this matter? It is because the current policy and rates ha	ve their own limitations as well (partially discussed in
E gas (GHG) emissions (1), and many	electric load would often induce more nonemitting genera- remains	to be done), of course, but help us here to gain a sense
seek to address climate change are clo	tors, such as wind and solar, to be built (2, 3). The short-run of the po	tential magnitude of structural impacts.
more generation from renewable and I	mixture (which is dominated by natural gas and coal) can Recog	inizing its importance, leading organizations employ
energy, incentives for greater efficiency of	look quite different from the long-run mixture that includes method	s that incorporate structural impacts (9, 10).
especially when it comes to the adoptis	states (and DC) with electricity portfolio standards, which value of	marginal approaches when estimating the impacts
(EVs). Indeed, the Biden administration h	require a portion of generation to be clean, often necessitat- of interv	rentions-but we append that the methods would
vehicle purchases in the United States by 2	ing structural responses to load increases. ideally c	apture the interventions' effects comprehensively.
to policies or behavioral changes that st	methodologies was recognized previously by a subset of the structure	al change, they can erroneously estimate the con-
GHG emissions is highly dependent on th	authors of ref. 1. When discussing the limitations of the sequence	es of actions. This undermines the promise of mar-
specific sources of generation that are disp	short-run method employed in ref. 4, for example, the ginal em	ission rates to support decision-making, distorting
Existing research shows that marginal	appendix recognizes that "A full model would need to account the sele	ction between alternatives based on their impacts
trast to average emissions (i.e., carbon	A similar caveat was given in ref. 5.	р.
United States (3-6). This paper contribu-	Such caveats were warranted because neglecting induced Autor atte	ations: "Grid Planning and Analysis Center, National Renewable Energy Cellers CO 804011 "Energy Systems and Climate Analysis Crown, Factory
and somewhat counterintuitive finding:	8 structural change can be impactful (6, 7). Holland et al. (1) cal- subted a magninal CO, emission rate of 591 km/MMM for the PowerRese	irch Institute, Palo Alto, CA 94304; and 'Electric Transportation Group, Electric irch Institute, Palo Alto, CA 94304
riod over which average emissions have	United States in 2019 and applied that to the Biden administra-	
Using the most recently available and o	tion's vehicular electrification targets through 2030. By contrast,	duction: RIG IET R MHA and WIC write the owner
wide electricity use (i.e., load). Our estim	if we take into account induced structural change with long-run marginal emission rates (%) up actimate the policies impact as	declare no competing interest.
the contiguous United States, hour of the	286–336 kg/WWh across three "business-as-usual" futures—	2022 the Author(s), Published by PNAS. This article is distributed under Creative tribution License 40.000 RM.
PNAS 2022 Vol. 119 No. 8 e2116632119	reflecting the notion that if we electrify vehicles, we are likely to To whom o	arrespondence may be addressed. Email: pieter gagnon@nrel.gov.
	build more generators, many of which will be nonemitting. Published N	overrber 28, 2022.
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	g Time of Day L	lay of the year
	Fig. 1. Examples of time-varying trends in short-run and long-run marginal emission rate app 1 in units of IbAXNh of busbar load for 5 historical years. Panel 8 shows long-run marginal em Both penele rise drifts for the continuous I linked Stater	roaches. Panel A shows short-run marginal emission rates from ref. iission rates from ref. 6 in kg/MWh of end-use load for 2024-2043.
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Carnegie Mellon Univ Engineering & Public Polic	rsity To underst Jarge chang	and long run e jes, we need w	ffects of http: ork here	p://nap.nationalacademies.org/26402

Two studies in R&R on long-run non-marginal effects of EV charging on power systems

1. Exogeneous EV load timing (National)

Hanig, L., C. Harper, D. Nock and J. Michalek (2025) "Driving the grid forward: How electric vehicle adoption shapes power system infrastructure and emissions," in review.

2. Endogenous EV load timing (PJM)

Chen, J., M. Craig, J. Michalek, M. Bruchon and P. Vaishnav (2025) "Negative electric vehicle emissions: Vehicle-to-grid can incentivize enough wind and solar investment to reverse EV charging emissions," in review.

Exogenous EV Load Timing

Hanig, L., C. Harper, D. Nock and J. Michalek (2025) "Driving the grid forward: How electric vehicle adoption shapes power system infrastructure and emissions," in review.

Modeling assumptions



EV adoption scenarios



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$\uparrow \text{EV}$ adoption : $\uparrow \text{wind}$, solar, gas & storage capacity



Scenarios with increasing EV adoption trajectories



Load timing matters, and flexible loads could have substantial implications

Endogenous (Flexible) EV Load Timing

Chen, J., M. Craig, J. Michalek, M. Bruchon and P. Vaishnaiv (2025) "Negative electric vehicle emissions: Vehicle-to-grid can incentivize enough wind and solar investment to reverse EV charging emissions," in review.

EVs have substantial potential as flexible load

Uncontrolled charging: The EV owner begins charging at full power following the last trip of the day until the vehicle is fully charged

Controlled charging: The EV owner allows the utility to decide charge timing following the last trip of the day, so long as it is fully charged prior to the first trip the following day. Charge timing is optimized to minimize operational cost

Vehicle to grid (V2G): Identical to controlled charging except that charging can be negative (sold back to the grid or displacing home load)

PJM case study

To understand the effects of flexible load on power system outcomes, we zoom in to a detailed case study with the resolution and tractability to model the effects of flexible load

PJM is the largest RTO in the US, serving 65M people in 13 states + DC

Grid mix similar to North America as a whole

5 transmission-constrained subregions

NHTS data on vehicle travel patterns

Weighted representative sample of vehicles selected to optimally match fleet statistics



Optimization model

Minimize operation costs (generation, startup, and generator, storage and vehicle reserves)

$$\begin{aligned} \text{Minimize } Z &= \sum_{t \in \mathcal{T}} \sum_{i \in I_r} \left(C_i^{\text{VARGEN}} p_{i,t}^{\text{GEN}} + s_{i,t}^{\text{STARTUP}} + C_i^{\text{GENRES}} a_{i,t}^{\text{GEN}} \right) \\ &+ \sum_{t \in \mathcal{T}} \sum_{k \in \mathcal{K}} C_k^{\text{STR}} a_{k,t}^{\text{STR}} + \sum_{t \in \mathcal{T}} \sum_{v \in \mathcal{V}} \sum_{r \in \mathcal{R}} C^{\text{VEH}} a_{v,r,t}^{\text{VEH}} \end{aligned}$$

subject to

- Reserve constraints
- Startup and shutdown constraints
- Ramp rate constraints
- Uptime and downtime constraints

```
Subject to
Generator constraints:
                                                                                                                                                                                                                                                      Generator regu-
                  a_{i,t}^{\text{GEN}} \le 1/12 * (p_{i,t-1} + R_i u_{i,t} + p_i^{\text{GENMIN}}(u_{i,t} - u_{i,t-1}) - p_{i,t}) - a_{i,t}^{\text{GENSP}}
                                                                                                                                                                                                                  \forall i \in \mathcal{I} \neq 1, \forall t \in \mathcal{T}lation reserve of-
                                                                                                                                                                                                                                                     fer constraints
                                                                                                                                                                                                                                                      Generator regu-
                  a_{i,t}^{\text{GEN}} \leq 1/12 * \left(p_i^{\text{GENMAX}} - p_{i,t}\right) - a_{i,t}^{\text{GENSP}}
                                                                                                                                                                                                                  \forall i \in \mathcal{I} \neq 1, \forall t \in \mathcal{T}lation reserve of-
                                                                                                                                                                                                                                                      fer constraints
                                                                                                                                                                                                                                                     Generator regu-
                  a_{i,t}^{\text{GEN}} \leq 1/12 * \left(p_i^{\text{GENMAX}} u_{i,t}\right) - a_{i,t}^{\text{GENSP}}
                                                                                                                                                                                                                  \forall i \in \mathcal{I} \neq 1, \forall t \in \mathcal{T}lation reserve of-
                                                                                                                                                                                                                                                      fer constraints
                                                                                                                                                                                                                                                      Generator spin-
                   a_{i,t}^{\text{GENSP}} \leq 1/6 * (p_{i,t-1} + R_i u_{i,t} + p_i^{\text{GENMIN}}(u_{i,t} - u_{i,t-1}) - p_{i,t}) - a_{i,t}^{\text{GENSP}}
                                                                                                                                                                                                                  \forall i \in \mathcal{I} \neq 1, \forall t \in \mathcal{T} \text{ning} \qquad \text{reserve}
                                                                                                                                                                                                                                                     offer constraints
                                                                                                                                                                                                                                                      Generator spin-
                  a_{i,t}^{\text{GENSP}} \leq 1/6 * (p_i^{\text{GENMAX}} - p_{i,t}) - a_{i,t}^{\text{GEN}}
                                                                                                                                                                                                                  \forall i \in \mathcal{I} \neq 1, \forall t \in \mathcal{T}ning
                                                                                                                                                                                                                                                                        reserve
                                                                                                                                                                                                                                                     offer constraints
                                                                                                                                                                                                                                                      Generator spin-
                   a_{i,t}^{\text{GENSP}} \leq 1/6 * \left( p_i^{\text{GENMAX}} u_{i,t} \right) - a_{i,t}^{\text{GEN}}
                                                                                                                                                                                                                  \forall i \in I \neq 1, \forall t \in T \text{ning}
                                                                                                                                                                                                                                                                       reserve
                                                                                                                                                                                                                                                      offer constraints
                                                                                                                                                                                                                                                      Slack variable re-
                   s_{i,t}^{\text{STARTUP}} \ge (u_{i,t} - u_{i,t-1}) C_i^{\text{STARTGEN}}
                                                                                                                                                                                                                          \forall i \in \mathcal{I}, \forall t \in \mathcal{T}flects
                                                                                                                                                                                                                                                      startup decision
                                                                                                                                                                                                                         \forall i \in \mathcal{I}, \forall t \in \mathcal{T}^{\text{Slack variable is}}
                    s_{i,i}^{\text{STARTUP}} > 0
                                                                                                                                                                                                                                                     nonnegative
                                                                                                                                                                                                                                                      Min and max out-
                   p_i^{\text{GENMIN}} u_{i,t} \le p_{i,t} \le p_i^{\text{GENMAX}} u_{i,t}
                                                                                                                                                                                                                          \forall i \in \mathcal{I}, \forall t \in \mathcal{T}^{\text{put}}
                                                                                                                                                                                                                                                      of online genera-
                                                                                                                                                                                                                                                      tors
                   p_{i,t}^{\text{GEN}} \leq p_{i,t-1}^{\text{GEN}} + R_i u_{i,t-1} + p_i^{\text{GENMIN}} (u_{i,t} - u_{i,t-1})
                                                                                                                                                                                                                          \forall i \in \mathcal{I}, \forall t \in \mathcal{T}Ramp rate limit
                  p_{i,t-1}^{\text{GEN}} \le p_{i,t}^{\text{GEN}} + R_i u_{i,t} + p_i^{\text{GENMIN}} (u_{i,t-1} - u_{i,t})
                                                                                                                                                                                                                          \forall i \in \mathcal{I}, \forall t \in \mathcal{T}Ramp rate limit
                   T_i^{\text{UPMIN}} - T_i^{\text{UPSTART}} \sum_{t=2}^{T_i^{\text{UPSTART}}} 
                                                                                                                                                                                                                                         \forall i \in \mathcal{I}_{\text{(first timesteps)}}^{\text{Minimum uptime}}
                                               (1-u_{i,t})=0
                  \sum_{t'=t}^{t+T_i^{\text{UPMIN}}-1} u_{i,t'} \geq T_i^{\text{UPMIN}} \left( u_{i,t} - u_{i,t-1} \right)
                                                                                                                                                                      \begin{array}{l} \forall i \in \mathcal{I}, \qquad \qquad \text{Minimum} \\ \forall t : \ T_i^{\text{UPMIN}} - T_i^{\text{UPSTART}} + 1 \leq t \leq |\mathcal{T}| - (\text{middle} \\ T_i^{\text{UPMIN}} + 1 \qquad \qquad \text{timestep} \end{array}
                                                                                                                                                                                                                                                      Minimum uptime
                                                                                                                                                                                                                                                      timesteps)
                                                                                                                                                                                                                  \forall i \in \mathcal{I}.
                                                                                                                                                                                                                                                     Minimum uptime
                   \sum_{t=t}^{n} u_{i,t'} \ge (T-t) \left( u_{i,t} - u_{i,t-1} \right)
                                                                                                                                                                                                                  ∀t
                                                                                                                                                                                                                                                    (final timesteps)
                                                                                                                                                                                                                  |\mathcal{T}| - T_i^{\text{UPMIN}} + 2
                    \sum_{t=2}^{T_i^{\text{DTMIN}} - T_i^{\text{DTSTART}}} u_{i,t} = 0
                                                                                                                                                                                                                                                     Minimum down-
                                                                                                                                                                                                                                         \forall i \in Itime
                                                                                                                                                                                                                                                     (first timesteps)
                   \sum_{i=T_{i}^{\text{DTMIN}-1}}^{t+T_{i}^{\text{DTMIN}-1}} 1 - u_{i,t'} \geq T_{i}^{\text{DTMIN}}\left(u_{i,t-1} - u_{i,t}\right)
                                                                                                                                                                                                                  \forall i \in I.
                                                                                                                                                                                                                                                     Minimum down-
                                                                                                                                                                                                                  \forall t : T_i^{\text{DTSTART}} + \text{time}
                                                                                                                                                                                                                  1 \leq t \leq |\mathcal{T}| - (\text{middle})
                                                                                                                                                                                                                   T_i^{\text{DTSTART}} + 1 timesteps)
                                                                                                                                                                                                                   \forall i \in \mathcal{I},
                                                                                                                                                                                                                                                     Minimum down-
                                                                                                                                                                                                                   \forall t :
                                                                                                                                                                                                                                       |\mathcal{T}|
                   \sum_{i=1}^{1} 1 - u_{i,t'} \ge (|\mathcal{T}| - t) \left( u_{i,t-1} - u_{i,t} \right)
                                                                                                                                                                                                                  T_i^{\text{DTSTART}} + 2 \leq_{\text{(final timesteps)}}^{\text{time}}
```

(1)

(2)

(3)

(4)

(5)

(6)

(7)

(8)

(9)

(10)

(11)

(12)

(13)

(14)

(15)

(16)

(17)

subject to

- Demand-supply constraints
- Transmission constraints
- Wind and solar availability constraints
- Storage energy and power constraints
- PEV battery SOC constraints
- PEV fully charged constraint for first trip of the day

```
System constraints:
                  P_{r,t} = \sum_{i \in \mathcal{I}_r} p_{i,t}^{\text{GEN}} + \sum_{k \in \mathcal{K}_r} p_{i,t}^{\text{STRD}} - \sum_{k \in \mathcal{K}_r} p_{i,t}^{\text{STRC}} - \sum_{r' \in \mathcal{R} \neq r} (p_{r',r,t}^{\text{RR}})
                                                                                                                                                                                                                             \forall r \in \mathcal{R}, t \in \mathcal{T}^{\text{Demand}} \quad \text{must}
                                                                                                                                                                                                                                                                                                         (18)
                          +\sum_{r,r,r',t} (p_{r,r',t}^{RR} \eta^{TR}) + p_{r,t}^{SGEN} + p_{r,t}^{WGEN} - \sum_{v \in \mathcal{V}} p_{v,r,t}^{VR} + \sum_{v \in \mathcal{V}} p_{v,r,t}^{DR}
                                                                                                                                                                                                                                                           equal supply
                                                                                                                                                                                                    \forall r \in \mathcal{R}, r' \in \mathcal{R} \neq r, t \in \mathcal{T}^{\text{Inter-region}}
                     -p_{r,r',t}^{\text{RRMAX}} \le p_{r,r',t}^{\text{RR}} \le p_{r,r',t}^{\text{RRMAX}}
                                                                                                                                                                                                                                                                                                          (19)
                                                                                                                                                                                                                                                            power flow limits
                                                                                                                                                                                                                                                         Regional solar PV
                   0 \le p_{r,t}^{\text{SGEN}} \le p_{r,t}^{\text{SGENMAX}}
                                                                                                                                                                                                                              \forall r \in \mathcal{R}, t \in \mathcal{T}
                                                                                                                                                                                                                                                                                                          (20)
                                                                                                                                                                                                                                                          output limits
                                                                                                                                                                                                                                                          Regional wind
                   0 \le p_{r,t}^{\text{WGEN}} \le p_{r,t}^{\text{WGENMAX}}
                                                                                                                                                                                                                             \forall r \in \mathcal{R}, t \in \mathcal{T}generator output
                                                                                                                                                                                                                                                                                                          (21)
                                                                                                                                                                                                                                                           limits
                                                                                                                                                                                                                                                          Regional spin-
                                                                                                                                                                                                                            \forall r \in \mathcal{R}, t \in \mathcal{T}^{\text{ning}} reserve
                   \phi^{SPIN} * P_{r,t} = \sum_{a} a_{i,t}^{GENSP} + \sum_{a} a_{k,t}^{STRSP} + \sum_{a} a_{v,r,t}^{VRSP}
                                                                                                                                                                                                                                                                                                         (22)
                                                                                                                                                                                                                                                           requirement
                                                                                                                                                                                                                                                          must be met
                                                                                                                                                                                                                                                          Regional regu-
                                                                                                                                                                                                                            \forall r \in \mathcal{R}, t \in \mathcal{T}^{\text{lation}} reserve
                   \phi^{REG} * P_{r,t} + \phi^{WIND} * p_{r,t}^{WGEN} + \phi^{SOL} * p^{S} = \sum_{i \in \mathcal{I}} a_{i,t}^{GEN} + \sum_{k \in \mathcal{I}} a_{k,t}^{STR} + \sum_{s \in \mathcal{I}} a_{o,r,t}^{VR}
                                                                                                                                                                                                                                                                                                         (23)
                                                                                                                                                                                                                                                            requirement
                                                                                                                                                                                                                                                          must be met
Storage constraints:
                                                                                                                                                                                                                           \forall k \in \mathcal{K}, \forall t \in \mathcal{T}^{\text{Storage state of}}
                   c_{k,t+1}^{\text{STR}} = c_{k,t}^{\text{STR}} + p_{k,t}^{\text{STRC}} \eta^{\text{STR}} - p_{k,t}^{\text{STRD}} / \eta^{\text{STR}}
                                                                                                                                                                                                                                                                                                          (24)
                                                                                                                                                                                                                                                          charge
                                                                                                                                                                                                                           \forall k \in \mathcal{K}, \forall t \in \mathcal{T}^{\text{Storage unit ca-}}
                   c_k^{\text{STRMIN}} \le c_{k,t}^{\text{STR}} \le c_k^{\text{STRMAX}}
                                                                                                                                                                                                                                                                                                          (25)
                                                                                                                                                                                                                                                           pacity
                                                                                                                                                                                                                                                           Max charge and
                   0 \le p_{k,t}^{\text{STRD}}, p_{k,t}^{\text{STRC}} \le p_{k}^{\text{STRMAX}}
                                                                                                                                                                                                                            \forall k \in \mathcal{K}, \forall t \in \mathcal{T} discharge of stor-
                                                                                                                                                                                                                                                                                                          (26)
                                                                                                                                                                                                                                                           age units
                                                                                                                                                                                                                                                           Max regulation
                                                                                                                                                                                                                           \forall k \in \mathcal{K}, \forall t \in \mathcal{T}^{and} spinning
                   a_{k,t}^{\text{STRSP}} \leq p_k^{\text{STRMAX}} - p_{k,t}^{\text{STRD}} + p_{k,t}^{\text{STRC}} - a_{k,t}^{\text{STR}}
                                                                                                                                                                                                                                                                                                         (27)
                                                                                                                                                                                                                                                            reserve offer of
                                                                                                                                                                                                                                                          storage units
                                                                                                                                                                                                                                                           Max regulation
                                                                                                                                                                                                                           \forall k \in \mathcal{K}, \forall t \in \mathcal{T}^{and} spinning
                   a_{k,t}^{\text{STRSP}} \leq c_{k,t}^{\text{STR}} - a_{k,t}^{\text{STR}}
                                                                                                                                                                                                                                                                                                          (28)
                                                                                                                                                                                                                                                           reserve offer of
                                                                                                                                                                                                                                                          storage units
PEV constraints:
                                                                                                                                                                                                           \forall v \in \mathcal{V}, \forall r \in \mathcal{R}, \forall t \in \mathcal{T}^{\text{PEV}} \quad \text{state} \quad \text{of}
                   c_{n,r,t+1}^{\text{VEH}} = c_{n,r,t}^{\text{CHG}} - p_{n,r,t}^{\text{VR}} \eta_n^{\text{VEH}} - N_{v,r} M_{v,t} \eta_n^{\text{VEH}}
                                                                                                                                                                                                                                                                                                          (29)
                                                                                                                                                                                                                                                          charge
                                                                                                                                                                                                           \forall v \in \mathcal{V}, \forall r \in \mathcal{R}, \forall t \in \mathcal{T}^{\text{PEV}} battery ca-
                   10\% N_{v,r} B_v \le c_{v,r,t}^{\text{VEH}} \le 90\% N_{v,r} B_v
                                                                                                                                                                                                                                                                                                          (30)
                                                                                                                                                                                                                                                           PEVs
                                                                                                                                                                                                                                                                                    fully
                    c_{n,r,t}^{\text{VEH}} = 90\% N_{n,r} B_n
                                                                                                                                                                                              \forall v \in V, \forall r \in R, \forall t = T_v^{DEPART} charged when
                                                                                                                                                                                                                                                                                                          (31)
                                                                                                                                                                                                                                                           departing home
                                                                                                                                                                                                           \forall v \in \mathcal{V}, \forall r \in \mathcal{R}, \forall t \in \mathcal{T}, state of
                   c_{v,r,t+1}^{\text{VEH}} = c_{v,r,t}^{\text{CHG}} - p_{v,r,t}^{\text{VR}} / \eta_v^{\text{CHG}} + p_{v,r,t}^{\text{DR}} * \eta_v^{\text{CHG}} N_{v,r} M_{v,t} \eta_v^{\text{VEH}}
                                                                                                                                                                                                                                                                                                          (32)
                                                                                                                                                                                                           \forall v \in \mathcal{V}, \forall r \in \mathcal{R}, \forall t \in \mathcal{T}^{\text{PEV}} charge rate
                   0 \le p_{v,r,t}^{\text{VR}}, p_{v,r,t}^{\text{DR}} \le N_{v,r}A_{v,t}R_v^{\text{MAXCHG}}
                                                                                                                                                                                                                                                                                                         (33)
                                                                                                                                                                                                                                                           limit
                                                                                                                                                                                                           \forall v \in \mathcal{V}, \forall r \in \mathcal{R}, \forall t \in \mathcal{T}^{\text{PEV} \text{ battery ca-}}
                   0 \le c_{v,r,t}^{\text{VEH}} \le N_{v,r}B_v
                                                                                                                                                                                                                                                                                                         (34)
                                                                                                                                                                                                                                                           pacity
                                                                                                                                                                                                                                                          Max regulation
                                                                                                                                                                                                                            \forall r \in \mathcal{R}, \forall v \in \mathcal{V}^{\text{and}}
                   a_{nrt}^{\text{VRSP}} \leq N_{v,r}A_{v,t}R_n^{\text{MAXCHG}} - p_{nrt}^{\text{DR}} + p_{nrt}^{\text{VR}} - a_{nrt}^{\text{VR}}
                                                                                                                                                                                                                                                                            spinning
                                                                                                                                                                                                                                                           reserve offer of
                                                                                                                                                                                                                                                            vehicle fleets
                   a_{nrt}^{\text{VRSP}} \leq c_{nrt}^{\text{VEH}} - a_{nrt}^{\text{VR}}
                                                                                                                                                                                                             \forall r \in \mathcal{R}, \forall v \in \mathcal{V}, \forall t \in \mathcal{T}
                                                                                                                                                                                                                                                                                                          (35)
                                                                                                                                                                                                                                                                                                          (36)
```



We find the maximum profitable wind+solar capacity under each scenario



Flexible load increases incentives to invest in wind and solar capacity



Carnegie Mellon University Engineering & Public Policy

Allowing capacity expansion changes the effects of flexible EV load on generation

Without induced s capacity expansion, flexible EV load allows coal to displace gas



Carnegie Mellon University Engineering & Public Policy

Induced capacity expansion lowers emissions, flips sign

Flexible load and especially V2G can make it profitable to build so much more wind & solar that the net effect of **adding** EV load is to **reduce** total grid emissions



Robustness checks

	5		3			
Input parameters	Baseline value	Tested value	Induced wind and solar capacity investment per PEV	Annual system cost reduction per PEV per year	Annual emissions externality reduction per PEV	Interpretation
Stationary storage capacity	5.4 GW 42 GWh	14 GW 56 GWh	-74%	-80%	-71%	PEV V2G has smaller (but positive) benefits for power systems with more stationary storage.
Transmission capacity	Varies	2× baseline	+21%	+25%	+32%	PEV V2G has larger benefits in power systems with more transmission capacity.
PEV fleet penetration	10%	20%	-15%	-19%	-32%	Larger PEV fleets yield diminishing returns.
Wind to solar capacity ratio	1.17	1.43 0.96	+4% +20%	+14% +14%	+4% +4.5%	PEV V2G benefits vary with assumed wind-to-solar ratio.

Table 2: Sensitivity Analysis: Robustness of V2G Results to Parameter Variations.Estimates are relative to the base case V2G effect estimates.

Caveats

Simulation/Optimization: Cannot capture all possible effects that determine power system operations in practice, but our unit commitment models are similar in many ways to those used by system operators

Capacity Expansion: Solving for optimal capacity expansion with the time scope, resolution, and vehicle resolution needed to assess load flexibility is intractable, but it is also not critical. We instead model scenarios of wind and solar expansion at ratios suggested by the interconnection queue, and we test alternative assumptions. Key findings are robust.

Perfect Information: Charging control scenarios represent best-case outcomes with perfect lookahead, optimal dispatch, and full participation – an aspirational bound we might approach with improved data and forecasting.

Non-Market Factors: Capacity investment scenarios examine what is profitable to build. Actual investment is affected by many other factors (regulation, permitting, politics, etc.)

More information

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