



# A Welfare Analysis of Policies Impacting Climate Change

Robert Hahn, Nathaniel Hendren,  
Robert Metcalfe, Ben Sprung-Keyser

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    - Grid and vehicle emissions differ drastically over time (and across space)

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  - 2) “Cost” per ton of CO<sub>2</sub> abated has at least 3 conceptually distinct and (often conflated) definitions in the literature
    - Resource cost per ton; government cost per ton; social cost per ton

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  - 1) Input assumptions differ across papers
  - 2) “Cost” per ton of CO<sub>2</sub> abated has at least 3 conceptually distinct and (often conflated) definitions in the literature
  - 3) “Cost per ton” methods each fail to fully capture welfare consequences
    - Treatment of inframarginal transfers and non-CO<sub>2</sub> benefits

## The MVPF of Policies Impacting Climate Change

- This paper: Extend and apply the Marginal Value of Public Funds (MVPF) framework to study the welfare impacts of US spending and revenue-raising policies addressing climate change

$$MVPF = \frac{\textit{Net Benefits to Individuals}}{\textit{Net Government Cost}}$$

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## Net Government Cost

- Upfront policy cost
- Impact of behavioral response on government budget (i.e., “fiscal externality”)

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- Suppose: Policy 1 has  $MVPF_1 = 1$  and Policy 2 has  $MVPF_2 = 2$ 
  - More spending on Policy 2 financed by less on 1 increases social welfare iff prefer to take \$1 from Policy 1 beneficiaries to give \$2 to Policy 2 beneficiaries
  - Can be transparent about a preference for equity
  - Can compare across policy domains (Hendren and Sprung-Keyser, 2020)

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### **For subsidy**

Higher MVPF is better

Infinite is Pareto improvement

### **For tax**

Lower MVPF is better

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**The willingness to pay for a small increase in the subsidy,  $d\tau$ , is given by  $WTP = x d\tau + V dx$**

- Monetary value of the subsidy (holding behavior fixed due to the envelope theorem), and the second term is the WTP from the change in the environmental externality.
- These two terms are sufficient for measuring WTP if we assume perfect competition and full pass-through.

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**The net cost to the government of the subsidy has two terms: Cost=  $x\tau + \tau dx$**

- The first term holds  $x$  fixed and the second term captures the fiscal impact of the change in  $x$ .
- This cost,  $\tau dx$ , is paid by the government but is not valued by individuals due to the envelope theorem.

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$$\begin{aligned} MVPF &= \frac{xd\tau + Vdx}{xd\tau + \tau dx} \\ &= \frac{1 + \frac{V}{p}(-\epsilon)}{1 + \frac{\tau}{p}(-\epsilon)} \end{aligned}$$

- where  $\epsilon = dx/dp \cdot p/x$  is the price elasticity of demand so that  $-\epsilon$  is the percentage change in consumption of  $x$  in response to a 1% increase in the consumer price.
- policies with high MVPFs tend to have higher magnitudes of the price elasticity,  $-\epsilon$ , higher environmental benefits per dollar of spending on the good,  $V/p$ , and lower preexisting subsidies,  $\tau/p$ .

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**Net benefits** for a subsidy = MVPF x Size (cost) of the policy

## Sample

- Construct MVPFs for a comprehensive set of spending and revenue-raising policies affecting greenhouse gas emissions rigorously evaluated using RCT or quasi-experimental methods
- Journal search from 2000–2024 in 18 journals and NBER working papers 2018+
- Full sample of 96 policies
  - 40 Subsidies: Wind, solar, EVs, HEVs, appliance rebates, vehicle retirement, weatherization
  - 11 Nudges and Marketing Policies (243 RCTs): Home Energy Reports (HERs), other nudges
  - 31 Revenue-raisers: Gasoline/fuel taxes, critical peak pricing, and cap and trade auctions.
  - 14 International Policies: Cookstoves, deforestation prevention, rice-burning prevention, energy efficiency rebates

## Data and Approach

- Use a consistent method to translate causal effects into benefits and costs
- Translate behavior (e.g., purchase new EV) into externality (e.g., CO<sub>2</sub>, etc.)
  - Vehicle externalities (VMT, MPG, lifespan), Grid composition (AVERT, EPA 2024)
- Translate externality into monetary valuations
  - SCC of \$193 in 2020 with 2% discount rate, robustness to \$76 and \$337
  - Local pollutants using AP3 with \$9.5M VSL (Tschofen, Azevedo, and Muller 2019)
- For each policy, construct two types of MVPFs
  - In-Context using measures from time and place where policy occurred
  - Baseline analysis as if the policy was implemented nationally in 2020 (assuming elasticities generalize)

# Roadmap

- 1 Subsidies
- 2 Nudges
- 3 Revenue Raisers
- 4 International Policies
- 5 Comparison to Cost per Ton Metrics

# Roadmap

- ① Investments that directly displace dirty electricity production have highest MVPFs (5+ for wind PTCs; 3-4 for residential solar; 1.5 for EVs; others ~1)
- ② **Nudges**
- ③ **Revenue Raisers**
- ④ **International Policies**
- ⑤ **Comparison to Cost per Ton Metrics**

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- 5 Common cost per ton metrics do not fully capture these lessons and often yield different rankings across definitions

# Roadmap

1

**Subsidies**

2

**Nudges**

3

**Revenue Raisers**

4

**International Policies**

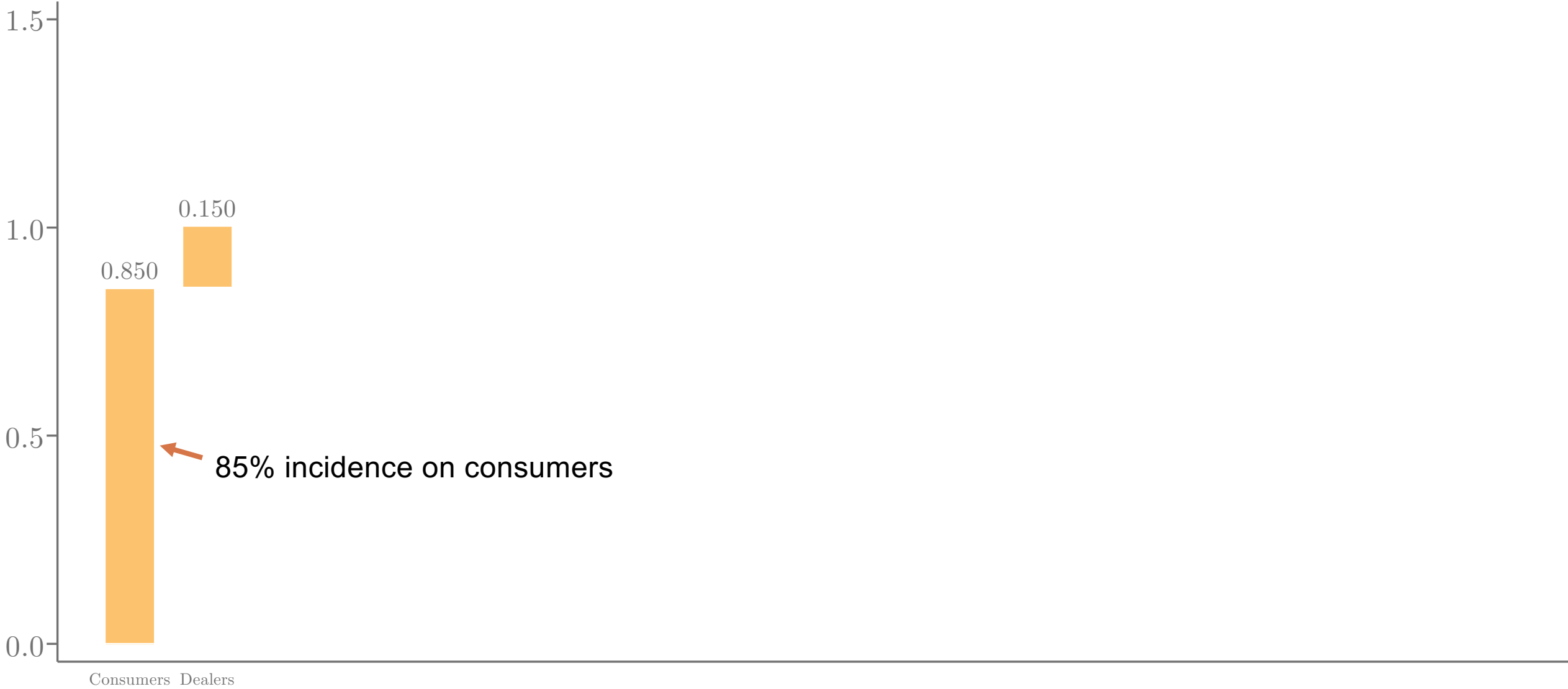
5

**Comparison to Cost per Ton Metrics**

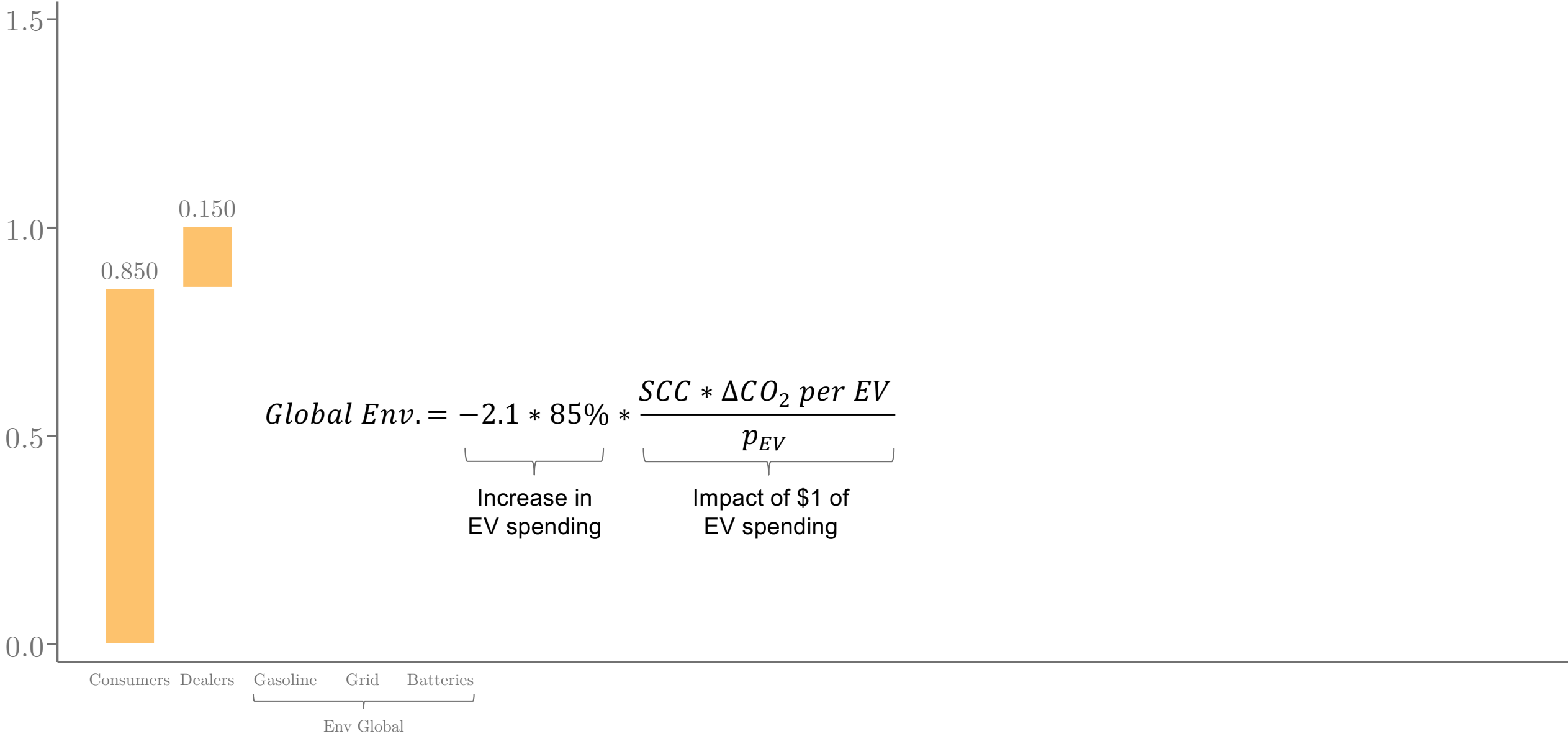
## Electric Vehicles: Example MVPF

- Consider an EV subsidy studied by Muehlegger and Rapson (2022)
- Use zip code variation in subsidies as part of the California Enhanced Fleet Modernization Program
- Estimate a price elasticity of demand of -2.1 and find that 85% of subsidy is passed to consumers
- How do we construct the MVPF? Consider a \$1 increase in federal EV subsidies in 2020.

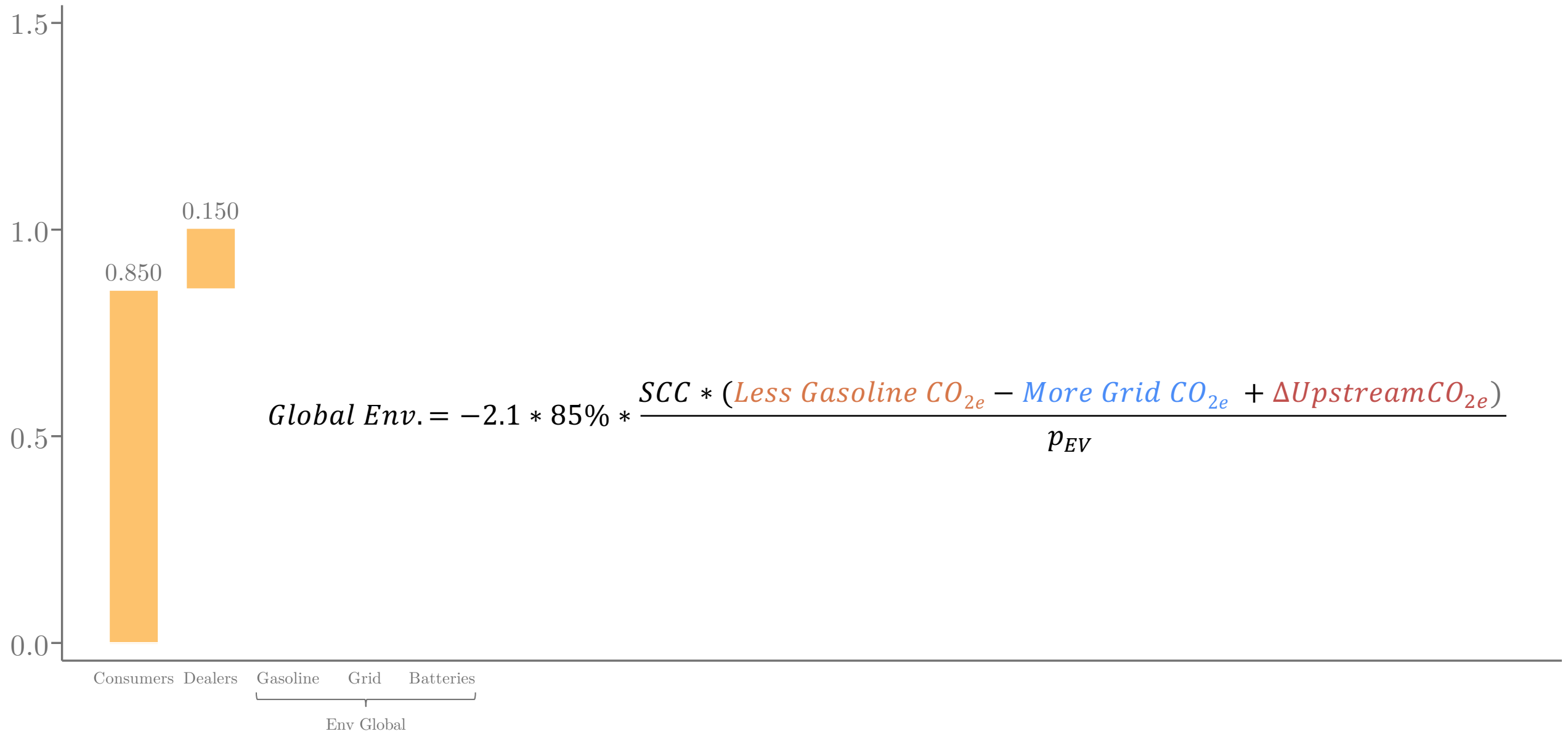
# Electric Vehicles: Subsidy Pass Through



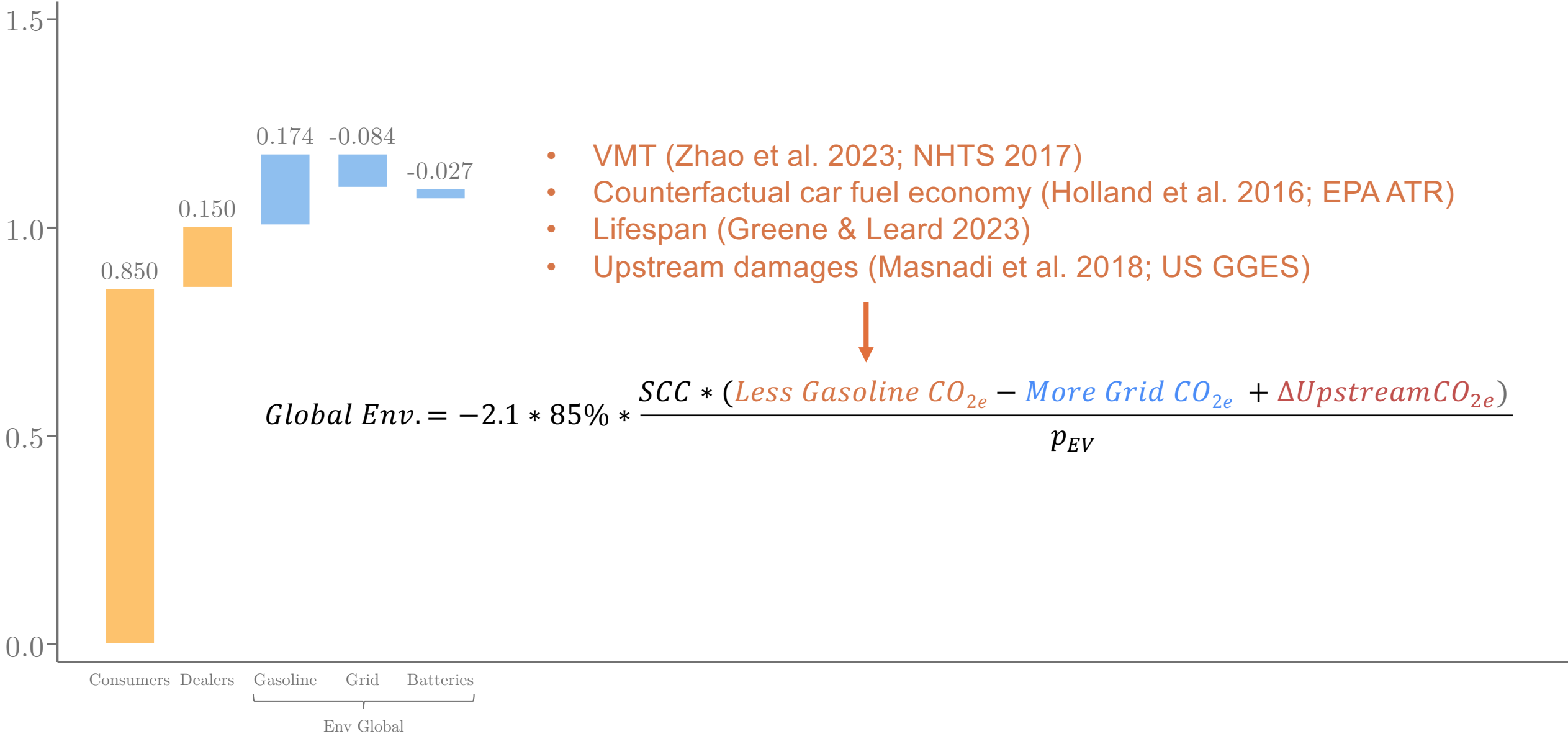
# Electric Vehicles: Global Environmental Benefits



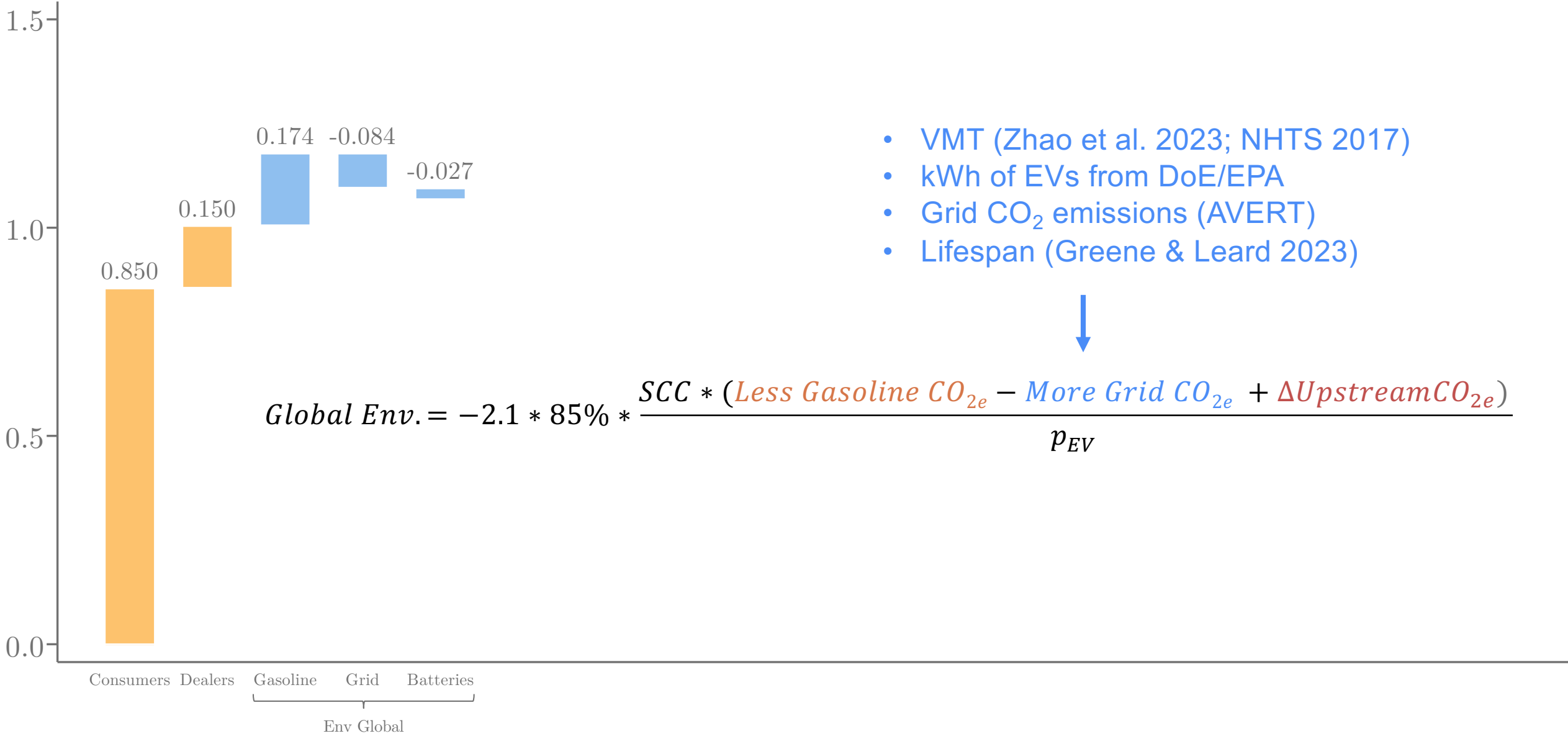
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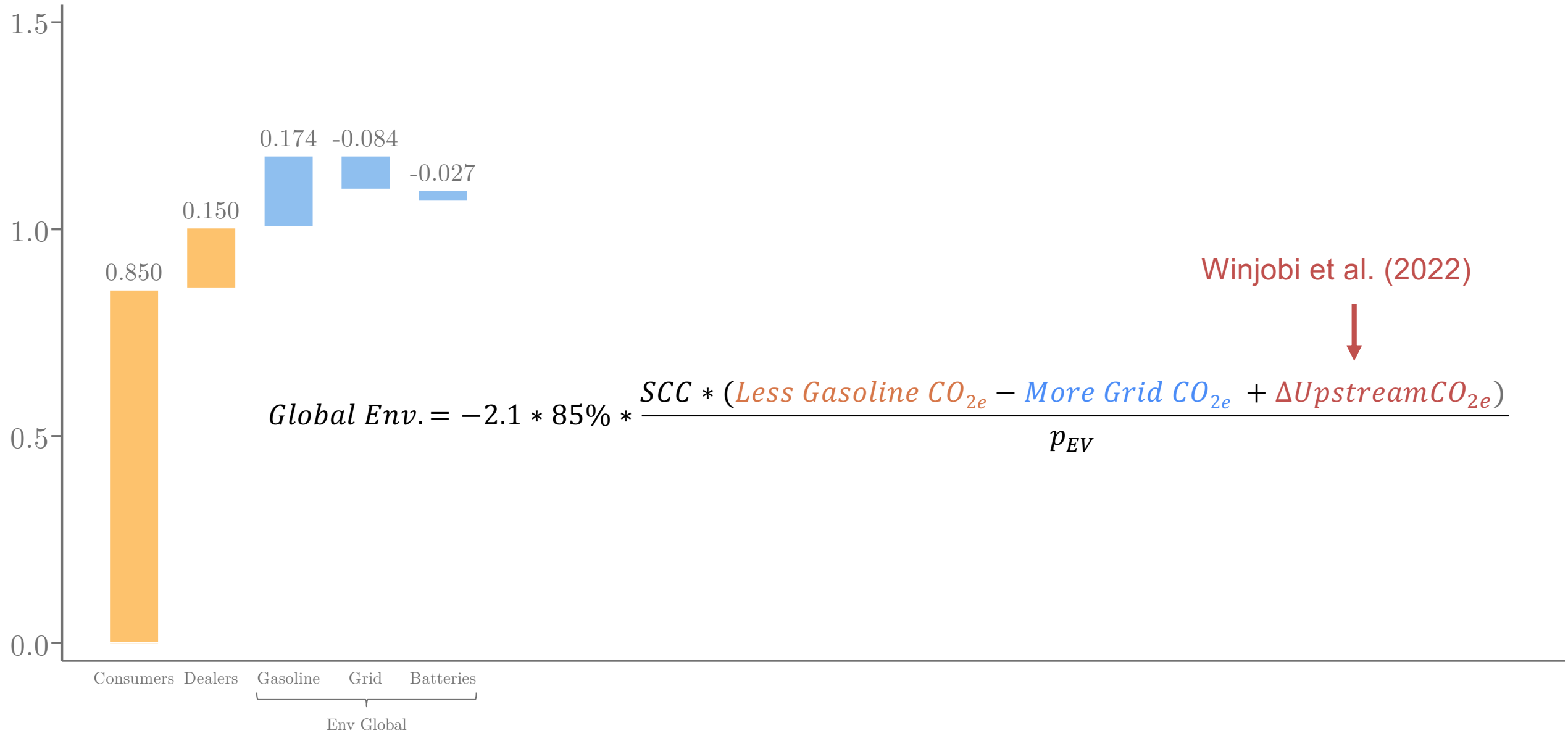
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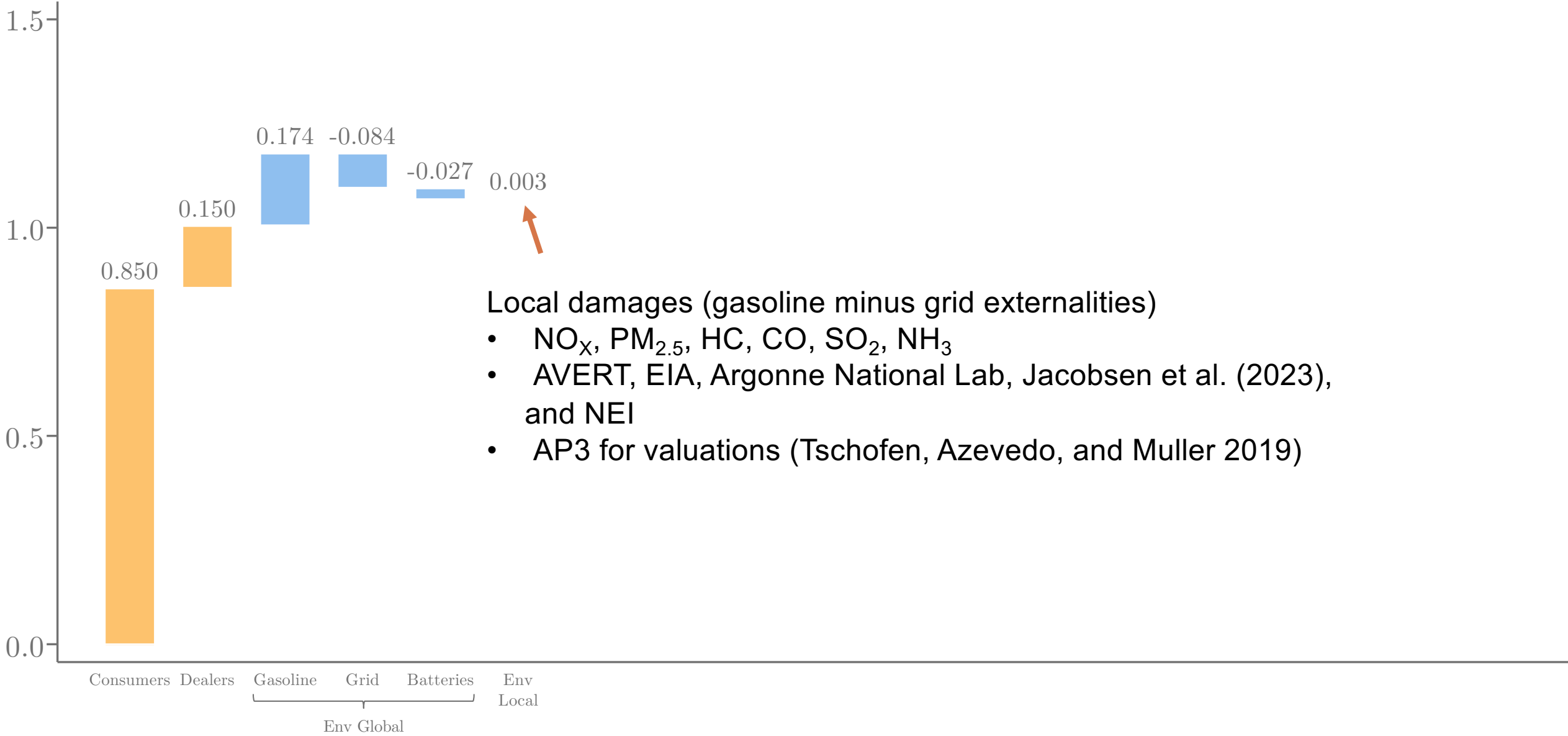
- VMT (Zhao et al. 2023; NHTS 2017)
- kWh of EVs from DoE/EPA
- Grid CO<sub>2</sub> emissions (AVERT)
- Lifespan (Greene & Leard 2023)



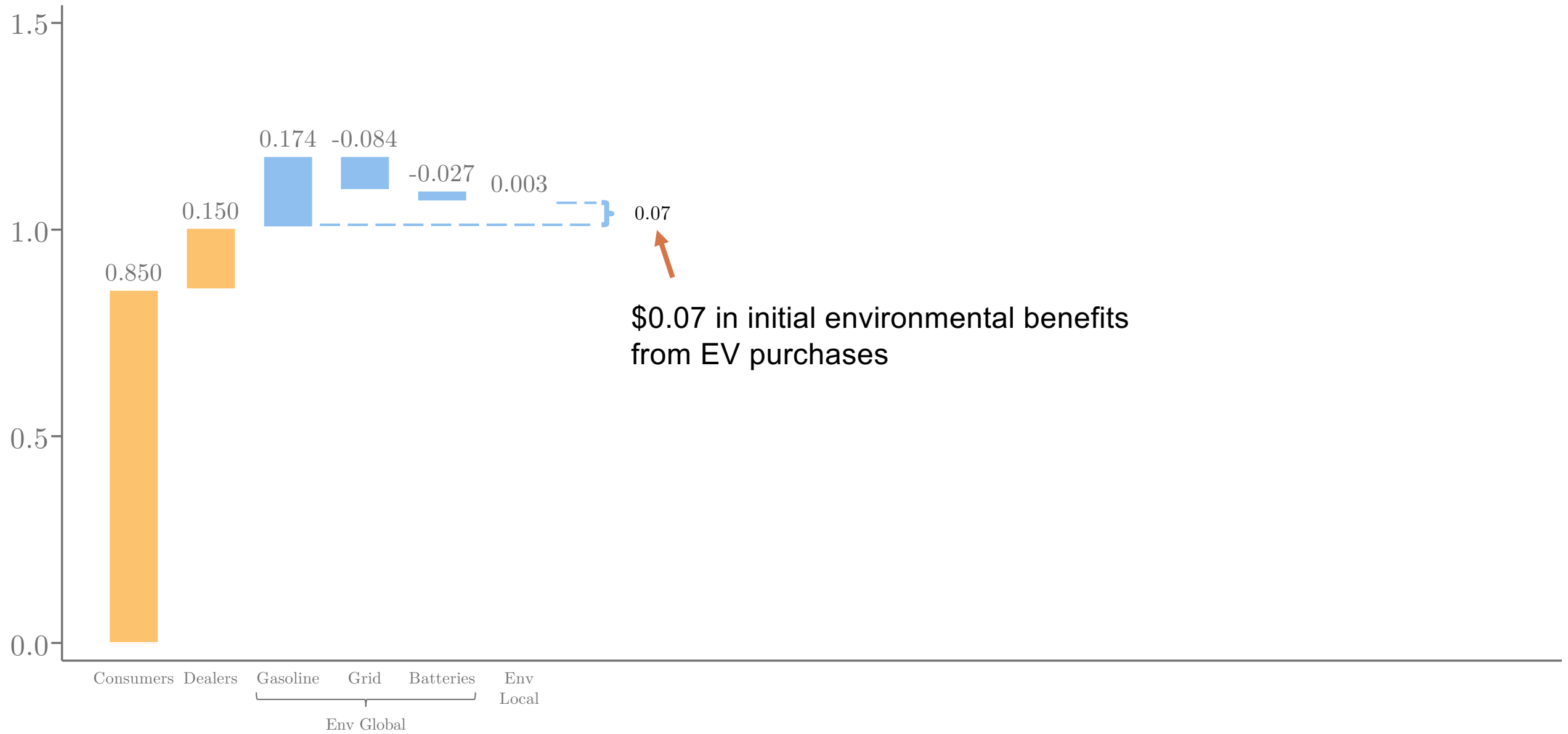
# Electric Vehicles: Global Environmental Benefits



# Electric Vehicles: Local Environmental Benefits



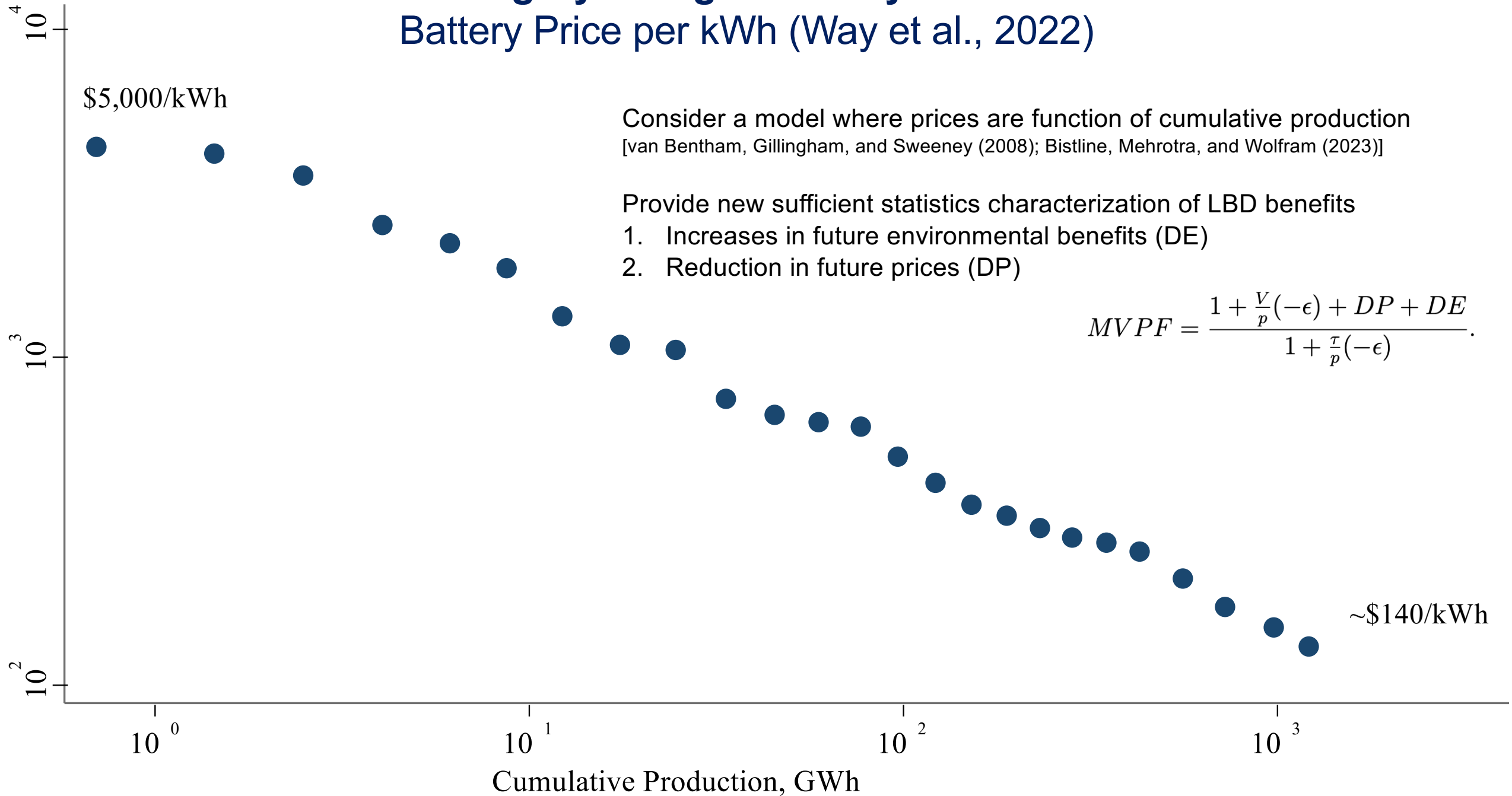
# Electric Vehicles: Total Environmental Benefits



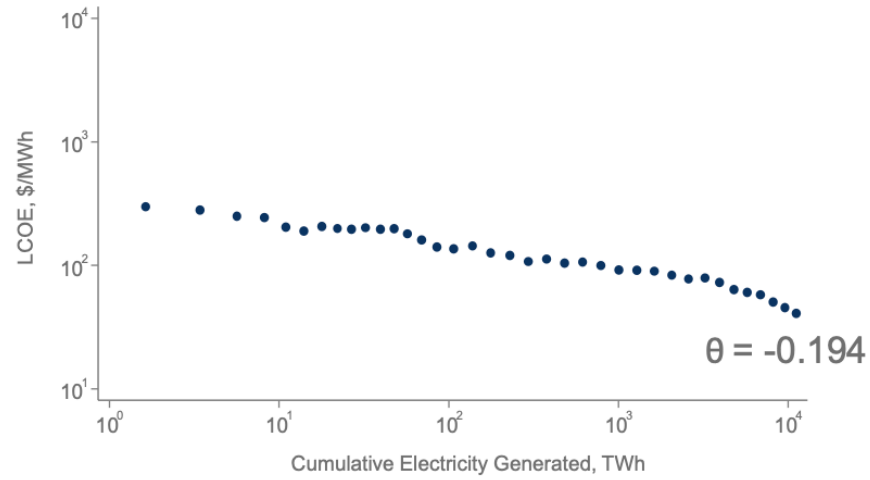
# Learning By Doing in Battery Production

## Battery Price per kWh (Way et al., 2022)

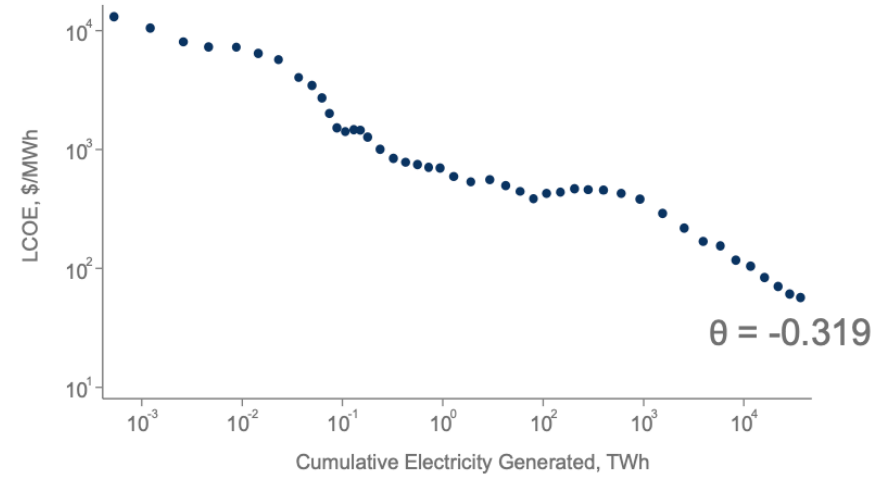
Cost, \$/kWh



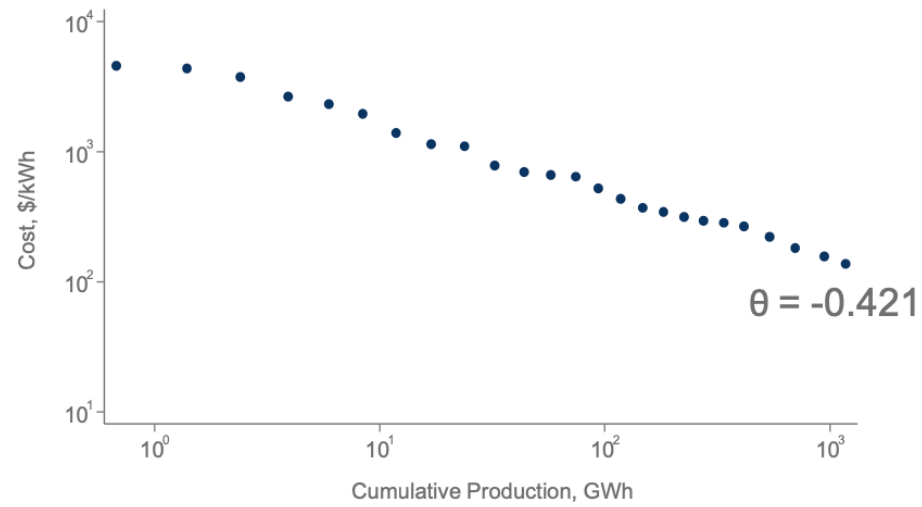
### A. Wind



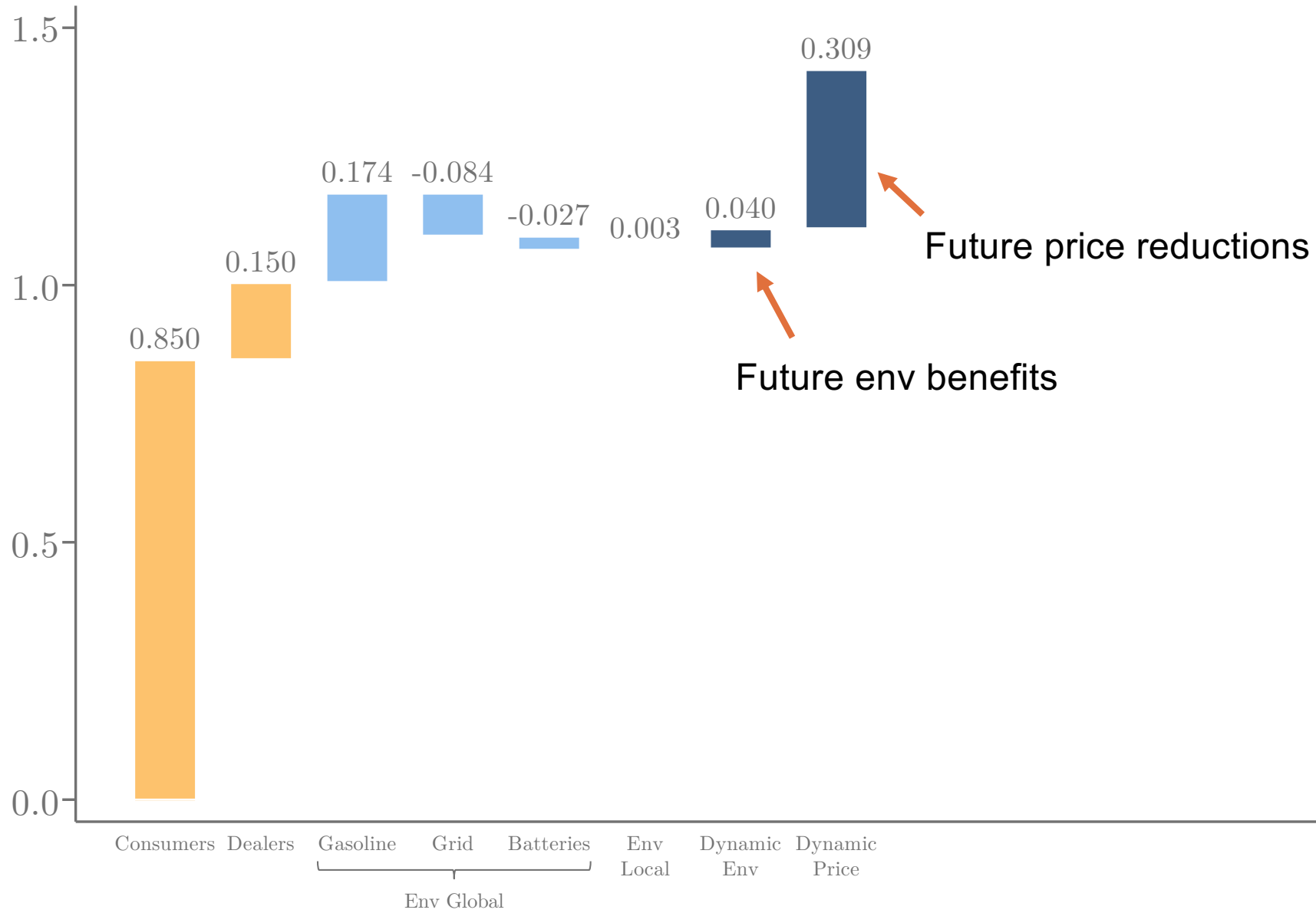
### B. Solar



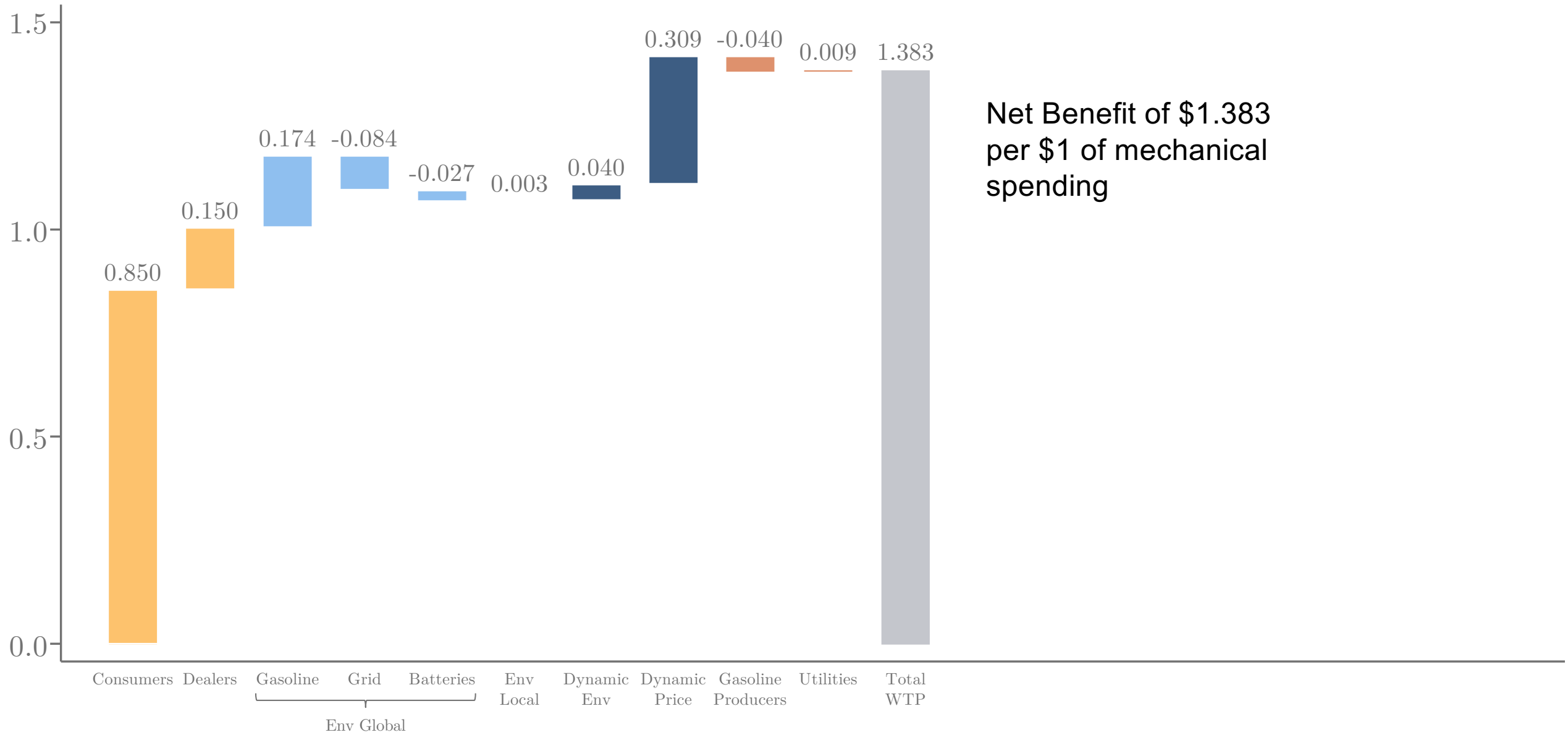
### C. Electric Vehicle Batteries



# Electric Vehicles: Learning by Doing Externalities

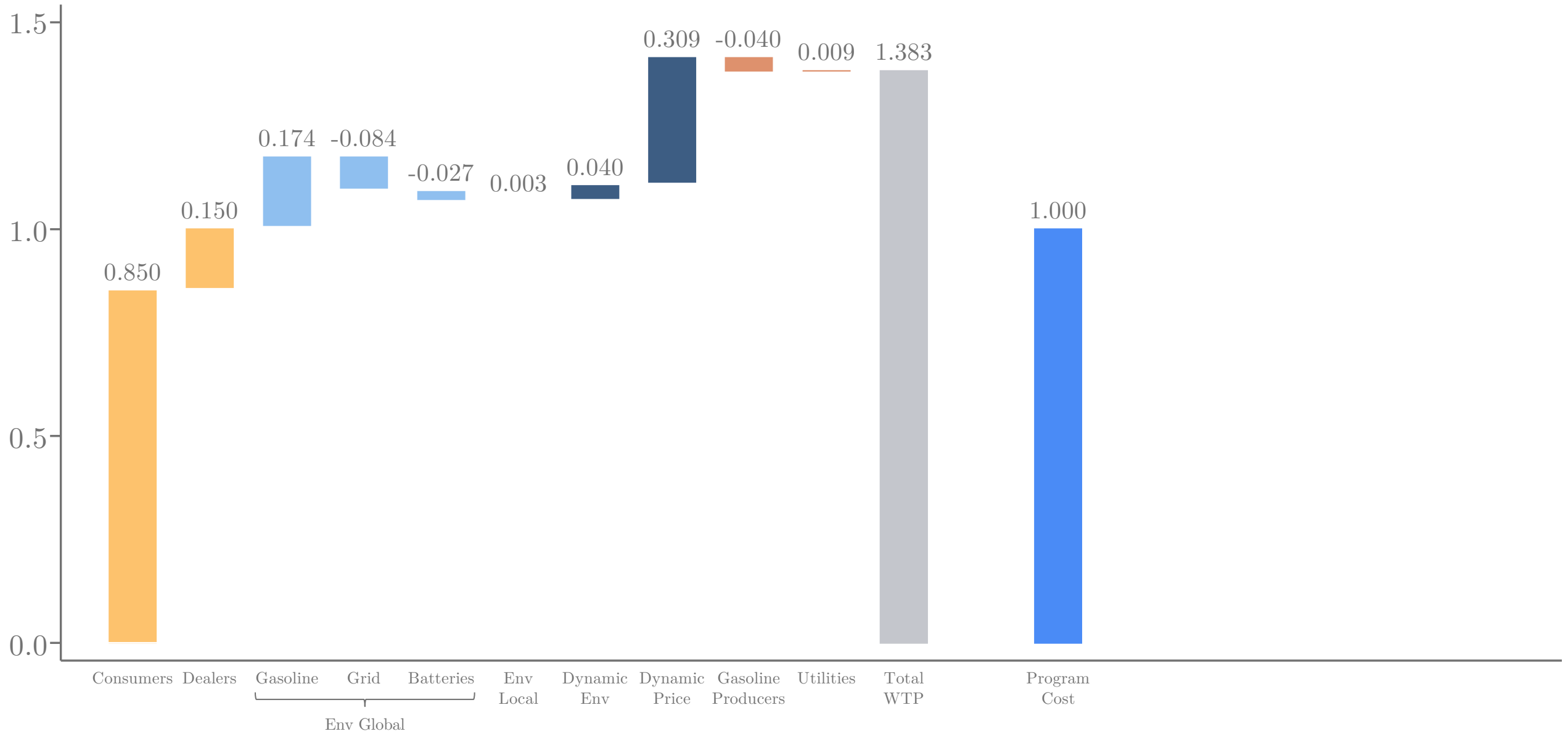


# Electric Vehicles: Net WTP

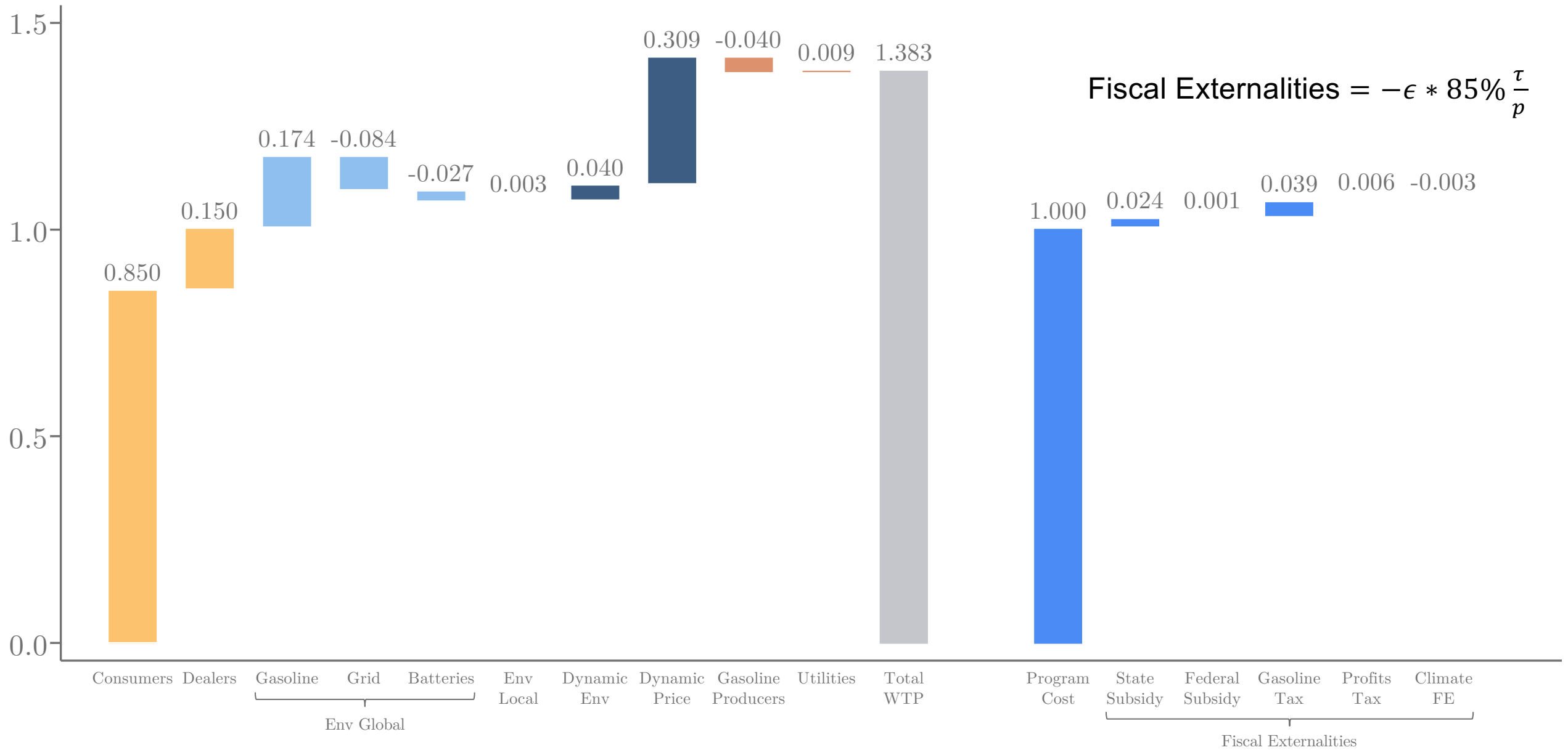


Net Benefit of \$1.383  
per \$1 of mechanical  
spending

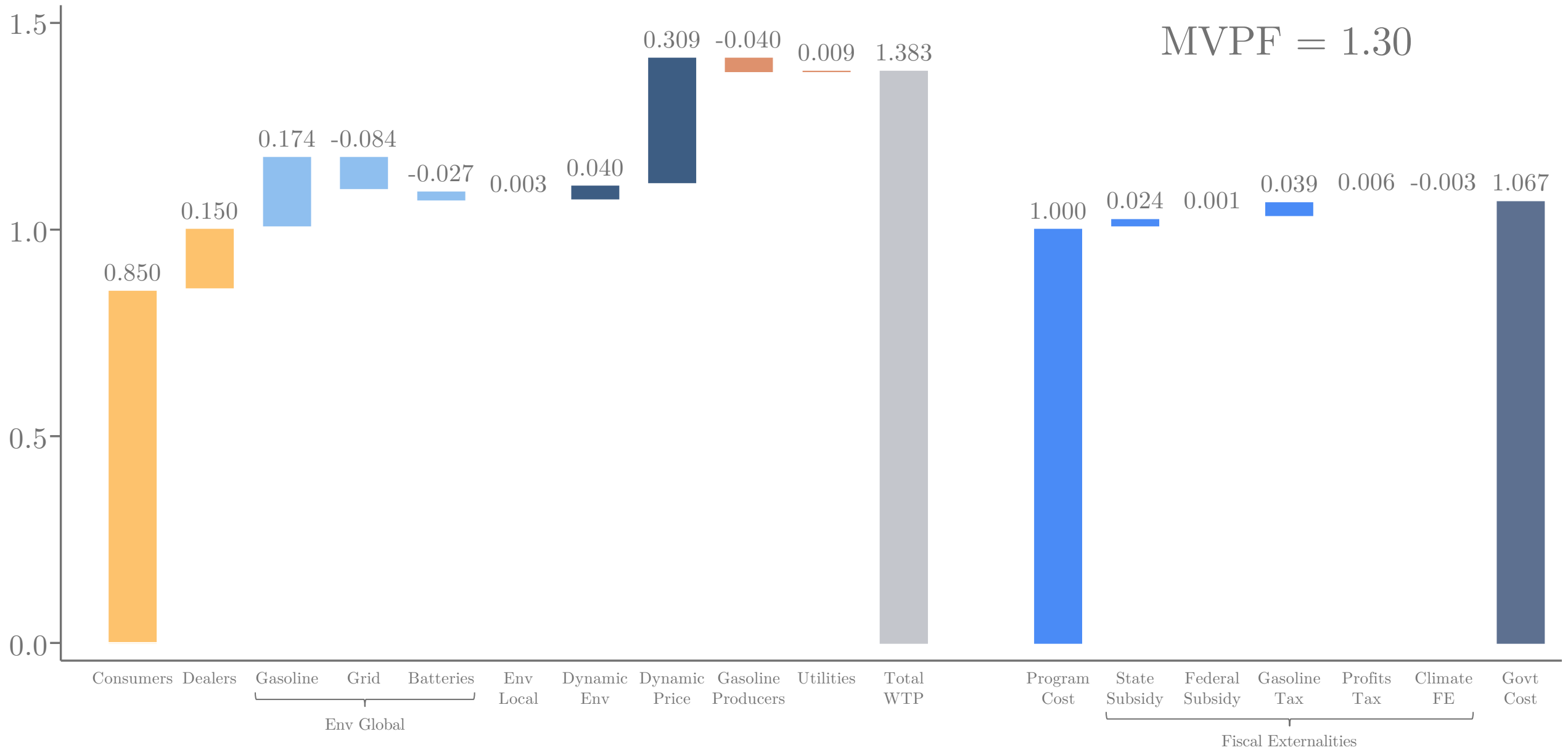
# Electric Vehicles: Cost to Government



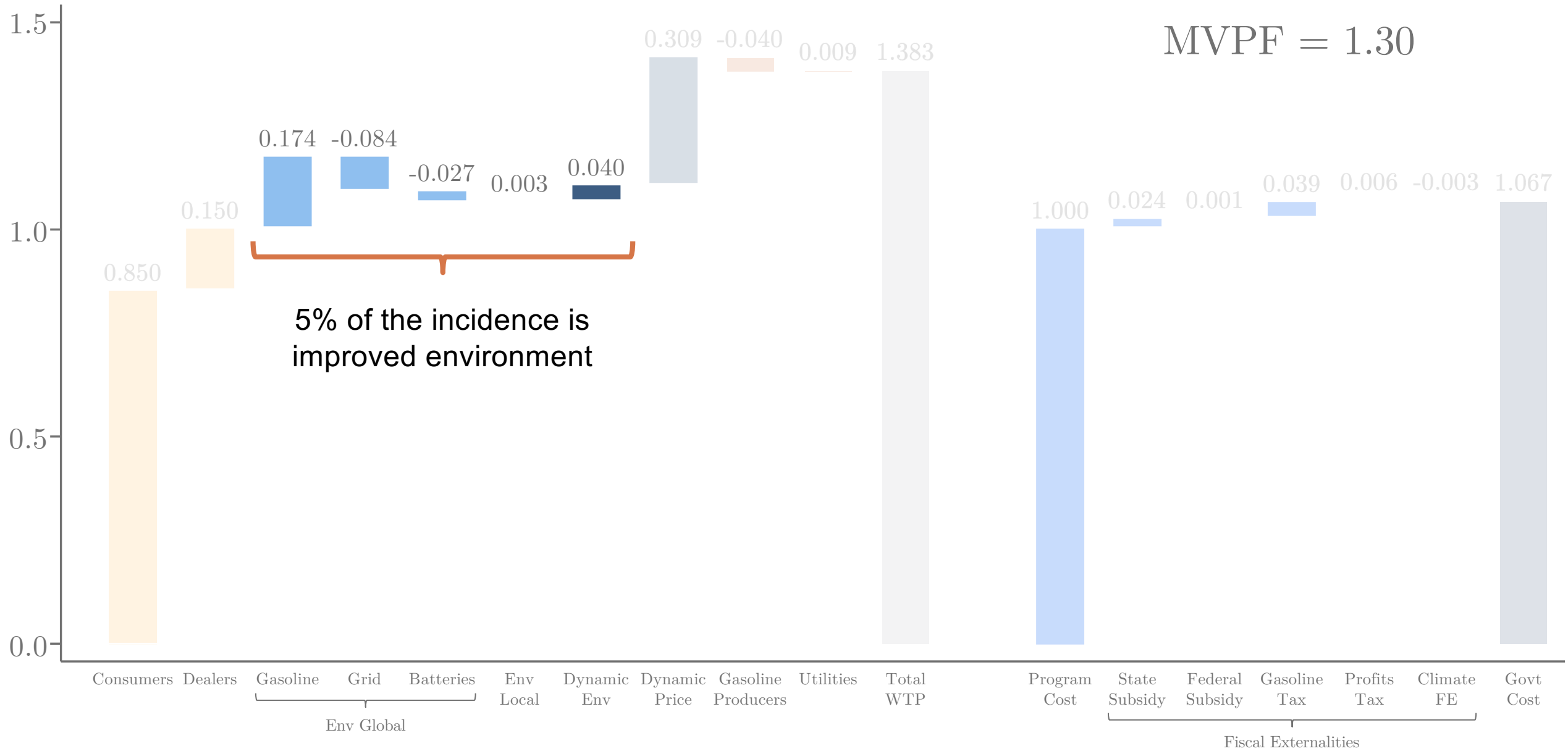
# Electric Vehicles: Fiscal Externalities



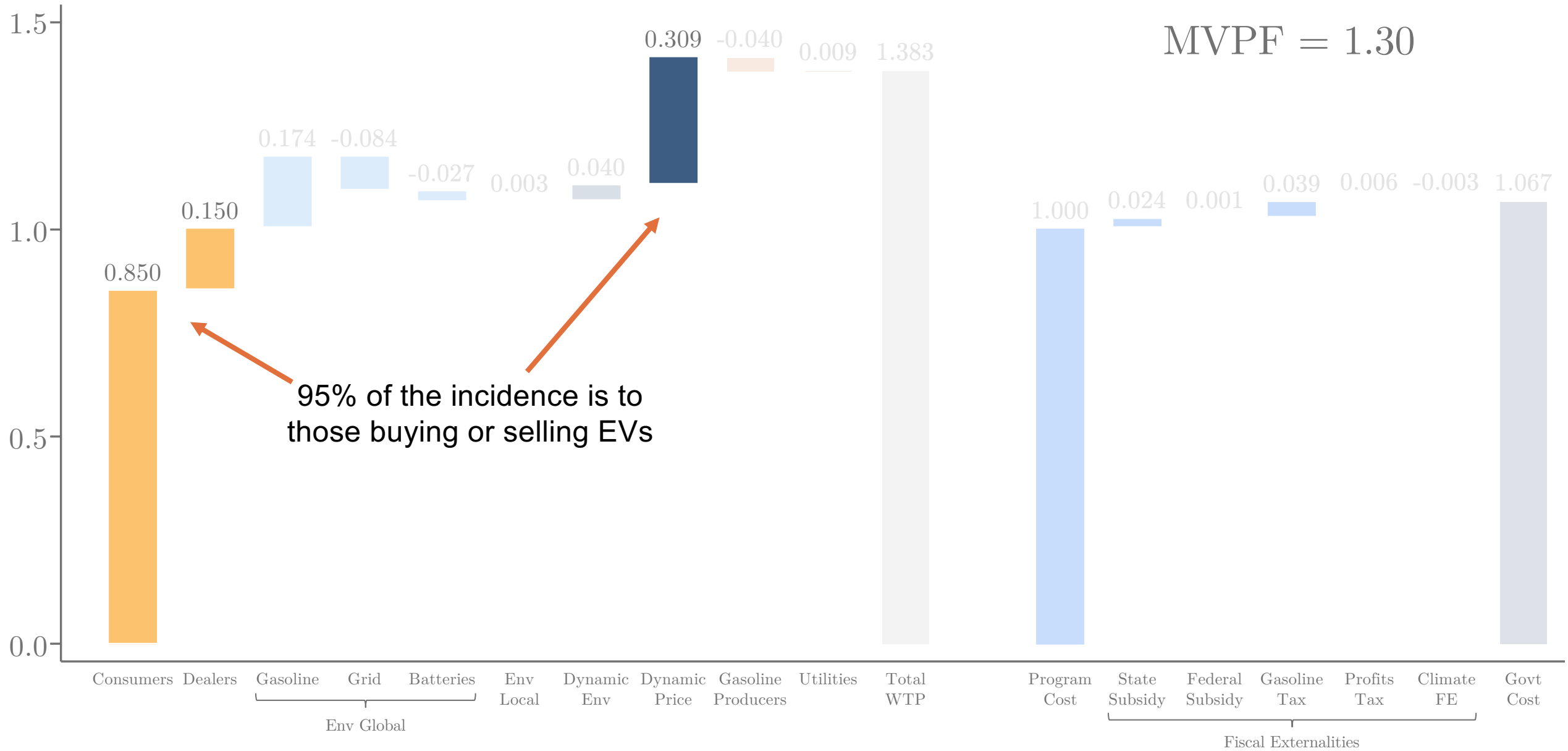
# Electric Vehicles: MVPF



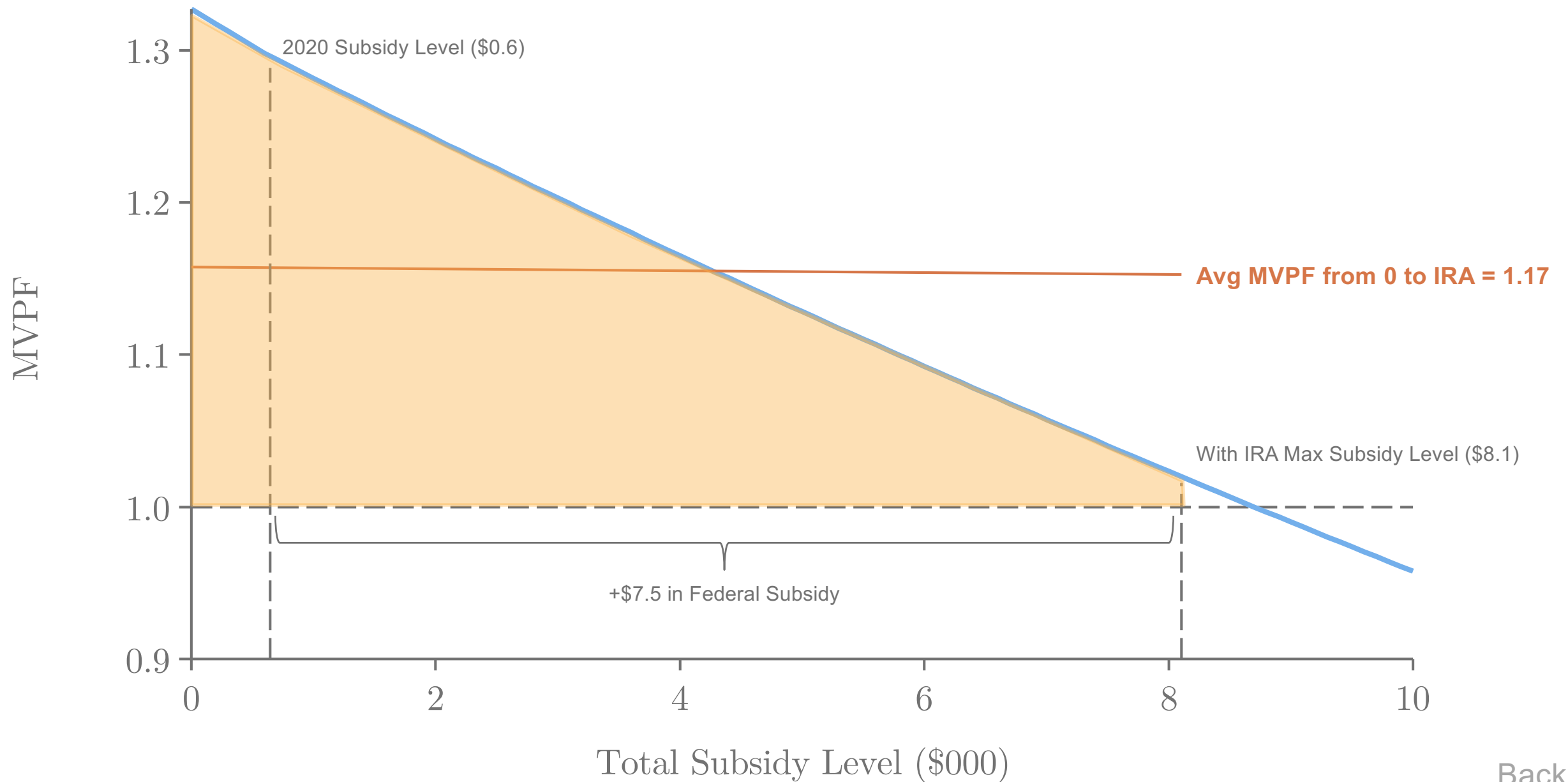
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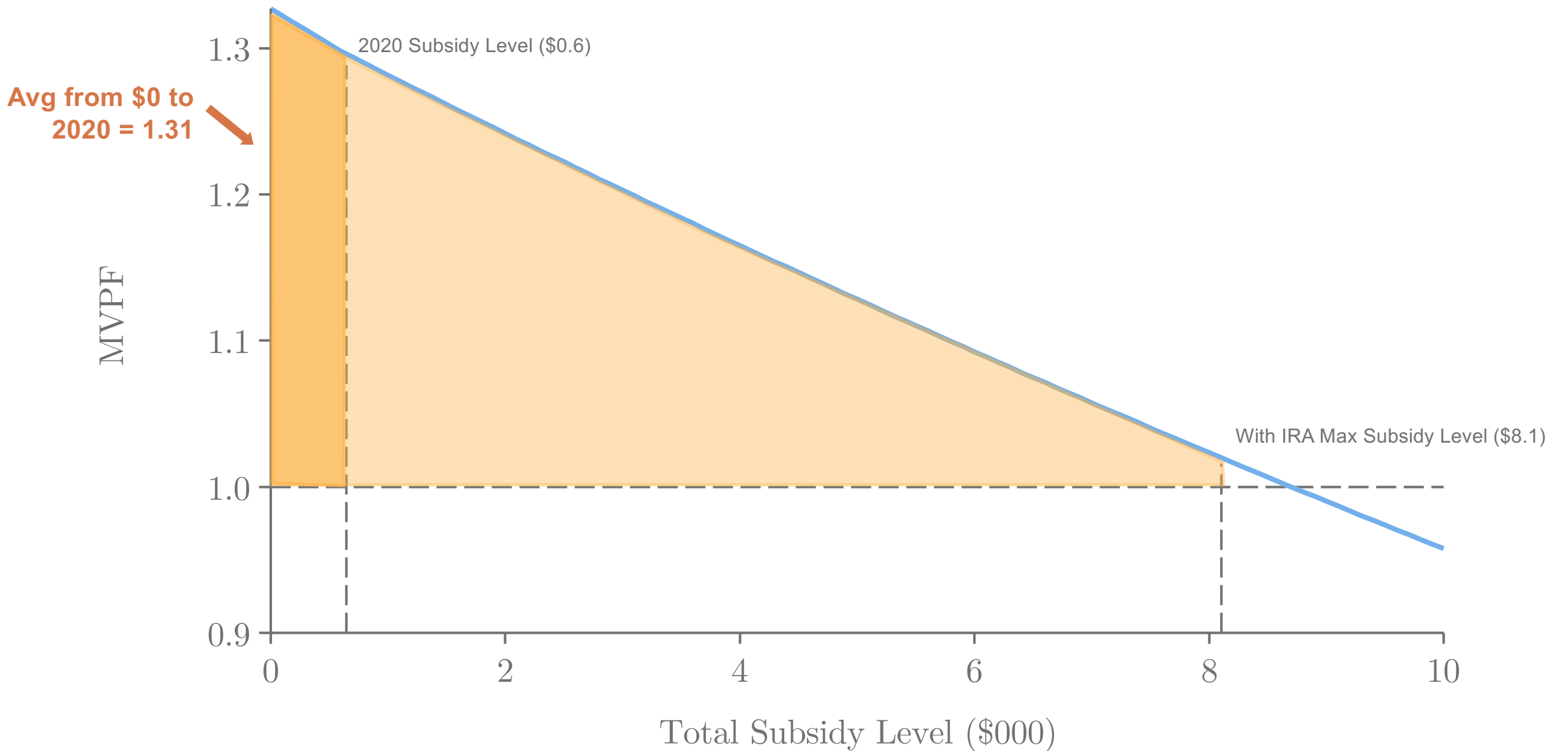
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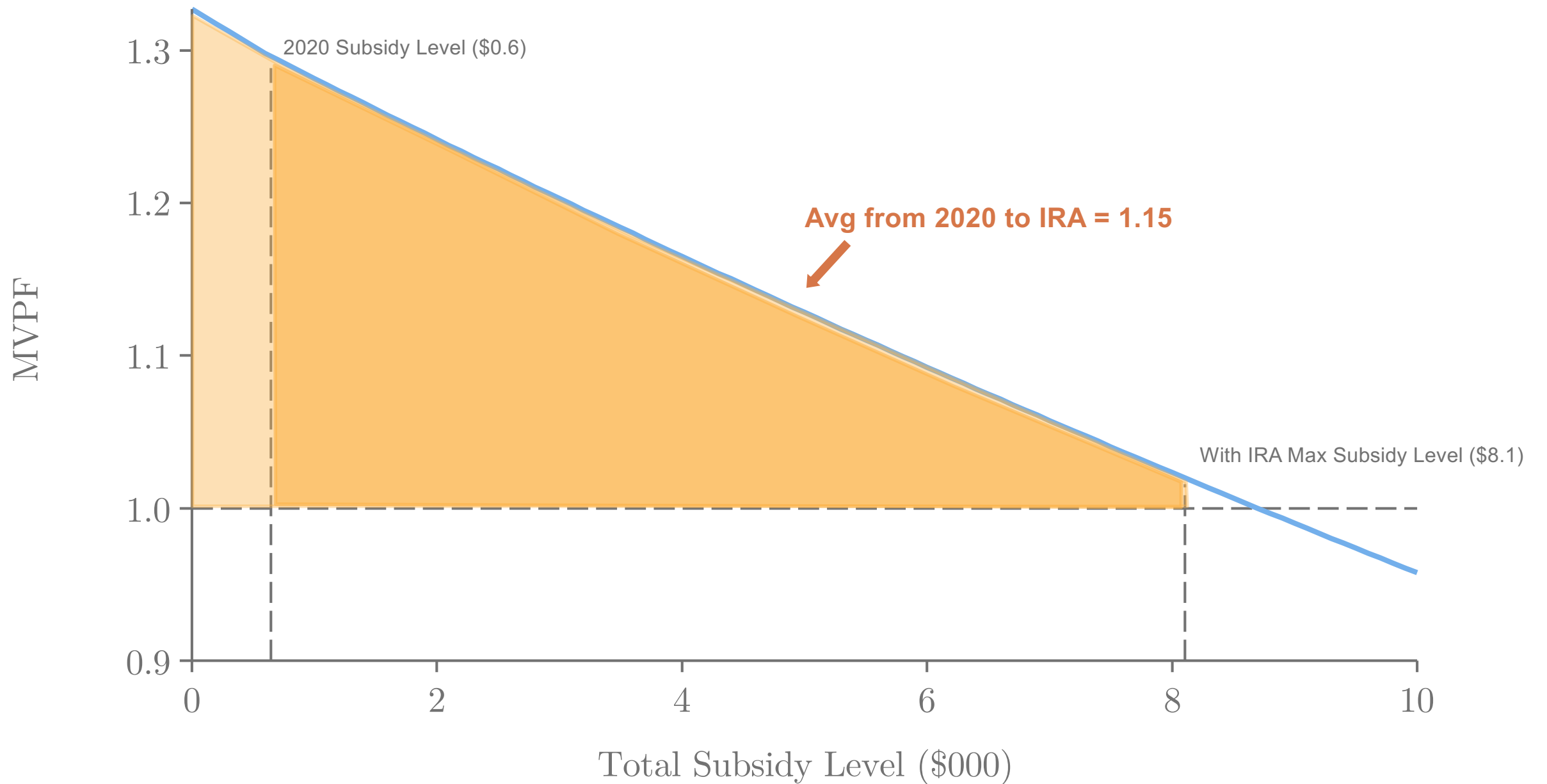
# Electric Vehicles: Non-Marginal (Average) MVPF



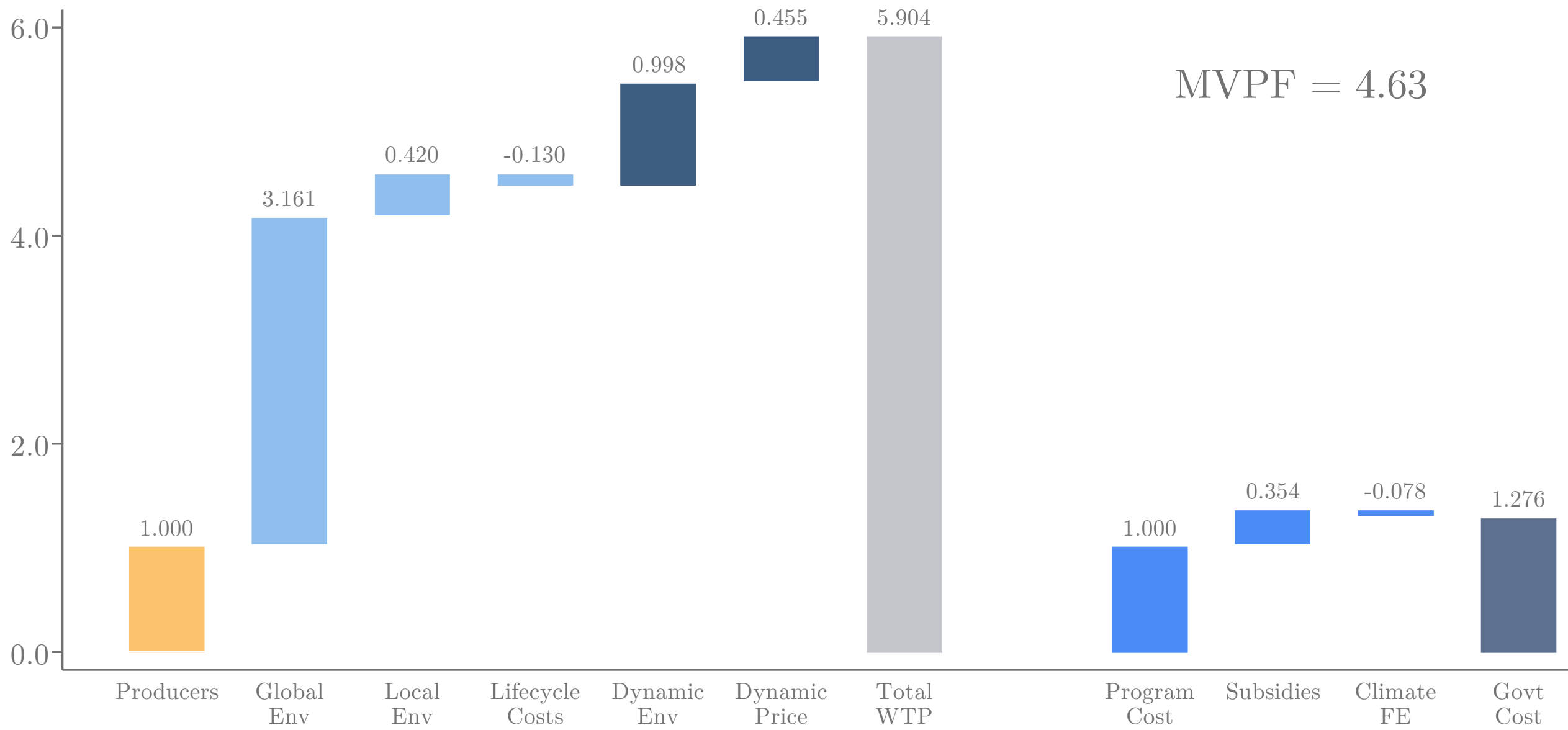
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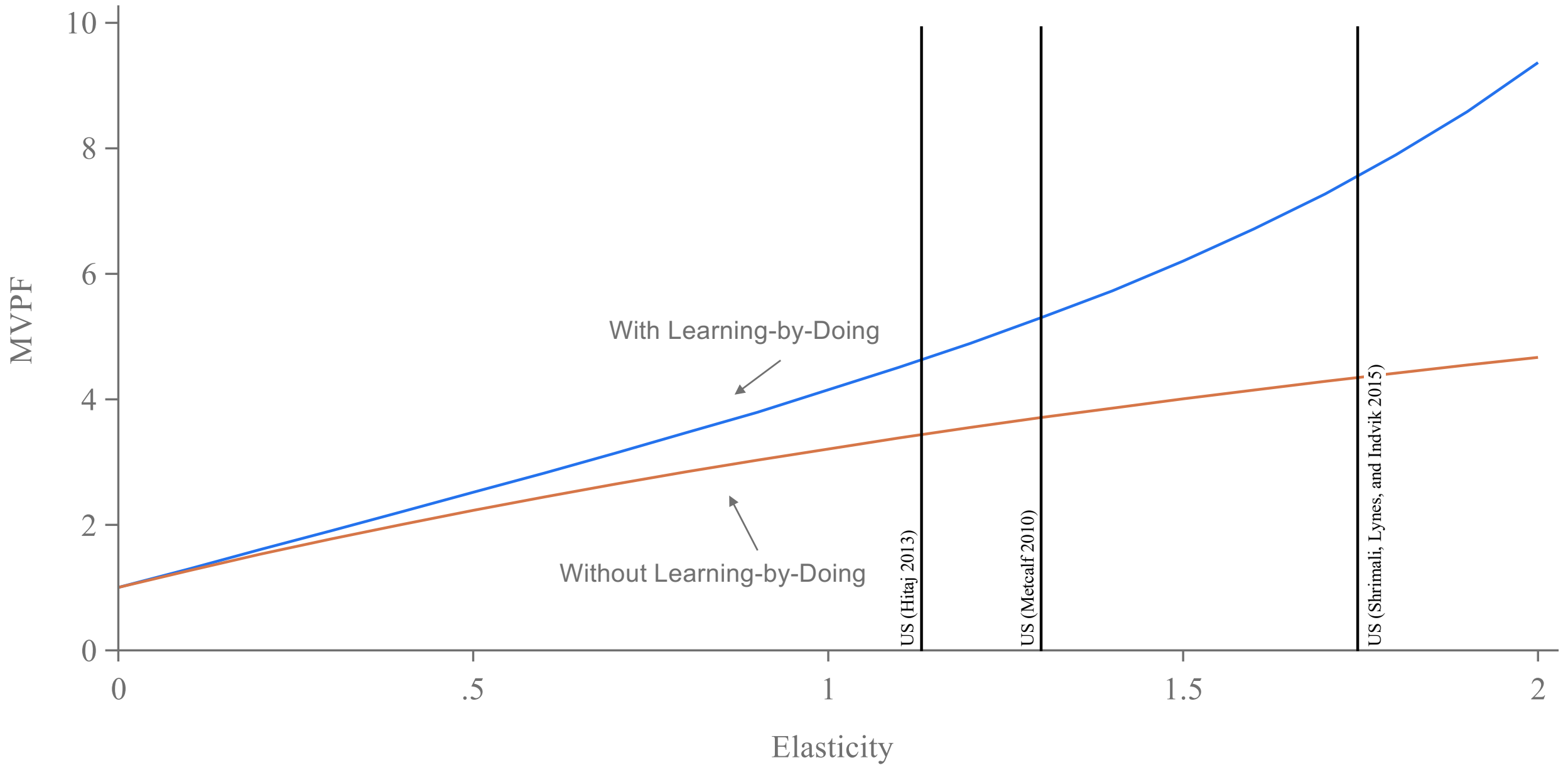
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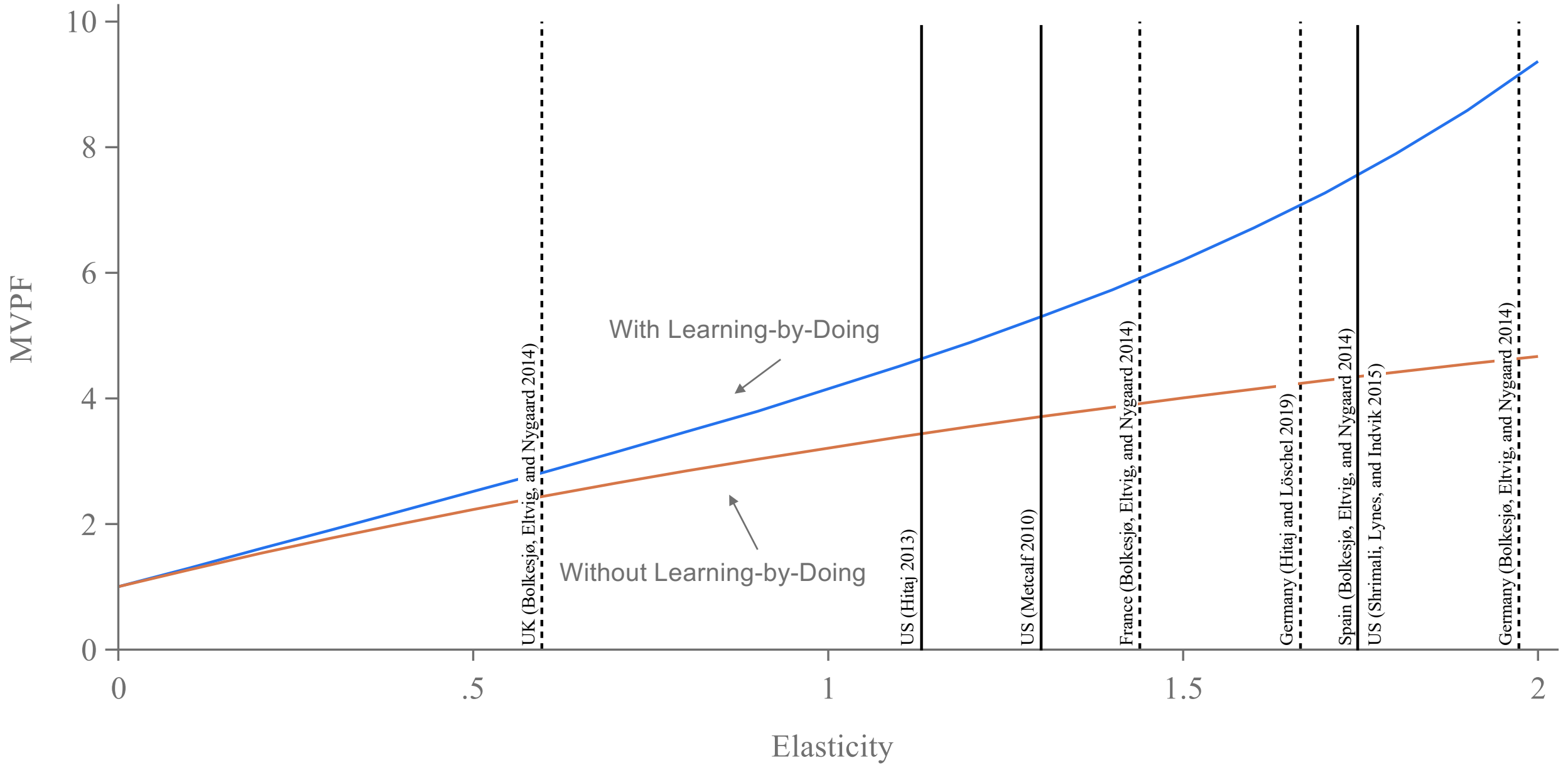
# Wind Production Tax Credits (Hitaj 2013)



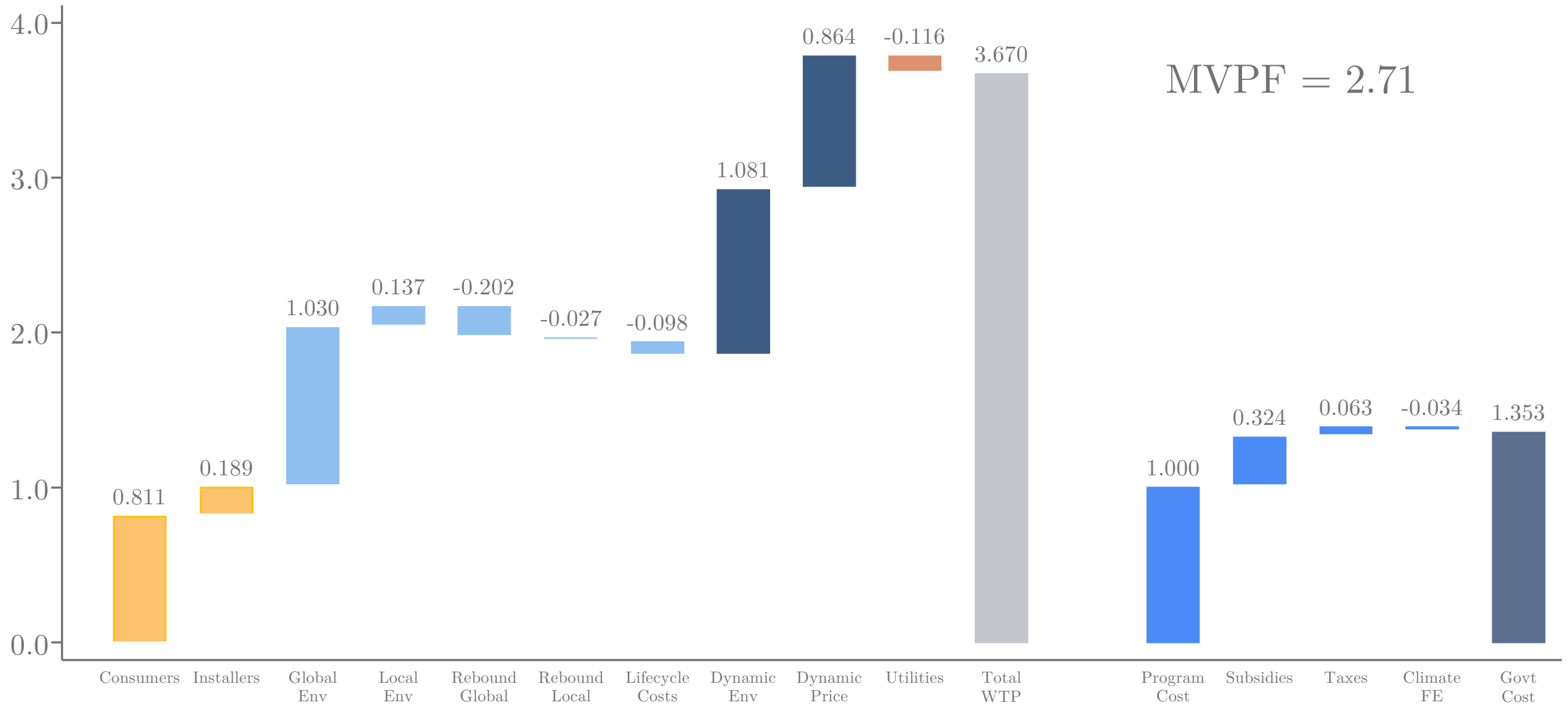
# Wind



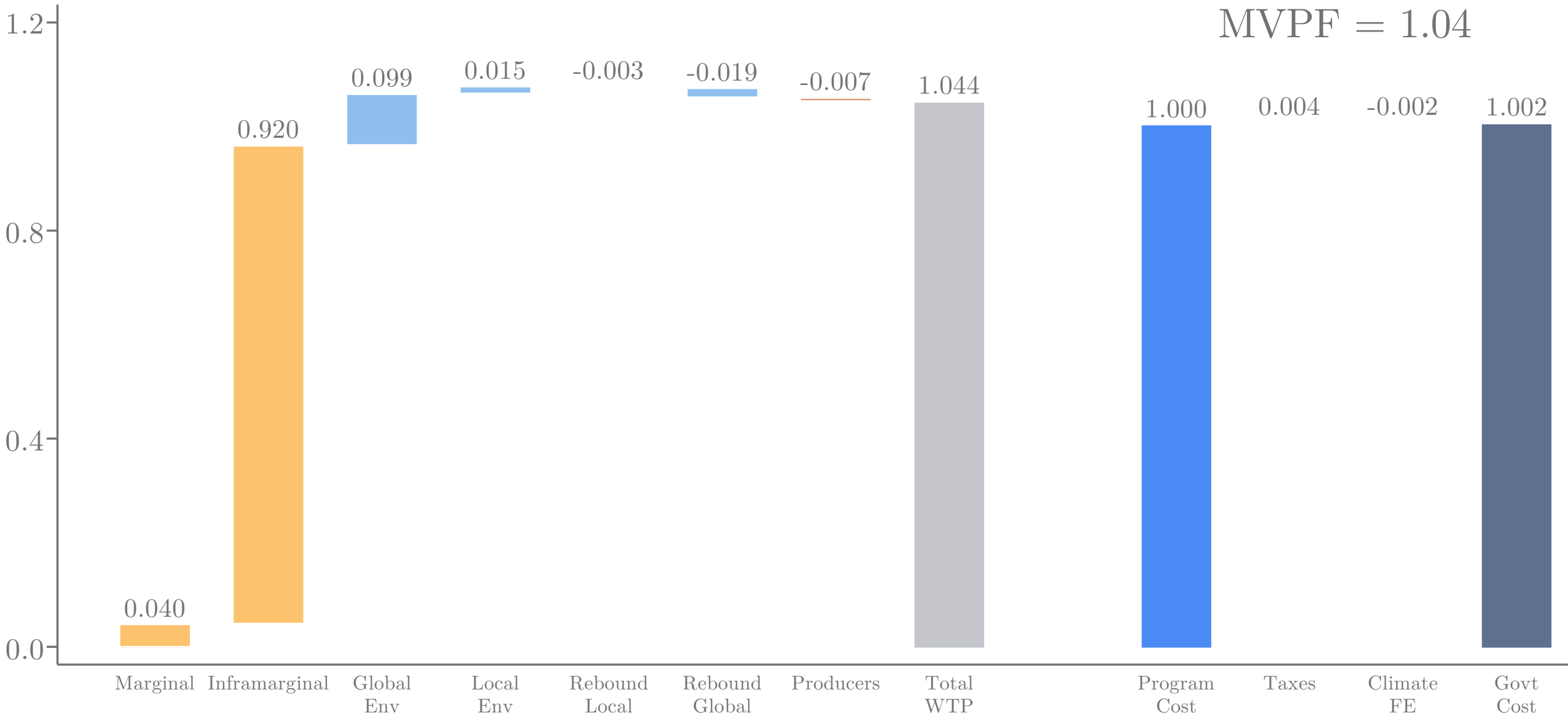
# Wind



# Residential Solar Subsidy (Pless and van Benthem 2019)



# Energy-Efficient Refrigerator Rebate (Houde and Aldy 2017)



# MVPFs of Climate Subsidies

Wind Production Credits



Electric Vehicles



0

1

2

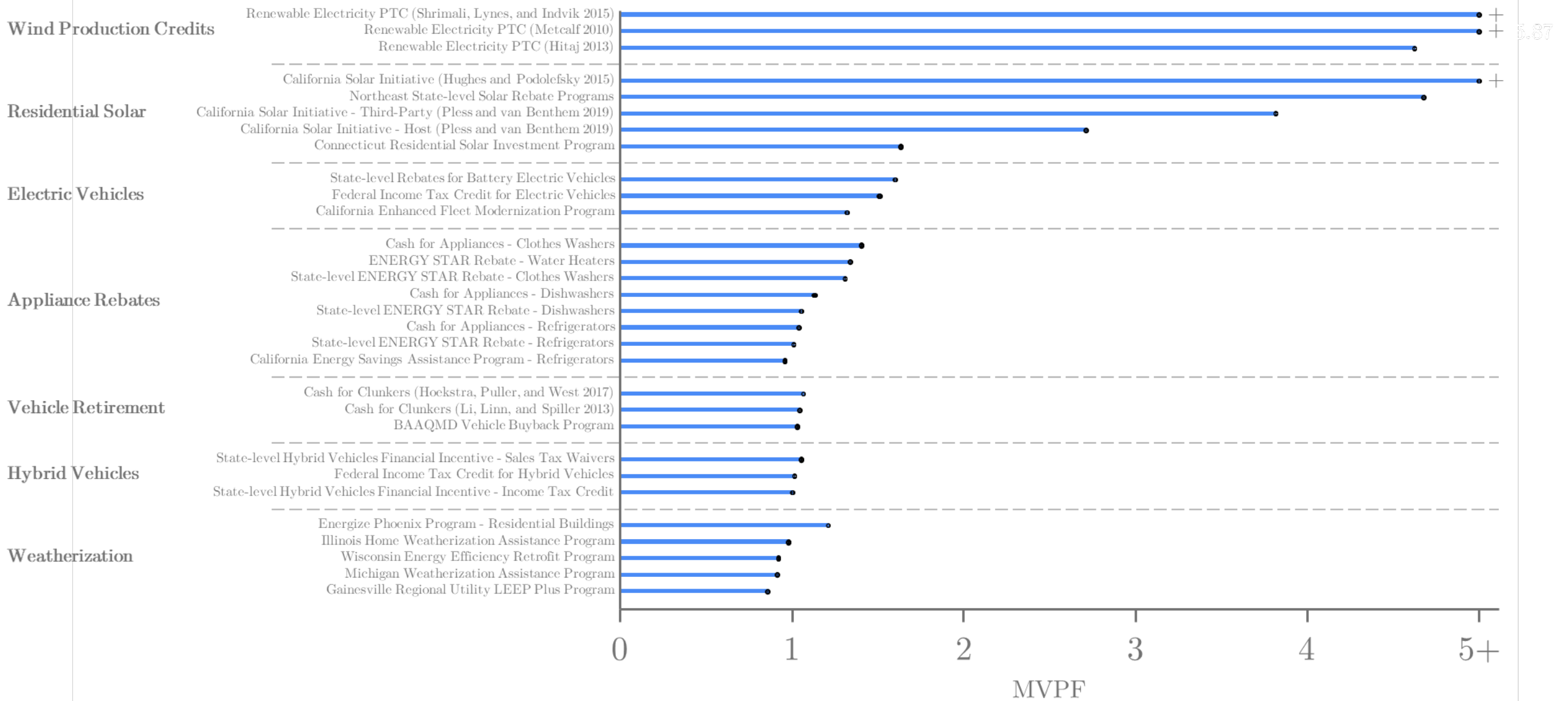
3

4

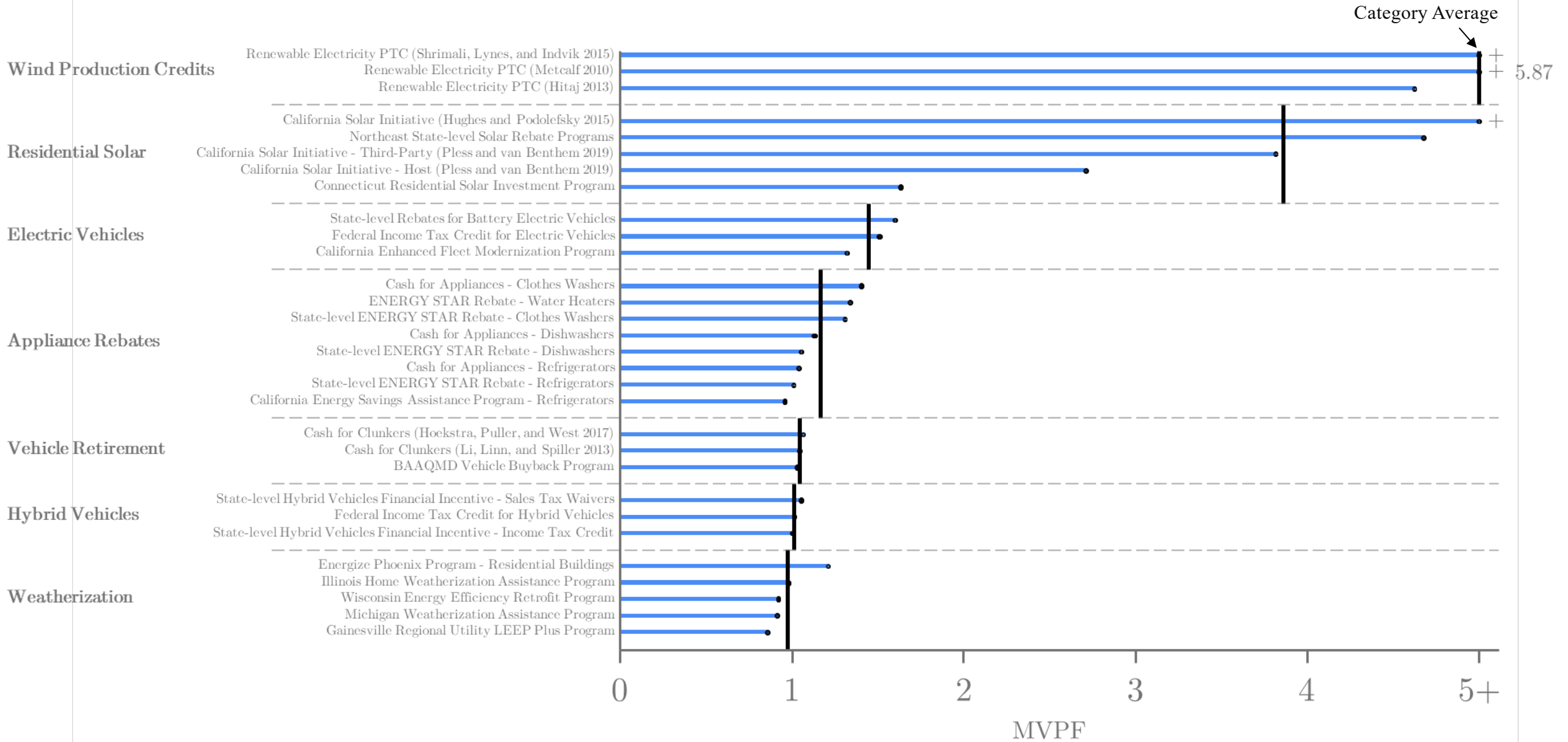
5+

MVPF

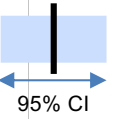
# MVPFs of Climate Subsidies



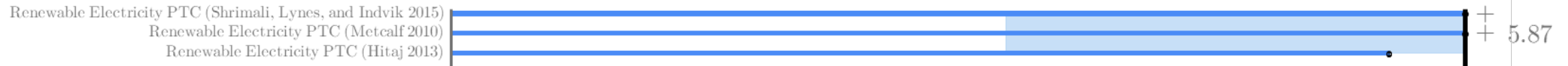
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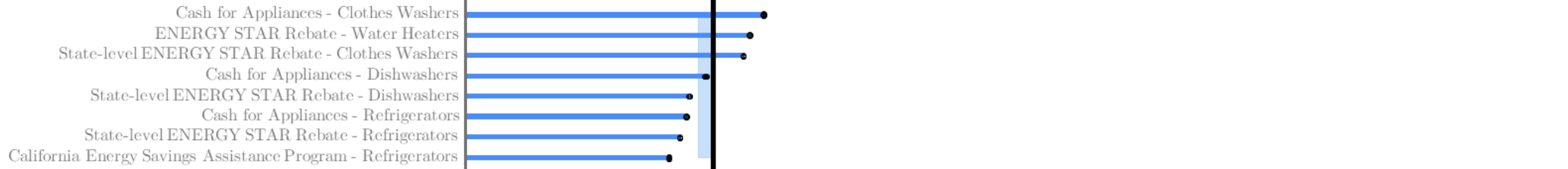
## Residential Solar



## Electric Vehicles



## Appliance Rebates



## Vehicle Retirement



## Hybrid Vehicles



## Weatherization

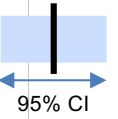


0 1 2 3 4 5+

MVPF

[SCC \\$76](#) [SCC \\$337](#) [No LBD](#) [US vs RoW](#) [No Profits](#) [Energy Savings](#) [In Context](#) [Non-Marginal](#)

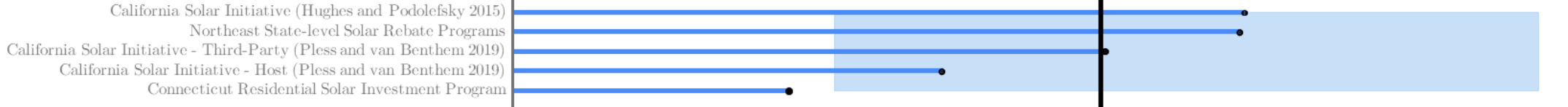
# MVPFs of Climate Subsidies: \$76 SCC



## Wind Production Credits



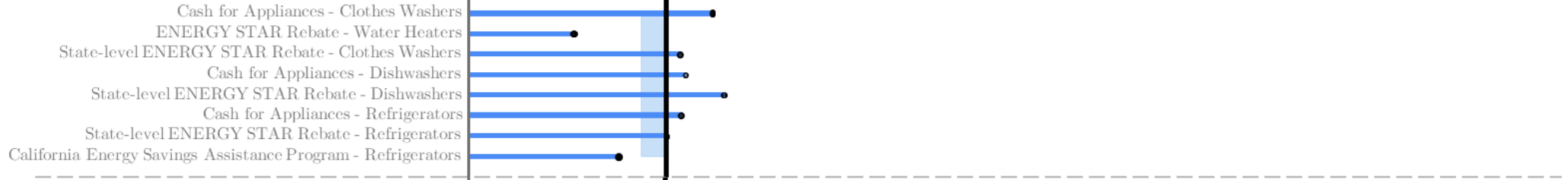
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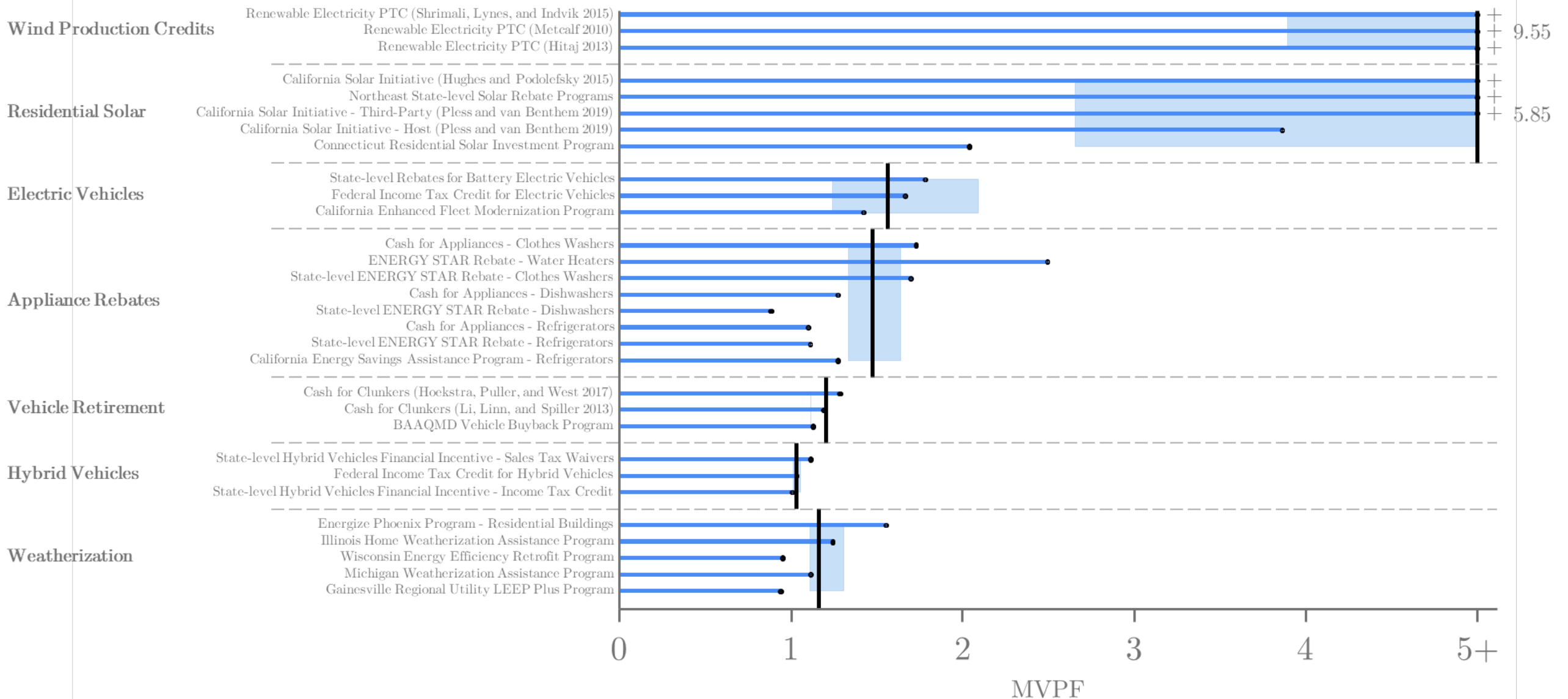
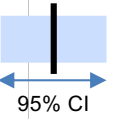


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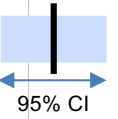
MVPF

5.87

# MVPFs of Climate Subsidies: \$337 SCC



# MVPFs of Climate Subsidies: \$193 SCC (Baseline)



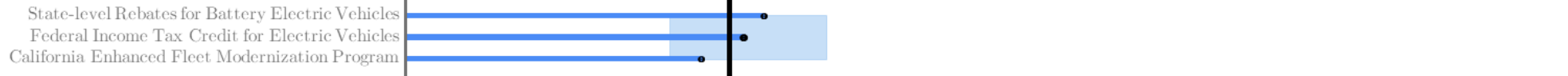
## Wind Production Credits



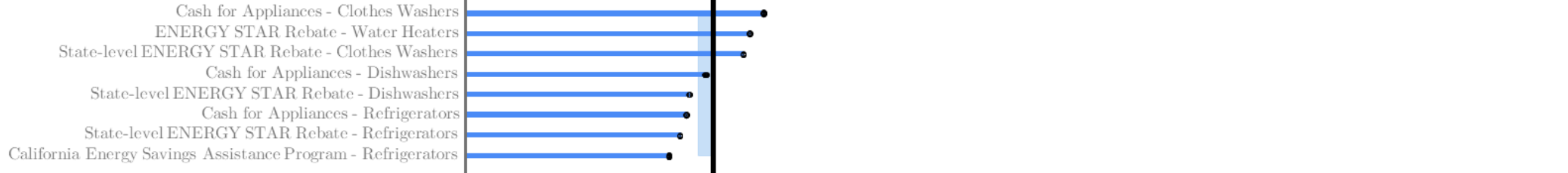
## Residential Solar



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## Appliance Rebates



## Vehicle Retirement



## Hybrid Vehicles



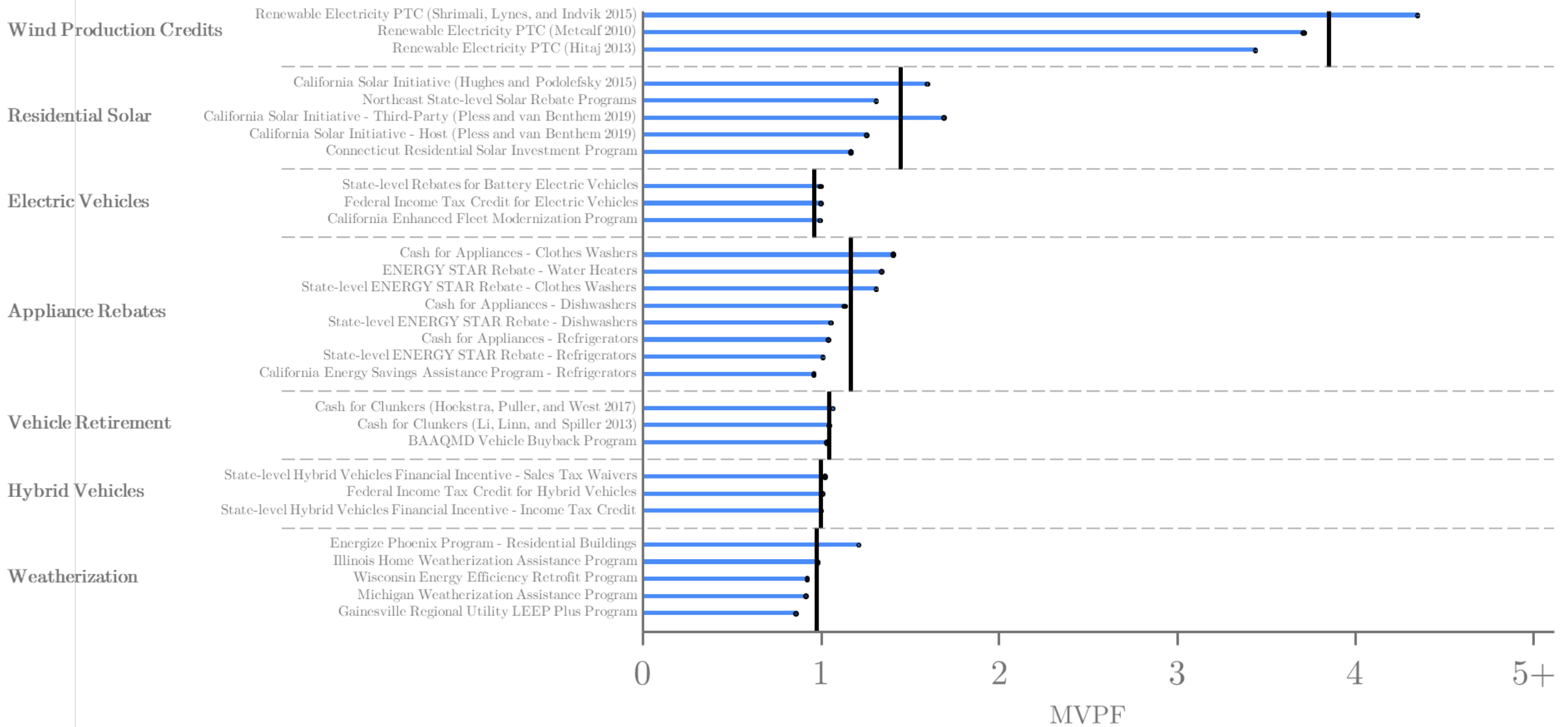
## Weatherization



0 1 2 3 4 5+

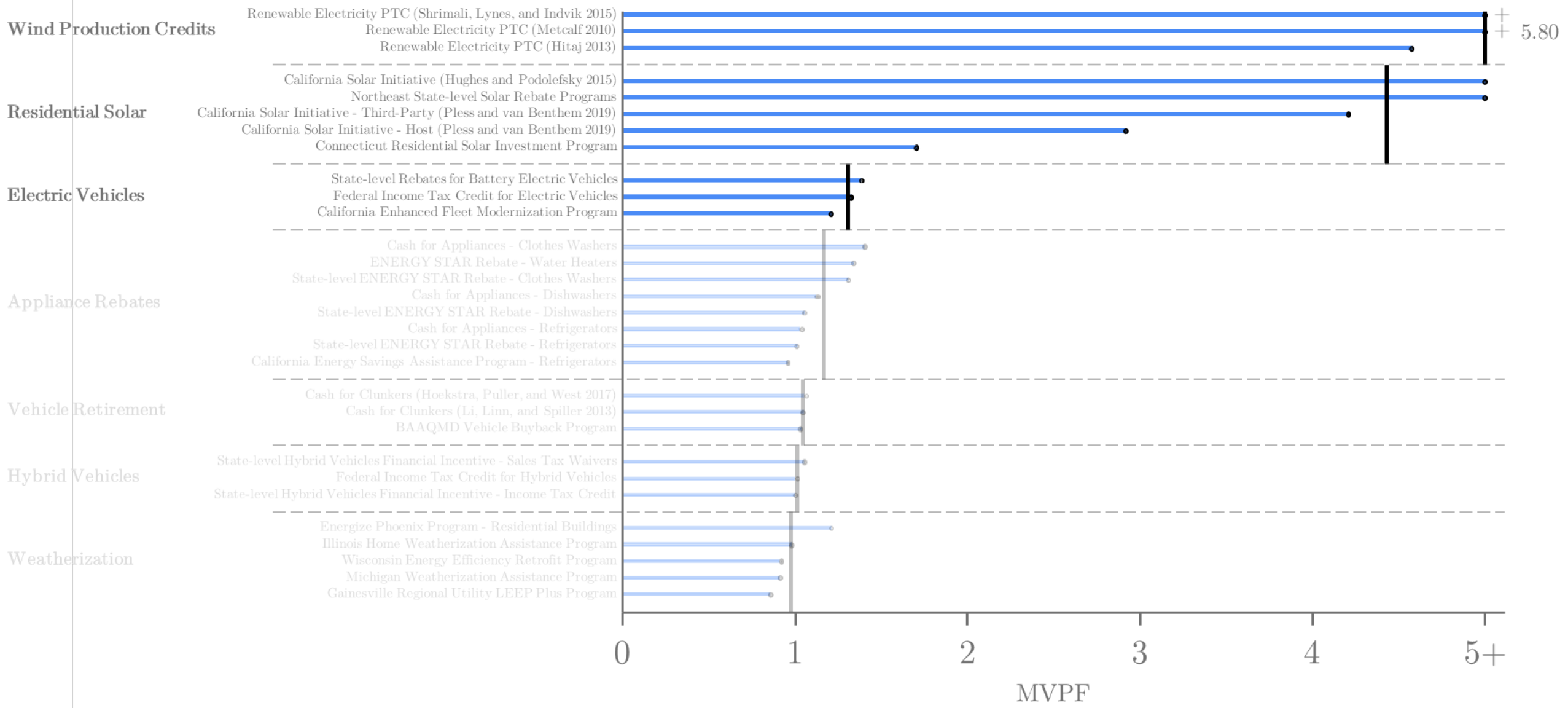
MVPF

# MVPFs of Climate Subsidies: Excluding Learning by Doing

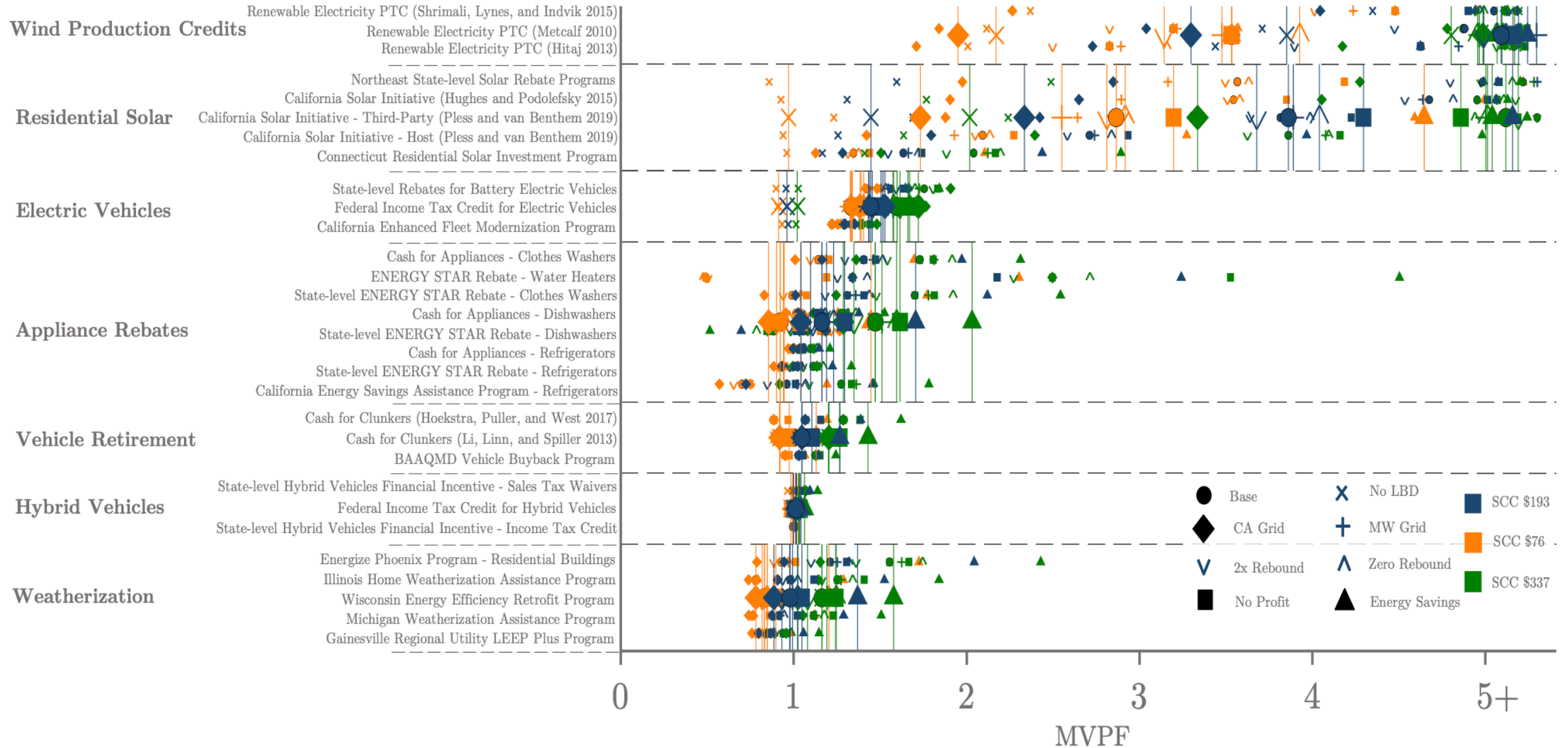


3.60

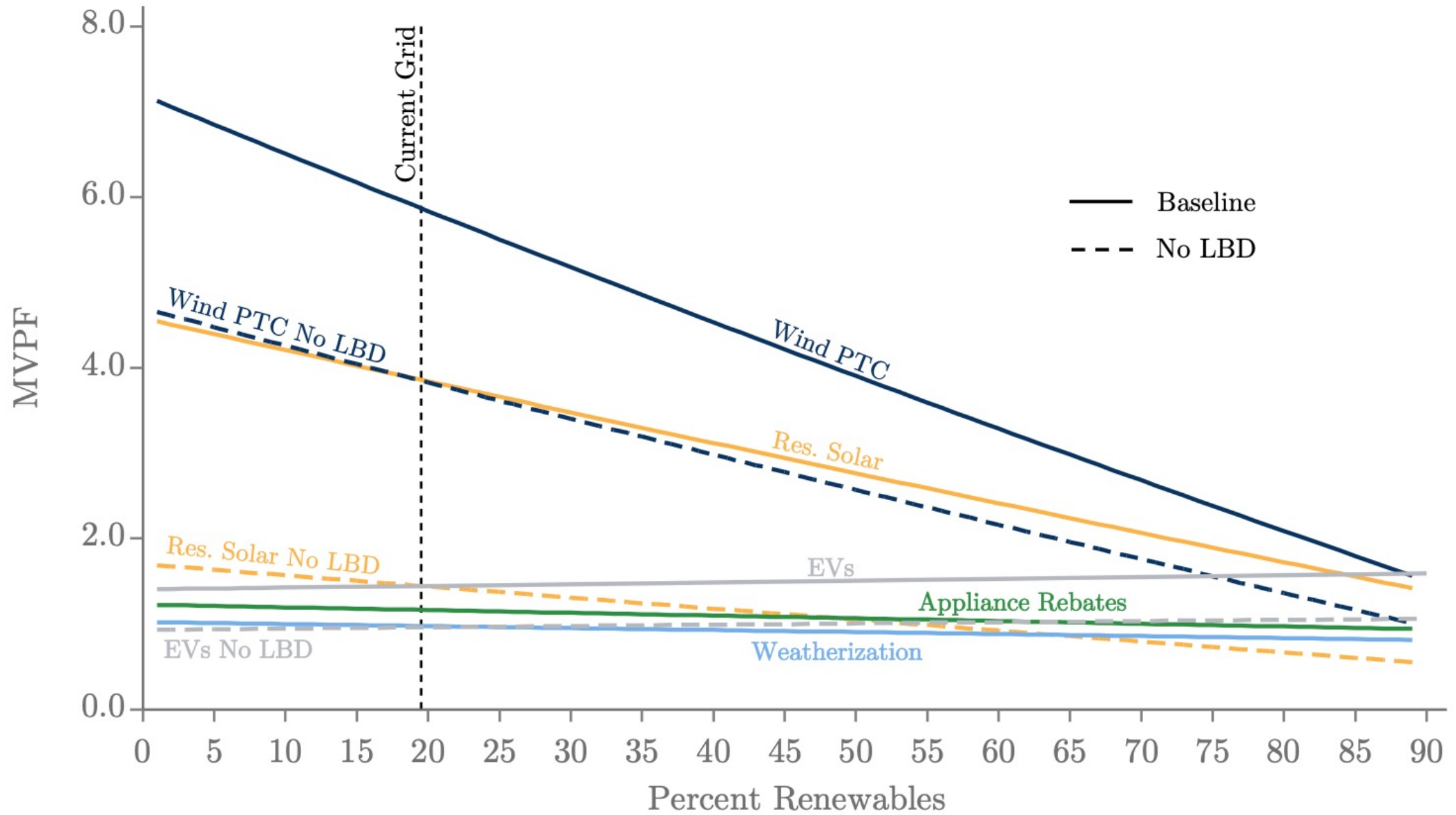
# MVPFs of Climate Subsidies: IRA levels



# A. MVPFs Under Varying Specifications



## B. MVPFs with a Changing Grid



# Results Roadmap

1

**Subsidies**

2

**Nudges**

3

**Revenue Raisers**

4

**International Policies**

5

**Comparison to Cost per Ton Metrics**

# MVPFs of 243 RCTs of Home Energy Reports

- Consider Home Energy Reports (HERs) developed by Opower
- Focus on regional variation in MVPF due to differences in grid emissions

## UtilityCo

1515 N. Courthouse Road, Floor 8  
Arlington, VA 22201-2909

0 014837 0023-C10-I -P14851-730905

\*\*\*\*\*AUTO\*\*5-DIGIT 12345

JANE JOHNSON  
3434 WAVERLEY STREET  
CITY, STATE 12345



### Home Energy Report

May 20, 2015

Account number 8249865991

We've put together this report to help you understand your energy use and what you can do to save.

Find a list of rebates and energy-saving products and services you can buy.

[www.utilityco.com/rebates](http://www.utilityco.com/rebates)

### Here's how you compare to neighbors



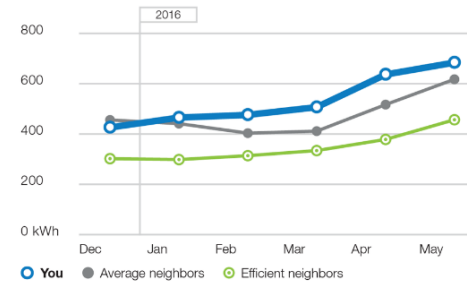
Apr 21, 2015 - May 20, 2015

This is based on 87 similar homes within approx. 4 miles. Efficient neighbors are the 20% who use the least amount of electricity. See back for details.

**!** You're using more than your neighbors.

**8%** more electricity than average neighbors

### Neighbor comparison over time



Over the last 6 months, you used more than your neighbors.

**\$182** extra cost

### Tips from efficient neighbors



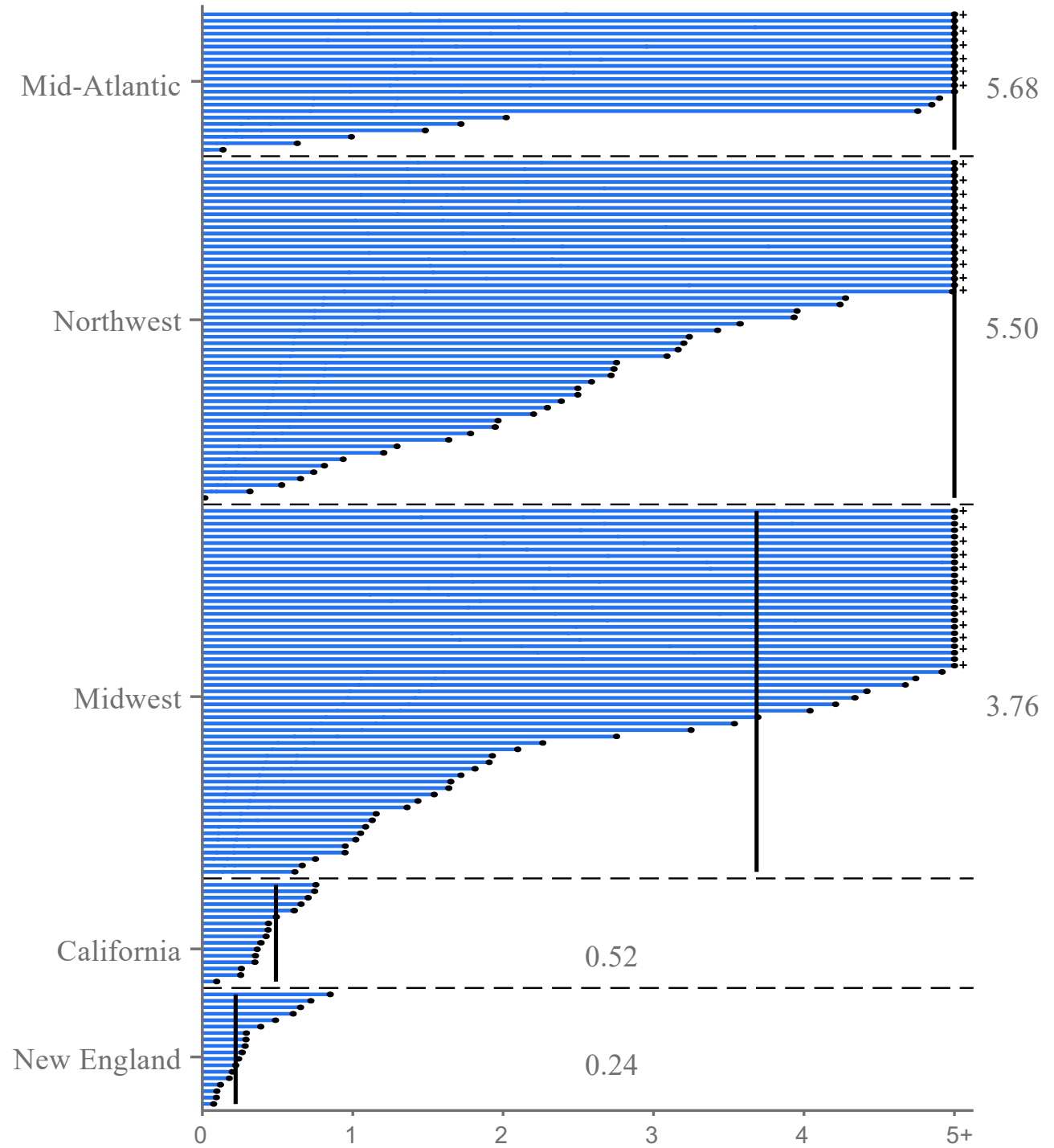
**Unplug electronics when they're not in use**  
Save up to \$75 per year



**Replace your inefficient light bulbs**  
Save up to \$30 over the bulb life

Turn over

# MVPFs of HERs by Region



# Results Roadmap

1

**Subsidies**

2

**Nudges**

3

**Revenue Raisers**

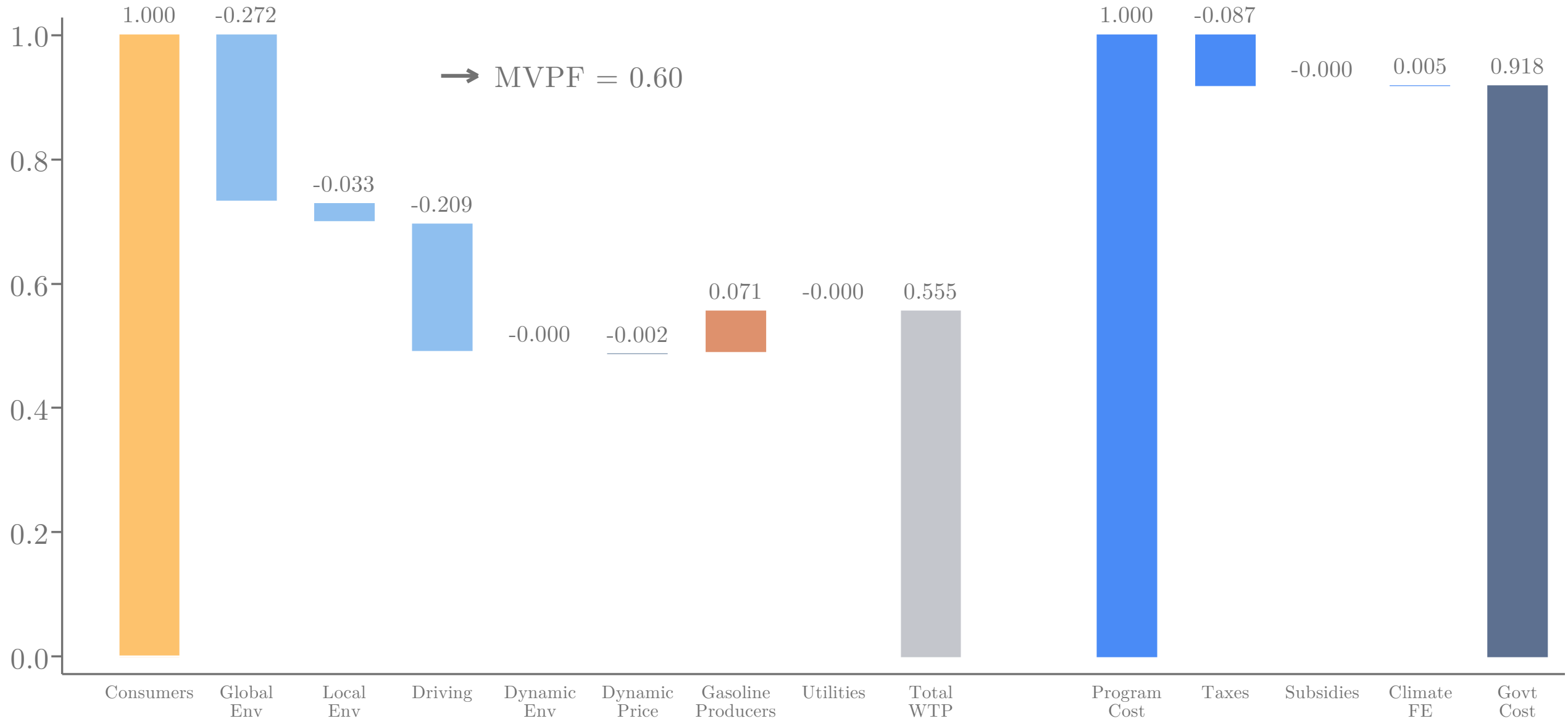
4

**International Policies**

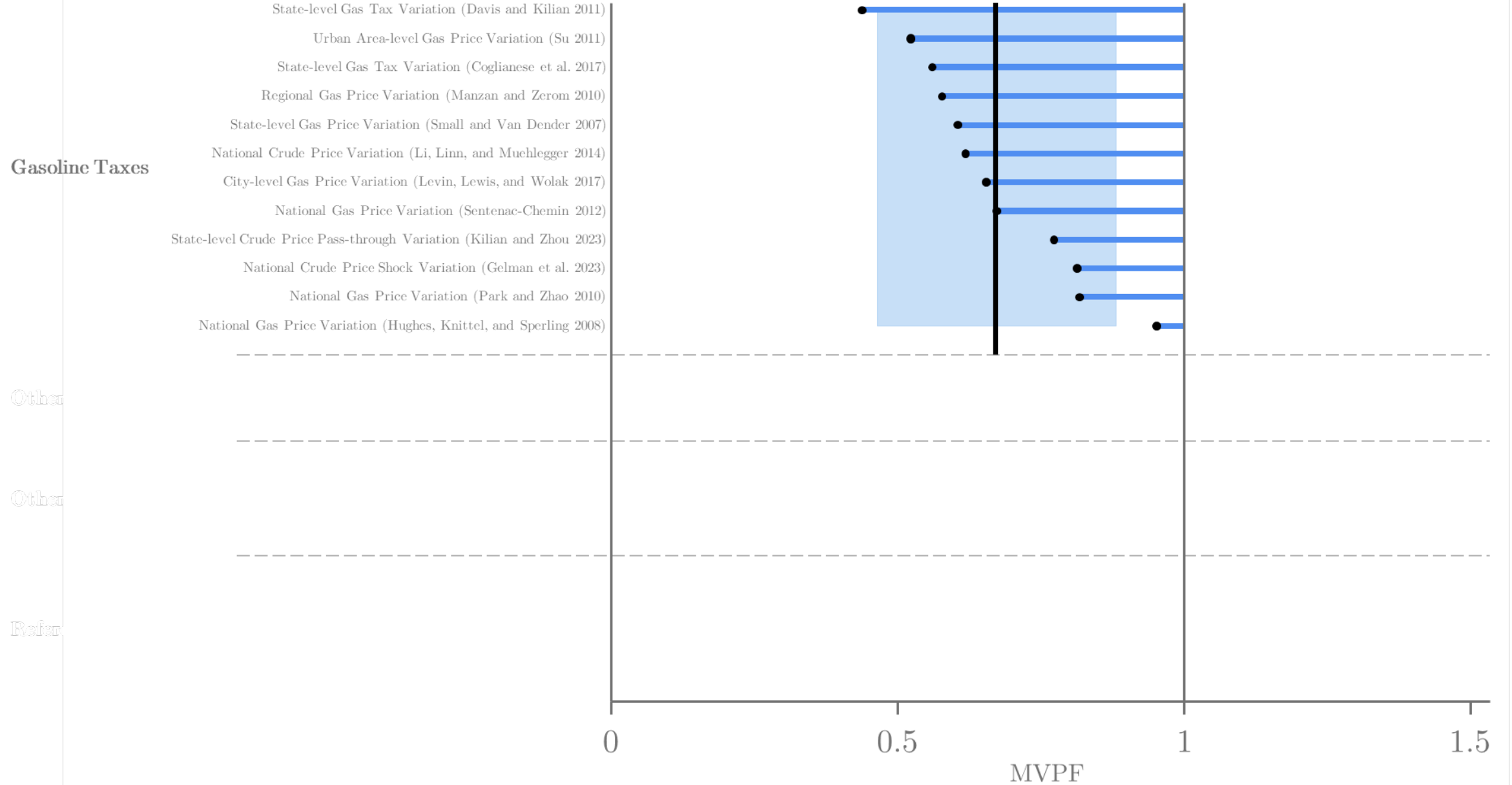
5

**Comparison to Cost per Ton Metrics**

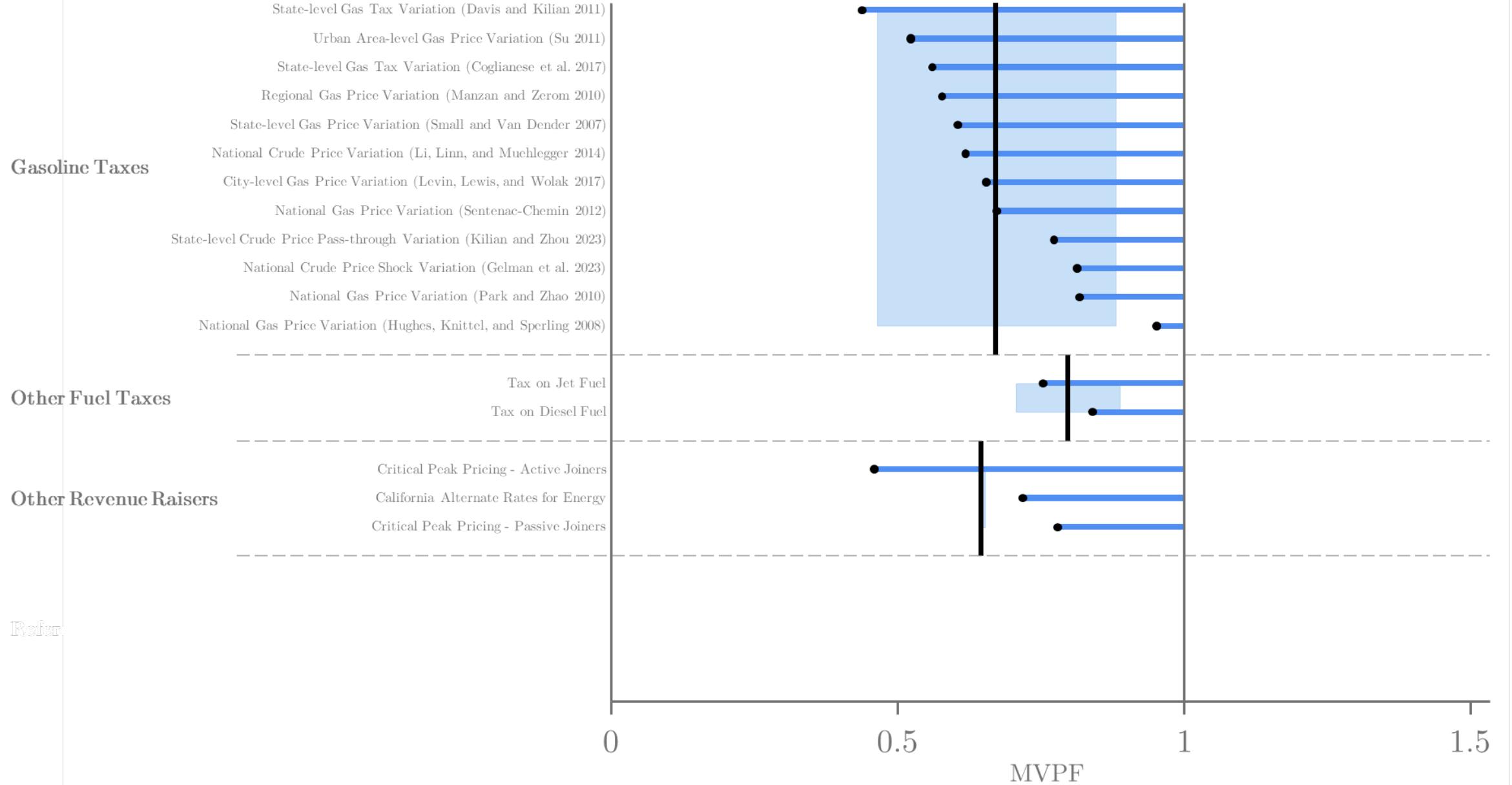
# Gasoline Tax MVPF - Price Elasticity from Small and Van Dender (2007)



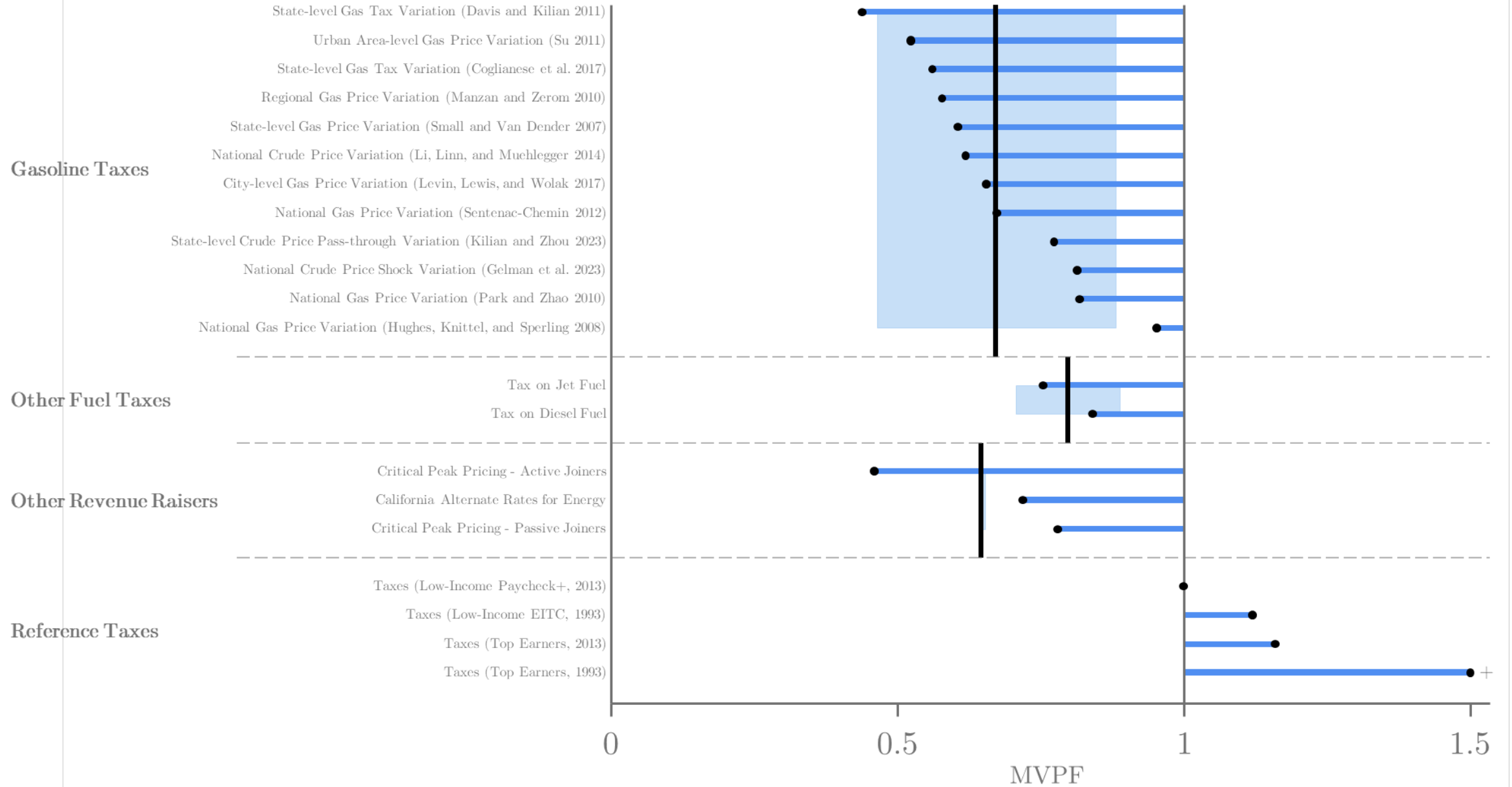
# MVPFs of Revenue Raisers (National 2020)



# MVPFs of Revenue Raisers (National 2020)



# MVPFs of Revenue Raisers (National 2020)



## Implications for weighting and the double dividend

### Weighting

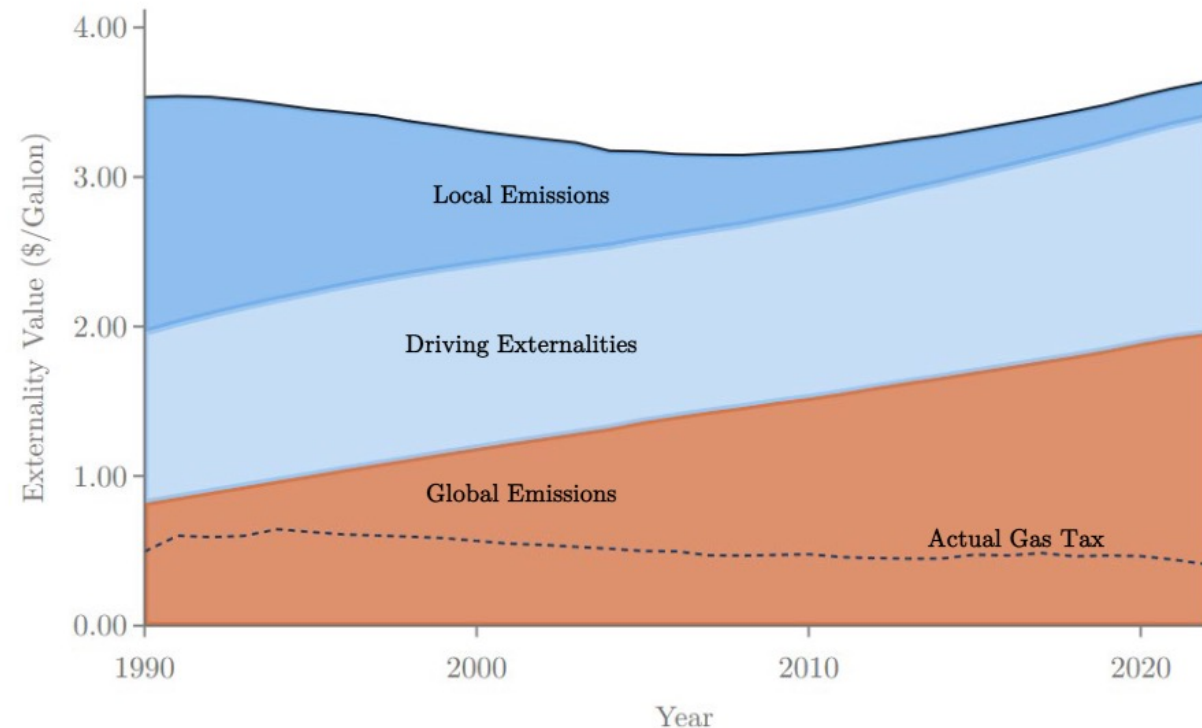
- Gap between income tax MVPF and gas tax MVPF may be the result of different implicit welfare weights across types of beneficiaries.

# Implications for weighting and the double dividend

## Weighting

- Gap between income tax MVPF and gas tax MVPF may be the result of different implicit welfare weights across types of beneficiaries.
- The Federal gas tax has not increased since 1993.

### A. Vehicle Externalities



# Implications for weighting and the double dividend

## Weighting

- Gap between income tax MVPF and gas tax MVPF may be the result of different implicit welfare weights across types of beneficiaries.
- The Federal gas tax has not increased since 1993.
  - Ignore all the environmental effects of gasoline but only consider the effect of gas taxes on accidents and congestion, our estimates suggest an MVPF of 0.95 associated with the gas tax.
  - This is 14% lower than the MVPF around 1.1 typically observed for tax changes on low-income individuals (Hendren & Sprung-Keyser 2020).

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- This suggests an implicit welfare weight on drivers that is higher than the weight on the earnings of a typical low-income individual.

## Double dividend

- Can tax pollution and can offset other non-distortionary taxes, although pollution taxes are smaller and more narrow

## The MVPF of Cap and Trade

- Examine cap and trade policies in the context (time and place) where they were implemented.
- Consider the effect of a reduction in permits auctioned

$$MVPF = \frac{-x \frac{dp}{dx} + V(1 - L)}{-x \frac{dp}{dx} - p}.$$

- First term: firms' WTP to avoid the increase in permit prices induced by a reduction in permit supply. This is offset by the environmental damages avoided,  $V(1-L)$ , due to a one-unit change in the number of permits auctioned.
  - On the cost side, the government receives the mechanical revenue from the higher prices,  $-x dp/dx > 0$ , but also loses  $p$  in revenue from the forgone permit no longer auctioned.
  - $p$  does not appear in the numerator due to the envelope theorem: the marginal firm holding a permit has a marginal abatement cost equal to the permit price.
- Examine Regional Greenhouse Gas Initiative (RGGI). Find permit reductions raised revenue while also producing net benefits for individuals
    - Formally, the  $MVPF < 0$  in this context
  - Estimates align with those from the European Emission Trading System (ETS)

# Results Roadmap

1

**Subsidies**

2

**Nudges**

3

**Revenue Raisers**

4

**International Policies**

5

**Comparison to Cost per Ton Metrics**

## Cookstoves in Kenya: Berkouwer and Dean (2022)

- Berkouwer and Dean (2022) study subsidies for “improved” cookstoves in Kenya
  - Paper finds each \$30 subsidy removes 7 tons of CO<sub>2</sub>

FIGURE 1: THE KENYAN CERAMIC JIKO AND THE IMPROVED JIKOKOA



Two-thirds of Kenyan households still use a traditional stove as their primary cooking technology. Displayed here is the 'Kenyan ceramic jiko' (KCJ), a mid-tier charcoal cookstove (left). The Jikokoa (right) is a modern charcoal cookstove sold in East Africa produced by Burn Manufacturing.  
Source: Burn Manufacturing (2021)

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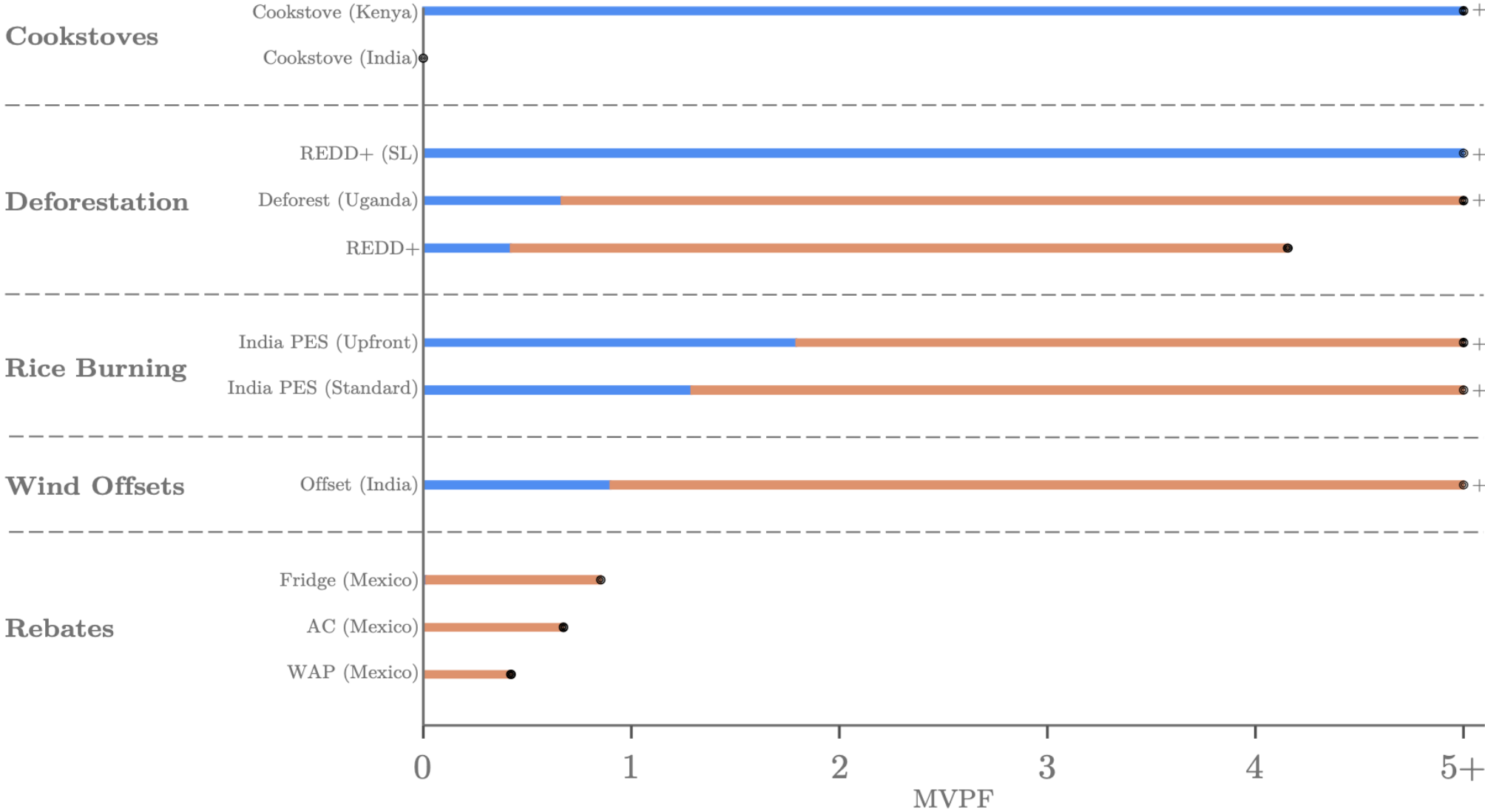
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- Net cost to the government would be  $\$30 - 7 \times 3.7 = \$4$ 
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- However, large variation in estimates of the effect of cookstoves and other international subsidies

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Source: Burn Manufacturing (2021)

FIGURE 8: Baseline MVPFs of International Policies



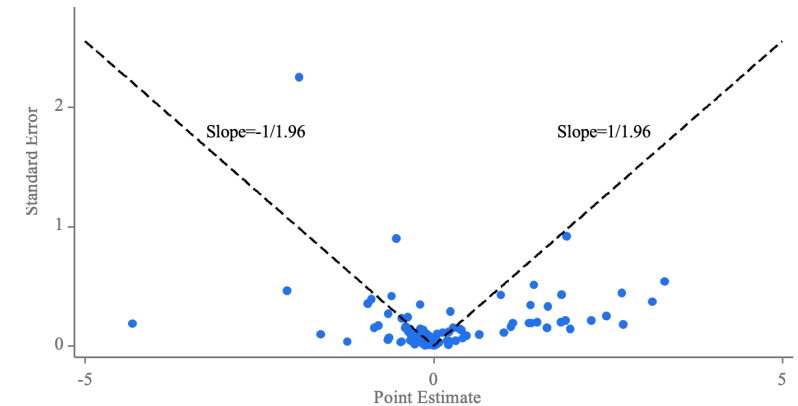
# Additional Analyses in the Paper

## ■ Distributional Incidence

- Excluding non-US benefits → MVPFs near 1 for most US-based subsidies
- Subsidies and taxes disproportionately affect the rich

## ■ Publication Bias

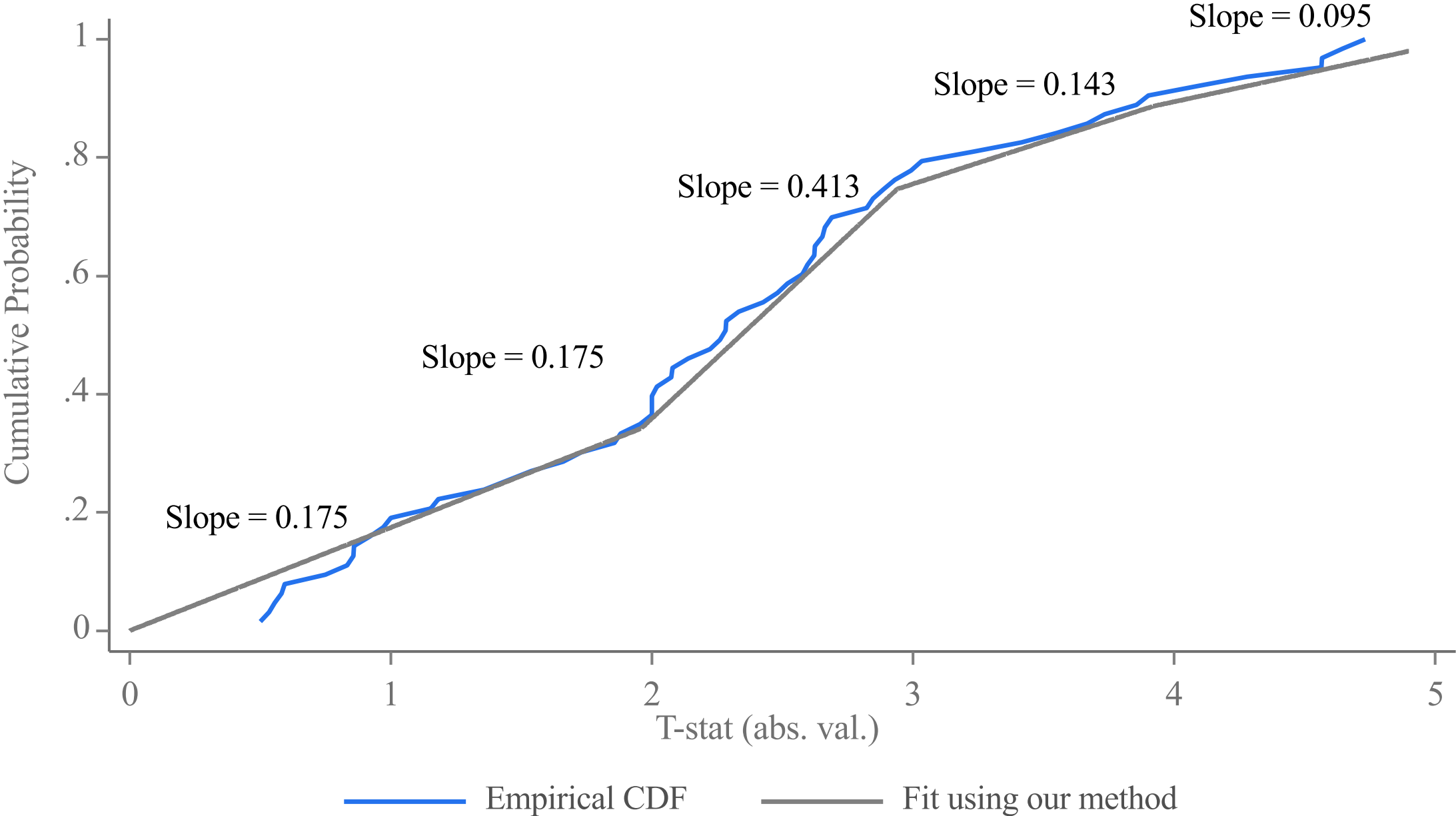
- Papers with t-stats  $> 1.96$  are 2X more likely to be published
- Adjusting for this using Andrews and Kasy (2019) does not meaningfully affect conclusions



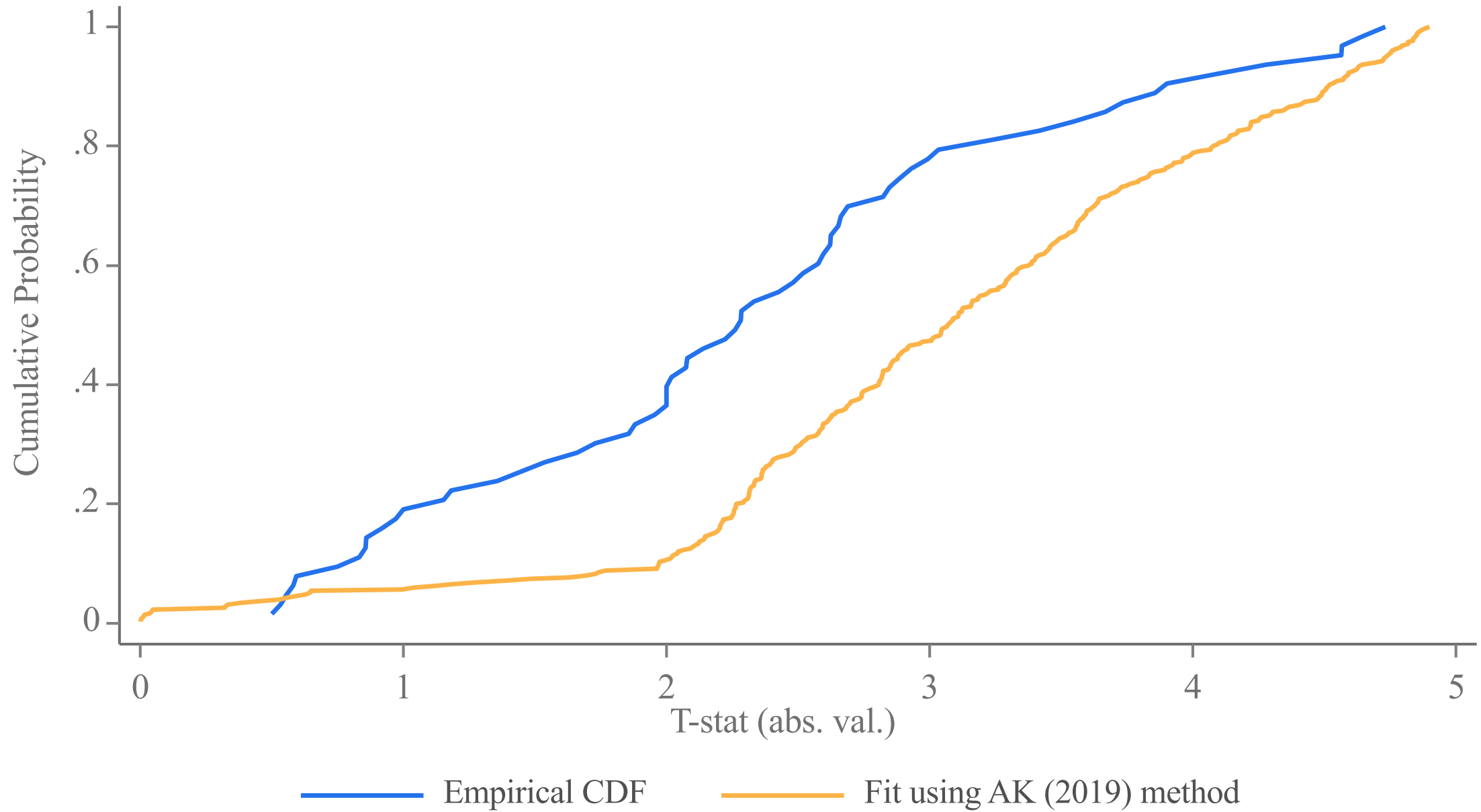
## ■ Non-Marginal analysis

- Evaluate how MVPF varies for 1<sup>st</sup> vs. last dollar of subsidy/tax and consider non-marginal policy changes corresponding to EV, Residential Solar and Wind policies under the IRA
- Relative orderings and broad magnitudes remain unchanged

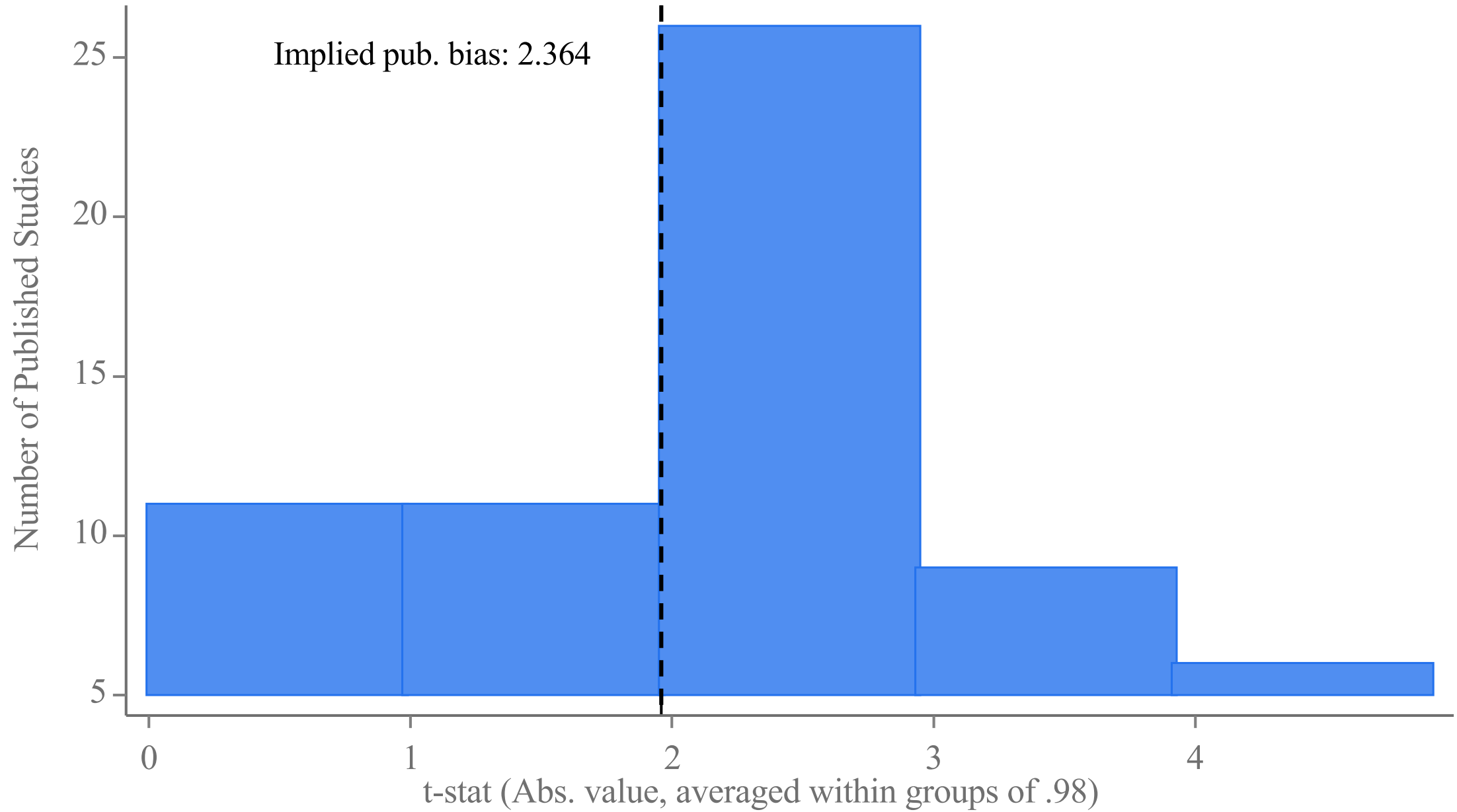
# Model Fit for Estimate of Publication Bias (Our approach)



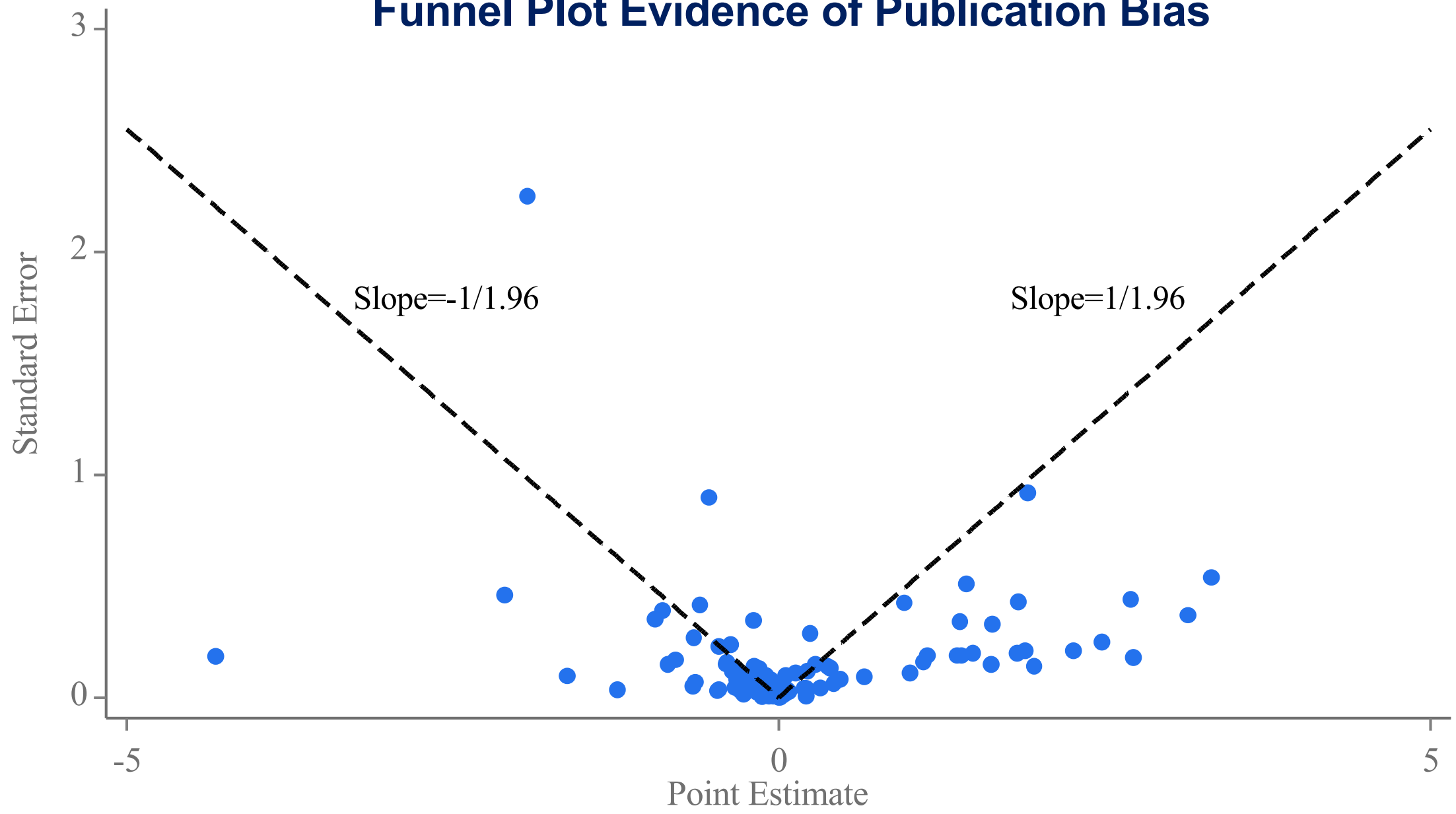
## Model Fit for Estimate of Publication Bias (AK 2019)



# Histogram Evidence of Publication Bias



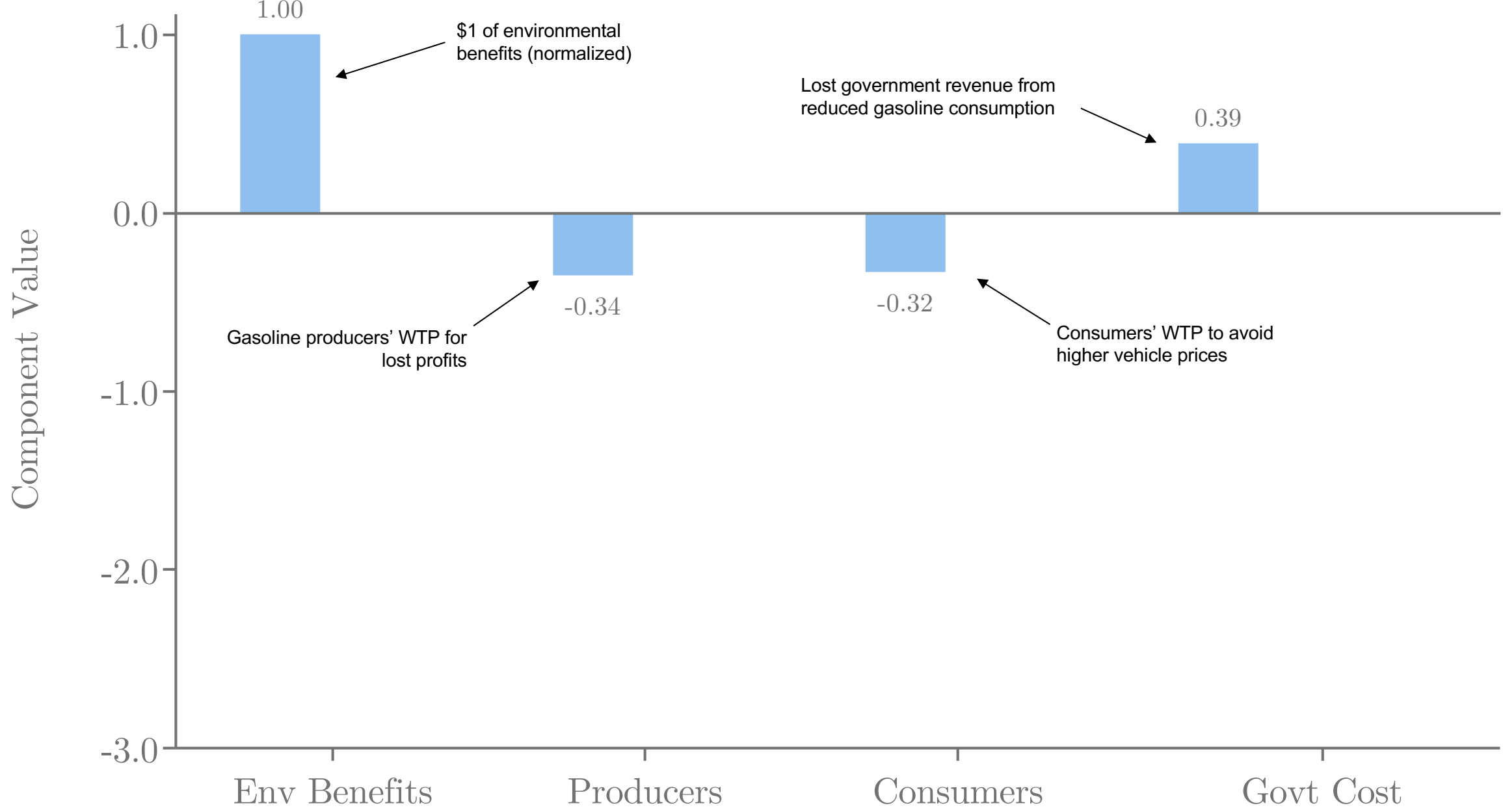
# Funnel Plot Evidence of Publication Bias



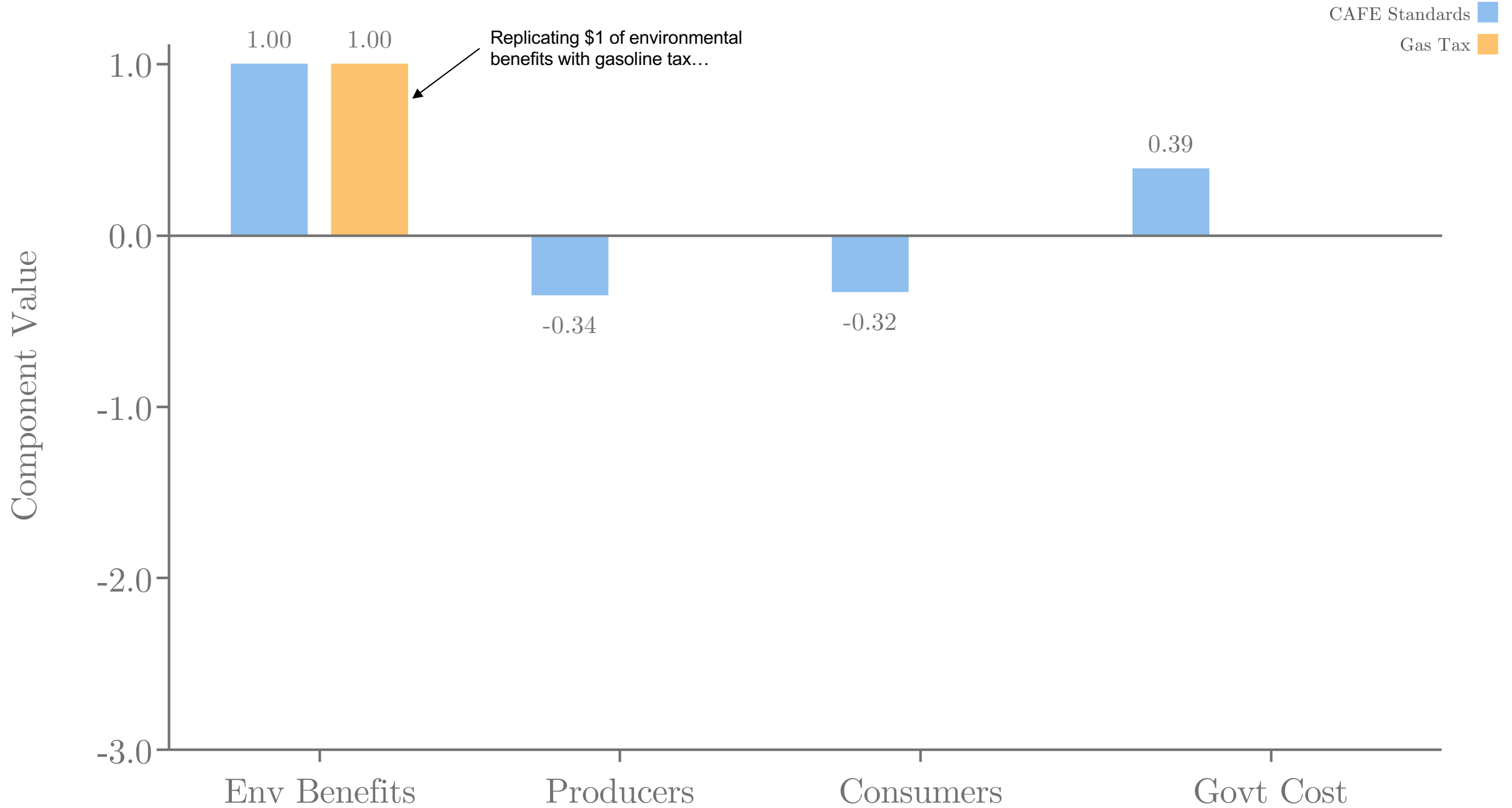
# Regulation

# CAFE Comparison to Gas + Income Tax (Leard and McConnell 2017)

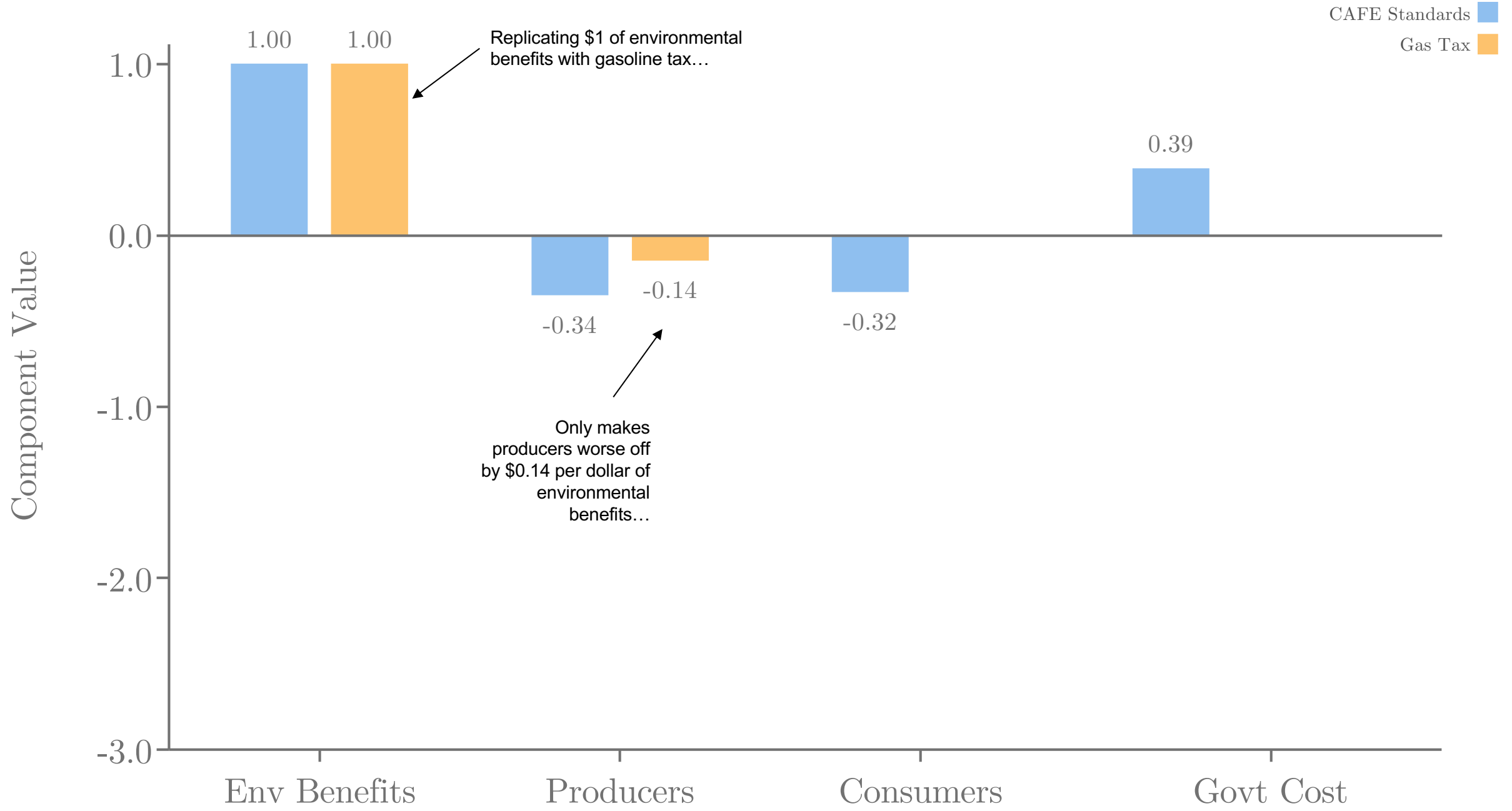
CAFE Standards ■



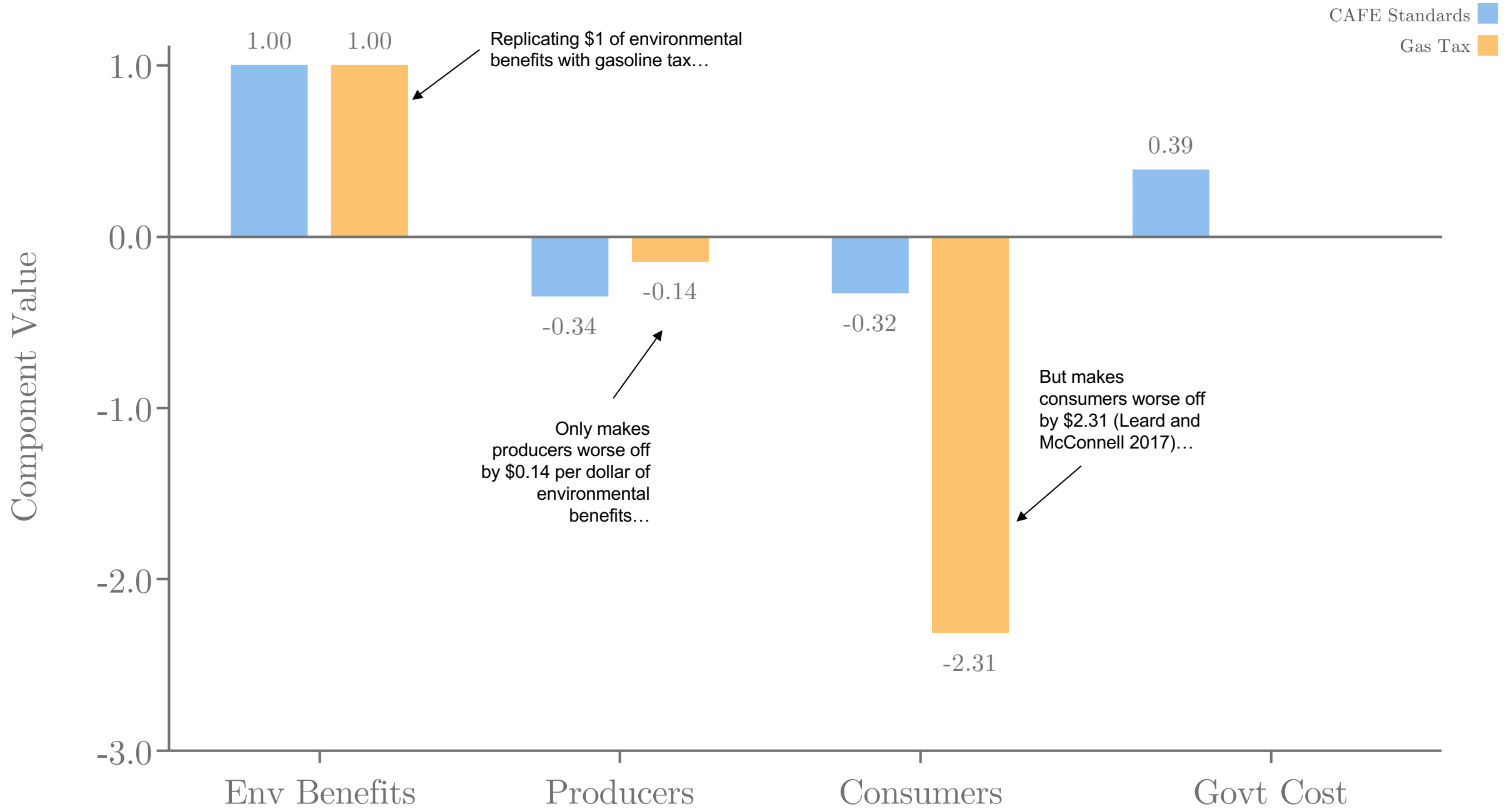
# CAFE Comparison to Gas + Income Tax



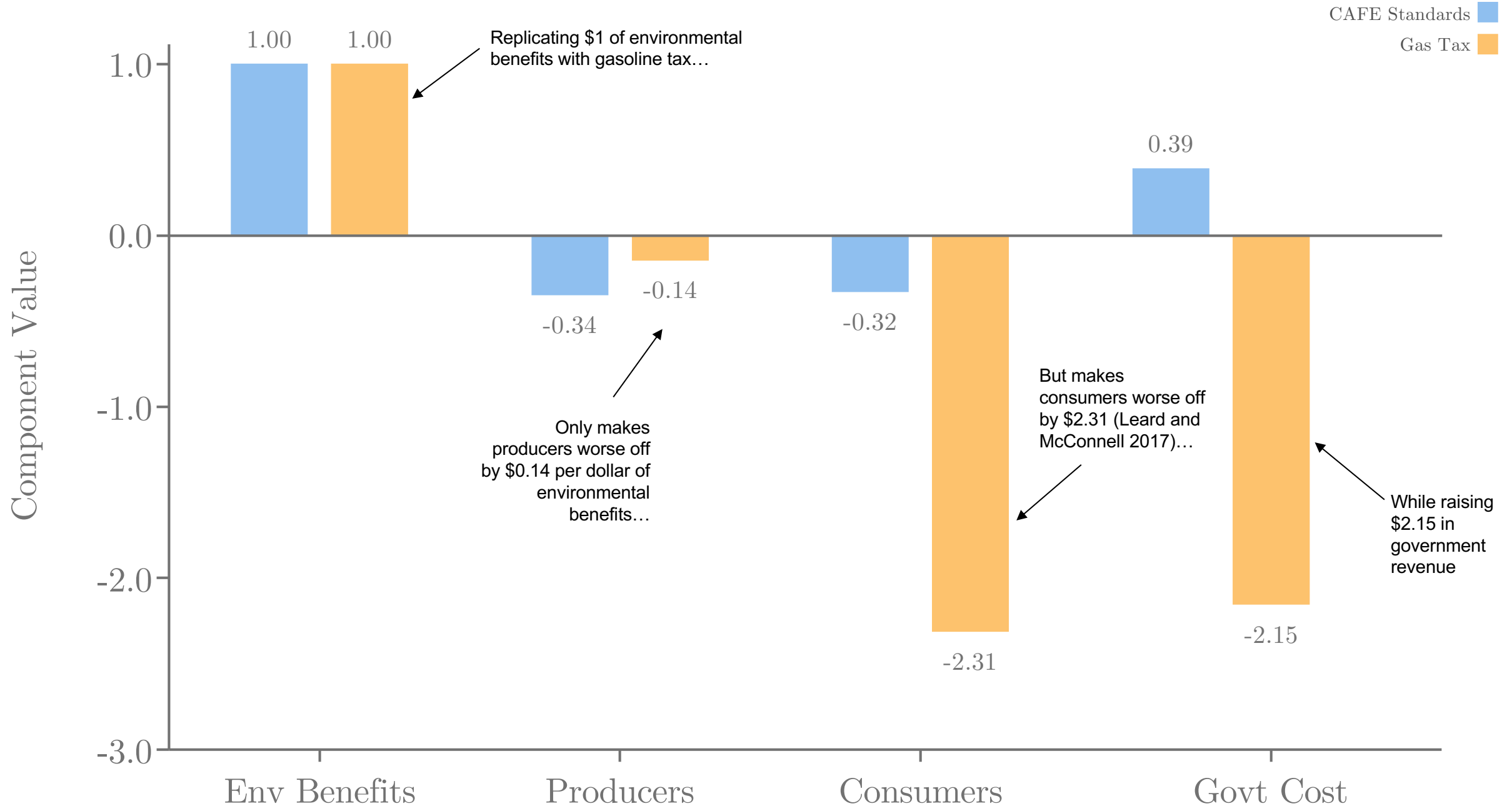
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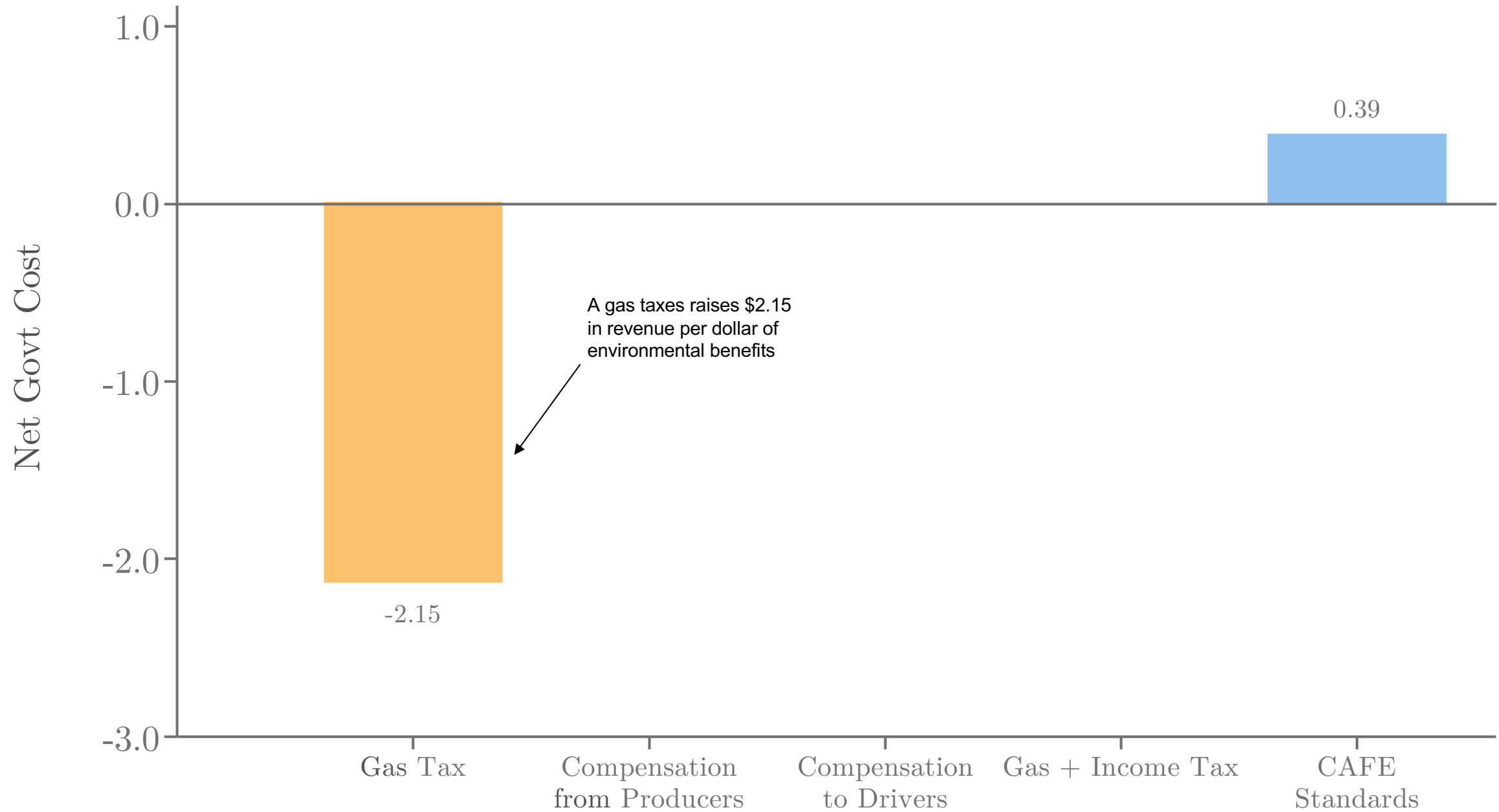
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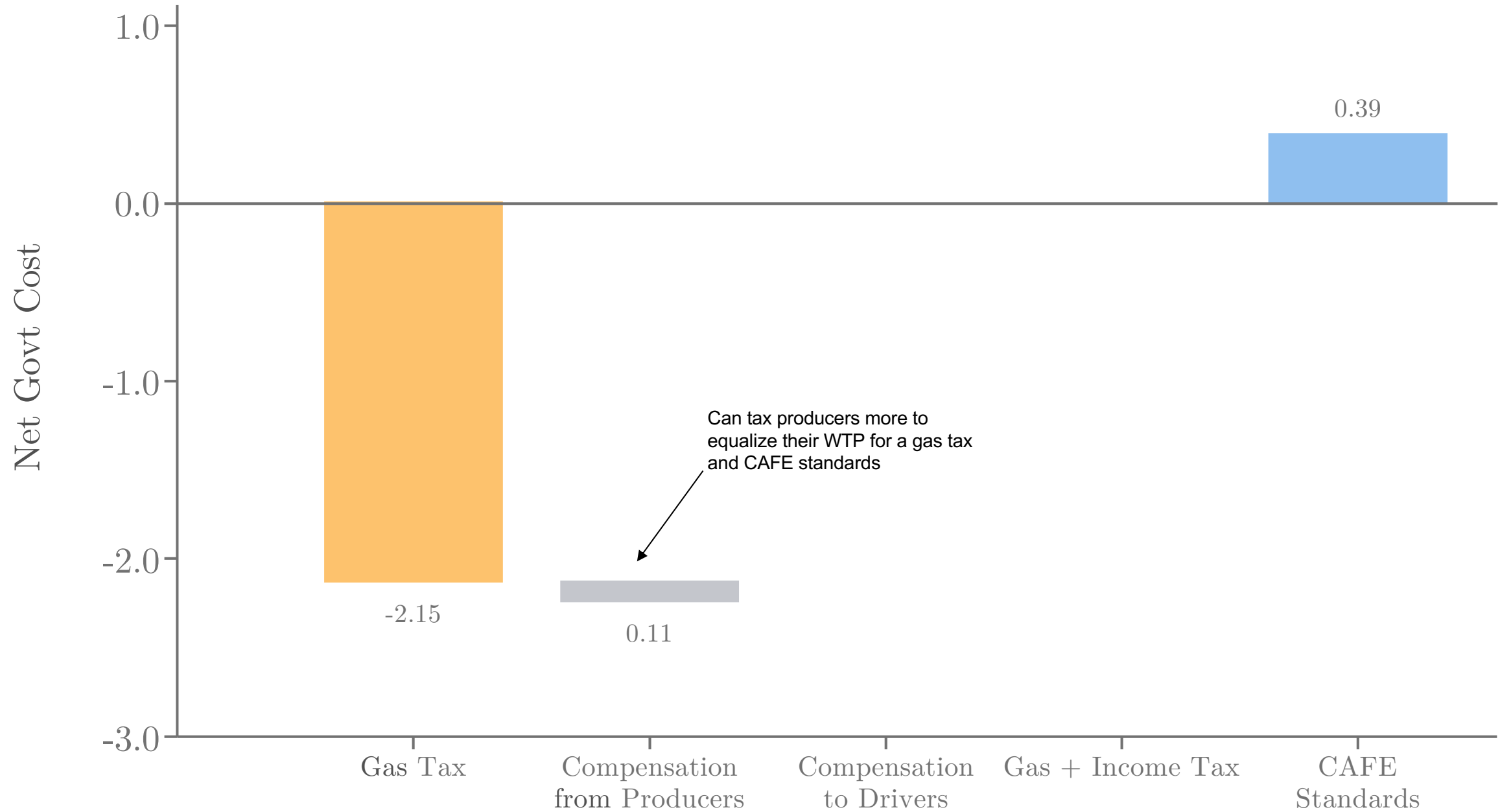
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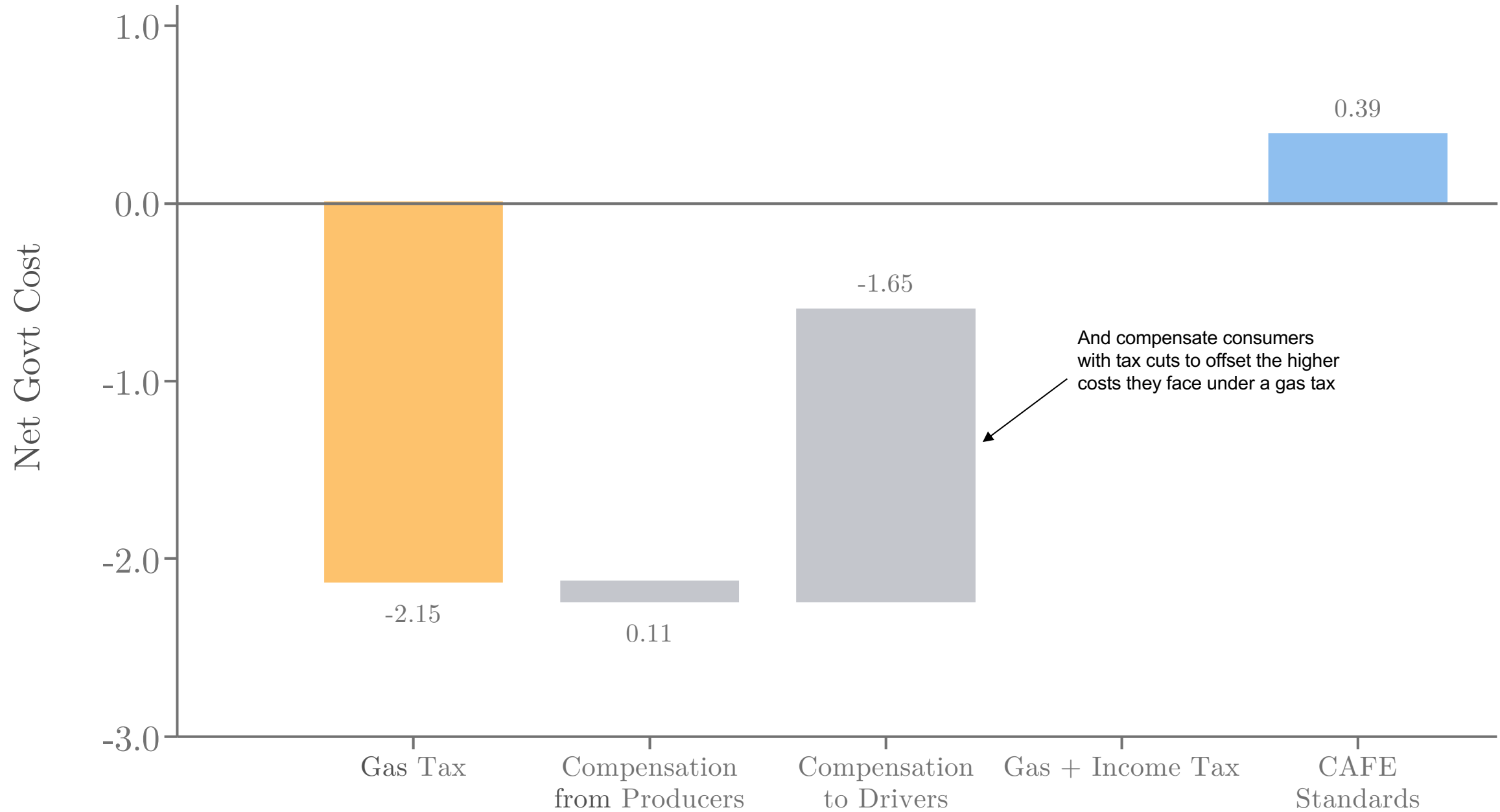
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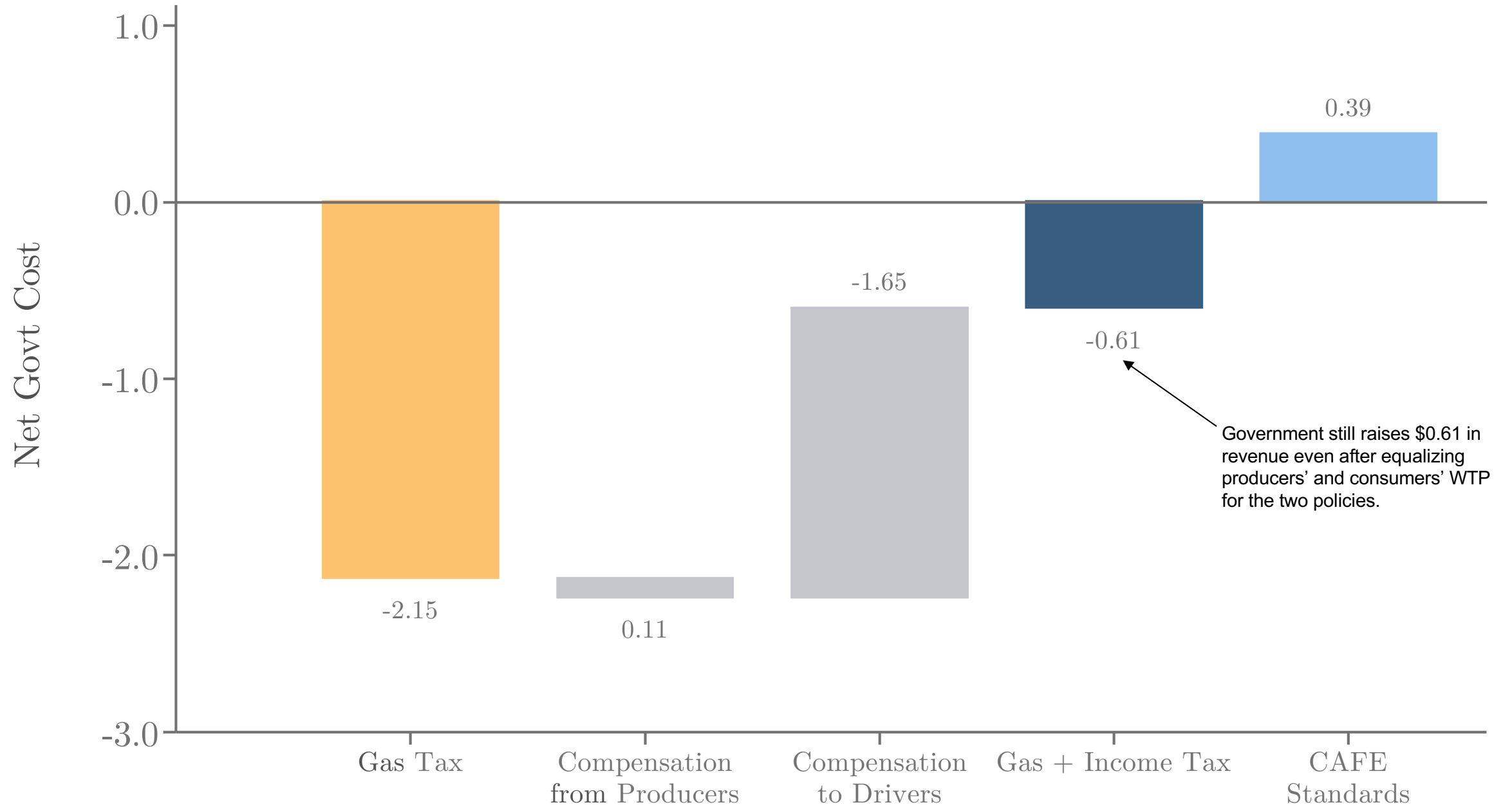
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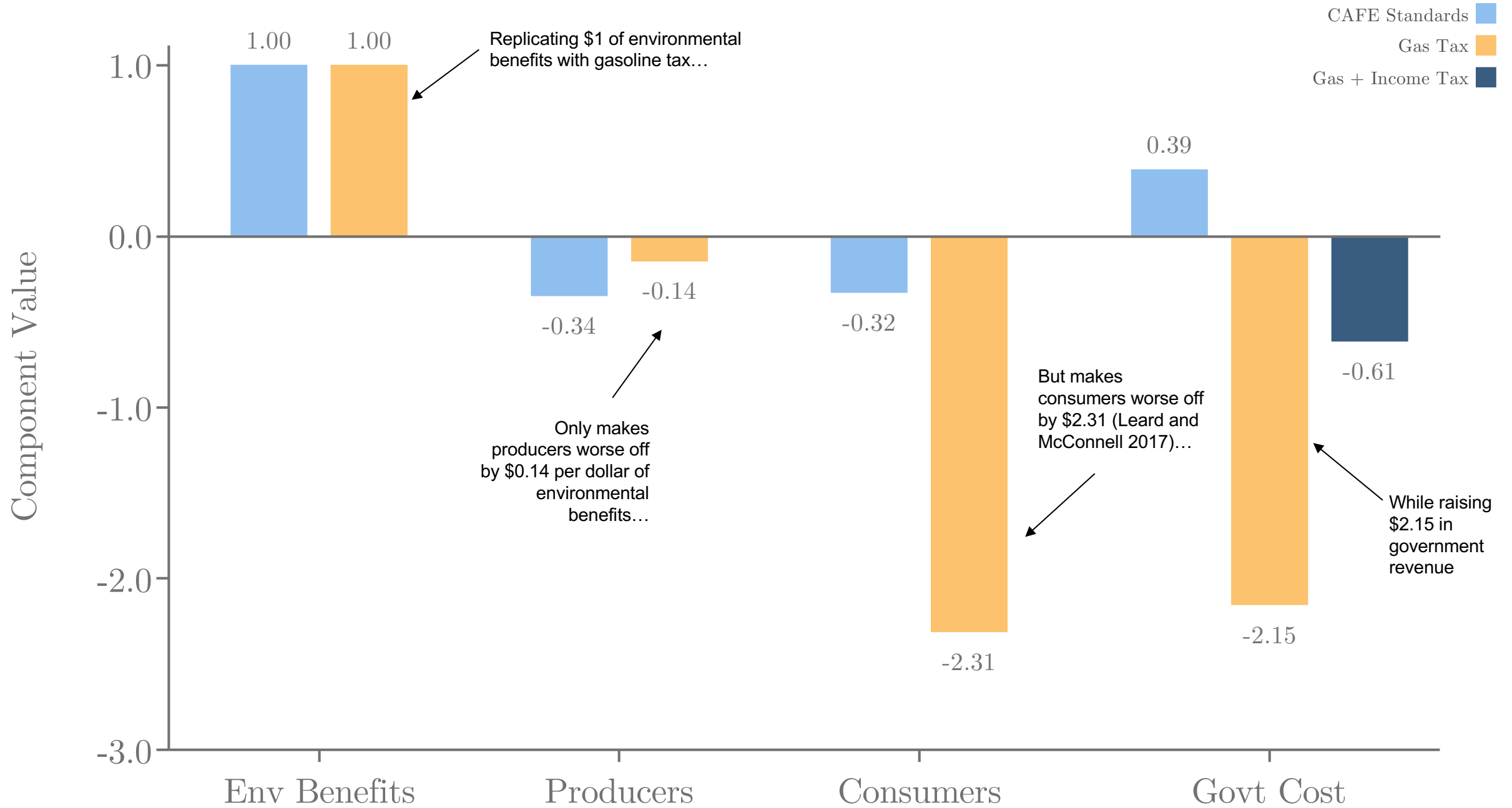
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# Results Roadmap

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**Subsidies**

2

**Nudges**

3

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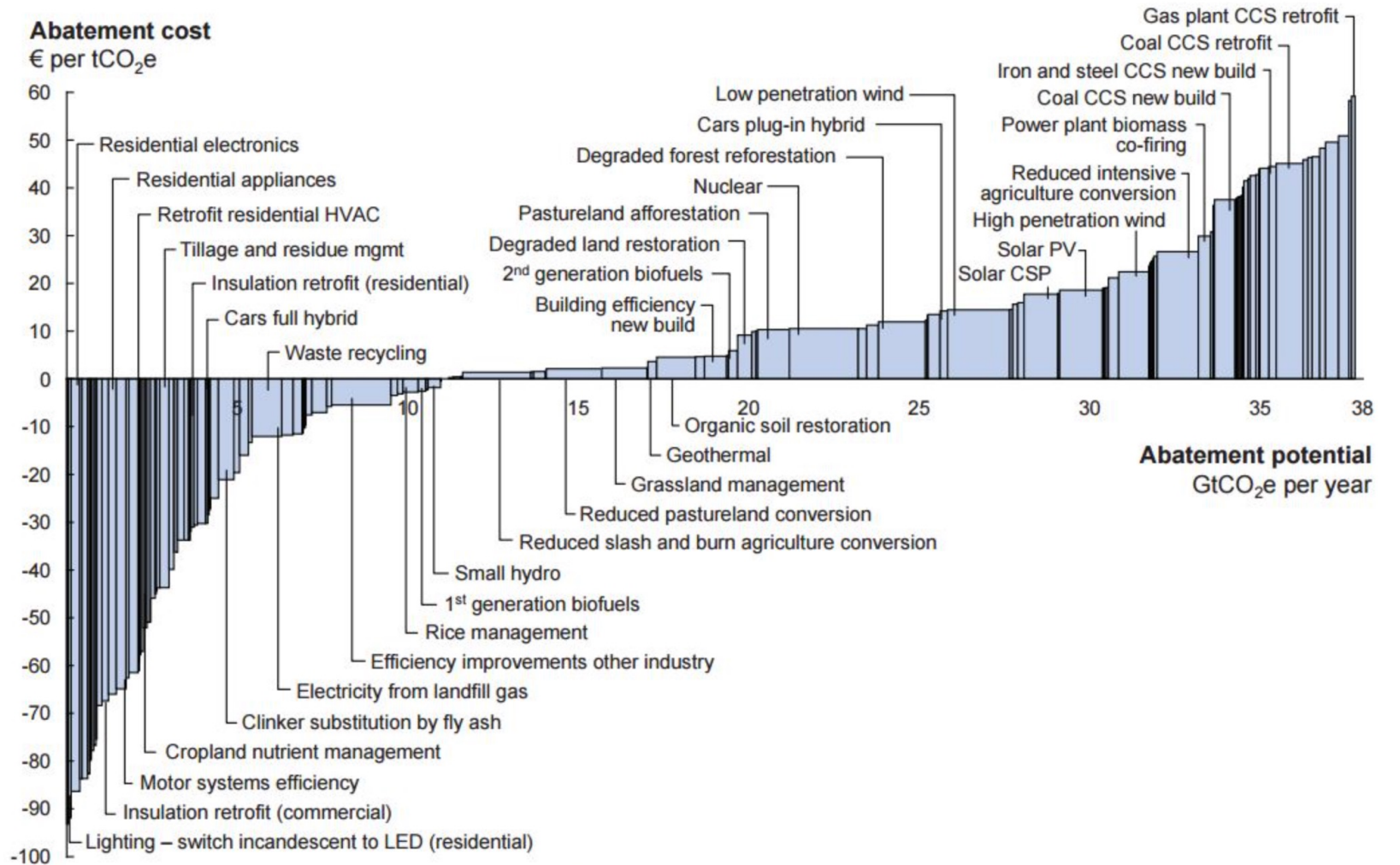
**Comparison to Cost per Ton Metrics**

# Cost Per Ton Metrics

## Resource Cost Per Ton

- Measure public and private resource expenditures
- Focuses on products rather than policies
- Omits cost to government of inframarginal transfers

Global GHG abatement cost curve beyond business-as-usual – 2030



Note: The curve presents an estimate of the maximum potential of all technical GHG abatement measures below €60 per tCO<sub>2</sub>e if each lever was pursued aggressively. It is not a forecast of what role different abatement measures and technologies will play.  
 Source: Global GHG Abatement Cost Curve v2.0

## Cost Per Ton Metrics

### Resource Cost Per Ton

- Measure public and private resource expenditures
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### Government Cost Per Ton

- Focus on government cost (inclusive of FE)
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### Social Cost Per Ton

- Social cost = government cost – private benefits – non-CO<sub>2</sub> social benefits

- Ignores opportunity cost of inframarginal transfers
- Independent of policy take-up (just like resource costs per ton)

# MVPF Versus Cost Per Ton

	MVPF	Cost Per Ton		
		Resource	Government	Social
<b>Subsidies</b>				
Wind Production Credits	5.870	-103	46	-32
Residential Solar	3.862	-77	90	-67
Electric Vehicles	1.445	-458	1,356	-415
Appliance Rebates	1.164	-2	474	111
Vehicle Retirement	1.047	987	876	148
Hybrid Vehicles	1.012	577	5,892	-38
Weatherization	0.978	194	779	207
<b>Nudges and Marketing</b>				
Opower Elec. (166 RCTs)	2.548	-41	77	70
<b>Revenue Raisers</b>				
Gasoline Taxes	0.671	-104	-770	-64

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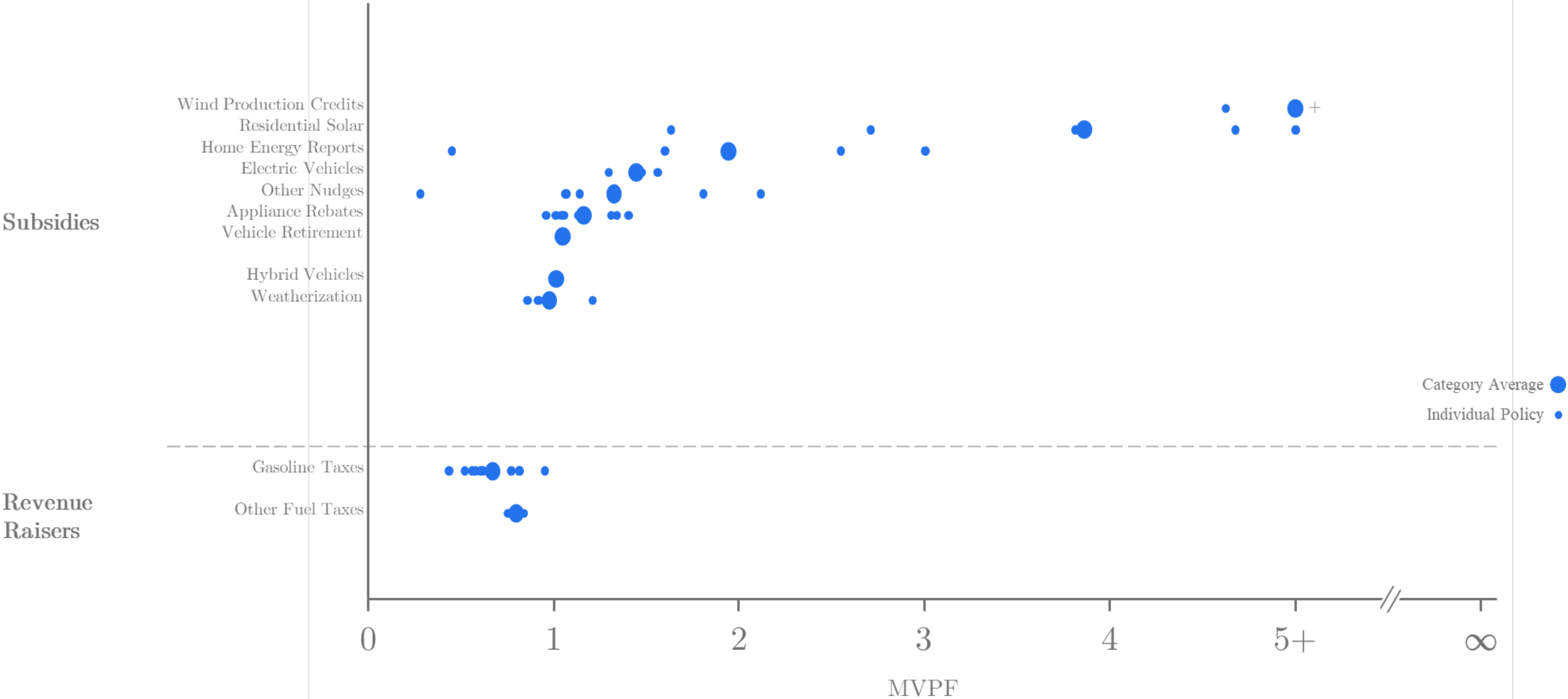
## Conclusion

- 1 Investments that directly displace dirty electricity production have highest MVPFs (5+ for wind PTCs; 3-4 for residential solar; 1.5 for EVs; others ~1)
- 2 Nudges to reduce electricity use have high MVPFs (3+) in places with dirty grids, but lower (<1) in clean grid areas (e.g. CA and Northeast)
- 3 Taxes on polluting goods (e.g., gas taxes) are relatively efficient (MVPFs < 0.7)
- 4 Spending on international policies can deliver the largest MVPFs in our sample, even considering only US-benefits and costs
- 5 Common cost per ton metrics do not fully capture these lessons and often yield different rankings across definitions

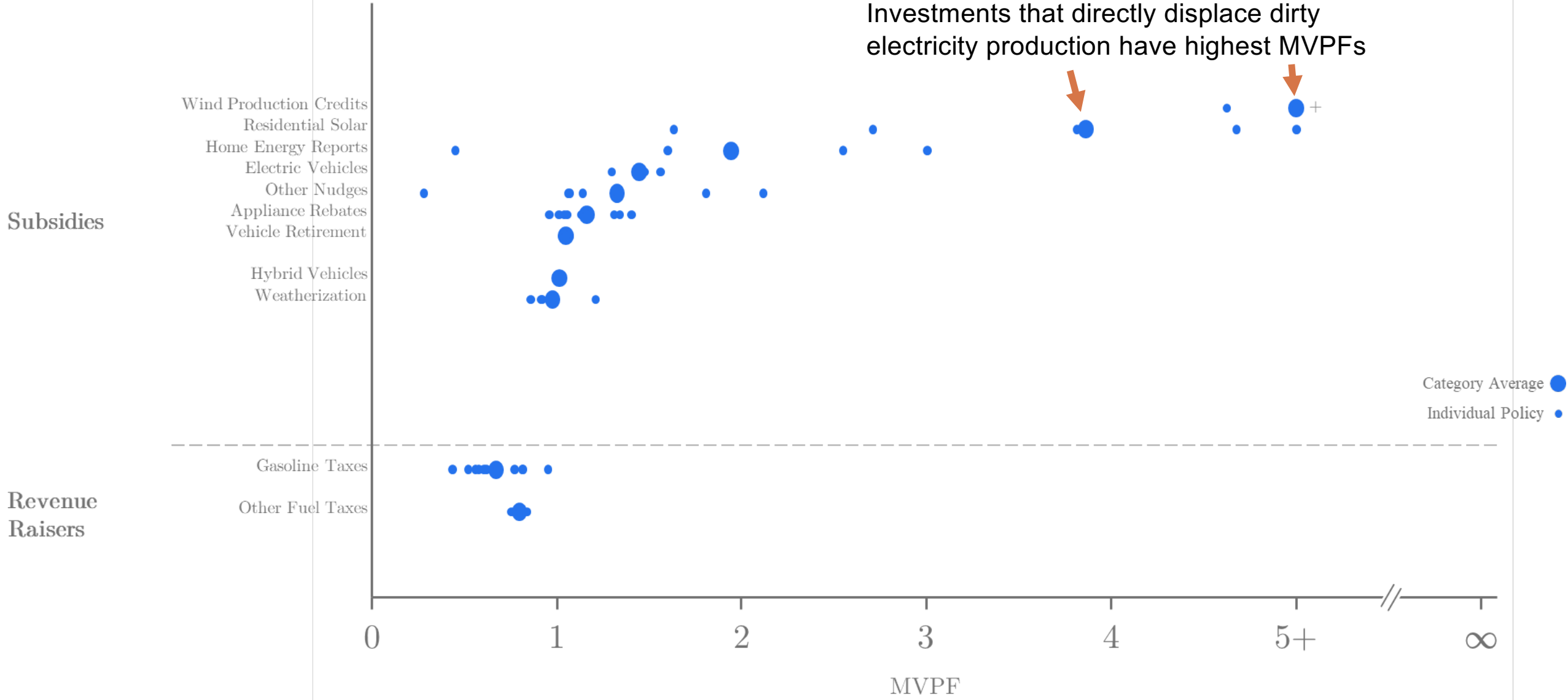
# Why does this all matter?

	ARRA Spending (2022 Prices)	IRA Spending			MVPF (Our Estimates)
		CBO Estimate	Goldman Sachs	Penn Wharton Model	
Clean Energy	\$67.9bn	\$192bn	\$274bn	\$263bn	Wind – 5.87 Solar – 3.86
EVs	\$8.3bn	\$14bn	\$393bn	\$393bn	1.3
Energy Efficiency	\$23.0bn	\$2bn	\$44bn	\$28bn	~1

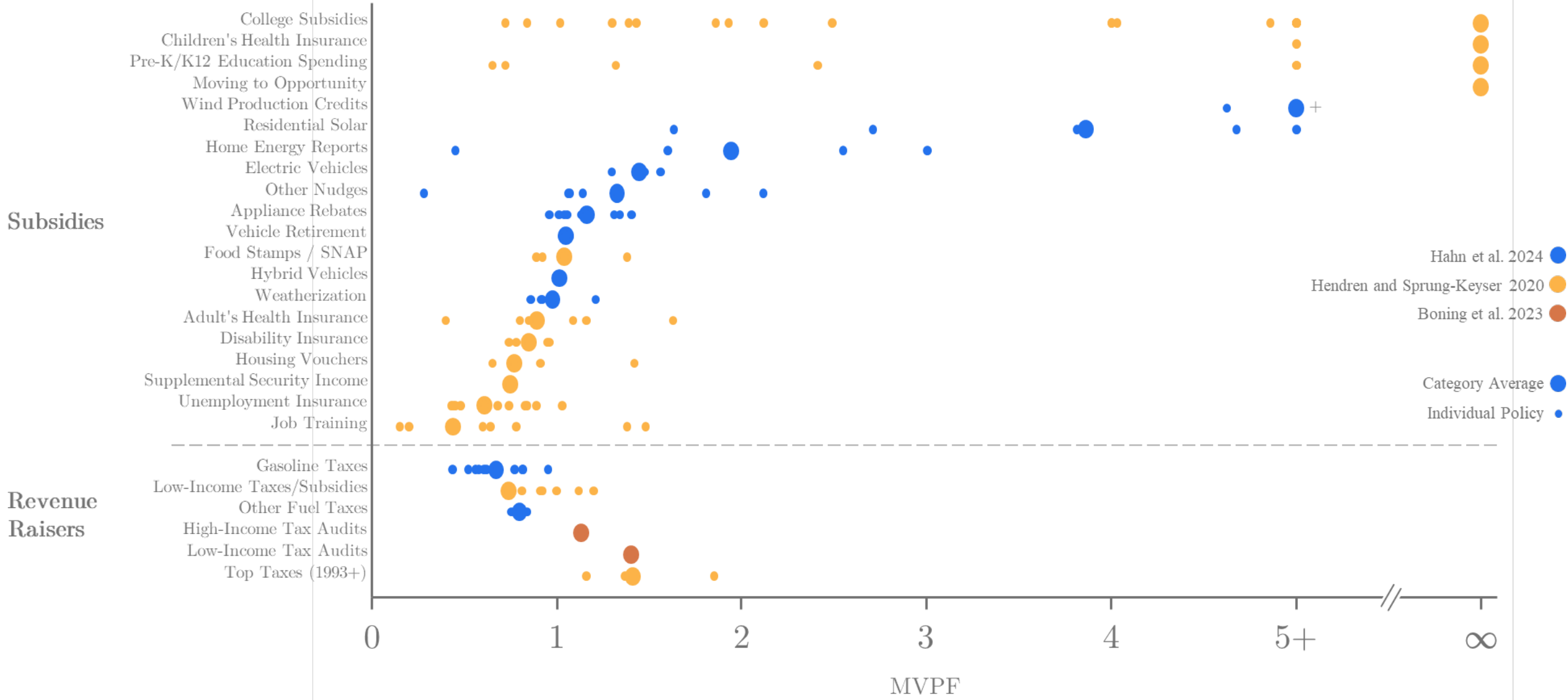
# MVPFs of Environmental Policies Versus Other Policy Categories



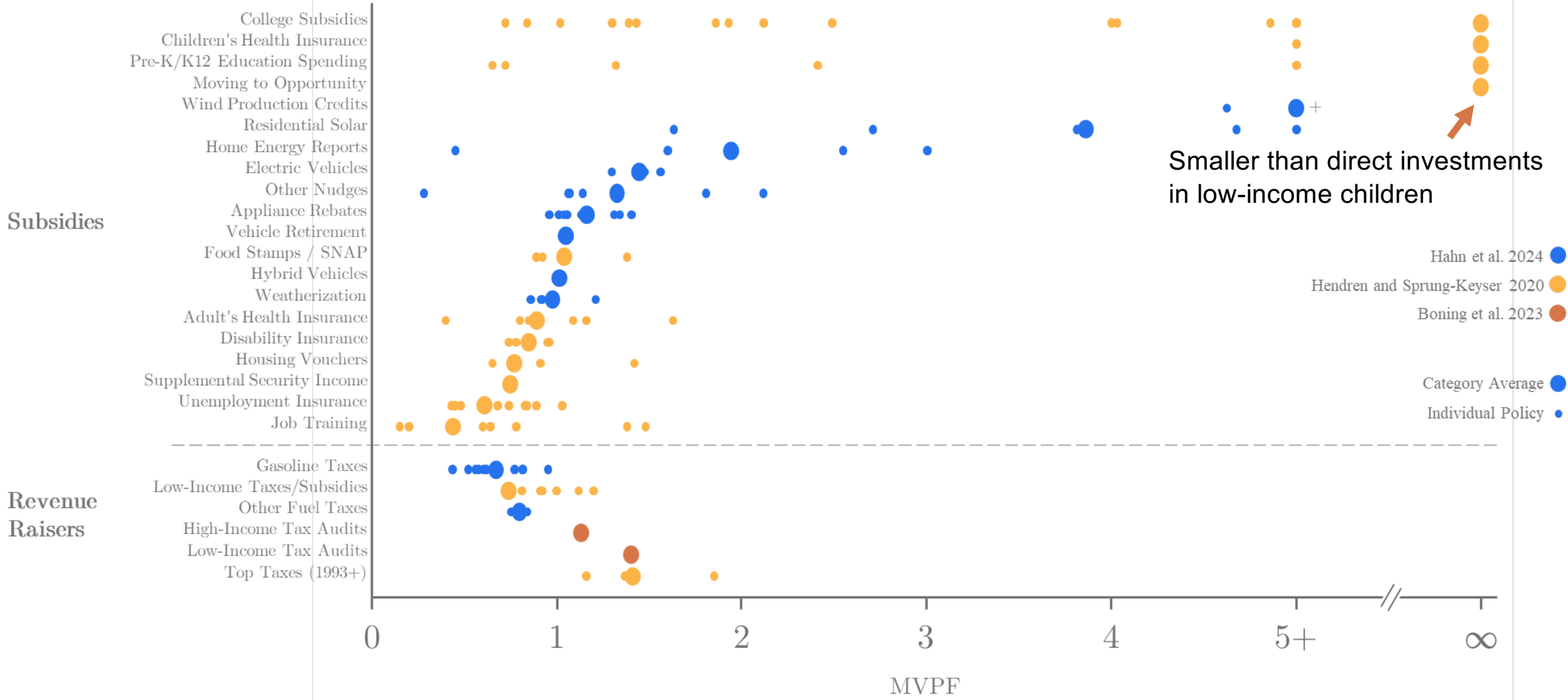
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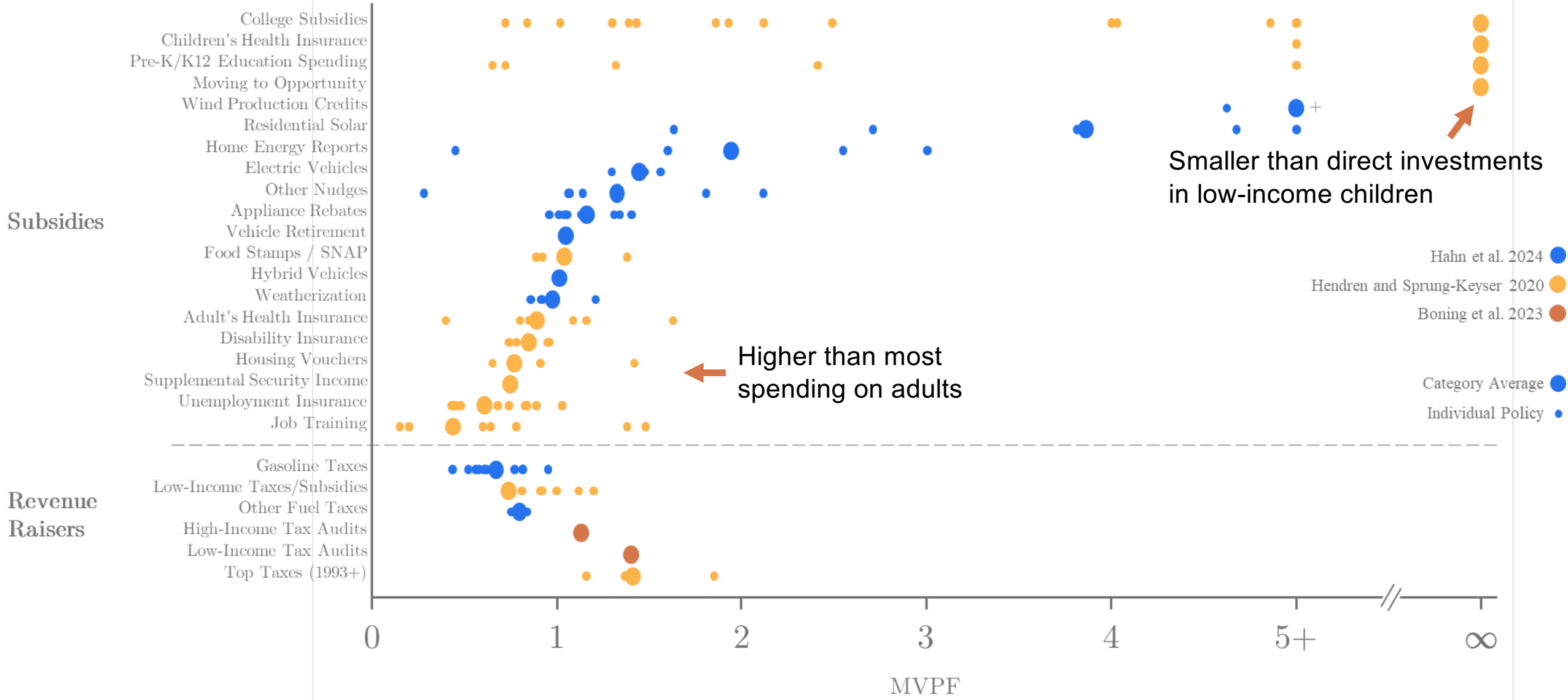
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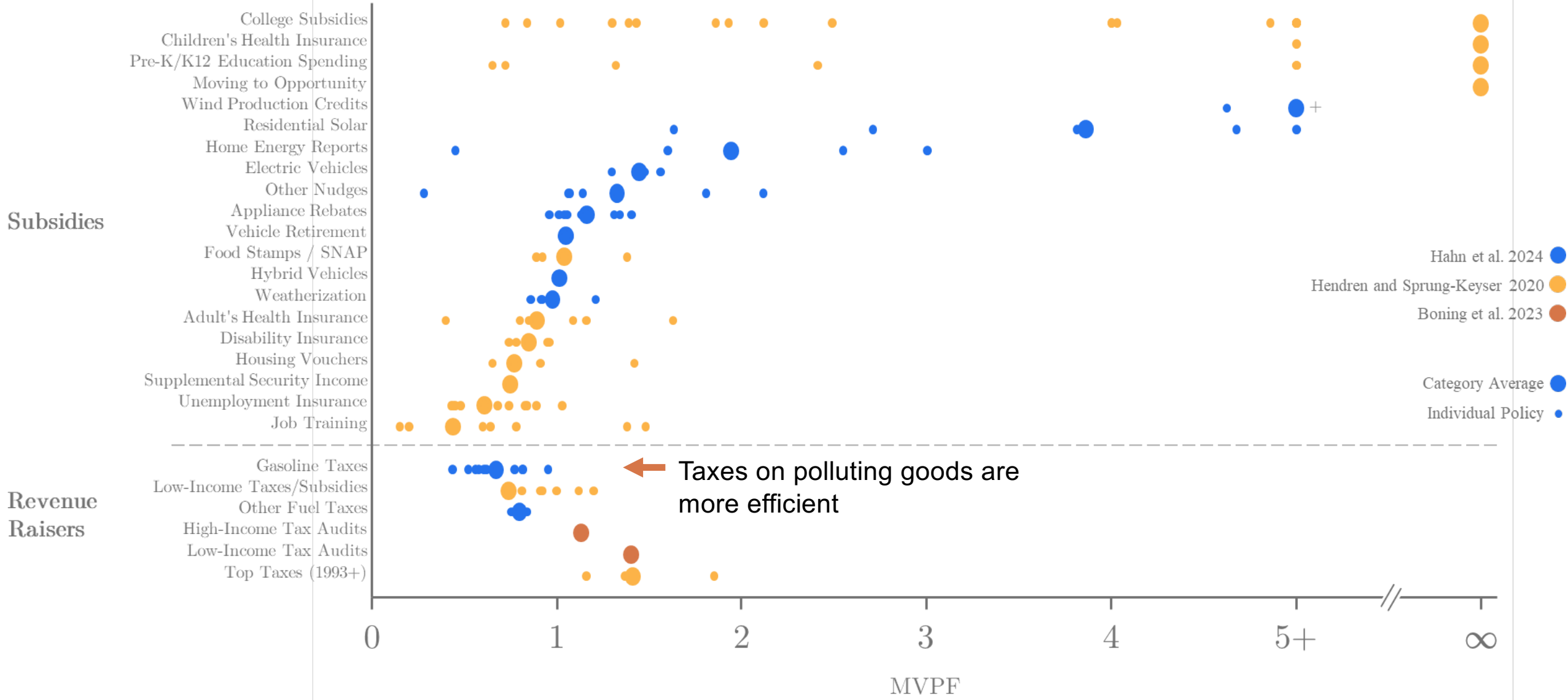
# MVPFs of Environmental Policies Versus Other Policy Categories



# MVPFs of Environmental Policies Versus Other Policy Categories



# MVPFs of Environmental Policies Versus Other Policy Categories



## Contributions

- 1 Apples vs. apples comparison of all climate policies (taxes, permits, nudges, subsidies) using the new tools in public finance
- 2 Generate a way to incorporate learning-by-doing benefits into welfare appraisal and public finance more generally
- 3 Provide a new framework for how climate fiscal externalities might be important for welfare appraisal, especially for international policies
- 4 Demonstrate theoretically and empirically that cost per ton is not a good approach for measuring the change in welfare for tax and subsidy policies

**Thank you!**



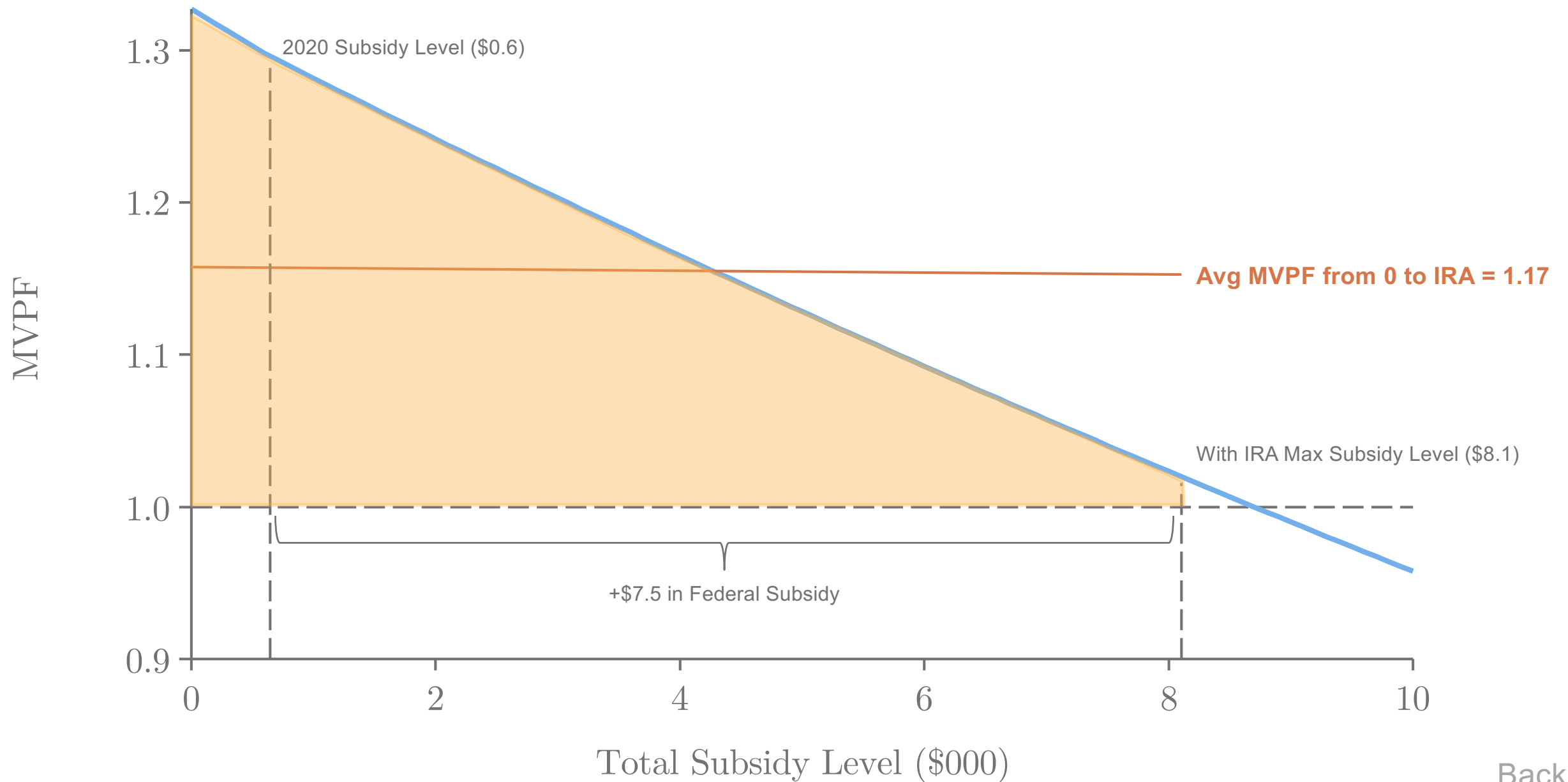
**P O L I C Y**  
**I M P A C T S**

The logo features the words "POLICY" and "IMPACTS" in a bold, dark blue, sans-serif font. The letters are spaced out. A thin orange horizontal line runs through the middle of the letters. Vertical orange lines extend from the top of the "Y" in "POLICY" and the "I" in "IMPACTS" down to the orange line. There are also small orange tick marks on the horizontal line at the top of each letter.

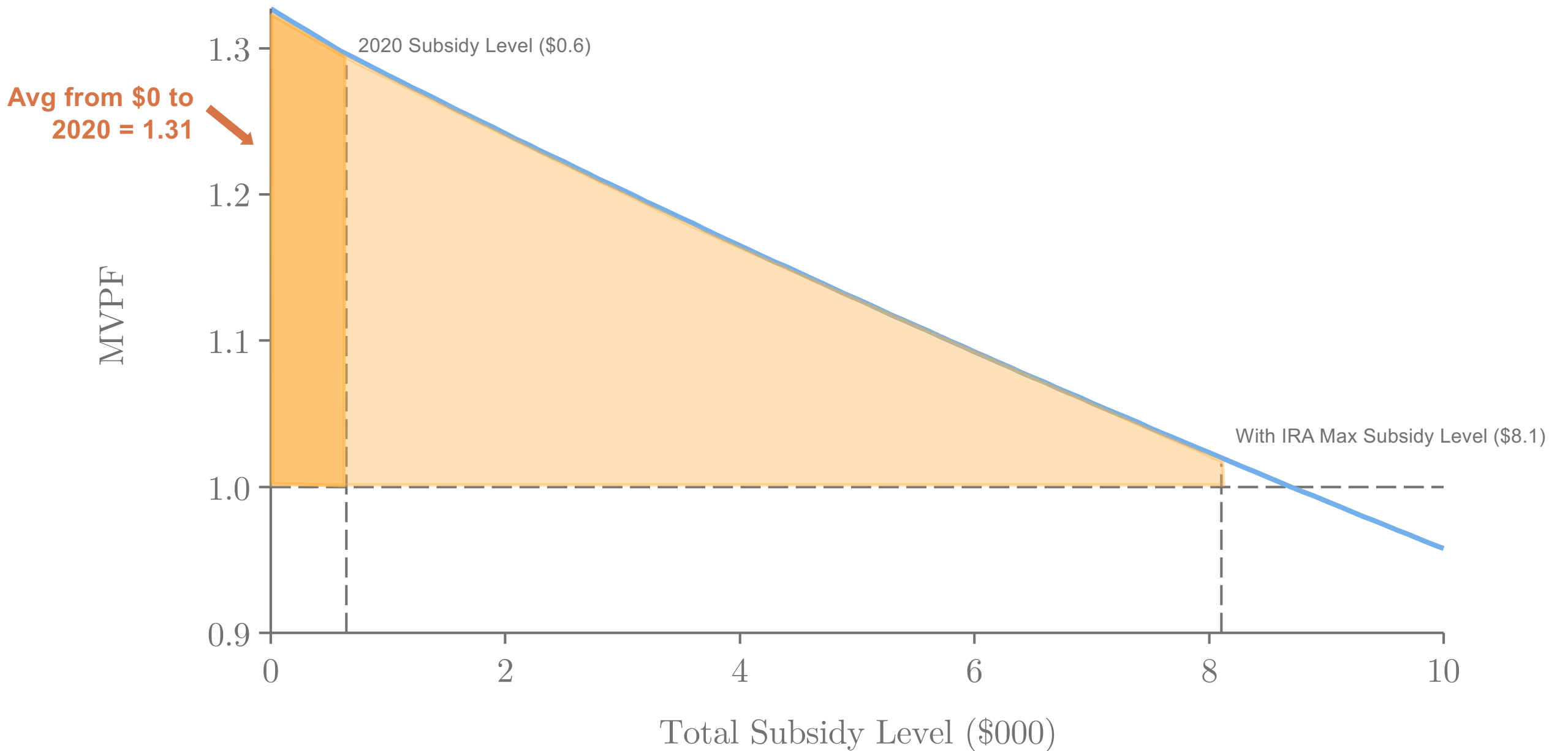
Appendix Table 9: MVPF Versus Social Cost Per Ton with MCF Adjustment

Panel A. With Learning by Doing	MVPF	Net Social Cost Per Ton			
		0% DWL	10% DWL	30% DWL	50% DWL
<b>Subsidies</b>					
Wind Production Credits	5.870	-32	-24	-15	-6
Residential Solar	3.862	-67	-48	-31	-14
Electric Vehicles	1.445	-415	-259	1	260
Appliance Rebates	1.164	111	159	254	349
Vehicle Retirement	1.047	148	235	411	586
Hybrid Vehicles	1.012	-38	555	1,749	2,942
Weatherization	0.978	207	285	441	596
<b>Nudges and Marketing</b>					
Opower Elec. (166 RCTs)	2.548	70	78	93	109
<b>Revenue Raisers</b>					
Gasoline Taxes	0.671	-64	-140	-294	-448

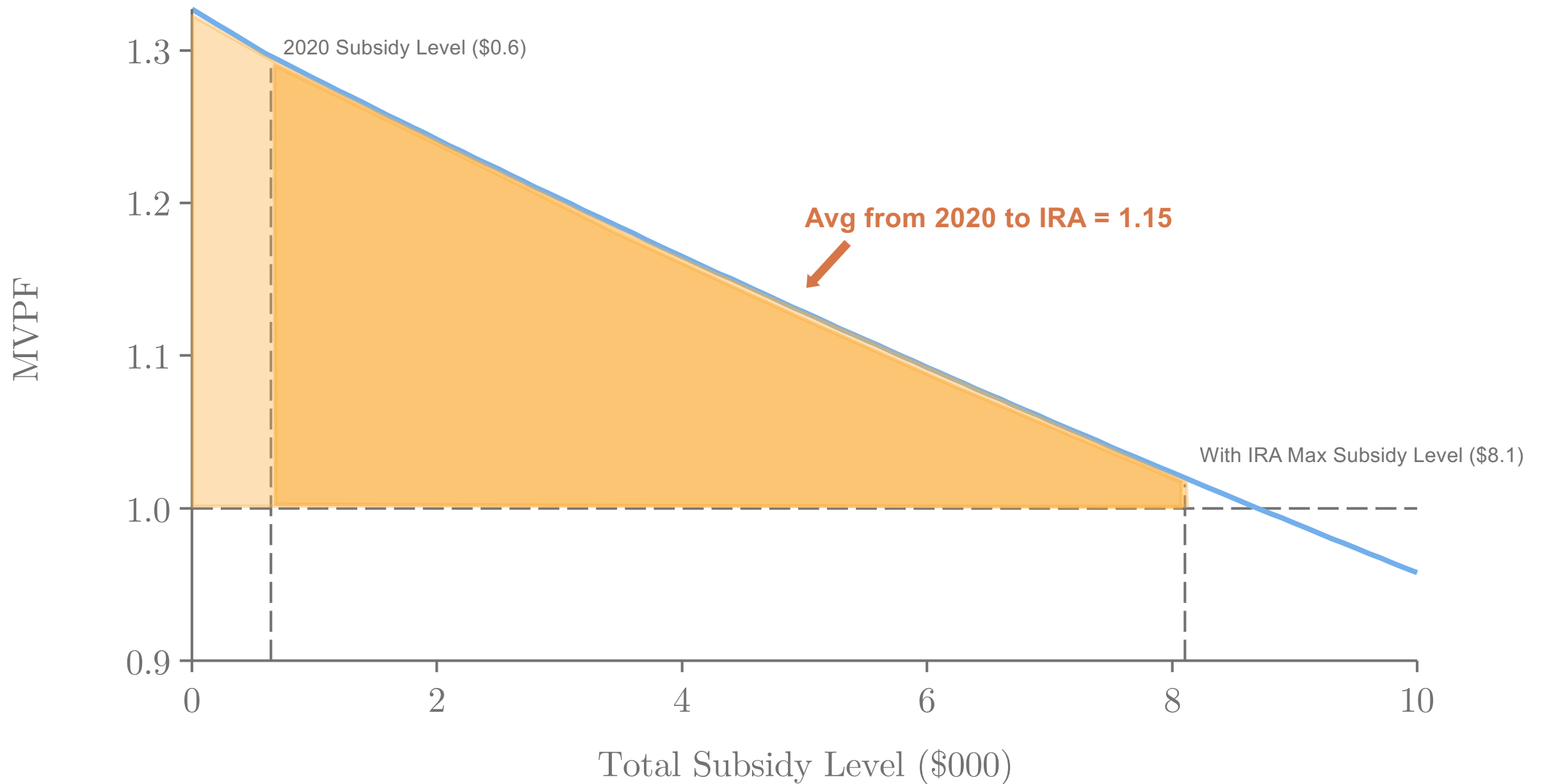
# Electric Vehicles: Non-Marginal (Average) MVPF



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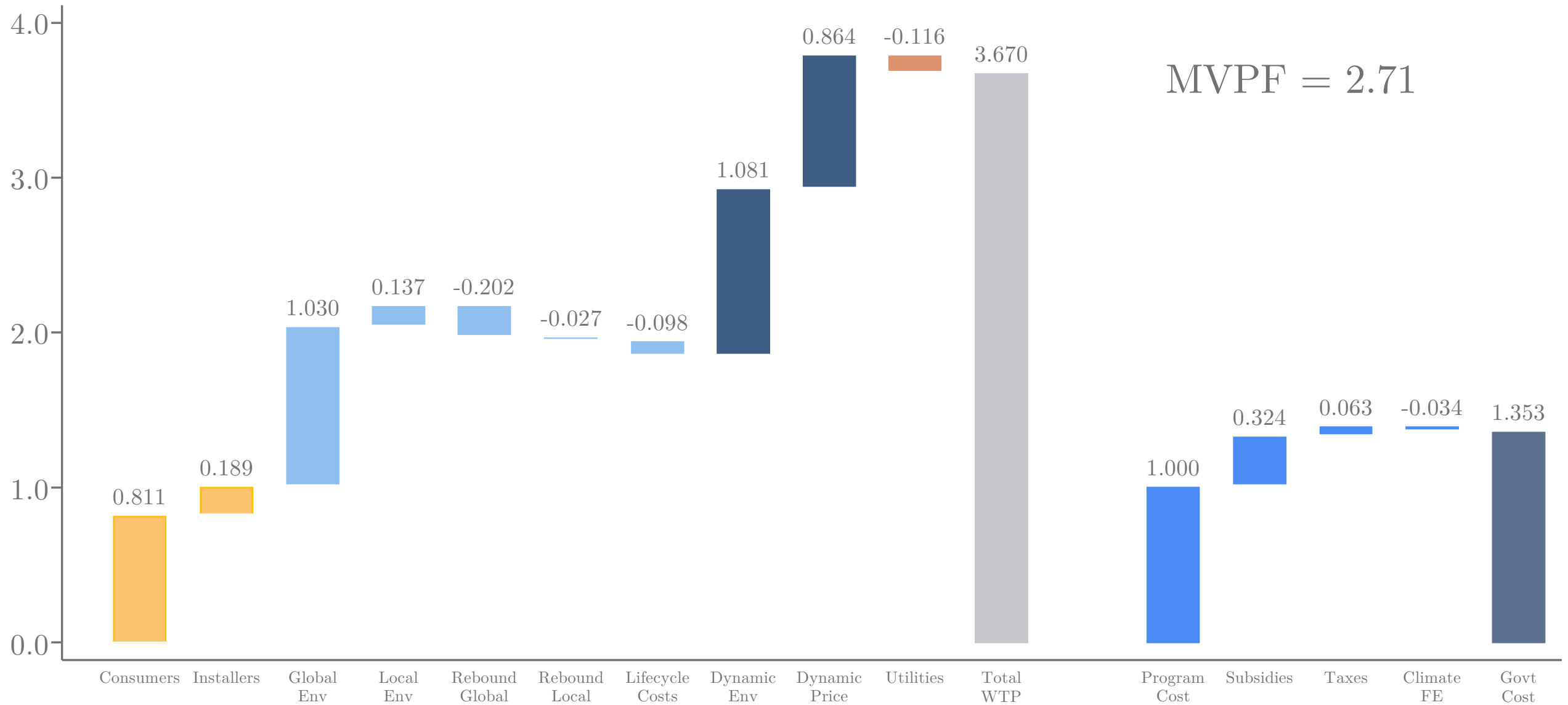
# Electric Vehicles: Non-Marginal (Average) MVPF



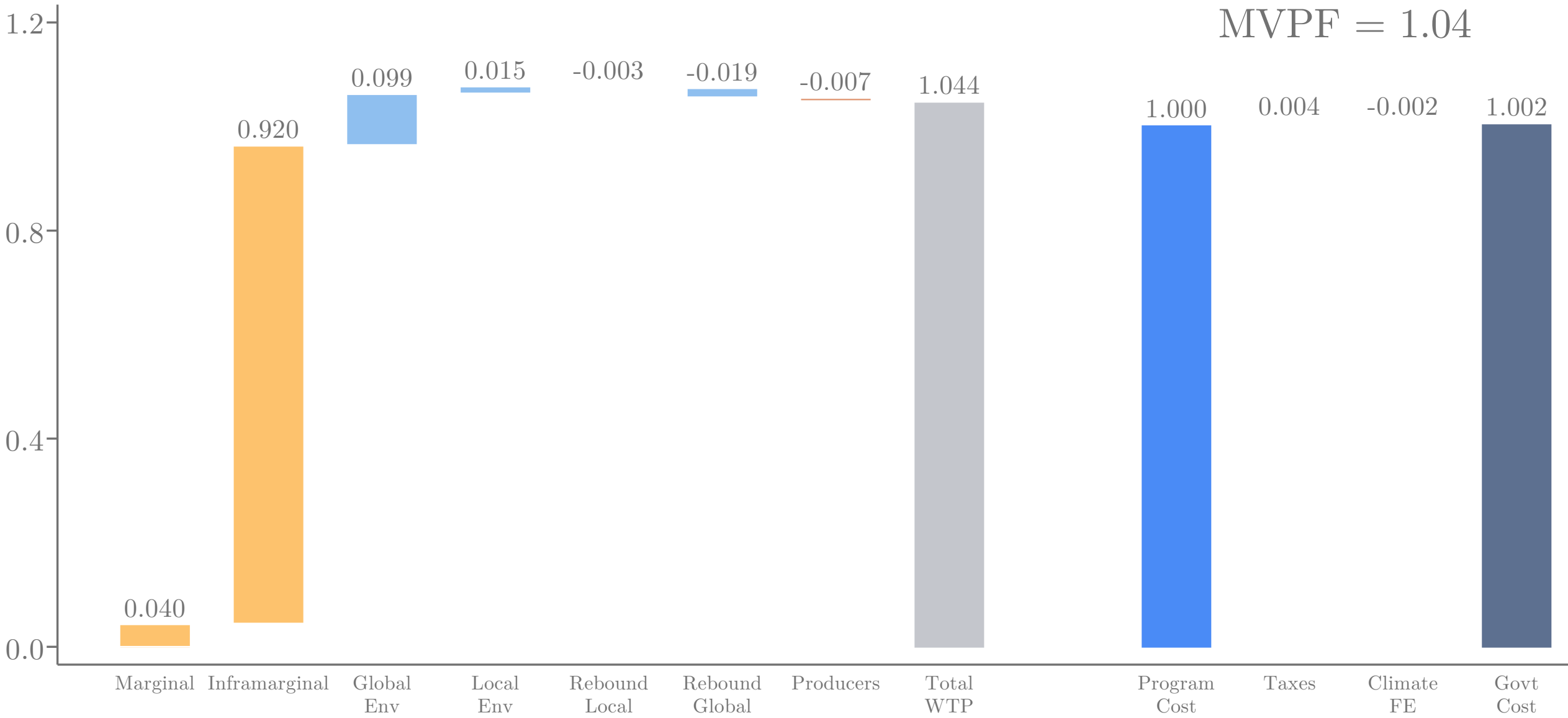
## Aside: Determinants of the Social Cost of Carbon

- Damages in IAMs are generally driven by a mix of health and productivity effects, broadly defined
  - Ex: GIVE (Rennert et al. 2022), DICE (Barrage and Nordhaus, 2023)
  - Other models focus exclusively on impacts on GDP (Nath et al. 2024; Bilal and Kanzig, 2024);
- This distinction might not matter for the concept of the SCC, but it matters for the government costs of climate policy
  - The US government has an equity stake in US productivity
- Our approach:
  - Use 50/50 productivity-mortality split (Rennert et al. 2022)
  - Allocate productivity in proportion to US share of GDP (Nordhaus, 2017)
  - Apply a 25.5% tax rate
- Result: \$3.70 of the \$193 of the SCC falls on US government

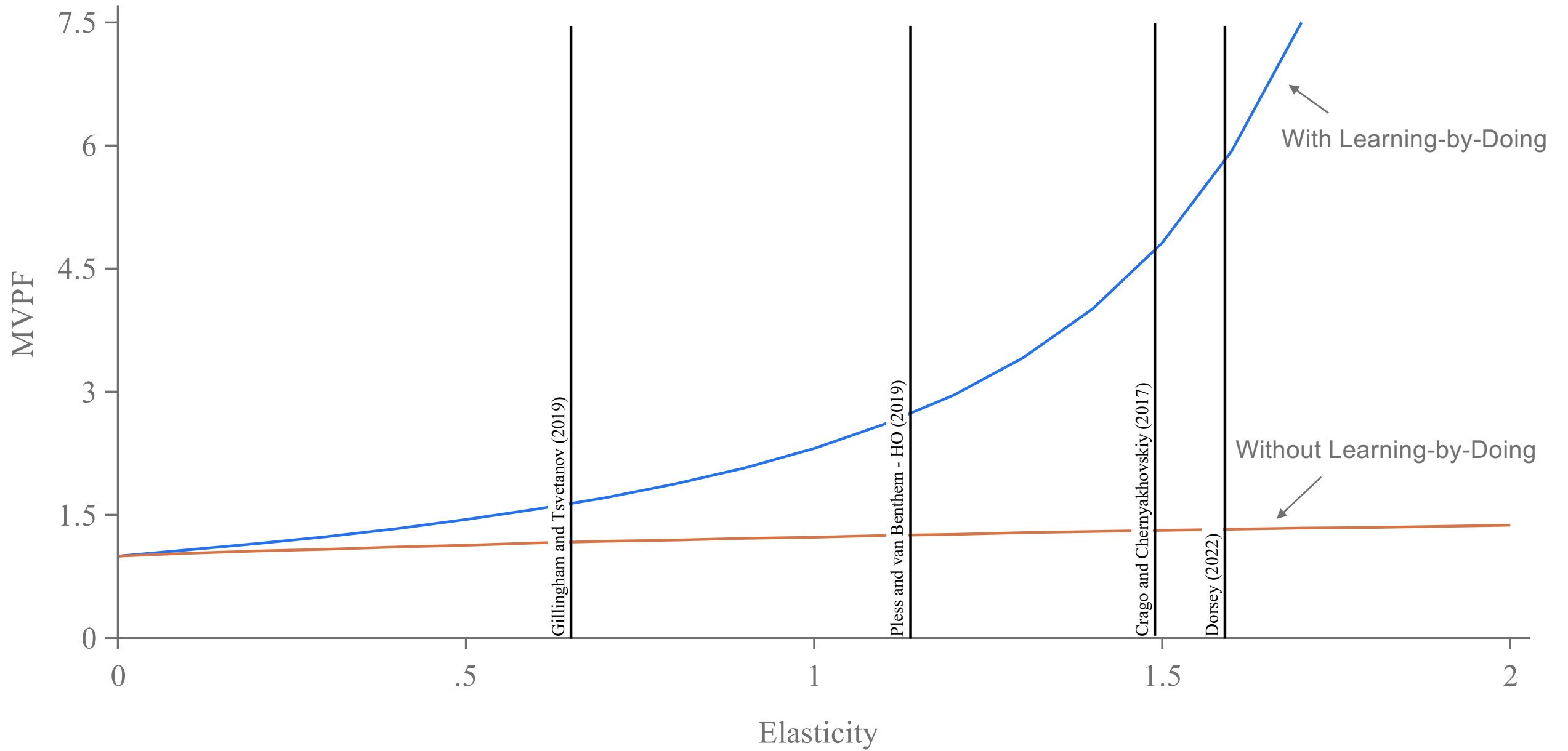
# Residential Solar Subsidy (Pless and van Benthem 2019)



# Energy-Efficient Refrigerator Rebate (Houde and Aldy 2017)

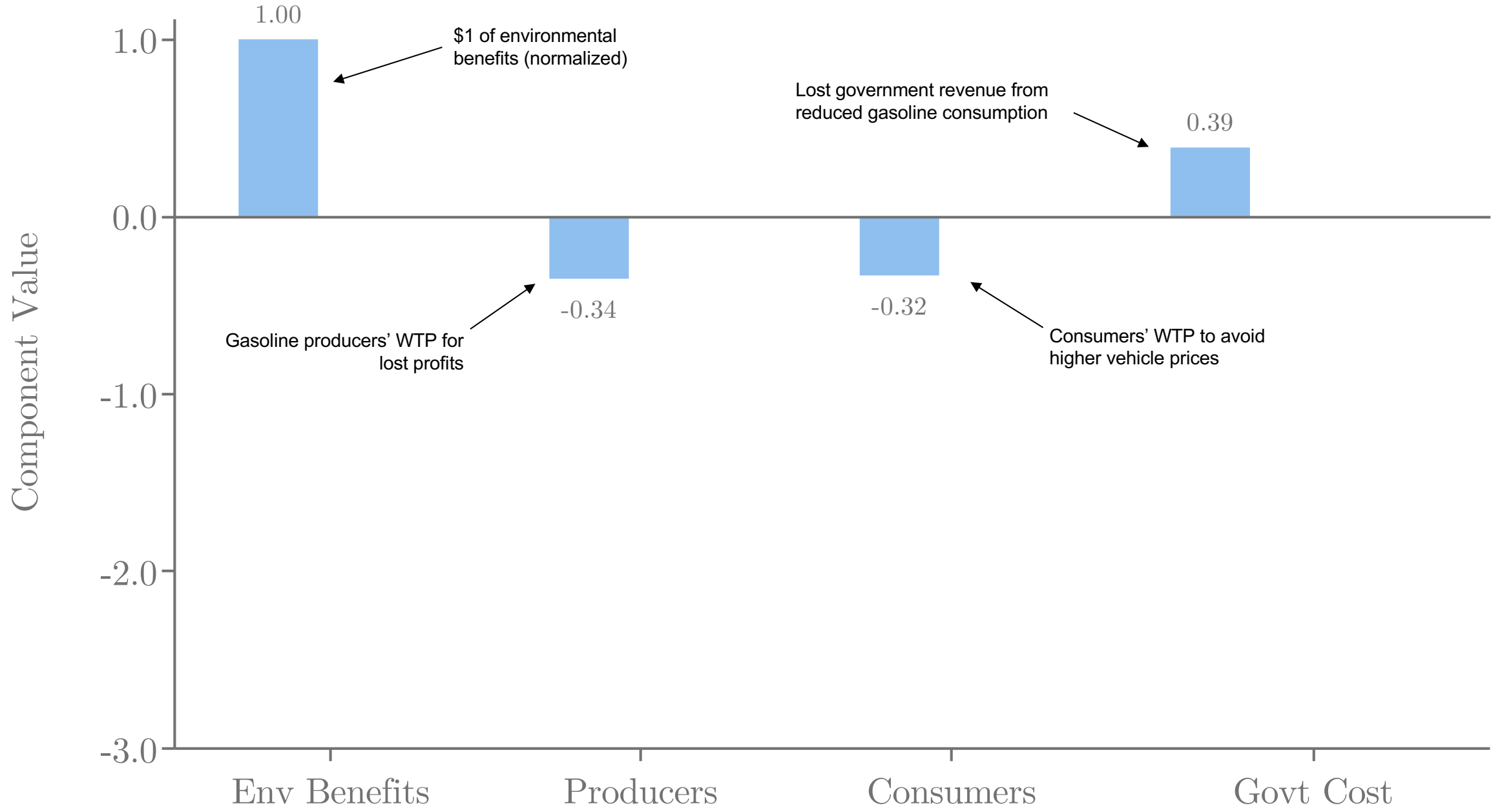


# Solar

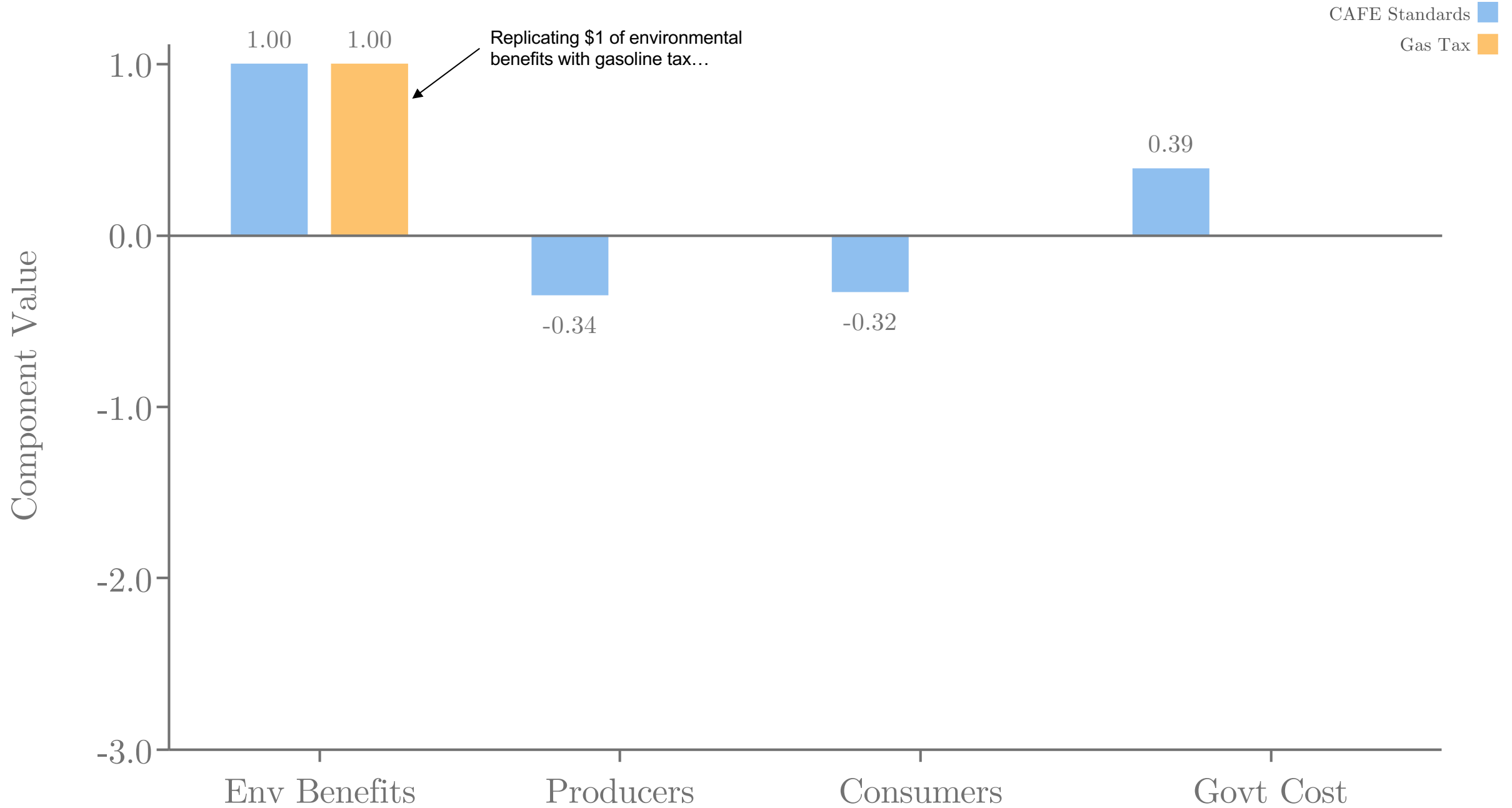


# CAFE Comparison to Gas + Income Tax

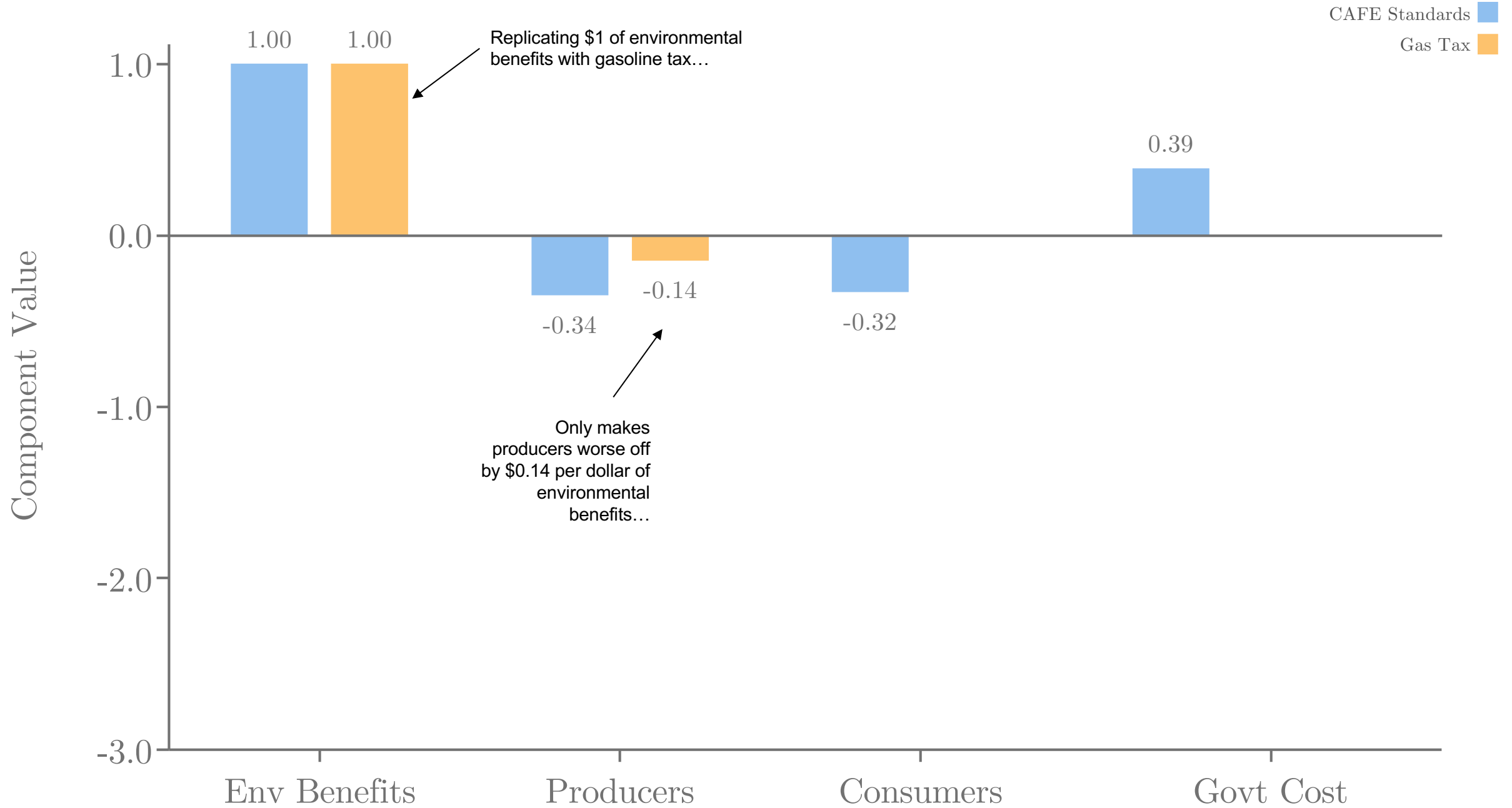
CAFE Standards 



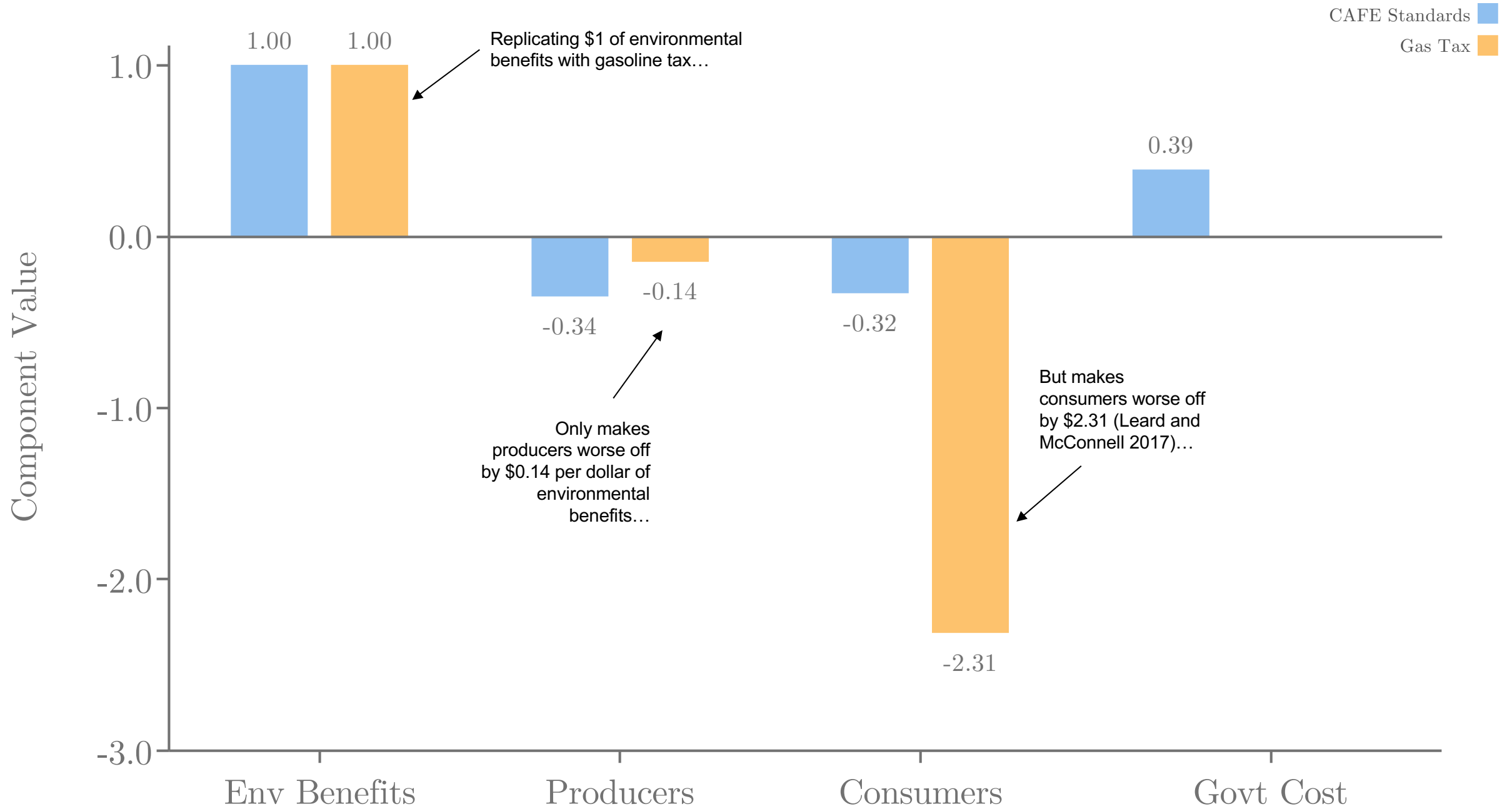
# CAFE Comparison to Gas + Income Tax



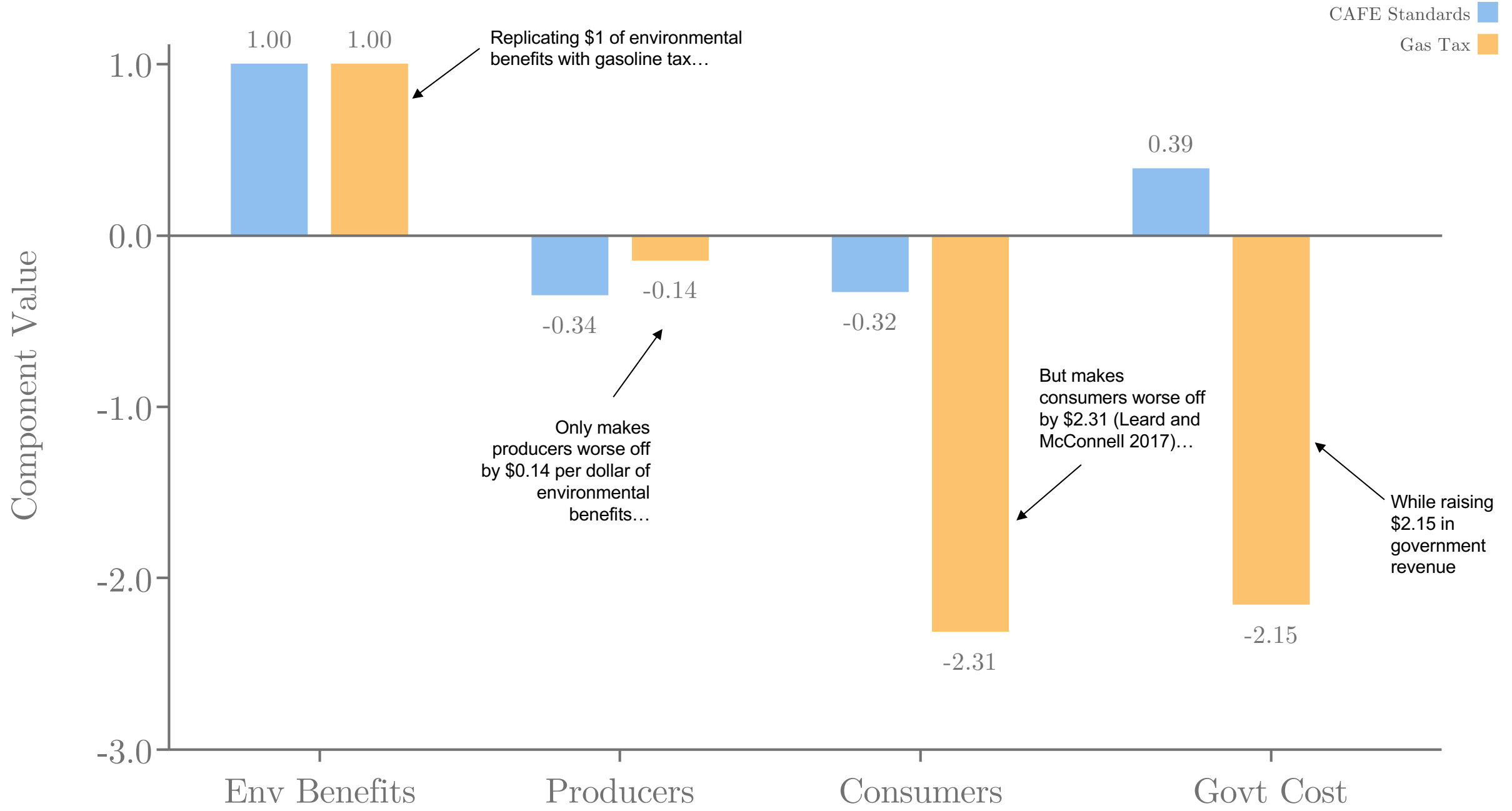
# CAFE Comparison to Gas + Income Tax



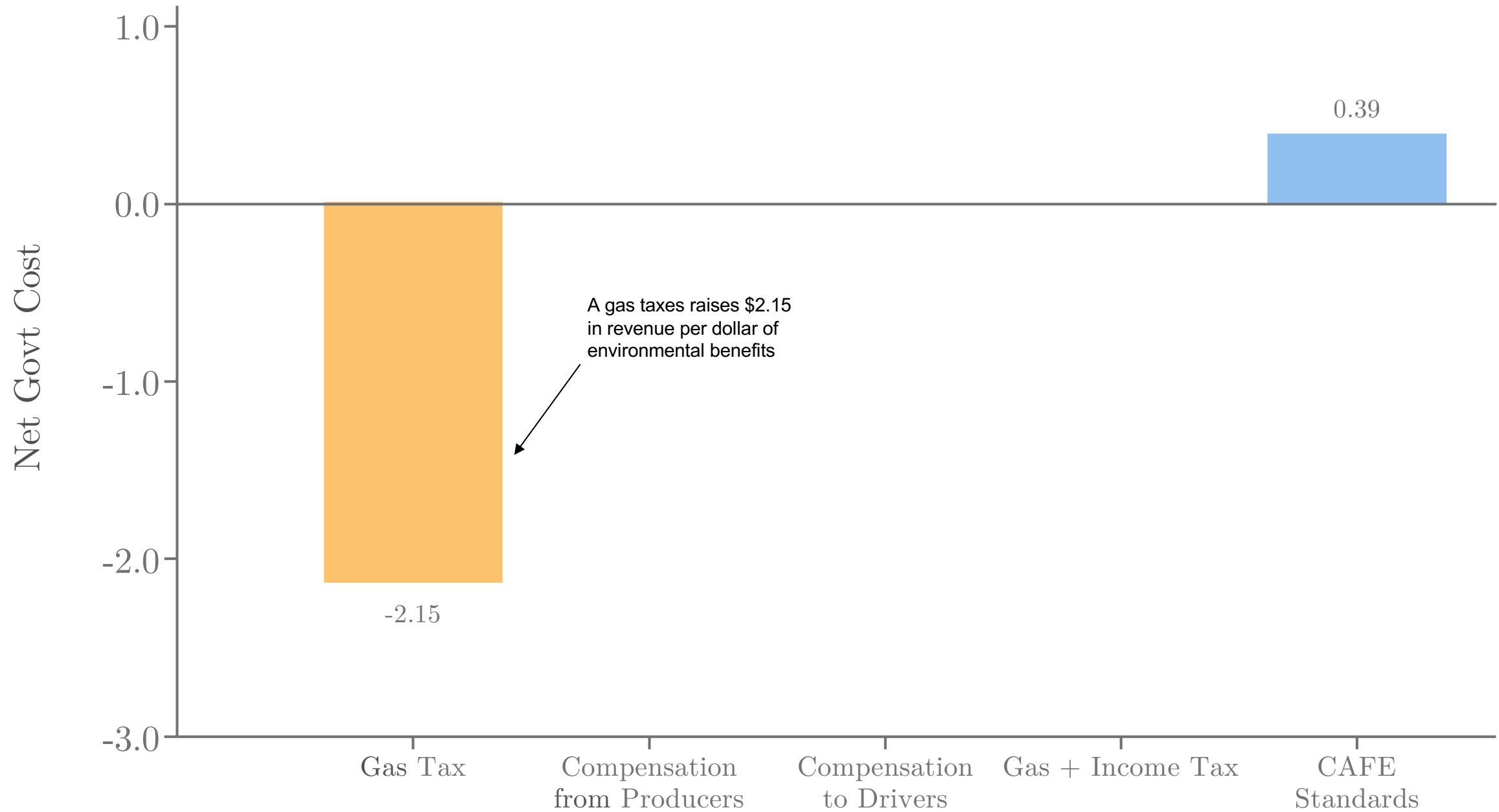
# CAFE Comparison to Gas + Income Tax



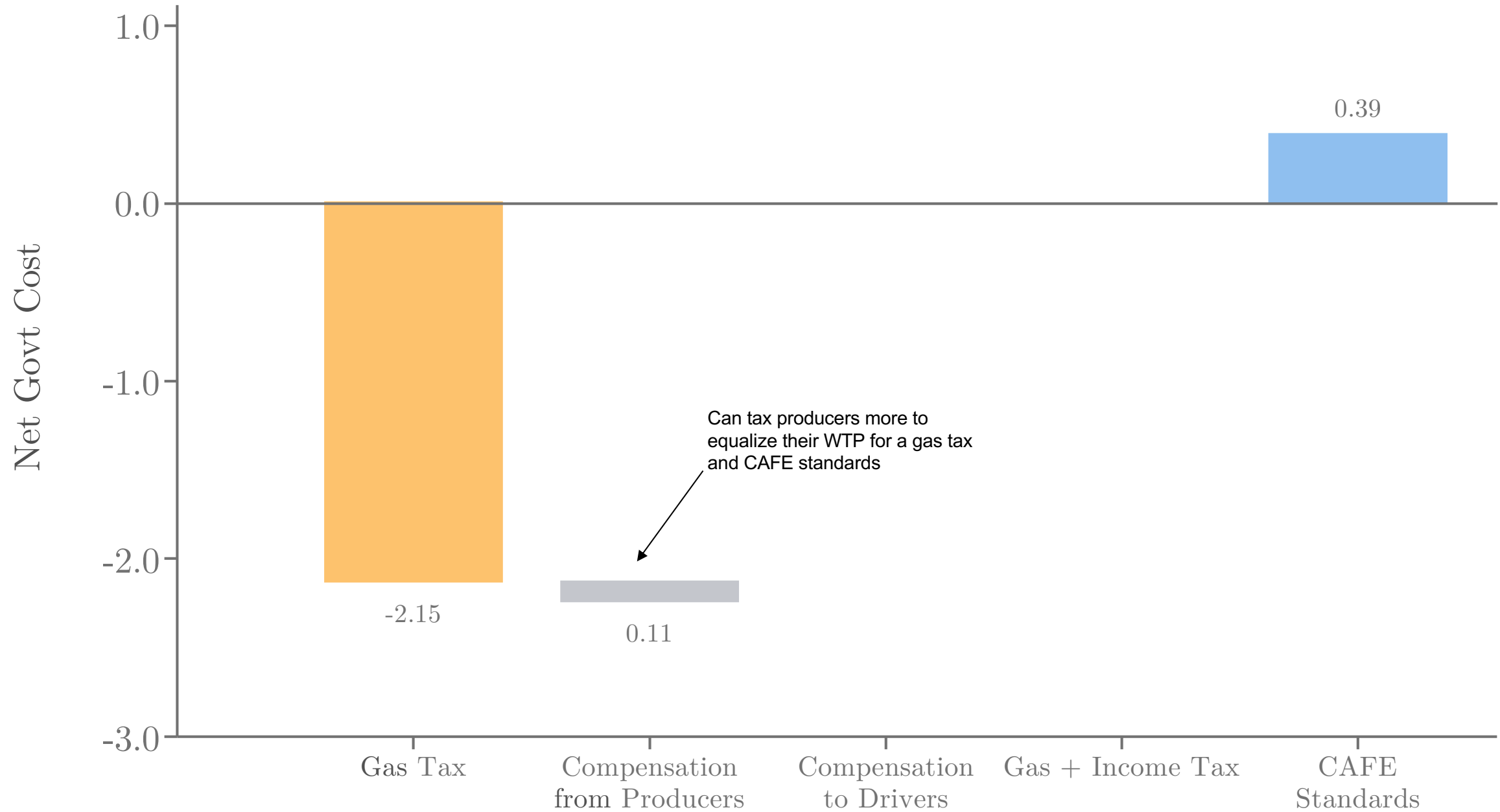
# CAFE Comparison to Gas + Income Tax



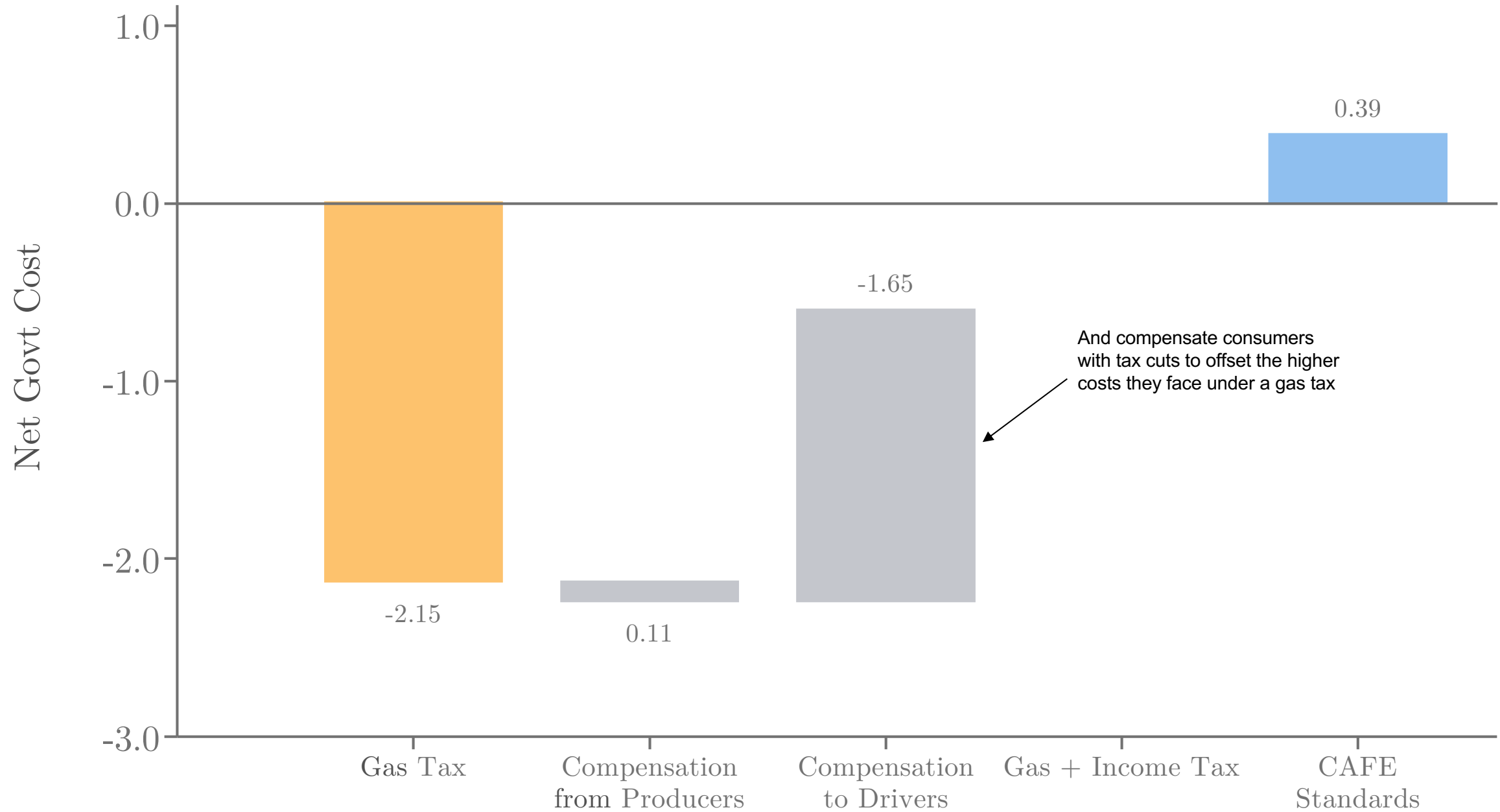
# CAFE Comparison to Gas + Income Tax



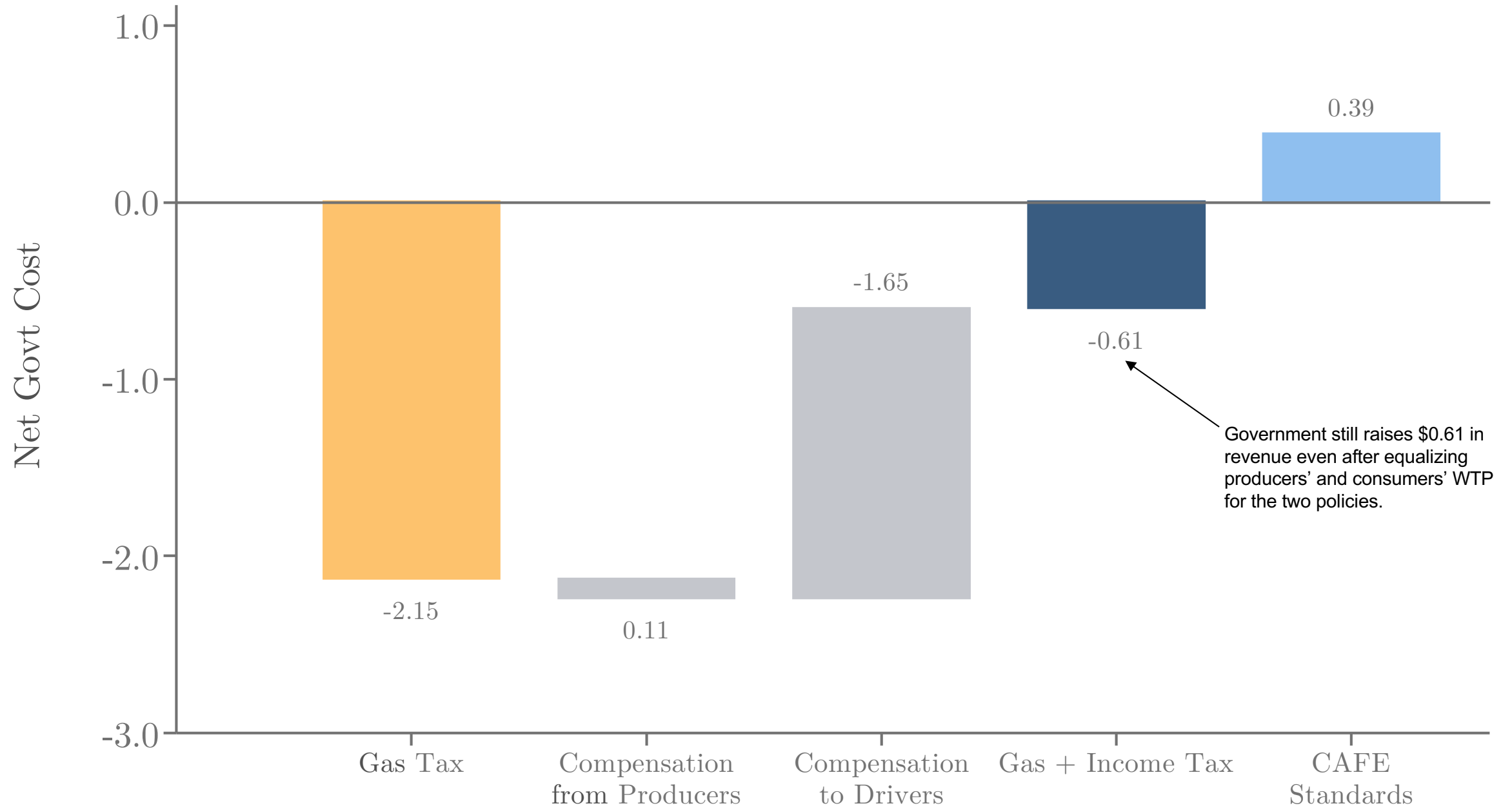
# CAFE Comparison to Gas + Income Tax



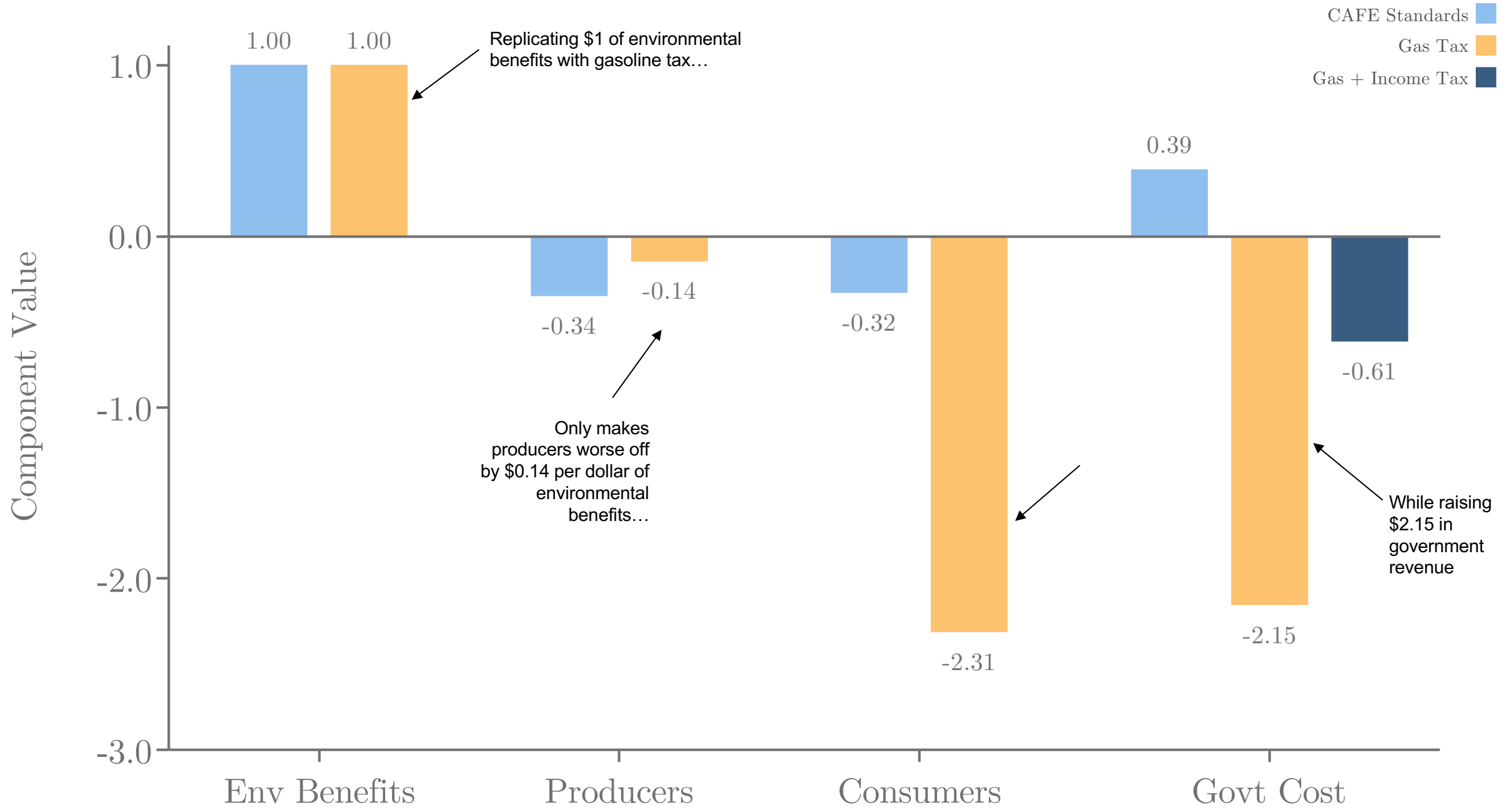
# CAFE Comparison to Gas + Income Tax



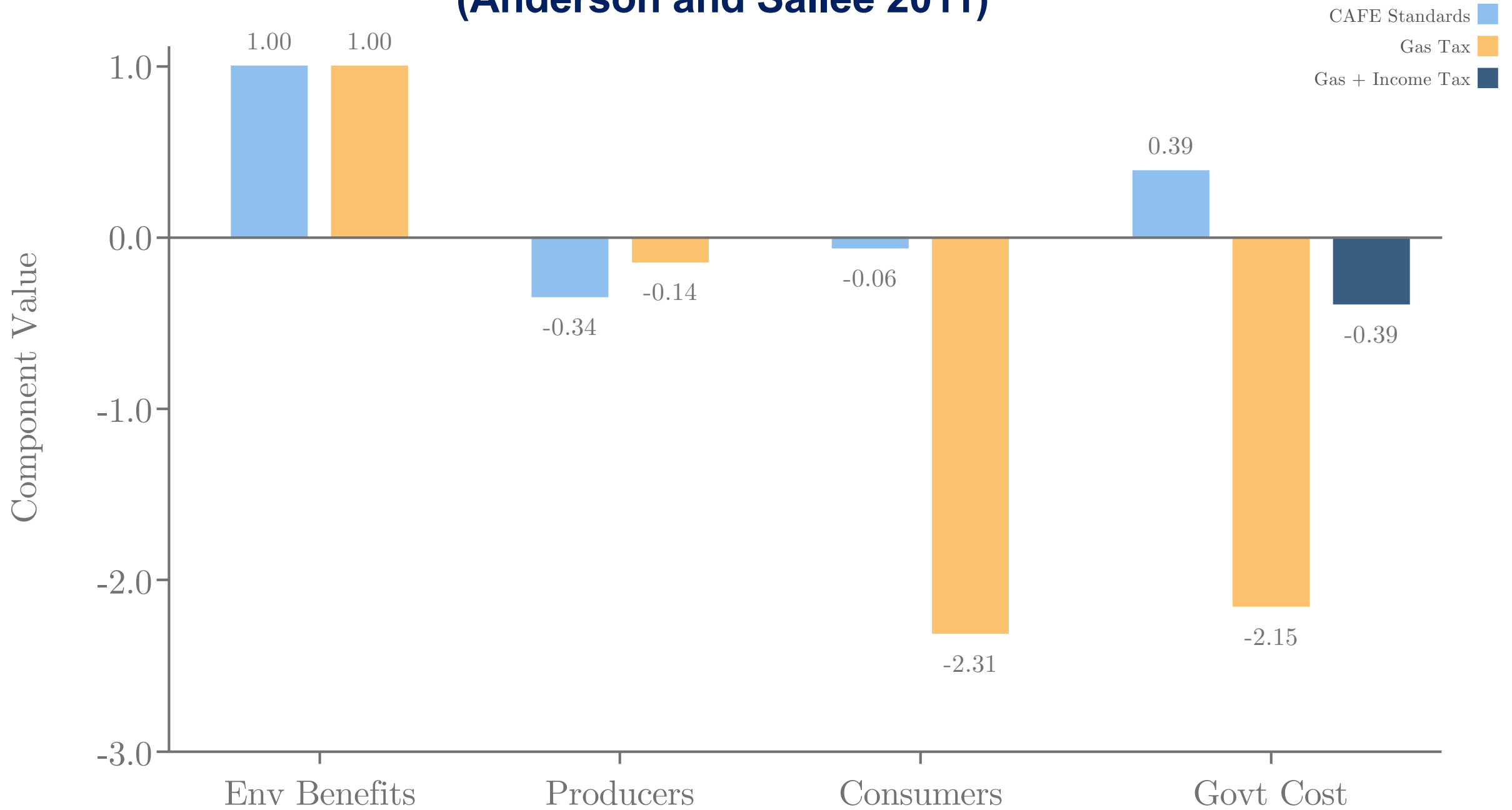
# CAFE Comparison to Gas + Income Tax



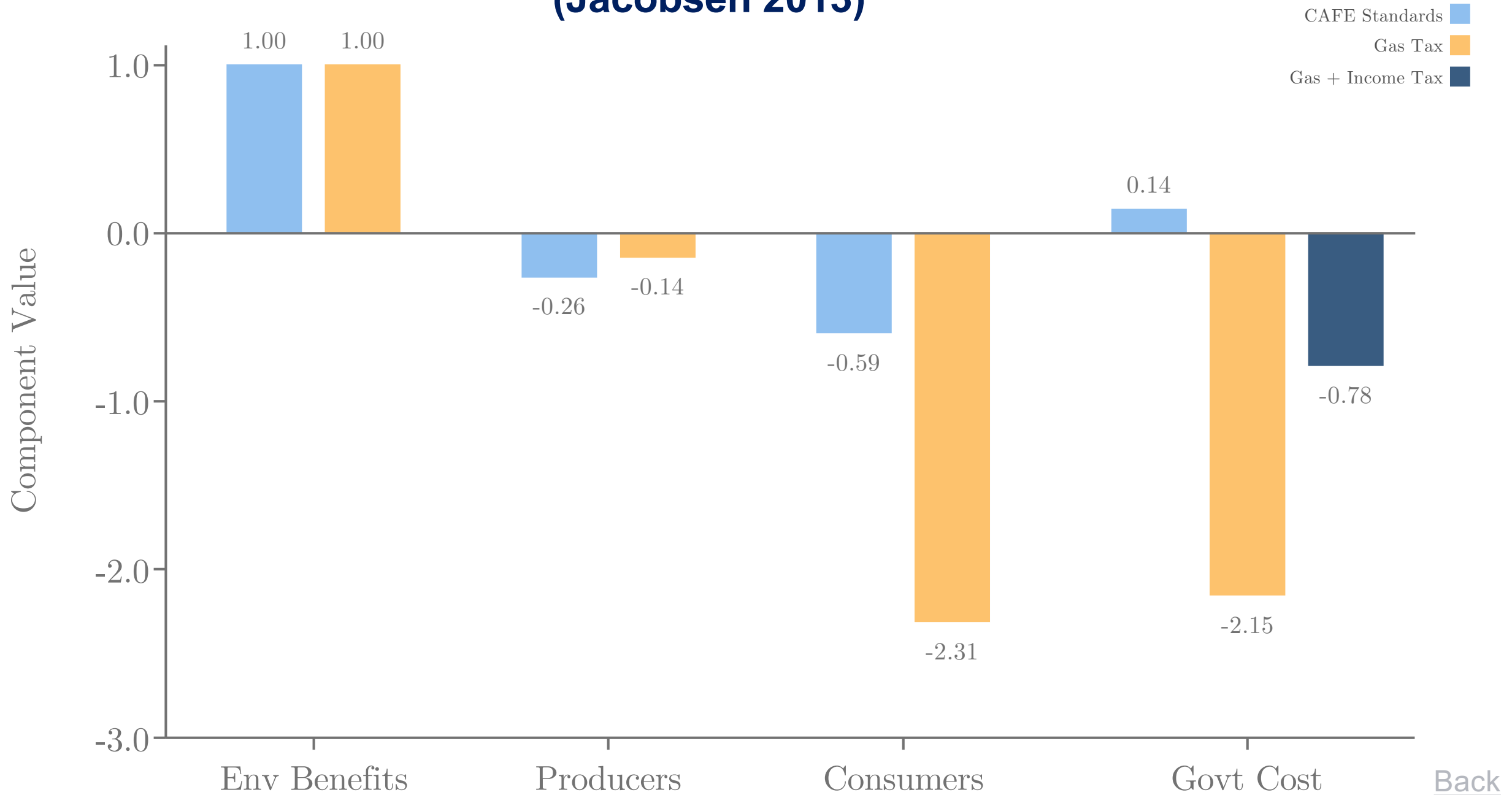
# CAFE Comparison to Gas + Income Tax



# CAFE Comparison to Gas + Income Tax (Anderson and Sallee 2011)

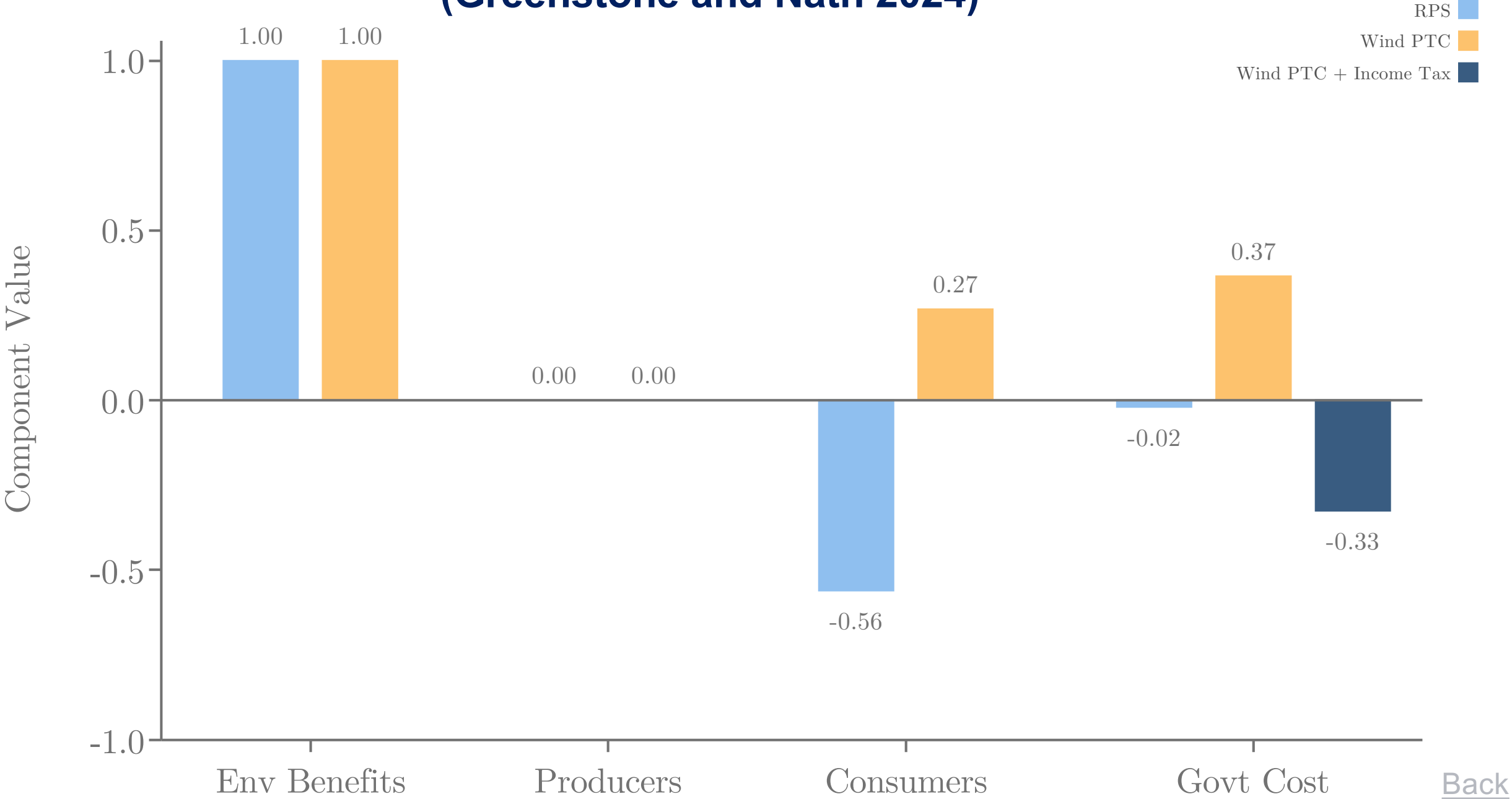


# CAFE Comparison to Gas + Income Tax (Jacobsen 2013)



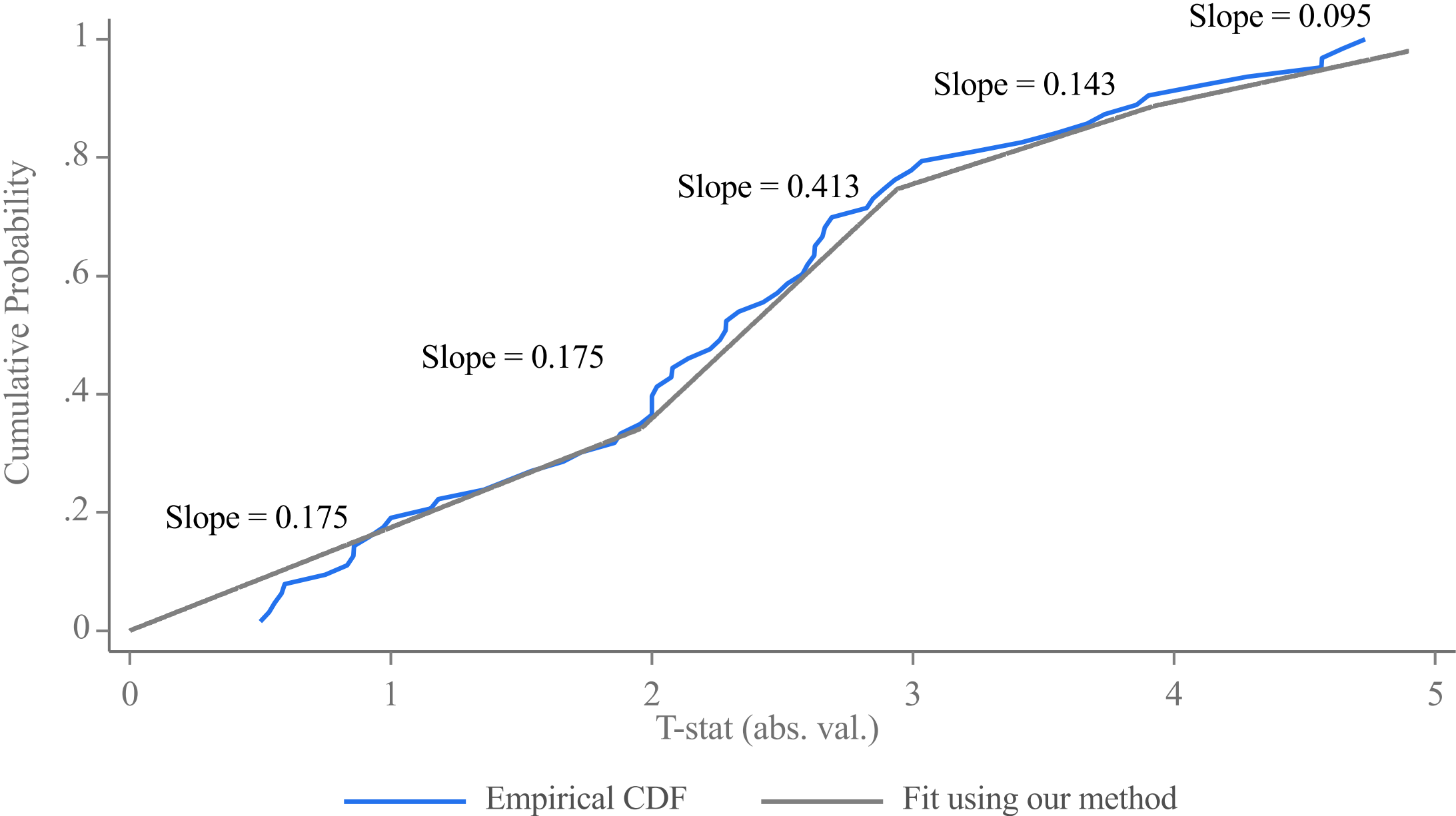
[Back](#)

# RPS Comparison to Wind PTC + Income Tax (Greenstone and Nath 2024)

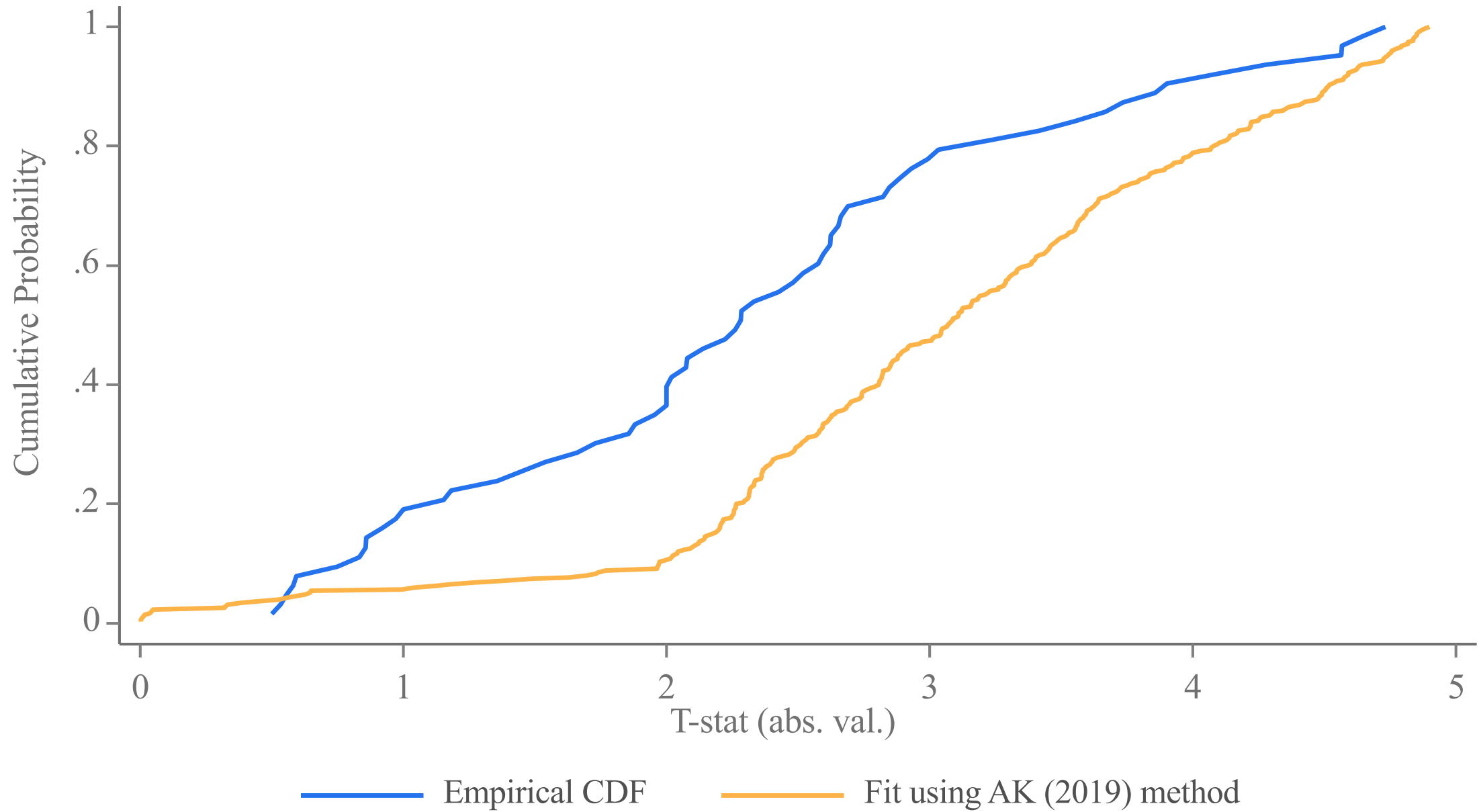


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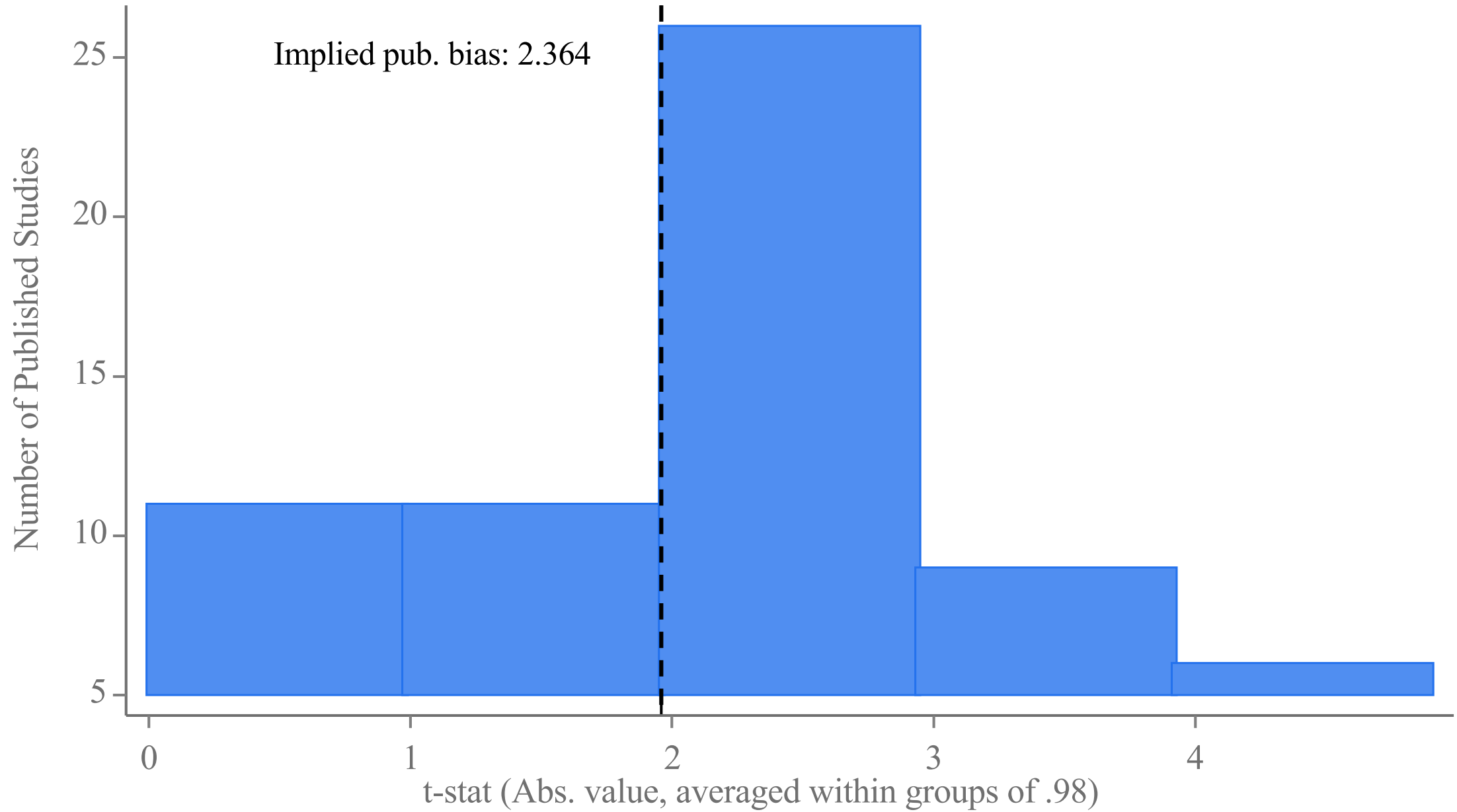
# Model Fit for Estimate of Publication Bias (Our approach)



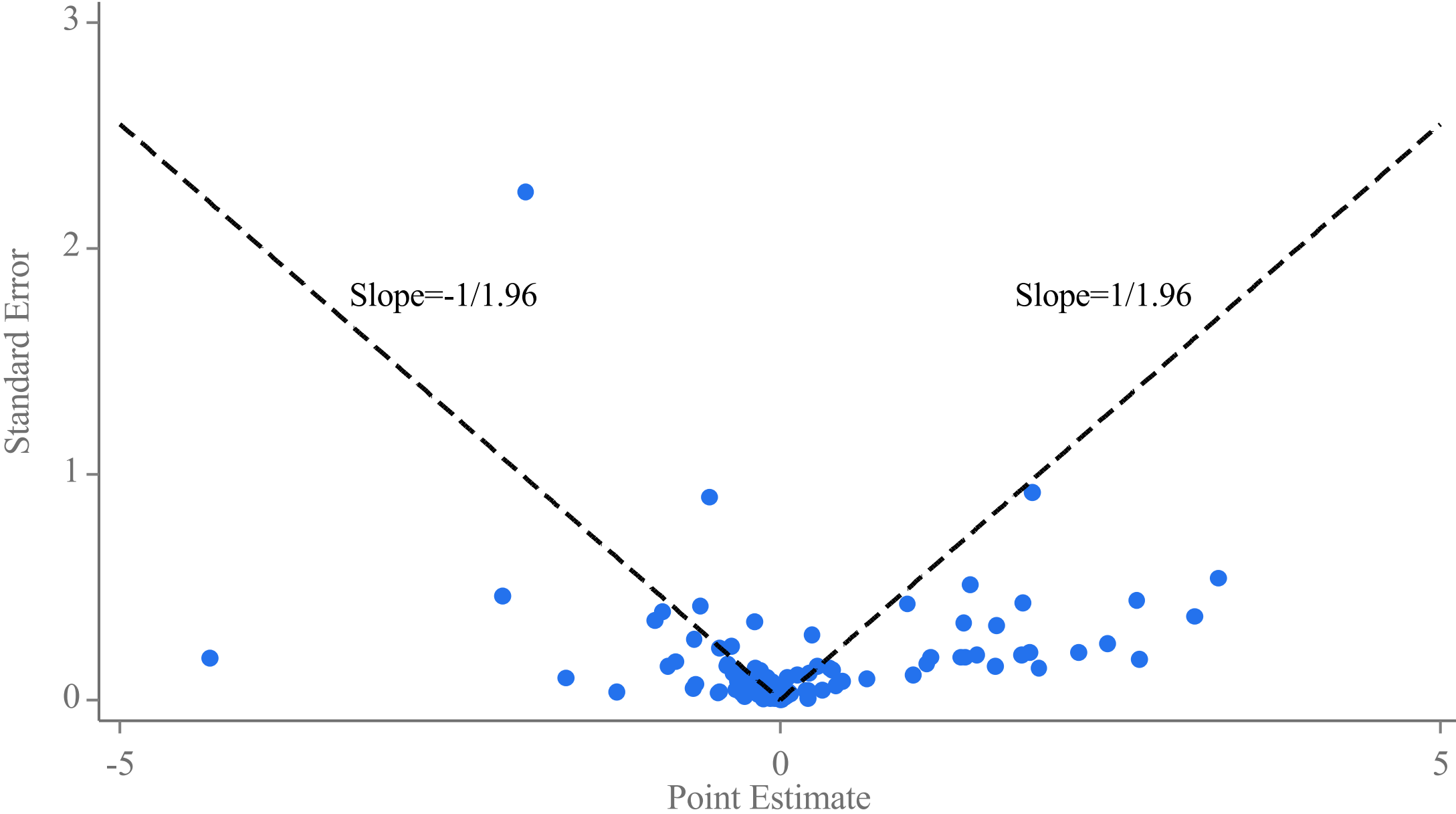
# Model Fit for Estimate of Publication Bias (AK 2019)



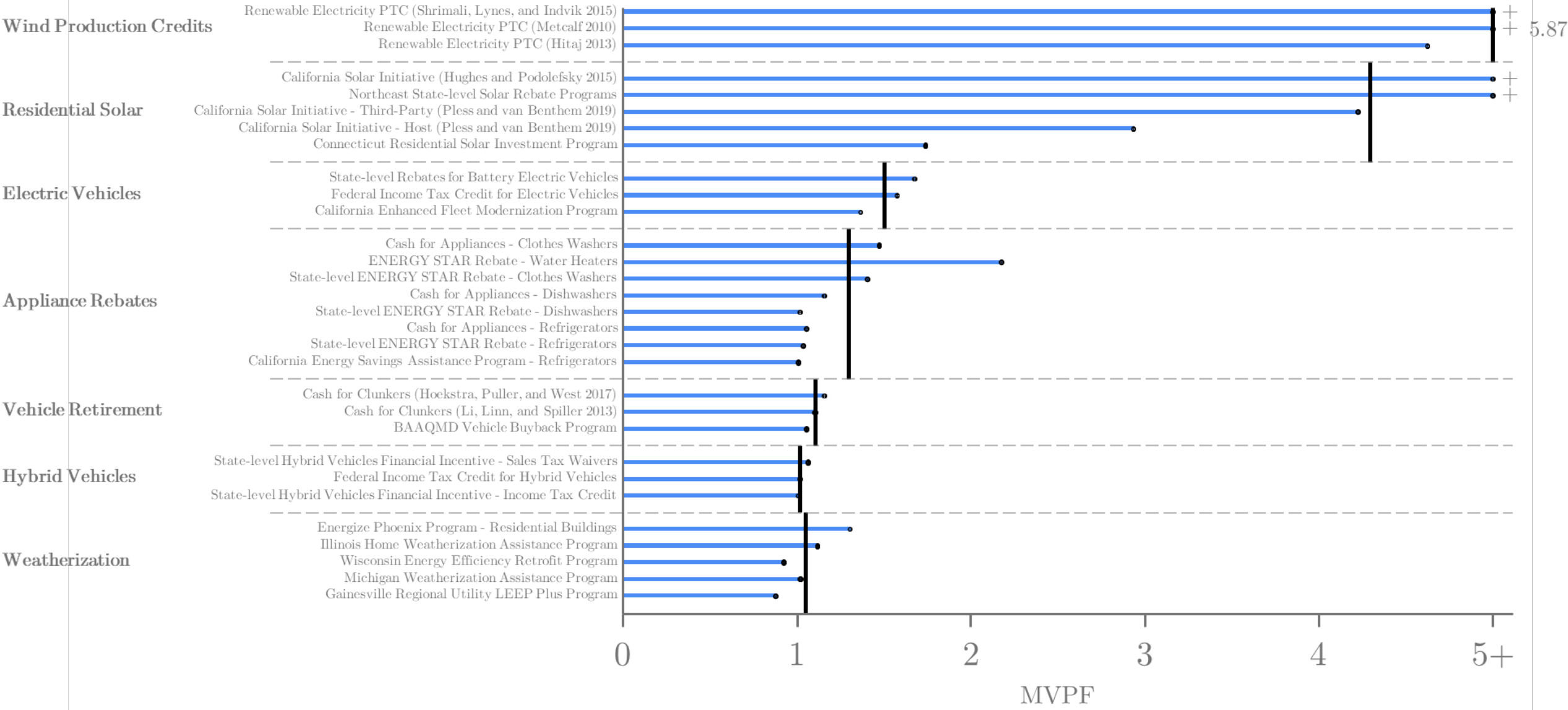
# Histogram Evidence of Publication Bias



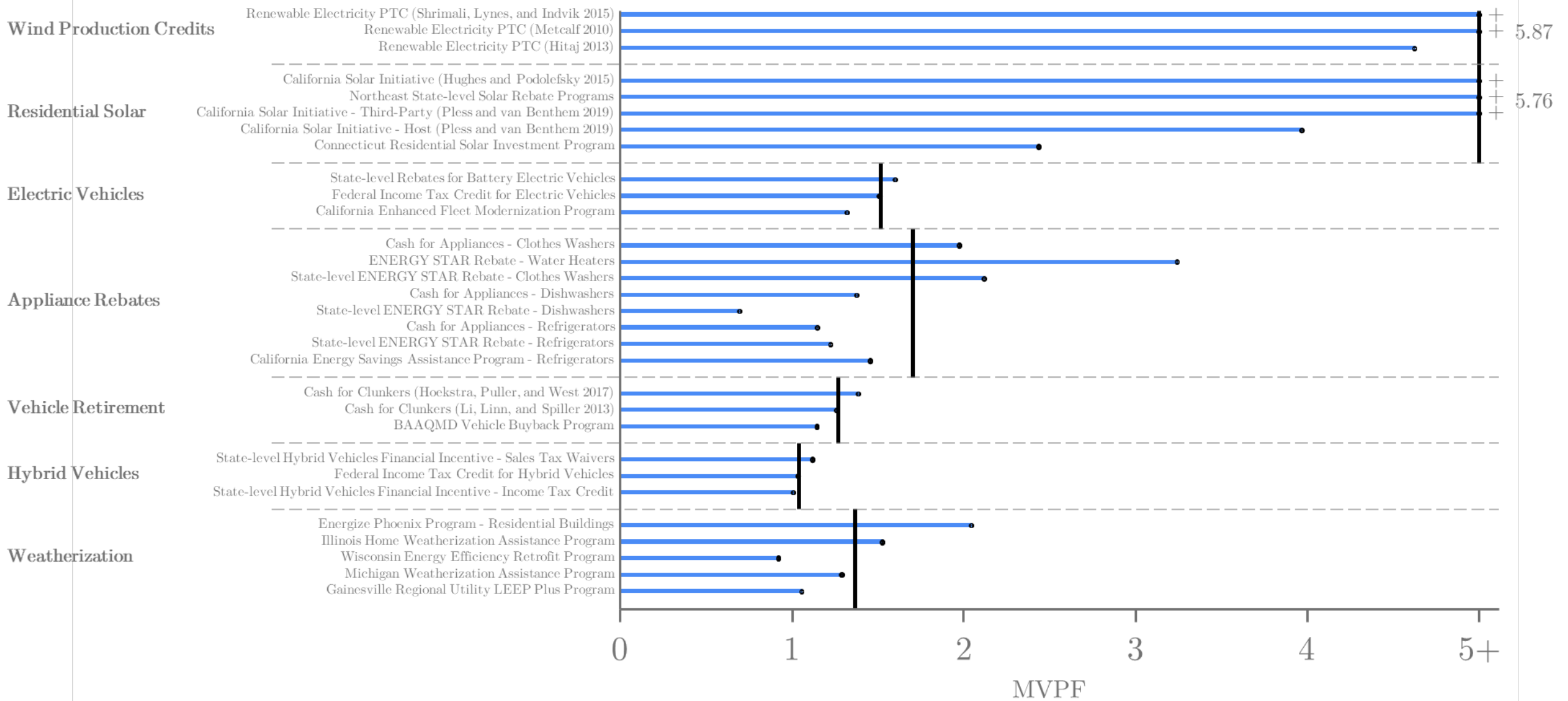
# Funnel Plot Evidence of Publication Bias



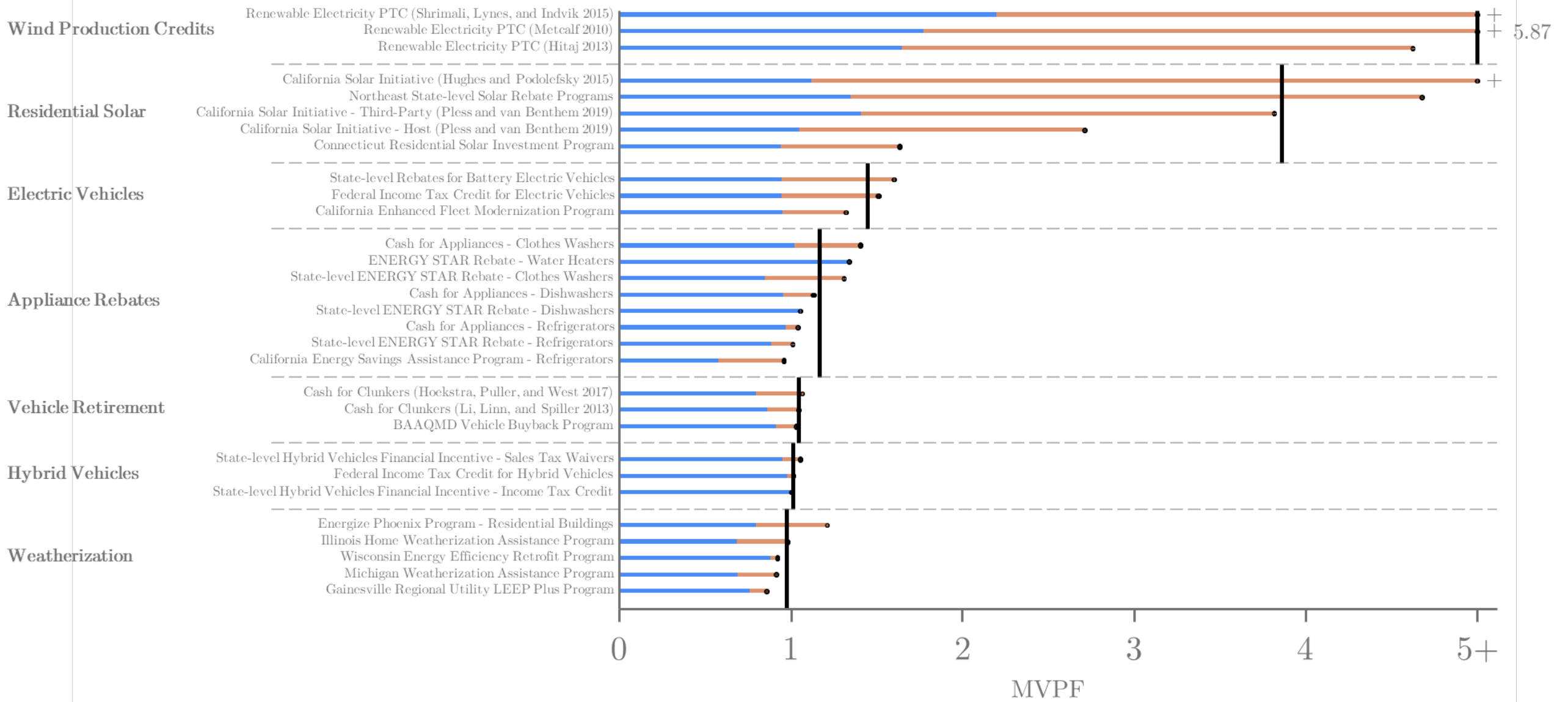
# MVPFs of Climate Subsidies (Excluding Profits)



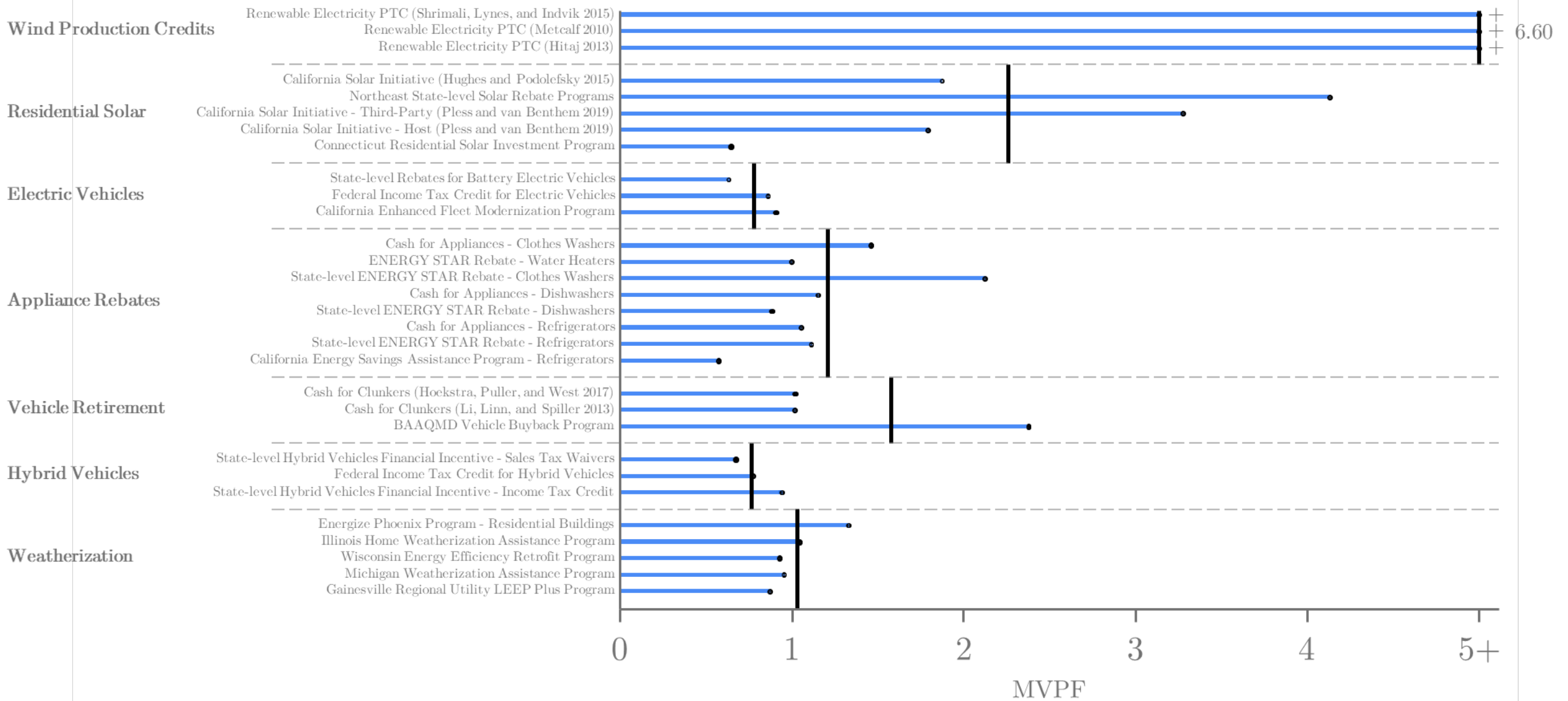
# MVPFs of Climate Subsidies (Including Energy Savings)



# MVPFs of Climate Subsidies (US vs Rest of World)



# MVPFs of Climate Subsidies (In Context)



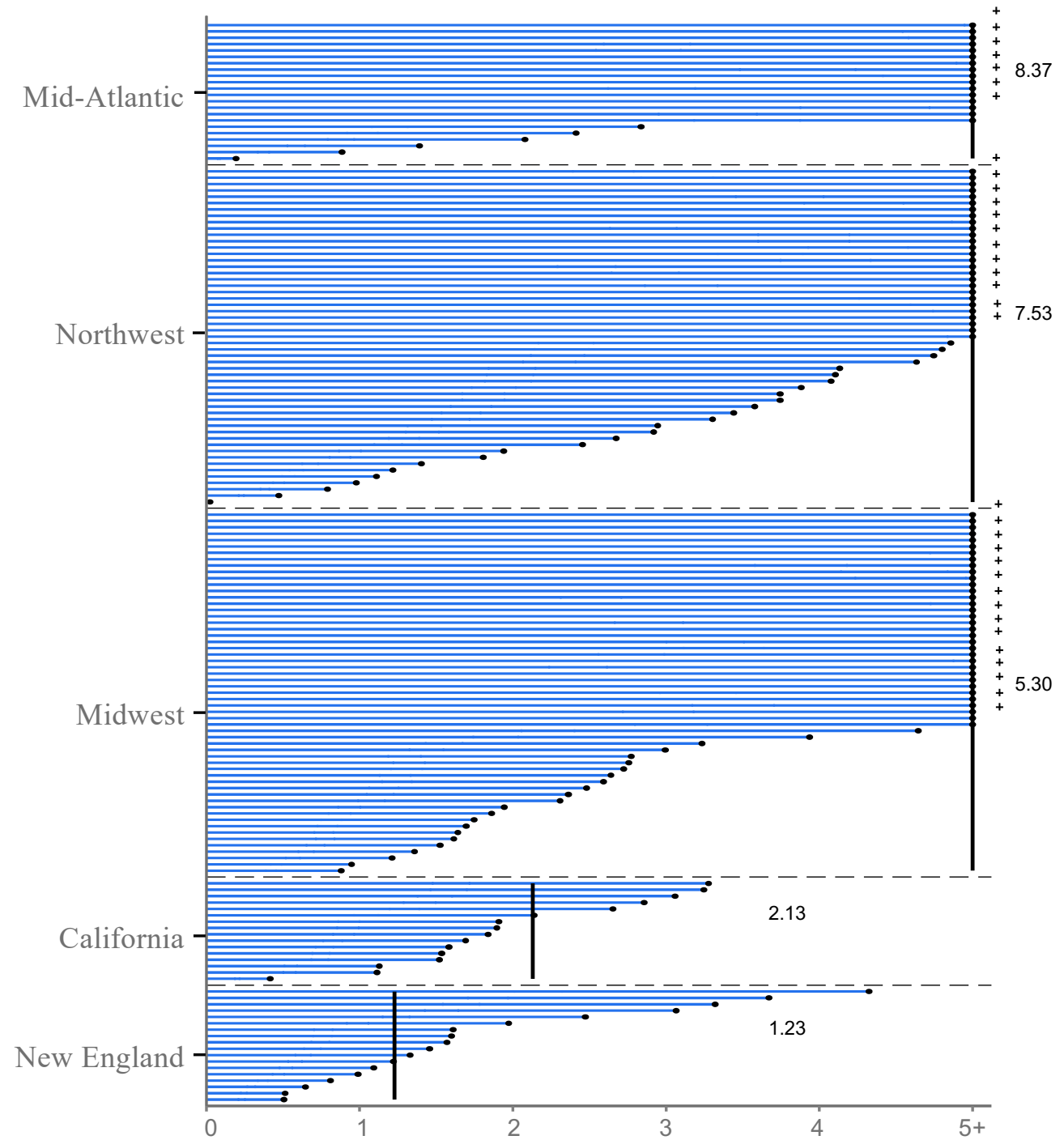
# MVPF Versus Cost Per Ton Excluding Learning by Doing

	MVPF	Cost Per Ton		
		Resource	Government	Social
<b>Subsidies</b>				
Wind Production Credits	3.851	-42	69	-8
Residential Solar	1.446	4	237	83
Electric Vehicles	0.961	963	2,422	283
Appliance Rebates	1.164	-2	474	111
Vehicle Retirement	1.047	987	876	148
Hybrid Vehicles	0.998	659	6,041	43
Weatherization	0.978	194	779	207
<b>Nudges and Marketing</b>				
Opower Elec. (166 RCTs)	2.548	-41	77	70
<b>Revenue Raisers</b>				
Gasoline Taxes	0.673	-104	-768	-62

# MVPF Versus Cost Per Ton Excluding Learning by Doing

	MVPF	Net Social Cost Per Ton				
		0% DWL	10% DWL	30% DWL	50% DWL	
<b>Subsidies</b>						
Wind Production Credits	5.870	-32	-24	-15	-6	
Residential Solar	3.862	-67	-48	-31	-14	
Electric Vehicles	1.445	-415	-259	1	260	
Appliance Rebates	1.164	111	159	254	349	
Vehicle Retirement	1.047	148	235	411	586	
Hybrid Vehicles	1.012	-38	555	1,749	2,942	
Weatherization	0.978	207	285	441	596	
<b>Nudges and Marketing</b>						
Opower Elec. (166 RCTs)	2.548	70	78	93	109	
<b>Revenue Raisers</b>						
Gasoline Taxes	0.671	-64	-140	-294	-448	

# MVPFs of HERs With 49% Energy Savings



# Stock and Gillingham (2018)

*Table 2*  
**Static Costs of Policies based on a Compilation of Economic Studies**  
*(ordered from lowest to highest cost)*

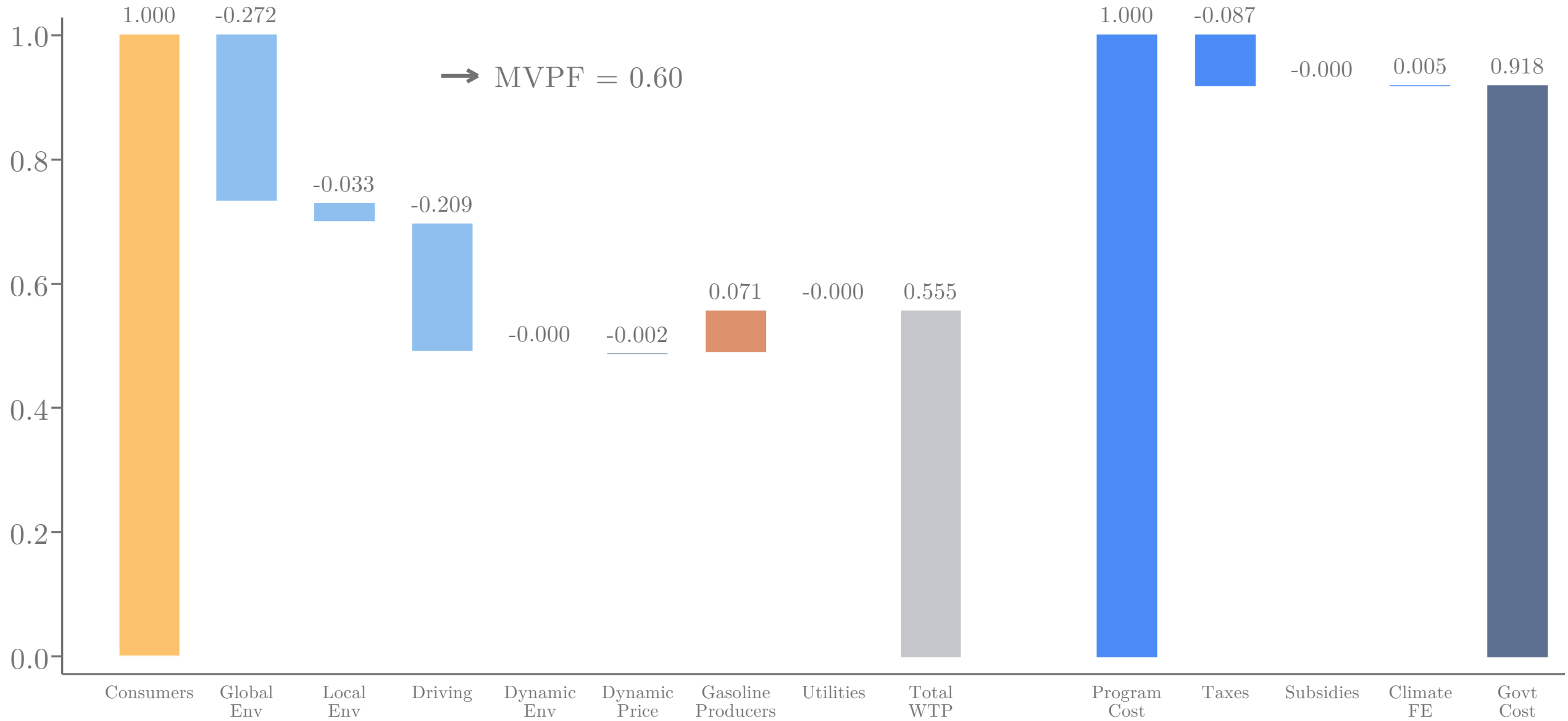
	<i>Policy</i>	<i>Estimate (\$2017/ton CO<sub>2e</sub>)</i>
Resource cost per ton	→ Behavioral energy efficiency	-190
	Corn starch ethanol (US)	-18 to +310
	Renewable Portfolio Standards	0-190
	Reforestation	1-10
Government cost per ton	→ Wind energy subsidies	2-260
	Clean Power Plan	11
social cost per ton	→ Gasoline tax	18-47
	Methane flaring regulation	20
	Reducing federal coal leasing	33-68
	CAFE Standards	48-310
	Agricultural emissions policies	50-65
	National Clean Energy Standard	51-110
	Soil management	57
	Livestock management policies	71
	Concentrating solar power expansion (China & India)	100
	Renewable fuel subsidies	100
Government cost per ton	→ Low carbon fuel standard	100-2,900
	Solar photovoltaics subsidies	140-2,100
	Biodiesel	150-250
Government cost per ton	→ Energy efficiency programs (China)	250-300
	Cash for Clunkers	270-420
	Weatherization assistance program	350
	Dedicated battery electric vehicle subsidy	350-640

*Note:* Figures are rounded to two significant digits. We have converted all estimates to 2017 dollars for comparability. See Appendix Table A-1 for sources and methods. CO<sub>2e</sub> denotes conversion of tons of non-CO<sub>2</sub> greenhouse gases to their CO<sub>2</sub> equivalent based on their global warming potential.

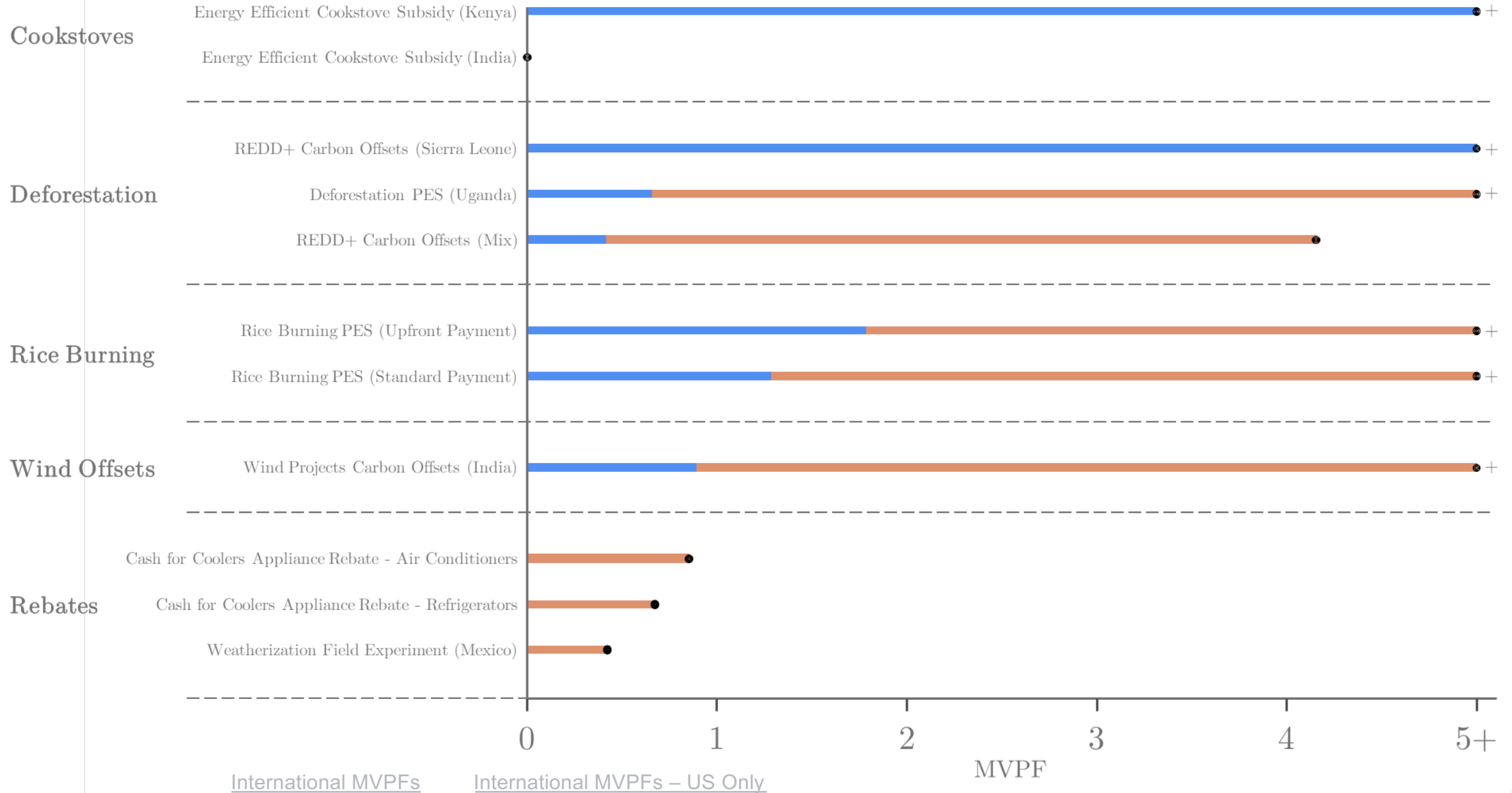
## Additional Analyses in the Paper

- Regulation and Cap-and-Trade [\[Link\]](#)
  - Can use MVPF framework to compare regulation to tax/subsidy
  - Can construct MVPF of auctioned permits in Cap and Trade systems
- Distributional Incidence [\[Link\]](#)
  - Excluding non-US benefits → MVPFs near 1 for most US-based subsidies
  - Subsidies and taxes disproportionately affect the rich
- Publication Bias [\[Link\]](#)
  - Papers with t-stats > 1.96 are 2X more likely to be published
  - Adjusting for this using Andrews and Kasy (2019) does not meaningfully affect conclusions
- Non-Marginal analysis [\[Link\]](#)
  - Evaluate how MVPF varies for 1<sup>st</sup> vs. last dollar of subsidy/tax and consider non-marginal policy changes corresponding to EV, Residential Solar and Wind policies under the IRA
  - Relative orderings and broad magnitudes remain unchanged

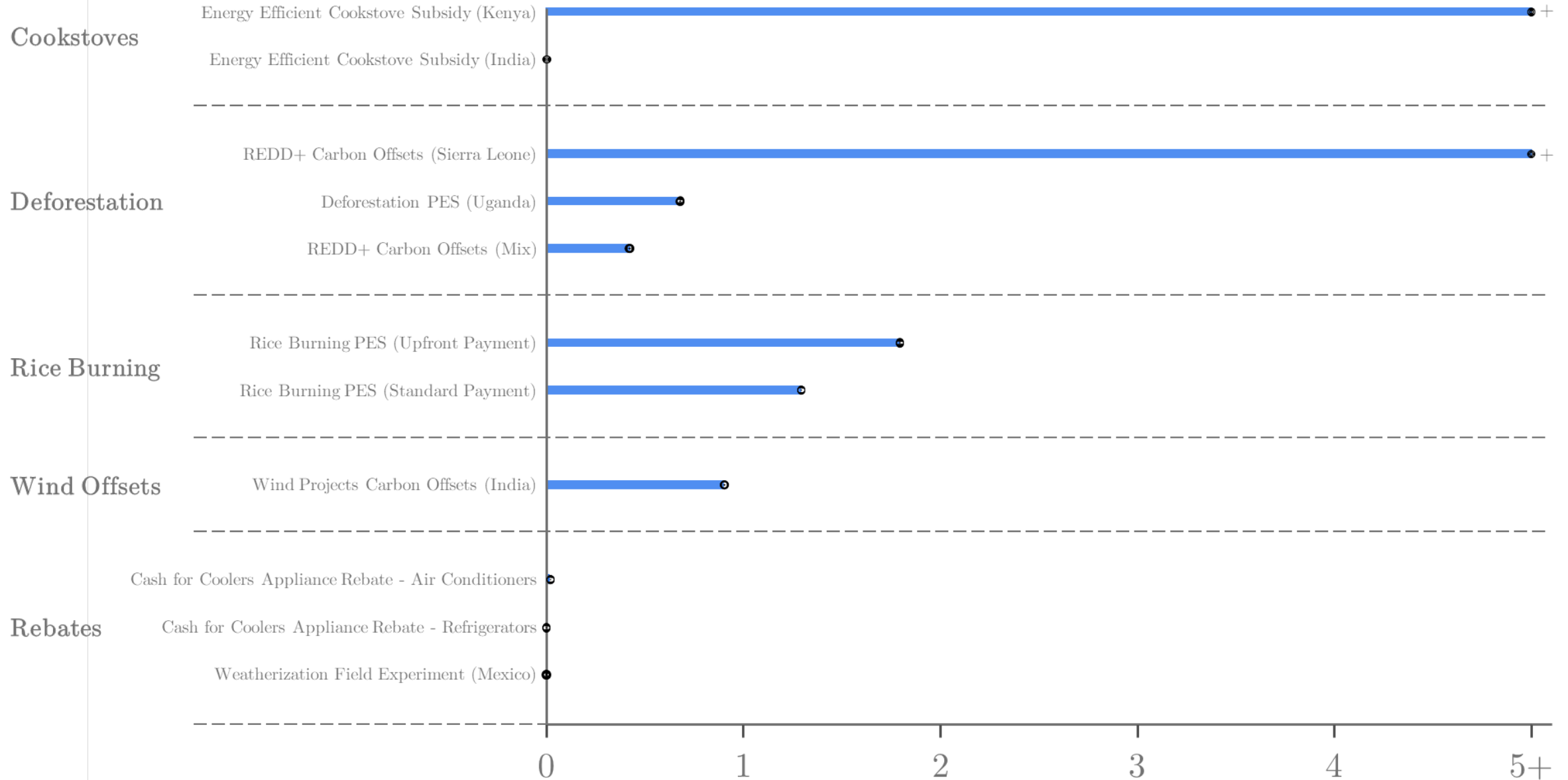
# Gasoline Tax MVPF - Price Elasticity from Small and Van Dender (2007)



# US-Only MVPFs of International Policies



# US-Only MVPFs of International Policies



[International MVPFs](#)

[International MVPFs – US Only](#)

MVPF

[Back](#)