

# Modeling Uncertainty in Climate Policy

## Bushnell and Smith

An Application to the US IRA

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discussion by Justin Kirkpatrick (Michigan State University)

## Tackles uncertainty in climate policy

- ~~Climate Policy~~ Energy systems models
  - Can't study climate policy without an energy system model
  - Grid is 33% of US emissions
  - Vastly more if transport is largely electrified
  - Useful for understanding grid evolution, not just for climate policy

## Big contribution here

- Data uncertainty on the assumptions about future inputs
  - Future electricity demand
  - Future NG prices
  - Future interest rates
  - **joint** distributions
- Data uncertainty is  $Y = f(\tilde{X})$ 
  - Model uncertainty  $Y = \tilde{f}(X)$
  - We can't know model inputs  $X_t$  perfectly, so draw from distribution and run simulation
  - Joint distribution of many time series'
- Allows for strikingly many more inputs to be forecast
  - Regional detail (!!)
  - Transmission constraints considered

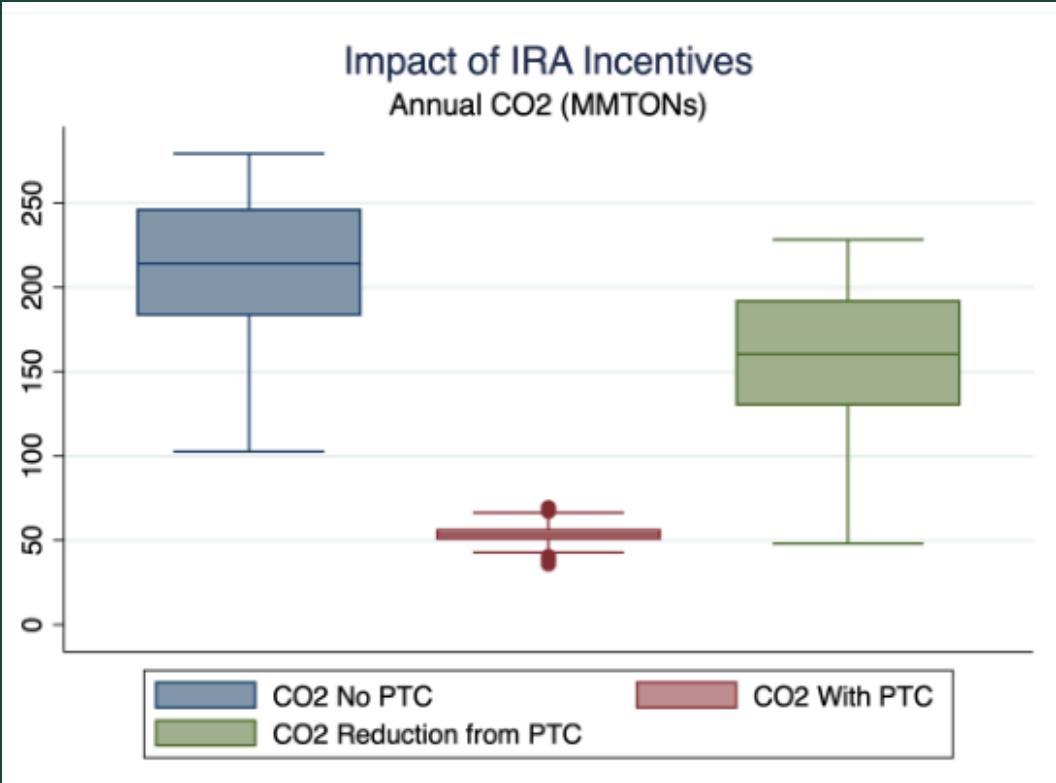
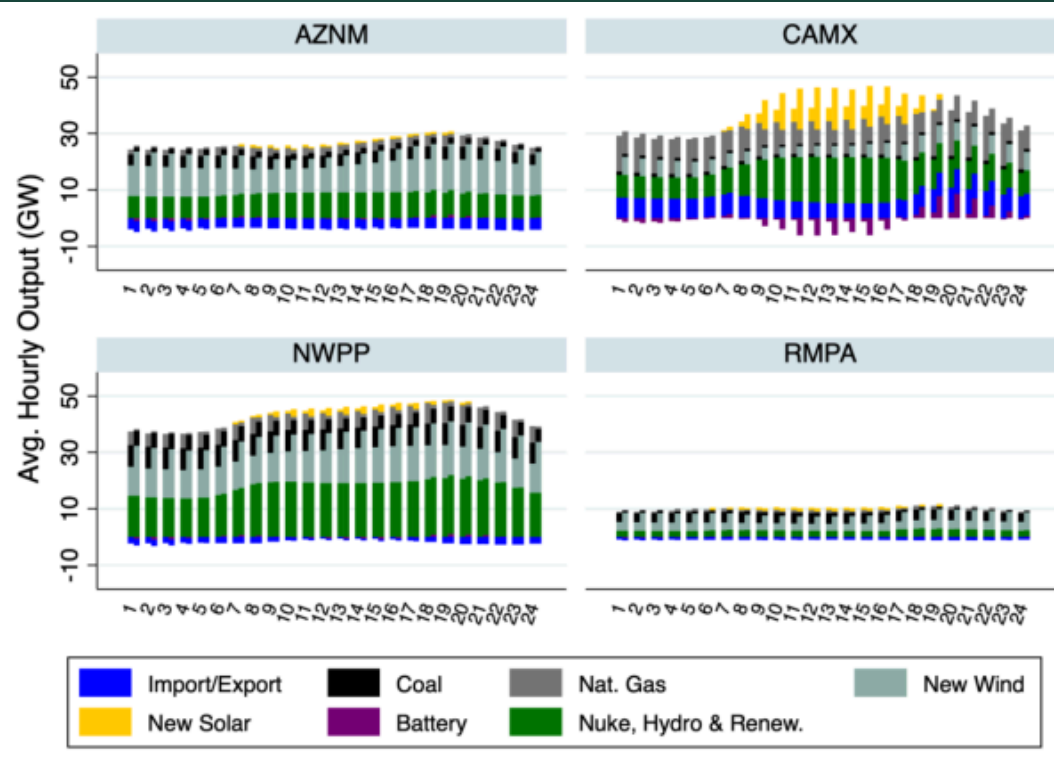
## Dynamic Factor Model

- Many variables  $\rightarrow$  PCA  $\rightarrow$  small number of factors
  - E.g. each region is projected back from factor
- Small number of factors (9) is feasible for VAR
- Draw factor from VAR results, draw input  $X_t$  from factor results,
  - Optimize operation and optimize investment for 2030

## Data-driven parsimony

- Elegant in construction

## Results



## Illustrate correlation between key inputs

- Think: NG price and interest rate
  - Macroeconomic conditions
- Does the DFM predict correlations similar to observed?

## **How often do grid simulation-based policy analyses use two highly correlated inputs in separate scenarios?**

- Table of scenarios from 5-6 published IRA papers
- Show any cases of scenarios that assume correlations (e.g. "high NG/high interest rate scenario")
- 🚚

## VAR on factors assumes stable relationship

- But does IRA potentially affect those relationships?
- Major policy, major changes → factors

## For instance

- PTC may drive lower battery costs → co-adoption of battery + solar
  - ⇒ Peak electricity demand relation to electricity sales in a state may be affected
- Other IRA programs interact
  - Temperature and electricity sales relationship may be affected by e.g. heat pumps and EVs

## Even factor trends may be affected

- Forecast energy demand factor trend estimated pre-2019 -- EVs?
- 2018 CEC forecast for 2030 "low demand" scenario was 326 TWh
  - DFM predicts 275-355 TWh

## Overnight Capital Costs of new generation

- Annualized cost per unit capacity  $F_j = OCC \cdot \frac{r(1+r)^n}{(1+r)^n - 1}$
- $r$  forecast in VAR
- Conservative estimates on  $OCC$  declines by 2030

## Uncertainty on $OCC$

- (admittedly ad hoc) distribution on  $OCC$  for 2030

## "Dynamic" $OCC$

- Scale effects, endogenous technological innovation (e.g. [Gerarden \(2023\)](#))



## I: 2 characteristic days

- 1 peak day, 1 off-peak day, weighted  $\frac{1}{90}$ ,  $\frac{89}{90}$
- 2 points does not capture "curvature" of dispatch and cost
- 3 points? Bottom 50%, next 24%, then top 1%?

## II: Transmission constraints as choice variable

- Transmission constraints assumed to be static
- Investments in interstate transmission & improvements in siting/planning of transmission part of IRA
- Can transmission upgrades be a choice variable?
  - Are nomogram constraints binding at key hours/seasons?

**Thanks to the authors  
(and organizers)!**