

*Empirical Models of Context*  
*Conditionality, (Inter)Dependence, and*  
*Endogeneity*

**Nonlinear Interaction Models**

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(Here for further pedagogical slides & materials:

<http://www.umich.edu/~franzese/SyllabiEtc.html>)

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# Interactions in *QualDep* (Inherently Interactive) Models

- Probit/Logit Models w/ Interactions

– Probit:  $p(y = 1) = \Phi(\mathbf{x}'\boldsymbol{\beta})$     – Logit:  $p(y = 1) = \frac{\exp(\mathbf{x}'\boldsymbol{\beta})}{1 + \exp(\mathbf{x}'\boldsymbol{\beta})} = [1 + e^{-\mathbf{x}'\boldsymbol{\beta}}]^{-1}$

- Marginal Effects: (nonlinear, so must specify at what  $\mathbf{x}$ ; effect depends on where in S-curve)

– Start w/  $\mathbf{x}'\boldsymbol{\beta}$  purely linear-additive; model inherently interactive because S-shaped:

- Probit:  $\frac{\partial p}{\partial x_k} = \frac{\partial \Phi(\mathbf{x}'\boldsymbol{\beta})}{\partial x_k} = \phi(\mathbf{x}'\boldsymbol{\beta}) \cdot \frac{\partial \mathbf{x}'\boldsymbol{\beta}}{\partial x_k} = \phi(\mathbf{x}'\boldsymbol{\beta}) \cdot \beta_k$

- Logit: 
$$\begin{aligned} \frac{\partial p}{\partial x_k} &= \frac{\partial \{e^{\mathbf{x}'\boldsymbol{\beta}} [1 + e^{\mathbf{x}'\boldsymbol{\beta}}]^{-1}\}}{\partial x_k} = \frac{e^{\mathbf{x}'\boldsymbol{\beta}}}{1 + e^{\mathbf{x}'\boldsymbol{\beta}}} \cdot \beta_k - \frac{e^{\mathbf{x}'\boldsymbol{\beta}}}{(1 + e^{\mathbf{x}'\boldsymbol{\beta}})^2} \cdot e^{\mathbf{x}'\boldsymbol{\beta}} \cdot \beta_x \\ &= \left[ \frac{e^{\mathbf{x}'\boldsymbol{\beta}} (1 + e^{\mathbf{x}'\boldsymbol{\beta}})}{(1 + e^{\mathbf{x}'\boldsymbol{\beta}})^2} - \frac{(e^{\mathbf{x}'\boldsymbol{\beta}})^2}{(1 + e^{\mathbf{x}'\boldsymbol{\beta}})^2} \right] \cdot \beta_k = \frac{e^{\mathbf{x}'\boldsymbol{\beta}}}{(1 + e^{\mathbf{x}'\boldsymbol{\beta}})^2} \cdot \beta_k \\ &= \frac{e^{\mathbf{x}'\boldsymbol{\beta}}}{1 + e^{\mathbf{x}'\boldsymbol{\beta}}} \cdot \frac{1}{1 + e^{\mathbf{x}'\boldsymbol{\beta}}} \cdot \beta_k = p \cdot (1 - p) \cdot \beta_k \end{aligned}$$

# Interactions in *QualDep* (Inherently Interactive) Models

- Now, if  $\mathbf{x}'\boldsymbol{\beta} = \dots + \beta_x x + \beta_z z + \beta_{xz} xz \dots$ 
  - $\Rightarrow$  same except  $d\mathbf{x}'\boldsymbol{\beta}/dx = \beta_x + \beta_{xz}z$ ;
  - underlying propensity, i.e., movement along S-shape also interact explicitly  $x$  &  $z$ .
  - [Discuss meaning inherent v. explicit interactax...]

• Probit:

$$\frac{\partial p}{\partial x} = \phi(\mathbf{x}'\boldsymbol{\beta}) \cdot (\beta_x + \beta_{xz}z)$$

• Logit:

$$\frac{\partial p}{\partial x} = p \cdot (1 - p) \cdot (\beta_x + \beta_{xz}z)$$

- What about effect of  $z$  on effect of  $x$ ; i.e., the conditioning effect, *in terms of p*? [Discuss...]

$$\frac{\partial^2 p}{\partial x \partial z} \equiv \frac{\partial \left\{ \frac{\partial p}{\partial x} \right\}}{\partial z} = \frac{\partial \left\{ \phi(\mathbf{x}'\boldsymbol{\beta}) \cdot (\beta_x + \beta_{xz}z) \right\}}{\partial z}$$

$$= \underbrace{\phi(\mathbf{x}'\boldsymbol{\beta}) \cdot \beta_{xz}}_{1^{st} \text{ times derivative of the } 2^{nd}} + \underbrace{\left\{ \phi'(\mathbf{x}'\boldsymbol{\beta}) (\beta_z + \beta_{xz}x) \right\}}_{\text{derivative of the } 1^{st} \text{ times } 2^{nd}} (\beta_x + \beta_{xz}z)$$

$1^{st}$  times derivative of the  $2^{nd}$

derivative of the  $1^{st}$  times  $2^{nd}$

# Interactions in *QualDep* Models

- Standard Errors?

- *Delta Method*:

$$Asym.Var.(f(\hat{\beta}))$$

$$\approx \left[ \nabla_{\beta} f(\hat{\beta}) \right]' V(\hat{\beta}) \left[ \nabla_{\beta} f(\hat{\beta}) \right]$$

- Probit

marginal-  
effect s.e.:

$$\begin{bmatrix} \frac{\partial \left\{ \phi(\mathbf{x}'\hat{\beta}) \frac{\partial \mathbf{x}'\hat{\beta}}{\partial x_1} \right\}}{\partial \hat{\beta}_1} \\ \vdots \\ \frac{\partial \left\{ \phi(\mathbf{x}'\hat{\beta}) \frac{\partial \mathbf{x}'\hat{\beta}}{\partial x_k} \right\}}{\partial \hat{\beta}_k} \end{bmatrix}' \begin{bmatrix} \hat{V}(\hat{\beta}_1) & \dots & \hat{C}(\hat{\beta}_1, \hat{\beta}_k) \\ \vdots & \ddots & \vdots \\ \hat{C}(\hat{\beta}_1, \hat{\beta}_k) & \dots & \hat{V}(\hat{\beta}_k) \end{bmatrix} \begin{bmatrix} \frac{\partial \left\{ \phi(\mathbf{x}'\hat{\beta}) \frac{\partial \mathbf{x}'\hat{\beta}}{\partial x_1} \right\}}{\partial \hat{\beta}_1} \\ \vdots \\ \frac{\partial \left\{ \phi(\mathbf{x}'\hat{\beta}) \frac{\partial \mathbf{x}'\hat{\beta}}{\partial x_k} \right\}}{\partial \hat{\beta}_k} \end{bmatrix}$$

- Logit: same, except  $\hat{p}(1 - \hat{p}) \frac{\partial \mathbf{x}'\hat{\beta}}{\partial x}$  replaces  $\phi(\mathbf{x}'\hat{\beta}) \frac{\partial \mathbf{x}'\hat{\beta}}{\partial x}$

- For first-difference effects, similar, but need specify from what  $\mathbf{x}$  to what  $\mathbf{x}$ , and not just at what  $\mathbf{x}$ .

- Or you could **CLARIFY...** or **mfx...** or **inteff...**

# Complex Context-Conditionality

- *Complex Context-Conditionality*: Effect of anything depends on most everything else. E.g.:

- *Policymaking*:

- Socioeconomic-structure of interests
- Party-system and internal party-structures
- Electoral system & Governmental system
- Socio-economic realities linking policies to outcomes

- *Comparative Democratic Budgeteering*, e.g., begins as this simple proposition...

$$B = \dots + m(\mathbf{x}_m) \times s(\mathbf{x}_s) \times n(\mathbf{x}_n) + \dots$$

- [...which would be a mess as a linear-interactive model...]
- [...but which eventually becomes something still pretty messy but perhaps estimable...]

# Complex Context-Conditionality

- *Complex Context Conditionality*: Effect of anything depends on most everything else. E.g.:
  - *Voting*:
    - Voter preferences & informational environment
      - E.g., new Achen & Blais paper:
$$p(\text{vote}) = \Phi(\text{duty}, \text{instrumental incentives}, \text{duty} \times \text{instru.incent.})$$
    - Party/candidate locations & informational environment
    - Electoral & governmental system
  - *Institutions*: Sets of institutions; effect each depends configuration others present (e.g., this=core *VoC* claim)
  - *Strategic Interdep.*: each actors' action depends on everyone else's; complex feedback (see Franzese & Hays)

# Complex Context-Conditionality

- Empirically  $\Rightarrow$  Linear-interactive model of complex context-conditionality = Multicollinear Nightmare.
- Options?
  - Ignore context conditionality (stay linear-additive):
    - Inefficient at best, biased more usually, and, anyway, context-conditionality is our interest!
  - Isolate one or some very few interactions for close study; ignore rest (stay linear-interactive):
    - Same, to degree lessened by amount of interaction allowed, but demands on data rise rapidly w/ that amount.
  - “Structured Case Analysis”:
    - May help ‘theory generation’, but, for empirical evaluation, doesn’t help; worsens problem! (See Franzese *OxfHndbk CP* 2007).
  - **EMTI**<sup>TM</sup>: Lean harder on thry/subst to specify more precisely the nature interax: functional form, precise measures, etc.
    - Refines question put to the data (changes default tests also).
    - *GIVEN* thry/subst. specification into empirical model, can estimate complex interactivity. Side benefits. But must *give*.

# Nonlinear Least-Squares & EMTI

- EITM: Empirical Implications of Theoretical Models
  - *Vision*: Theory  $\Rightarrow$  more, sharper predictions  $\Rightarrow$  better tests, which therefore inform theory more, which...
- TMEI: Theory-specified Models for Empirical Inference
  - *Vision*: Theory structures empirical models & relations b/w obs  $\Rightarrow$  specification & (causal) i.d. of empirical models
- TIEM: Theoretical Implications of Empirical Measures
  - *Vision*: Emp. regularities, findings, measures inform theory dev'p.
- **EMTI**<sup>TM</sup>: Empirical Models of Theoretical Intuitions
  - *Vision*: Intuitions derived from theoretical models specify empirical models. I.e., empirical specification to match intuitions, not model.
- Note: Strongly counter some alternative moves stats & econometrics, & related; there toward non-parametric, matching, & experimentation—there, “model-dependence” a 4-letter word. Alternative audiences & rhetorical purposes?
  - Convince skeptic some causal effect exists, vs.
  - For the convinced, give richer, portable model of how world works.



# Complex Context-Conditionality and Nonlinear Least-Squares

- *Complex Context-Conditionality*: Effect of anything depends on most everything else. E.g.:
  - *Policymaking*:
    - Socioeconomic-structure of interests
    - Party-system and internal party-structures
    - Electoral system & Governmental system
    - Socio-economic realities linking policies to outcomes
  - *Comparative Democratic Budgeteering*, e.g., begins as this simple proposition...
$$B = \dots + m(\mathbf{x}_m) \times s(\mathbf{x}_s) \times n(\mathbf{x}_n) + \dots$$
  - ...and eventually becomes this...

# Complex Context-Conditionality and Nonlinear Least-Squares

- *Comp Dem Budgeteering*...eventually becomes this:

$$B = \dots + s(u_s) \times m(ec, gc) \times n(d, p, \rho, u_r, IPC, DM) + \dots$$

- ...where *incentive-nature* given by...

$$n(u_r, \rho, DM, IPC, d, p) = \Lambda(\mathbf{x}'\boldsymbol{\beta}) \times \beta_p p + [1 - \Lambda(\mathbf{x}'\boldsymbol{\beta})] \times \beta_d d,$$

$$\text{where } \Lambda(\mathbf{x}'\boldsymbol{\beta}) \equiv \frac{e^{\mathbf{x}'\boldsymbol{\beta}}}{1 + e^{\mathbf{x}'\boldsymbol{\beta}}}, \text{ and where}$$

$$\mathbf{x}'\boldsymbol{\beta} = \beta_{ur} u_r + \beta_{\rho} \rho + \beta_{DM} \ln(DM) + \beta_{IPC} IPC^{-1} + \beta_{DMIPC} \ln(DM) \times IPC^{-1}$$

- ...and *incentive-magnitude* given by...

$$m(ec, gc) = \beta_{ec} ec + \beta_{egc} ec \times gc$$

- ...and *strategic-capacity* given by...

– some Shugart-Carey & related list to specify  $u_s = u_s(\mathbf{x}_s) = \mathbf{x}_s' \boldsymbol{\beta}_s$ .

- [Incidentally, Achen & Blais similar proportionality argument & estimation strategy, though simpler:  $\Phi(d + (1-d)inst)$ ; much like next example...]

# Nonlinear Least-Squares (NLS)

$$\mathbf{y} = f(\mathbf{X}, \boldsymbol{\beta}) + \boldsymbol{\varepsilon} \quad \text{with} \quad \boldsymbol{\varepsilon} \sim g(\boldsymbol{\varepsilon})$$

$$\Rightarrow E(\mathbf{y}) = f(\mathbf{X}, \boldsymbol{\beta}), \quad \text{so} \quad \mathbf{y} = f(\mathbf{X}, \hat{\boldsymbol{\beta}}) + \hat{\boldsymbol{\varepsilon}}$$

$$\Rightarrow \underset{\tilde{\boldsymbol{\beta}}}{\text{Min}} \hat{\boldsymbol{\varepsilon}}' \hat{\boldsymbol{\varepsilon}} \Rightarrow \underset{\tilde{\boldsymbol{\beta}}}{\text{Min}} [\mathbf{y} - f(\mathbf{X}, \tilde{\boldsymbol{\beta}})]' [\mathbf{y} - f(\mathbf{X}, \tilde{\boldsymbol{\beta}})]$$

$$\Rightarrow \underset{\tilde{\boldsymbol{\beta}}}{\text{Min}} \text{SSE} = \mathbf{y}'\mathbf{y} - \mathbf{y}'f(\mathbf{X}, \tilde{\boldsymbol{\beta}}) - f(\mathbf{X}, \tilde{\boldsymbol{\beta}})' \mathbf{y} + f(\mathbf{X}, \tilde{\boldsymbol{\beta}})' f(\mathbf{X}, \tilde{\boldsymbol{\beta}})$$

$$\Rightarrow \text{FOC: } \nabla_{\tilde{\boldsymbol{\beta}}} \text{SSE} = 0 \Rightarrow -2 \nabla_{\tilde{\boldsymbol{\beta}}} f(\mathbf{X}, \tilde{\boldsymbol{\beta}})' \mathbf{y} + 2 \nabla_{\tilde{\boldsymbol{\beta}}} f(\mathbf{X}, \tilde{\boldsymbol{\beta}})' f(\mathbf{X}, \tilde{\boldsymbol{\beta}}) = 0$$

So, if, e.g.,  $f(\mathbf{X}, \boldsymbol{\beta}) = \mathbf{X}\boldsymbol{\beta}$ , then:  $\mathbf{X}'\mathbf{y} = \mathbf{X}'\mathbf{X}\tilde{\boldsymbol{\beta}} \Rightarrow \hat{\boldsymbol{\beta}}_{LS} = (\mathbf{X}'\mathbf{X})^{-1} \mathbf{X}'\mathbf{y}$ , and if

$\mathbf{V}(\boldsymbol{\varepsilon}) \equiv \boldsymbol{\Omega} = \sigma^2 \mathbf{I}$ , then  $\widehat{\mathbf{V}}(\hat{\boldsymbol{\varepsilon}})_{LS} = \frac{1}{n-k} [\mathbf{y} - f(\mathbf{X}, \hat{\boldsymbol{\beta}}_{LS})]' [\mathbf{y} - f(\mathbf{X}, \hat{\boldsymbol{\beta}}_{LS})]$  (also, as always).

That is, intuitively, writing  $\nabla_{\tilde{\boldsymbol{\beta}}} f(\mathbf{X}, \hat{\boldsymbol{\beta}}_{LS})$  as simply  $\nabla$ , we have:

$$\hat{\boldsymbol{\beta}}_{LS} = (\nabla' \nabla)^{-1} \nabla' \mathbf{y}$$

$$\widehat{\mathbf{V}}(\hat{\boldsymbol{\beta}}_{LS})_{LS} = \widehat{\mathbf{V}}[(\nabla' \nabla)^{-1} \nabla' \mathbf{y}] = (\nabla' \nabla)^{-1} \nabla' \widehat{\mathbf{V}}(\mathbf{y}) \nabla (\nabla' \nabla)^{-1},$$

which if  $f(\mathbf{X}, \hat{\boldsymbol{\beta}}_{LS}) = \mathbf{X}\hat{\boldsymbol{\beta}}_{LS}$  meaning  $\nabla = \mathbf{X}$ , &, if  $\boldsymbol{\Omega} = \sigma^2 \mathbf{I}$ , gives the familiar

$$\hat{\boldsymbol{\beta}}_{LS} = (\mathbf{X}'\mathbf{X})^{-1} \mathbf{X}'\mathbf{y} \quad \& \quad \widehat{\mathbf{V}}(\hat{\boldsymbol{\beta}}_{LS})_{LS} = \sigma^2 (\mathbf{X}'\mathbf{X})^{-1}, \quad \text{as always.}$$

- NLS is BLUE under same conditions as OLS, w/  $\nabla$  for  $\mathbf{X}$ .
- Interpreting NLS (already know how): Effects = derivatives & 1<sup>st</sup>-differences; s.e.'s by Delta Method or simulation as usual...

# Generalized Nonlinear Least-Squares

- GNLS:
$$\mathbf{y} = f(\mathbf{X}, \boldsymbol{\beta}) + \boldsymbol{\varepsilon} \quad \text{with} \quad V(\boldsymbol{\varepsilon}) = \sigma^2 \boldsymbol{\Omega} \neq \sigma^2 \mathbf{I}$$
$$\Rightarrow \hat{\boldsymbol{\beta}}_{GNLS} = (\nabla' \boldsymbol{\Omega}^{-1} \nabla)^{-1} \nabla' \boldsymbol{\Omega}^{-1} \mathbf{y}$$
$$\Rightarrow V(\hat{\boldsymbol{\beta}}_{GNLS}) = (\nabla' \boldsymbol{\Omega}^{-1} \nabla)^{-1} \nabla' \boldsymbol{\Omega}^{-1} V(\mathbf{y}) \boldsymbol{\Omega}^{-1} \nabla (\nabla' \boldsymbol{\Omega}^{-1} \nabla)^{-1}$$
$$= (\nabla' \boldsymbol{\Omega}^{-1} \nabla)^{-1} \nabla' \boldsymbol{\Omega}^{-1} \boldsymbol{\Omega} \boldsymbol{\Omega}^{-1} \nabla (\nabla' \boldsymbol{\Omega}^{-1} \nabla)^{-1}$$
$$= (\nabla' \boldsymbol{\Omega}^{-1} \nabla)^{-1} \nabla' \boldsymbol{\Omega}^{-1} \nabla (\nabla' \boldsymbol{\Omega}^{-1} \nabla)^{-1} = (\nabla' \boldsymbol{\Omega}^{-1} \nabla)^{-1}$$
  - GNLS is BLUE in same cond's NLS, but  $\boldsymbol{\Omega}$  for  $\mathbf{I}$ .
  - ...don't know  $\boldsymbol{\Omega}$ , so need consistent 1<sup>st</sup> stage (e.g., NLS)
- FG-NLS is asymptotically BLUE:

$$\mathbf{y} = f(\mathbf{X}, \boldsymbol{\beta}) + \boldsymbol{\varepsilon} \quad \text{with} \quad V(\boldsymbol{\varepsilon}) = \sigma^2 \boldsymbol{\Omega} \neq \sigma^2 \mathbf{I}$$
$$\Rightarrow \hat{\boldsymbol{\beta}}_{FG-NLS} = (\nabla' \hat{\boldsymbol{\Omega}}^{-1} \nabla)^{-1} \nabla' \hat{\boldsymbol{\Omega}}^{-1} \mathbf{y}$$
$$\Rightarrow V(\hat{\boldsymbol{\beta}}_{FG-NLS}) = (\nabla' \hat{\boldsymbol{\Omega}}^{-1} \nabla)^{-1} \nabla' \hat{\boldsymbol{\Omega}}^{-1} V(\mathbf{y}) \hat{\boldsymbol{\Omega}}^{-1} \nabla (\nabla' \hat{\boldsymbol{\Omega}}^{-1} \nabla)^{-1}$$
$$= (\nabla' \hat{\boldsymbol{\Omega}}^{-1} \nabla)^{-1}$$

# Nonlinear Least-Squares:

## “Multiple Hands on the Wheel” Model (Franzese, *PA* ‘03)

- Monetary Policy in Open & Institutionalized Econ
  - Key C&IPE Insts/Struct: CBI, ER-Regime, Mon. Open
    - ° CBI  $\equiv$  ° Govt Delegated Mon Pol to CB
    - ° Peg  $\equiv$  ° Domestic (CB&Gov) Delegate to Peg-Curr (CB&Gov)
    - ° FinOp  $\equiv$  ° Dom cannot delegate b/c effectively del’d to globe
  - Effect of ev’thing to which for. & dom. mon. pol-mkrs would respond diff’ly depends on combo insts-structs & v.v., &, through intl inst-structs, for. on dom. & v.v.

$$\pi = \begin{cases} P \cdot E \cdot C \cdot \pi_1(X_1) + P \cdot E \cdot (1 - C) \cdot \pi_2(X_2) \\ + P \cdot (1 - E) \cdot C \cdot \pi_3(X_3) + P \cdot (1 - E) \cdot (1 - C) \cdot \pi_4(X_4) \\ (1 - P) \cdot E \cdot C \cdot \pi_5(X_5) + (1 - P) \cdot E \cdot (1 - C) \cdot \pi_6(X_6) \\ + (1 - P) \cdot (1 - E) \cdot C \cdot \pi_7(X_7) + (1 - P) \cdot (1 - E) \cdot (1 - C) \cdot \pi_8(X_8) \end{cases}$$

- Multicolinear Nightmare:
  - $2^3=8$  inst-struct conds,  $i$ , times  $k$  factors per  $\pi_i(\mathbf{X}_i)$  if lin-interact
  - Exponentially more if all polynominals;  $k!/2(k-2)!$  if all pairs.
  - Good thing can lean on some thry to specify more precisely!

# Nonlinear Least-Squares:

## “Multiple Hands on the Wheel” Model

- CB & Govt Interaction (Franzese, *AJPS* ‘99):

$$E(\pi) = c \cdot \pi_c(\mathbf{x}_c) + (1-c) \cdot \pi_g(\mathbf{x}_g)$$

$$\pi_c = \bar{\pi}_c \quad \pi_g(\mathbf{x}_g) = \pi_g(GP, UD, BC, TE, EY, FS, AW, \pi_a)$$

– *Note*: in this case, NL model nested within linear-interactive model; test is that  $b_{x \cdot cbi} / b_x$  equal  $\forall x$ .

- Full Monetary Exposure & Atomistic  $\Rightarrow$  zero domestic autonomy  $\Rightarrow$

$$\left. \begin{array}{l} \widehat{\pi_1(\mathbf{x}_1)} = \widehat{\pi_2(\mathbf{x}_2)} \\ = \widehat{\pi_5(\mathbf{x}_5)} = \widehat{\pi_6(\mathbf{x}_6)} \end{array} \right\} = \pi_a \Rightarrow \begin{cases} E \cdot \pi_a + P \cdot (1-E) \cdot C \cdot \pi_3(\mathbf{x}_3) + P \cdot (1-E) \cdot (1-C) \cdot \pi_4(\mathbf{x}_4) \\ + (1-P) \cdot (1-E) \cdot C \cdot \bar{\pi}_c + (1-P) \cdot (1-E) \cdot (1-C) \cdot \pi_g(\mathbf{x}_8) \end{cases}$$

- s.t. that, full e.r.fix  $\Rightarrow$  CB&Gov match peg  $\Rightarrow$

$$\widehat{\pi_3(\mathbf{x}_3)} = \widehat{\pi_4(\mathbf{x}_4)} = \pi_p \Rightarrow \begin{cases} E \cdot \pi_a + P \cdot (1-E) \cdot \pi_p \\ + (1-P) \cdot (1-E) \cdot [C \cdot \bar{\pi}_c + (1-C) \cdot \pi_g(\mathbf{x}_8)] \end{cases}$$

# Nonlinear Least-Squares:

## “Multiple Hands on the Wheel” Model

- Compact & intuitive, yet gives all theoretically expected interactions, in the form expected

$$\pi = E \cdot \pi_a + (1 - E) \cdot \left\{ P \cdot \pi_p + (1 - P) \cdot \left[ C \cdot \bar{\pi}_c + (1 - C) \cdot \pi_g(X_g) \right] \right\}$$

$\Rightarrow$

$$\frac{\partial \pi}{\partial E} = \pi_a(P^*, E^*, C^*, X^*, \pi_a^*) - \left\{ P \cdot \pi_p(P^*, E^*, C^*, X^*, \pi_p^*) + (1 - P) \cdot \left[ C \cdot \bar{\pi}_c + (1 - C) \cdot \pi_g(X_g) \right] \right\}$$

$$\frac{\partial \pi}{\partial P} = (1 - E) \cdot \left\{ \pi_p(P^*, E^*, C^*, X^*, \pi_p^*) - \left[ C \cdot \bar{\pi}_c + (1 - C) \cdot \pi_g(X_g) \right] \right\}$$

$$\frac{\partial \pi}{\partial C} = (1 - E) \cdot \left\{ (1 - P) \cdot \left[ \bar{\pi}_c - \pi_g(X_g) \right] \right\}$$

$$\frac{\partial \pi}{\partial c} = (1 - E) \cdot \left\{ (1 - P) \cdot \left[ (1 - C) \cdot \frac{\partial \pi_g}{\partial c} \right] \right\}$$

$$\frac{\partial \pi}{\partial z^*} = E \cdot \frac{\partial \pi_a}{\partial z^*} + (1 - E) \cdot \left\{ P \cdot \frac{\partial \pi_p}{\partial z^*} + (1 - P) \cdot \left[ (1 - C) \cdot \frac{\partial \pi_g}{\partial \pi_a} \cdot \frac{\partial \pi_a}{\partial z^*} \right] \right\}$$

# Nonlinear Least-Squares:

## “Multiple Hands on the Wheel” Model

- Effectively Estimable, yet gives all theoretically expected interactions, in the form expected

$$E(\pi) = B_0 + \beta_e E \cdot \beta_{\pi^*} \pi_a + (1 - \beta_e E) \cdot \left\{ \left[ \left( \beta_{gp} GP + \beta_{ey} EY + \beta_{up} UP + \beta_{bc} BC + \beta_{aw} AW + \beta_{fs} FS + \beta_{te} TE + \beta_a \pi_a \right) \right] \right. \\ \left. \cdot \left( 1 - \beta_{c1} C \right) + \beta_{c1} C \cdot \beta_{c2} \right. \\ \left. \cdot \left( 1 - \beta_{sp} SP - \beta_{mp} MP \right) + \beta_{sp} SP \cdot \beta_{\pi^*} \pi_{sp} + \beta_{mp} MP \cdot \beta_{\pi^*} \pi_{mp} \right\}$$

- Just 14 parameters (plus intercepts & dynamics, assuming those constant), just 3 more than lin-add!
- Parameters substantive meaning, too:
  - Degree to which...constrains certain set of actors.
  - Yields est. of inflation-target hypothetical fully indep CB
    - $\Rightarrow$  general strategy for estimating/measuring unobservables:
      - If know role factor will play & explanators of factor well enough, can estimate unobservables conditional on both those theories, if both powerful enough & enough empirical variation.



# Nonlinear Least-Squares:

## “Multiple Hands on the Wheel” Model

- Neat, but does it work? (Try it! Data online; stata: **help nl**). Estimated Equation, w/ Std. Errs.:

$$E(\pi) \approx \left\{ \begin{array}{l} .53^{.30} + .55^{.05} \pi_{t-1} - .12^{.04} \pi_{t-2} + .44^{.14} E \cdot .59^{.07} \cdot \pi_a + \\ (1 - .44^{.14} E) \cdot \left\{ \begin{array}{l} 1.0^{.05} SP \cdot .59^{.07} \pi_{sp} + .22^{.12} MP \cdot .59^{.07} \pi_{mp} + \\ (1 - 1.0^{.05} SP - .22^{.12} MP) \cdot \left[ \begin{array}{l} 1.0^{.11} C \cdot (-.59^{1.2}) + \\ (1 - 1.0^{.11} C) \cdot \left( \begin{array}{l} -.60^{.30} GP + 2.6^{1.3} EY + 16^{4.6} UP - 11^{2.4} BC \\ +1.2^{.49} AW - 1.1^{.30} FS - 8.2^{4.9} TE + .64^{.24} \pi_a \end{array} \right) \end{array} \right. \end{array} \right\} \end{array} \right\}$$

- Estimated Effects (highly context-conditional):

$$E\left(\frac{d\pi}{dx}\right) = (1 - .44E) \cdot \left\{ (1 - SP - .22MP) \cdot [(1 - C) \cdot b_x] \right\}$$

$$E\left(\frac{d\pi}{dC}\right) = (1 - .44 \cdot E) \cdot \left\{ (1 - SP - .22MP) \cdot [(.6GP - 2.6EY - 16UP + 11BC - 1.2AW + 1.1FS + 8.2TE - .64\pi_a) - .59] \right\}$$

$$E\left(\frac{d\pi}{dP}\right) = (1 - .44E) \cdot b_p \cdot \left\{ .59\pi_p - [(1 - C) \cdot (-.6GP + 2.6EY + 16UP - 11BC + 1.2AW - 1.1FS - 8.2TE + .64\pi_a) - .59C] \right\}$$

$$E\left(\frac{d\pi}{dE}\right) = .44 \cdot \left( .59\pi_a - \left\{ b_p P \cdot .59\pi_p + (1 - b_p P) \cdot [(1 - C) \cdot (-.6GP + 2.6EY + 16UP - 11BC + 1.2AW - 1.1FS - 8.2TE + .64\pi_a) - .59C] \right\} \right)$$

# Nonlinear Least-Squares:

## “Multiple Hands on the Wheel” Model

**Table 2:** Estimated Effects of Domestic Political-Economic Conditions,  $d\pi/x$ , as Function of Central Bank Autonomy,  $CBA$ , International Monetary Exposure,  $E$ , and Exchange-Rate Regime,  $P$

		<i>Little Exposed (E=0.40)</i>			<i>Moderately Exposed (E=0.65)</i>			<i>Highly Exposed (E=0.90)</i>		
		<i>Float</i>	<i>Basket Peg</i>	<i>Simple Peg</i>	<i>Float</i>	<i>Basket Peg</i>	<i>Simple Peg</i>	<i>Float</i>	<i>Basket Peg</i>	<i>Simple Peg</i>
<i>Estimated Impact of a Post-Election Year (<math>d\pi/dEY</math>)</i>										
<i>central</i>	<i>0.26</i>	+1.563 <sup>.79</sup>	+1.224 <sup>.61</sup>	+0.000 <sup>.09</sup>	+1.352 <sup>.69</sup>	+1.059 <sup>.53</sup>	+0.000 <sup>.07</sup>	+1.142 <sup>.60</sup>	+0.894 <sup>.47</sup>	+0.000 <sup>.06</sup>
<i>bank</i>	<i>0.46</i>	+1.120 <sup>.57</sup>	+0.877 <sup>.44</sup>	+0.000 <sup>.06</sup>	+0.970 <sup>.50</sup>	+0.759 <sup>.39</sup>	+0.000 <sup>.05</sup>	+0.819 <sup>.44</sup>	+0.641 <sup>.34</sup>	+0.000 <sup>.05</sup>
<i>auton.</i>	<i>0.66</i>	+0.678 <sup>.37</sup>	+0.531 <sup>.29</sup>	+0.000 <sup>.04</sup>	+0.587 <sup>.32</sup>	+0.459 <sup>.25</sup>	+0.000 <sup>.03</sup>	+0.495 <sup>.28</sup>	+0.388 <sup>.22</sup>	+0.000 <sup>.03</sup>
<i>Estimated Impact of 10% Increase in Union Density (<math>0.1 \cdot d\pi/dUP</math>)</i>										
<i>central</i>	<i>0.26</i>	+0.98 <sup>.25</sup>	+0.76 <sup>.18</sup>	+0.00 <sup>.05</sup>	+0.84 <sup>.21</sup>	+0.66 <sup>.16</sup>	+0.00 <sup>.04</sup>	+0.71 <sup>.19</sup>	+0.56 <sup>.14</sup>	+0.00 <sup>.04</sup>
<i>bank</i>	<i>0.46</i>	+0.70 <sup>.18</sup>	+0.55 <sup>.13</sup>	+0.00 <sup>.04</sup>	+0.61 <sup>.15</sup>	+0.47 <sup>.11</sup>	+0.00 <sup>.03</sup>	+0.51 <sup>.14</sup>	+0.40 <sup>.10</sup>	+0.00 <sup>.03</sup>
<i>auton.</i>	<i>0.66</i>	+0.42 <sup>.13</sup>	+0.33 <sup>.10</sup>	+0.00 <sup>.02</sup>	+0.37 <sup>.11</sup>	+0.29 <sup>.08</sup>	+0.00 <sup>.02</sup>	+0.31 <sup>.10</sup>	+0.24 <sup>.08</sup>	+0.00 <sup>.02</sup>
<i>Estimated Impact of 1% Increase in Financial-Sector Employment-Share (<math>d\pi/dFS</math>)</i>										
<i>central</i>	<i>0.26</i>	-0.66 <sup>.18</sup>	-0.52 <sup>.12</sup>	-0.00 <sup>.03</sup>	-0.57 <sup>.16</sup>	-0.45 <sup>.11</sup>	-0.00 <sup>.03</sup>	-0.48 <sup>.15</sup>	-0.38 <sup>.11</sup>	-0.00 <sup>.03</sup>
<i>bank</i>	<i>0.46</i>	-0.47 <sup>.13</sup>	-0.37 <sup>.09</sup>	-0.00 <sup>.02</sup>	-0.41 <sup>.12</sup>	-0.32 <sup>.08</sup>	-0.00 <sup>.02</sup>	-0.35 <sup>.11</sup>	-0.27 <sup>.08</sup>	-0.00 <sup>.02</sup>
<i>auton.</i>	<i>0.66</i>	-0.29 <sup>.10</sup>	-0.22 <sup>.07</sup>	-0.00 <sup>.01</sup>	-0.25 <sup>.09</sup>	-0.19 <sup>.06</sup>	-0.00 <sup>.01</sup>	-0.21 <sup>.08</sup>	-0.16 <sup>.06</sup>	-0.00 <sup>.01</sup>
<i>Estimated Impact of 1% Increase in Average Inflation Abroad (<math>d\pi/d\pi_{\cdot}</math>)</i>										
<i>central</i>	<i>0.26</i>	+0.49 <sup>.14</sup>	+0.41 <sup>.13</sup>	+0.11 <sup>.05</sup>	+0.50 <sup>.12</sup>	+0.43 <sup>.11</sup>	+0.17 <sup>.07</sup>	+0.52 <sup>.10</sup>	+0.46 <sup>.10</sup>	+0.24 <sup>.09</sup>
<i>bank</i>	<i>0.46</i>	+0.38 <sup>.10</sup>	+0.32 <sup>.09</sup>	+0.11 <sup>.04</sup>	+0.41 <sup>.08</sup>	+0.36 <sup>.08</sup>	+0.17 <sup>.06</sup>	+0.44 <sup>.08</sup>	+0.39 <sup>.08</sup>	+0.24 <sup>.08</sup>
<i>auton.</i>	<i>0.66</i>	+0.27 <sup>.06</sup>	+0.24 <sup>.06</sup>	+0.11 <sup>.04</sup>	+0.32 <sup>.06</sup>	+0.28 <sup>.06</sup>	+0.17 <sup>.06</sup>	+0.36 <sup>.06</sup>	+0.33 <sup>.06</sup>	+0.24 <sup>.08</sup>

NOTES: These are *first-year effects*, meaning before the estimated dynamics unfold. Standard errors noted in superscripts.

# Nonlinear Least-Squares: “Multiple Hands on the Wheel” Model

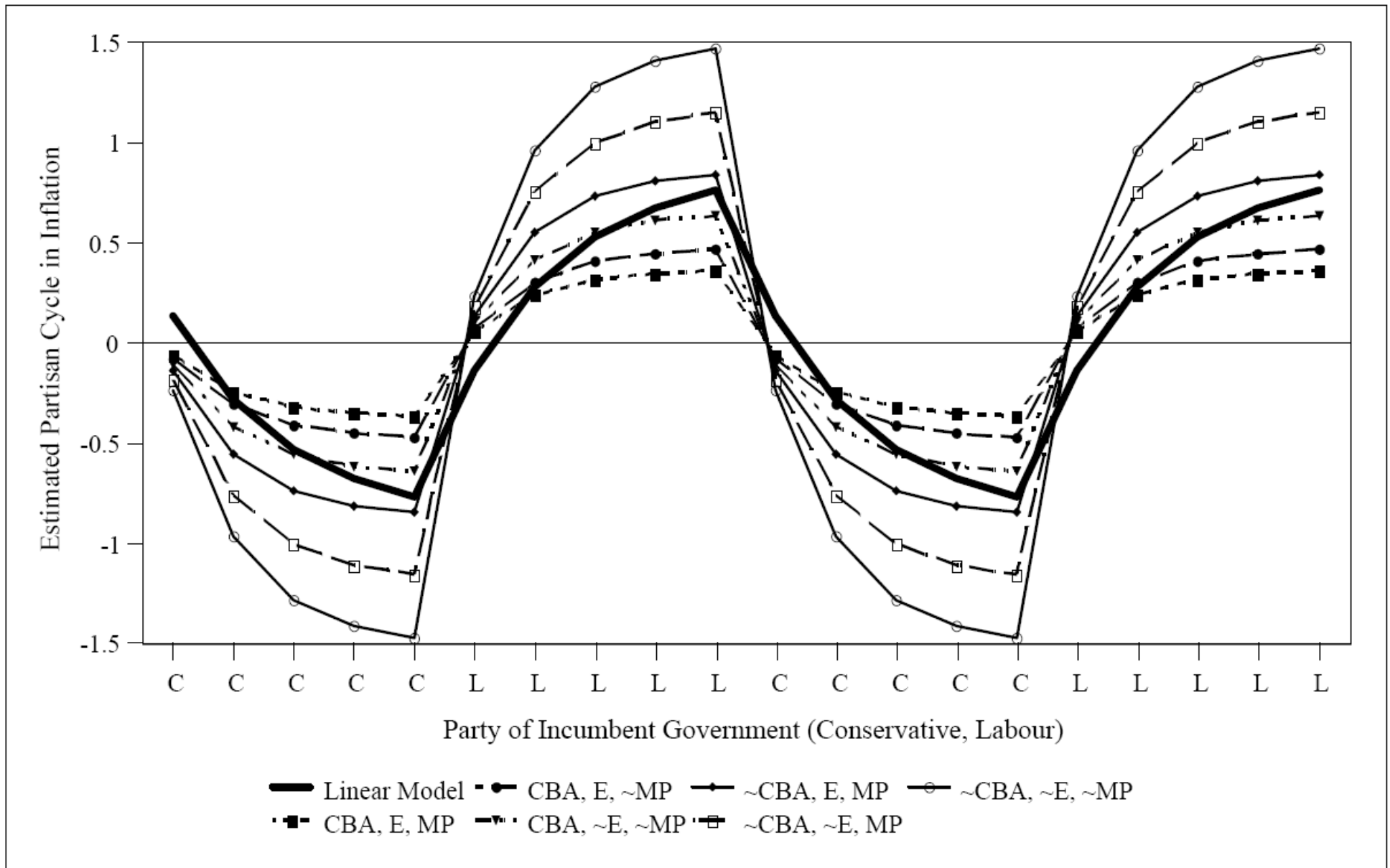
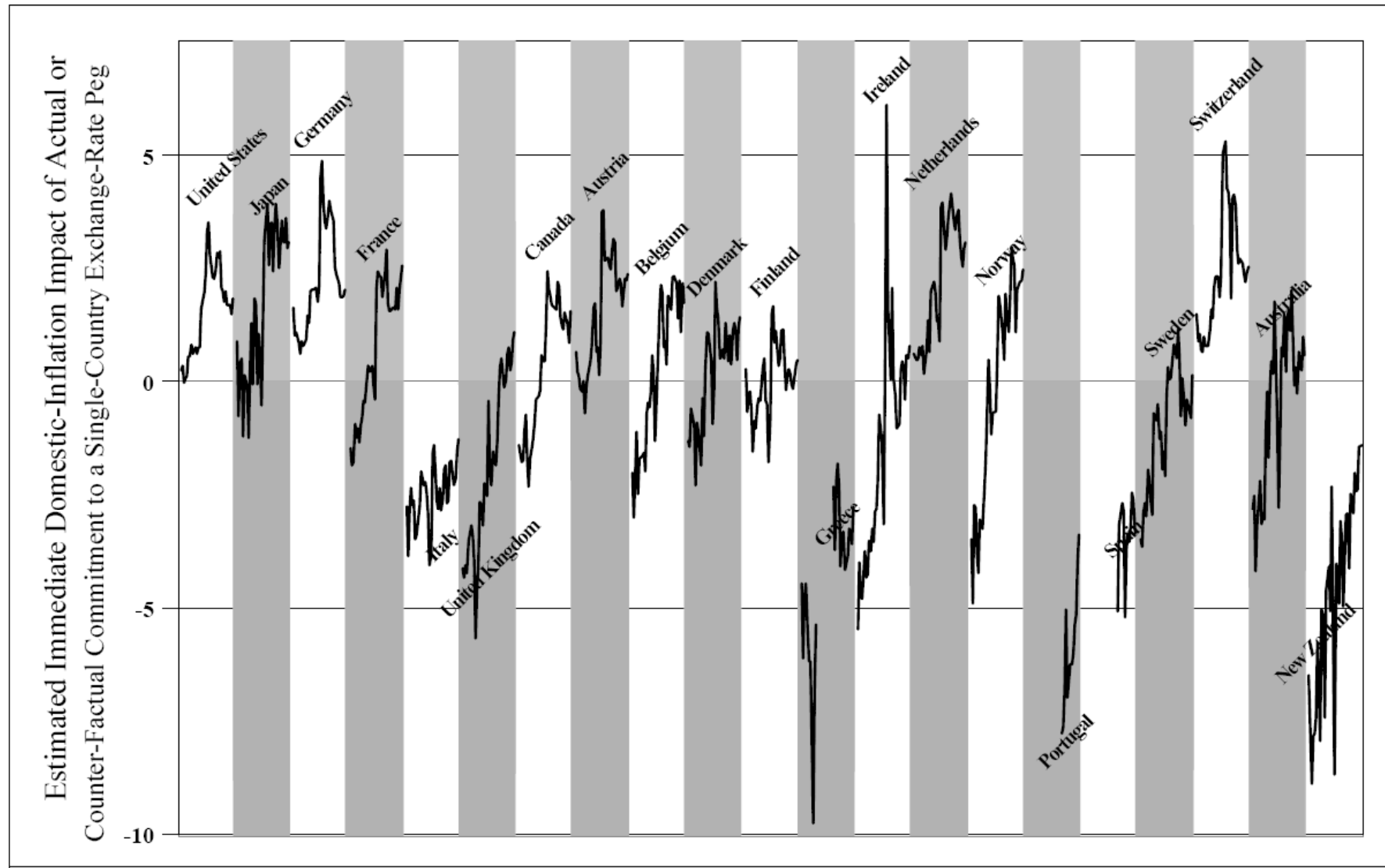


Figure 1: Estimated Partisan Cycles in the Linear & Theoretically Informed Models at High & Low  $CBA$ ,  $E$ , &  $MP$

# Nonlinear Least-Squares: “Multiple Hands on the Wheel” Model



**Figure 2:** Estimated Domestic-Inflation Effect of Actual or Counter-Factual *SP* in 21 Countries, 1957-90. Estimates plotted for  $dINF/dSP$  at the values of all other variables in the equation actually occurring in that country-year. For counter-factual pegs, peg country assumed to have OECD-average inflation that year. Shading separates countries and extends from 1955 to 1990 in each country, left to right.

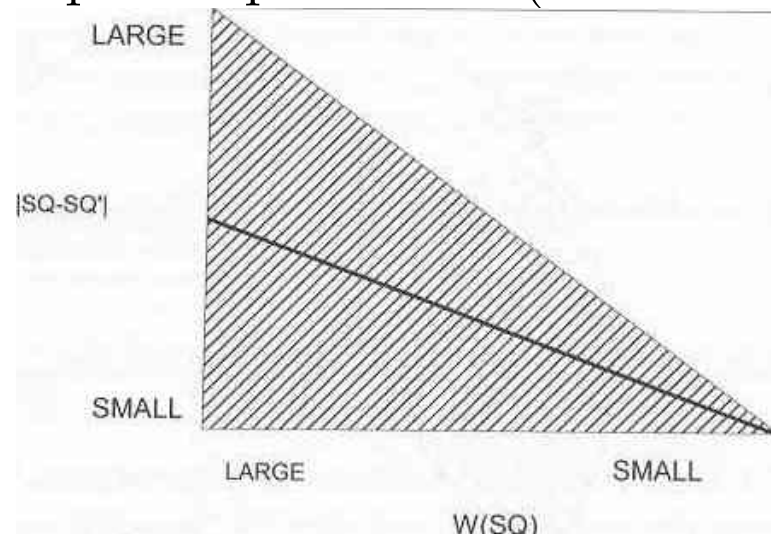
## Multiple Policymakers:

### Veto Actors Bargaining in Common Pools

- Multiple implications for policy outcomes dispersal of policymaking-authority across diverse actors:
  - Veto-Actor Theory (Tsebelis '02) emphasizes:
    - Privileges *S.Q.*, & so retards policy adjustment, reduces change.
  - Collective-Action/Common-Pool Theories (WSJ '81):
    - Externalities & so overexploit/underinvest public goods.
  - Bargaining & Delegation Theories rather stress:
    - Bargaining Strengths/Positions, yielding Weighted Compromise.
- This project attempts a synthesis:
  - Disting. theoretically/conceptually many effects of # (fragment.) & diversity (polar., partisan) policymakers.
  - Empirical model of many effects distinctly & effectively.
  - Preliminary application to evolution fiscal policy (pub debt) in developed democracies, 1950s-90s.

# Veto Actors: Deadlock, Delayed Stabilization, & Policy-Adjustment Retardation

- Tsebelis ('95b, '99, '00, '02): Essential Argument:
  - $\uparrow$  # &/or ideological/interest polarization of pol-mkng actors whose approval required to  $\Delta$ SQ, i.e., *veto actors*,  $\Rightarrow$ , loosely,  $\downarrow$  probability &/or magnitude policy  $\Delta$ .
  - I.e., strictly, as size  $W(\text{SQ}) \downarrow$ , which generally does as # &/or polarization  $V_A \uparrow$ , range *possible* policy  $\Delta(\text{SQ}) \downarrow$ .
  - $\Rightarrow$  following empirical prediction (Tsebelis 2002, Fig. 1.7):



- Suggests both mean/expected policy- $\Delta$  & variance pol & pol- $\Delta \uparrow\downarrow$  as size of  $W(\text{SQ}) \uparrow\downarrow$  (aside: why only suggests)
- No prediction of pol-level or of direction pol- $\Delta$ , only of  $E(|\Delta p|)$ ,  $V(\Delta p)$ .

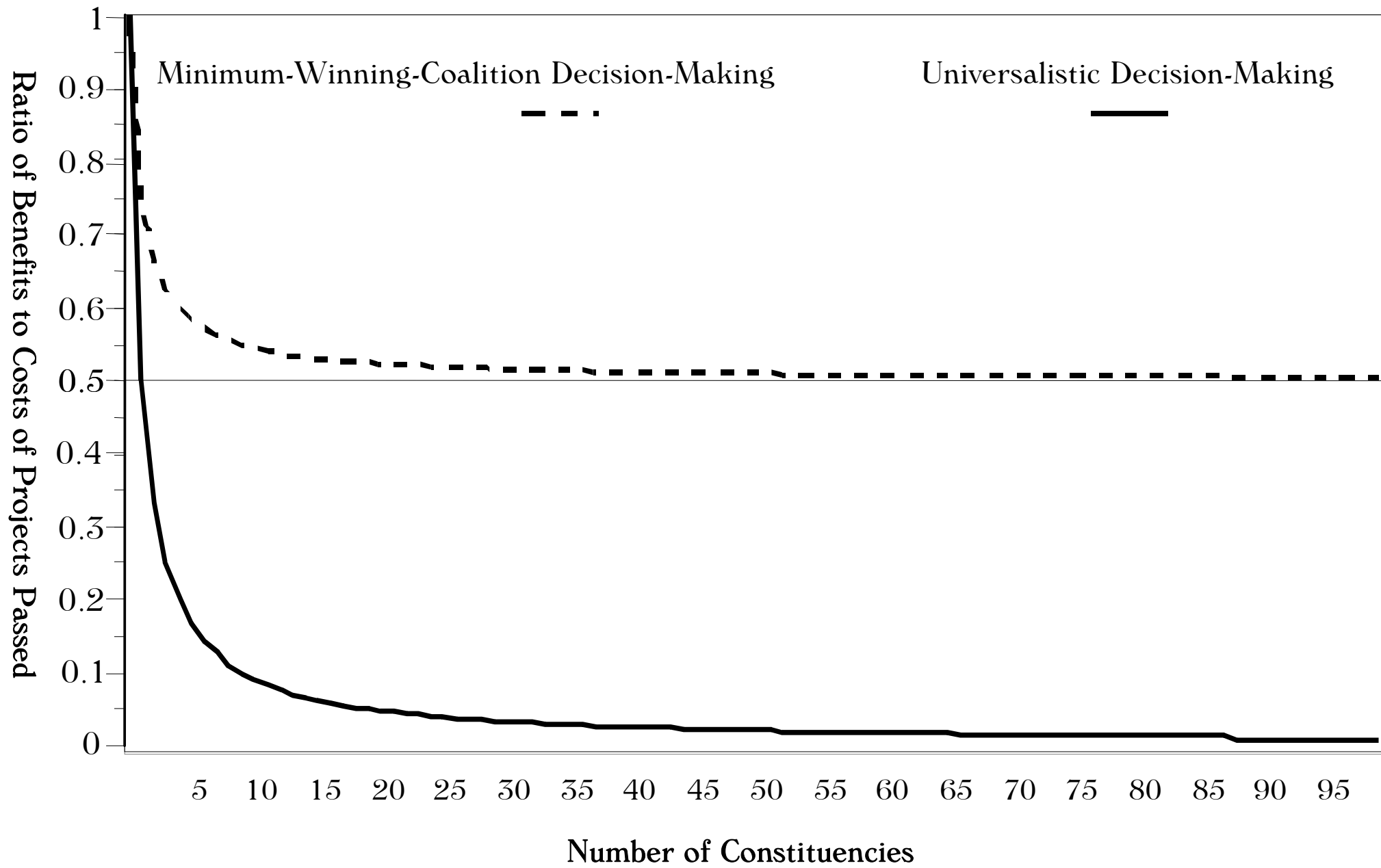
# Veto-Actor Implications

- $\uparrow \#$  (=Frag) & Polar of VA Privileges SQ  $\Rightarrow$ 
  - Retards policy-adjustment rates/delays stabilization,
  - $\downarrow$  range of possible policy- $\Delta$ , & so, possibly,
  - $\downarrow$  magnitude/variance policy-  $\Delta$  (1<sup>st</sup>- & 2<sup>nd</sup>-order  $E(\Delta)$ ).
- Results, e.g. in fiscal policy, deficits & debts; originally mixed, but tighter specify thry into empirical analysis:
  - (F '00, '02) **How model:** policy-adjustment-rate effect = conditional coefficient on LDV in dynamic model, not level.
  - (F '00, '02) **How measure:** frag & polar in VA theory =
    - raw  $\#$ , not eff.  $\#$  (size-wtd) VA;
    - max range pref's, not  $V(pref's)$  or  $sd(pref's)$ , (size-wtd)
- $\Rightarrow$  Model:  $y_t = \dots + \rho(\#VA, Range\{pref(VA)\}) \times y_{t-1} \dots$   
&/or  $V(y_t) = f(\#, Range) \Rightarrow$  empirical support.

# Common-Pool Theory (1)

- Weingast, Shepsle, Johnsen (1981): districting & distributive/pork-barrel spend (*law of 1/n*)
  - Benefits concentrate district  $i$ :  $B_i = f(C)$ ,  $f' > 0$  &  $f'' < 0$
  - Costs disperse across  $n$  districts:  $C_i = C/n$
  - $\Rightarrow$  optimal project-size from  $i$ 's view  $\uparrow$  in # districts:  
 $f'(C^*) = 1/n$  (...log-linearly?)
- Alternative Decision Rules/Processes [...]  $\Rightarrow$ 
  - [...] *Law of 1/n* is general, & stronger as legislative behavior more Universalistic & less Minimal-Winning, which tendency  $\uparrow$  as rational ignorance, winning-coalition uncertainty, or legislative-rule closure to amend or veto  $\uparrow$ .
  - E.g., PubRev = common pool for  $n$  reps, overused to distribute bens; this CA prob worsens “proportionally” by *law 1/n*, i.e. at rate  $b/w$  those at which  $(n+1)/2n$  (MWC) &  $1/n$  (uni)  $\downarrow$  in  $n$ 
    - See next slide for illustration...





# Manifestations of Common Pools

- Velasco ('98, '99, '00): inter-temporal totality pub rev is C-P to today's policymakers  $\Rightarrow$  deficits & debts also *law of 1/n*
- Peterson & co's, Treisman: federalism  $\Rightarrow$  multiple tax authorities  $\Rightarrow$  several common-pool problems:
  - Inter-jurisdiction competition (w/ high factor mobility)  $\Rightarrow$  C-P of investment resources  $\Rightarrow$  over-fishing: taxes too low.
  - National govt as lender last resort  $\Rightarrow$  subnational jurisdictions see fed guarantee & funds as common pool  $\Rightarrow$  excessive borrowing by subnat'l units. (e.g., EU, EMU & Euro  $\Rightarrow$  common pools...)
- Again, should be quite general:
  - **Anything that gains set of pol-makers credit  $\Rightarrow$  underinvested as  $\uparrow n$**
  - **Anything that gains set of pol-makers blame  $\Rightarrow$  overexploited as  $\uparrow n$**
- E.g., (theory of the 2<sup>nd</sup>-best), ELECTIONEERING:
  - Magnitude incentive electioneer fades w/  $n$  (see, e.g., Goodhart)
  - Control over electioneering diminishes w/  $n$ .
- Notice: CP not arise in Tsebelis' VA Theory b/c  $\#$  & pref's of VA's exog & predetermined, whereas in CP theory:  $\text{prefs} = f(\#)$ .

# Modeling Common-Pool Effects

- CP Effects distinguishable from VA Effects:
  - C-P Effects on *levels*, not (as in VA) in dynamics.
  - Proportional to  $1/n$  for *equal-sized* actors. Standard Olsonian encompassingness logic  $\Rightarrow$  proper  $n$  here *is* *size-weighted* (effective & s.d./var.)
  - Fractionalization ( $\#$ ) & esp. polarization (het.) relate to VA effects; CP, conversely, relate primarily to  $\#$ , although het. can exacerbate some CA probs.
- Suggests Proper Model of Policy-Response to some public demand for,  $\mathbf{x}_1'\boldsymbol{\beta}_1$ , or against,  $\mathbf{x}_2'\boldsymbol{\beta}_2$ :
  - $\dots + (\mathbf{x}_1'\boldsymbol{\beta}_1)(1-f(\ln(Eff\#))) + (\mathbf{x}_2'\boldsymbol{\beta}_2)(1+f(\ln(Eff\#))) + \dots$
  - Same  $f(\ln(Eff\#))$ , b/c overexploit/underinvest same <sup>o</sup>

# Bargaining, Delegation, & Compromise

- **Explicit extensive-form delegation & bargaining games:** huge theoretical & empirical literature
- F ('99, '02, '03): less context-specific empirical strategy...
  - Because broad comparativist seek thry that *travels*, not that requires different model each context.
- Offering is roughly equivalent Nash Bargaining.
  - Most ext forms  $\Rightarrow$  eqbm bounded by actors' ideal pts:
    - Convex set/hull, upper-contour set (=core of coop. game thry),
    - So like Tsebelis, but further, though short of explicit ext-form
  - Policy outside that range possible,
    - e.g., if uncertainty resolved unfavorably,
    - but that  $\Rightarrow$  highly unlikely that  $E(\text{pol})$  outside this range
  - Thus,  $E(\text{pol}) = \text{some convex-combo (wtd-avg) pol-mkrs' ideals} \Rightarrow \text{convex-combo emp. models} \approx \text{compromise}$ 
    - If Nash Bargain, e.g., (n.b. NB=coop. game-thry but equiv. sev. reasonable ext-form non-coop barg. games: Rubinstein '82),  $\Rightarrow$  (geometric) *wtd-influence pol-mkng*; i.e., simple wtd-avg.

# Empirical Manifestations & Model of Compromise Policymaking

- Re: def's & debt, Cusack ('99, '01; cf., Clark '03)
  - *Arg*: left more Keynes-active counter-cyc; right less, even pro-cyc
  - *Add Nash-Barg Model*  $\Rightarrow$  wtd-avg pol-mkr partisanship conditions  $\circ$  Keynesian cntr-cyc fisc-pol response to macroecon.
- Empirical Implementation:
  - Ideally:
    - Describe barg power party  $i$  as  $f(\text{charact's } i \ \& \ \text{barg envr}, j, \Rightarrow f(\mathbf{v}_{ij})$
    - Desc. pol response to conditions  $\mathbf{x}_k$  if  $i$  sole pol-mkng control:  $q_i(\mathbf{x}_k)$
    - Then embed Nash-Barg sol'n,  $\Sigma_i f(\mathbf{v}_{ij})q_i(\mathbf{x}_k)$ , in emp. model to est.
  - Currently:
    - Assume wtd-avg compromise outcome pre-estimation.
    - I.e., simply assume by measure & specification that Policy responds to  $WtdPartisanshipCurrGovt \times MacroeconomicConditions$ .

# Empirical Model of the Theoretical Synthesis (1)

- Different aspects of policy-maker fragmentation, polarization, & partisanship:
  - V-A Effects: raw # (frag) and ideological ranges (polar)
  - C-P Effects: eff # (frag) &, maybe, ideol. s.d./var (polar)
  - D-B Effects: power-wtd mean ideologies (partisanship)
- Different ways these distinct effects manifest in pol:
  - V-A (primarily) to slow pol-adjust (delay stabilization);
  - C-P induces over-draw from common resources (incl. from future as in debt); under-invest in common properties (less electioneering), log-proportionately
  - D-B induces convex-combinatorial (compromise) policies, incl. greater left-activist/right-conservative Keynesian-countercyclical/conservative pro-cyclical, in proportion to degree left/right controls policymaking

# Empirical Model of the Theoretical Synthesis (2)

- ...implies specification where:
  - Abs # VA & ideol range modify pol-adjust rates
  - (log) Eff # pol-mkrs & s.d. ideol (wtd measures) gauge C-P prob in *electioneering* (+debt-lvl effect?)
  - Some barg process among partisan pol-mkrs (e.g., Nash  $\Rightarrow$  wtd-influence) determines combo reflected in net policy responsiveness to macro ( $^{\circ}$  K-activism)
- $\Rightarrow$

$$\begin{aligned} D_{it} = & \alpha_i + (1 + \rho_n NoP_{it} + \rho_{ar} ARwiG_{it}) \times (\rho_1 D_{i,t-1} + \rho_2 D_{i,t-2} + \rho_3 D_{i,t-3}) \\ & + (\beta_{\Delta Y} \Delta Y_{i,t} + \beta_{\Delta U} \Delta U_{i,t} + \beta_{\Delta P} \Delta P_{i,t}) \times (1 + \beta_{cg} CoG_{it}) \\ & + (\gamma_{e1} E_{it} + \gamma_{e2} E_{i,t-1}) \times (1 + \gamma_{en} ENoP_{it} + \gamma_{sd} SDwiG_{it}) + \mathbf{x}'_{it} \boldsymbol{\eta} + \mathbf{z}'_{it} \boldsymbol{\omega} + \varepsilon_{it} \end{aligned}$$

# Empirical Model Specification & Data

$$D_{it} = \alpha_i + (1 + \rho_n NoP_{it} + \rho_{ar} ARwiG_{it}) \times (\rho_1 D_{i,t-1} + \rho_2 D_{i,t-2} + \rho_3 D_{i,t-3}) + \mathbf{x}'_{it} \boldsymbol{\eta} + \mathbf{z}'_{it} \boldsymbol{\omega} + \varepsilon_{it} \\ + (\beta_{\Delta Y} \Delta Y_{i,t} + \beta_{\Delta U} \Delta U_{i,t} + \beta_{\Delta P} \Delta P_{i,t}) \times (1 + \beta_{cg} CoG_{it}) + (\gamma_{e1} E_{it} + \gamma_{e2} E_{i,t-1}) \times (1 + \gamma_{en} ENoP_{it} + \gamma_{sd} SDwiG_{it})$$

$D_{it}$  = Debt (%GDP);

$NoP$  &  $ARwiG$  = raw Num of Prtys in Govt & Abs Range w/i Govt:

VA conception, so modify dynamics. Expect  $\rho_n$  &  $\rho_{ar} > 0$ .

By thry & for efficiency: modify all lag dynamics same.

$CoG$  (govt center, left to right, 0-10):

Modifies response to macroecon (equally, by thry & for eff'cy) :  $\beta_{cg} < 0$ .

Macroec:  $\Delta Y$  = real GDP growth;  $\Delta U$  =  $\Delta$  unemp rate;  $\Delta P$  = infl rate.

$\mathbf{x}'\boldsymbol{\eta}$  = controls: set pol-econ cond's response to which not partisan-differentiated or gov comm-pool: (e.g., E(real-int)-E(real-grow),  $ToT$ )

$ENoP$  &  $SDwiG$  = Effective Num of Prtys in govt & Std Dev w/i Govt:

Frag & Polar by *wtd-influence* concept. CP lvl-effects modify (at same rate) electioneering, pre-elect:  $E_t$  & post-elect:  $E_{t-1}$ :  $\gamma_{en}$  &  $\gamma_{sd} < 0$ .

$\mathbf{z}'\boldsymbol{\omega}$  = set of constituent terms in the interactions:

$ENoP$ ,  $SDwiG$  may have positive coeff's by CP effect lvl debt, but issue is *temporal fract*, not curr. govt *fract*. Thry o/w says omit.



		<b>Coeff.</b>	<b>Std. Err.</b>	<b>t-Stat.</b>	<b>Pr(<math>T &gt;  t </math>)</b>
<i>Lagged</i>	$D_{t-1}$	1.212	0.060	20.112	0.000
<i>Dependent</i>	$D_{t-2}$	-0.153	0.085	-1.792	0.074
<i>Variables</i>	$D_{t-3}$	-0.121	0.045	-2.677	0.008
$\rho_n$ ( <i>veto-actor effect: fractionalization</i> )		<b>0.007</b>	<b>0.006</b>	<b>1.089</b>	<b>0.277</b>
$\rho_{ar}$ ( <i>veto-actor effect: polarization</i> )		<b>-0.000</b>	<b>0.006</b>	<b>-0.013</b>	<b>0.990</b>
<i>Macroeconomic</i> <i>Conditions</i>	$\Delta Y$	-0.336	0.111	-3.033	0.003
	$\Delta U$	0.992	0.308	3.219	0.001
	$\Delta P$	-0.188	0.063	-2.965	0.003
$\beta_{cg}$ ( <i>partisan-compromise bargaining</i> )		<b>-0.037</b>	<b>0.037</b>	<b>-0.988</b>	<b>0.323</b>
<i>Controls</i>	$x_1$ ( <i>open</i> )	15.891	5.279	3.010	0.003
	$x_2$ ( <i>ToT</i> )	0.388	1.744	0.222	0.824
	$x_3$ ( <i>open · ToT</i> )	-10.681	5.156	-2.072	0.039
	$x_4$ ( <i>dxrig</i> )	-0.036	0.066	-0.544	0.587
	$x_5$ ( <i>oy</i> )	2.064	1.094	1.886	0.060
<i>Pre- and Post-Electoral</i> <i>Indicators</i>	$E_t$	0.687	0.568	1.210	0.227
	$E_{t-1}$	1.490	0.645	2.310	0.021
$\gamma_{en}$ ( <i>common-pool effect: fractionalization</i> )		<b>-0.547</b>	<b>0.182</b>	<b>-3.001</b>	<b>0.003</b>
$\gamma_{sd}$ ( <i>common-pool effect: polarization</i> )		<b>0.573</b>	<b>0.486</b>	<b>1.179</b>	<b>0.239</b>
<i>Constituent</i> <i>Terms</i> <i>from the</i> <i>Interactions</i>	$z_1$ ( <i>CoG</i> )	0.051	0.131	0.390	0.697
	$z_2$ ( <i>ENoP</i> )	0.281	0.446	0.629	0.530
	$z_3$ ( <i>SDwiG</i> )	0.542	0.437	1.242	0.215
	$z_4$ ( <i>NoP</i> )	0.181	0.277	0.654	0.514
	$z_5$ ( <i>ARwiG</i> )	-0.312	0.259	-1.205	0.228
<b>Summary Statistics</b>					
<b>N (Deg. Free)</b>		735 (691)		$s_e^2$	2.525
<b>R<sup>2</sup> (<math>\bar{R}^2</math>)</b>		0.991 (0.990)		<b>DW-Stat.</b>	2.101

- Joint-significance of multiple-policymaker conditioning effects ( $\gamma_{en}$ ,  $\gamma_{sd}$ ,  $\rho_n$ ,  $\rho_{ar}$ ,  $\beta_{cg}$ ) overwhelmingly rejects excluding ( $p \approx .001$ ), whereas joint-sig coeff's on constit. terms,  $\mathbf{z}$ , clearly fails reject ( $p \approx .602$ ) exclusion. (Almost) All theory says should be zero (*SDwiG* & *ARwiG* closest thry & emp.), so...

		<b>Coeff.</b>	<b>Std. Err.</b>	<b>t-Stat.</b>	<b>Pr(<math>T &gt;  t </math>)</b>
<i>Lagged</i>	$D_{t-1}$	1.207	0.060	20.290	0.000
<i>Dependent</i>	$D_{t-2}$	-0.158	0.085	-1.851	0.065
<i>Variables</i>	$D_{t-3}$	-0.117	0.045	-2.577	0.010
$\rho_n$ ( <i>veto-actor effect: fractionalization</i> )		<b>0.011</b>	<b>0.005</b>	<b>2.369</b>	<b>0.018</b>
$\rho_{ar}$ ( <i>veto-actor effect: polarization</i> )		<b>-0.002</b>	<b>0.004</b>	<b>-0.437</b>	<b>0.662</b>
<i>Macroeconomic</i> <i>Conditions</i>	$\Delta Y$	-0.375	0.087	-4.332	0.000
	$\Delta U$	1.095	0.286	3.829	0.000
	$\Delta P$	-0.207	0.053	-3.889	0.000
$\beta_{cg}$ ( <i>partisan-compromise bargaining</i> )		<b>-0.051</b>	<b>0.020</b>	<b>-2.484</b>	<b>0.013</b>
<i>Controls</i>	$x_1$ ( <i>open</i> )	16.128	5.314	3.035	0.002
	$x_2$ ( <i>ToT</i> )	0.414	1.728	0.239	0.811
	$x_3$ ( <i>open · ToT</i> )	-10.780	5.194	-2.076	0.038
	$x_4$ ( <i>dxrig</i> )	-0.038	0.066	-0.578	0.563
	$x_5$ ( <i>oy</i> )	1.898	1.100	1.724	0.085
<i>Pre- and Post-Electoral</i> <i>Indicators</i>	$E_t$	0.475	0.420	1.133	0.258
	$E_{t-1}$	1.146	0.562	2.040	0.042
$\gamma_{en}$ ( <i>common-pool effect: fractionalization</i> )		<b>-0.570</b>	<b>0.209</b>	<b>-2.727</b>	<b>0.007</b>
$\gamma_{sd}$ ( <i>common-pool effect: polarization</i> )		<b>0.881</b>	<b>0.586</b>	<b>1.503</b>	<b>0.133</b>
<b>Summary Statistics</b>					
<b>N (Deg. Free)</b>		735 (696)		$s_e^2$	2.522
<b>R<sup>2</sup> (<math>\bar{R}^2</math>)</b>		0.991 (0.990)		<b>DW-Stat.</b>	2.099

**Veto-Actor Effects: Estimates of Policy-Adjustment Rate**

<i>Adjustment Rates</i>	<i>NoP=1</i>	<i>NoP=2</i>	<i>NoP=3</i>	<i>NoP=4</i>	<i>NoP=5</i>	<i>NoP=6</i>
<b>Lag Coefficient<sup>a</sup></b>	0.943	0.952	0.960	0.969	0.978	0.986
<b>Policy-Adjust/Yr<sup>b</sup></b>	0.057	0.048	0.040	0.031	0.022	0.014
<b>Long-Run Mult.<sup>c</sup></b>	17.498	20.639	25.154	32.200	44.727	73.208
<b><sup>1</sup>/<sub>2</sub>-Life<sup>d</sup></b>	11.778	13.956	17.087	21.971	30.654	50.397
<b>90%-Life<sup>e</sup></b>	39.127	46.362	56.761	72.985	101.832	167.415

**Bargaining Effects: Estimates of Keynesian Fiscal Responsiveness**

	<i>Mean Econ. Performance -2 std. dev.</i>	<i>Mean Econ. Performance -1 std. dev.</i>	<i>Mean Economic Performance</i>	<i>Mean Econ. Performance +1 std. dev.</i>	<i>Mean Econ. Performance +2 std. dev.</i>
<i>Growth</i>	-2.354	0.454	3.261	6.069	8.877
<i>d(UE)</i>	1.915	1.034	0.153	-0.728	-1.608
<i>Infl</i>	-3.593	1.230	6.054	10.877	15.701

<i>CoG</i>	<i>E(D Econ)<sup>f</sup></i>	<i>E(D Econ)</i>	<i>E(D Econ)</i>	<i>E(D Econ)</i>	<i>E(D Econ)</i>	<i>Fiscal-Cycle Magnitude<sup>g</sup></i>
<b>3.0</b>	3.157	0.599	-1.959	-4.516	-7.074	10.231
<b>4.2</b>	2.930	0.556	-1.818	-4.192	-6.566	9.496
<b>5.4</b>	2.703	0.513	-1.677	-3.867	-6.058	8.761
<b>6.6</b>	2.476	0.470	-1.536	-3.543	-5.549	8.026
<b>7.8</b>	2.250	0.427	-1.396	-3.218	-5.041	7.291
<b>9.0</b>	2.023	0.384	-1.255	-2.894	-4.533	6.555

**Collective-Action/Common-Pool Effects: Estimates of Electoral Debt-Cycle Magnitude**

	<i>ENoP=1</i>	<i>ENoP=2</i>	<i>ENoP=3</i>	<i>ENoP=4</i>	<i>ENoP=5</i>
<b>Electoral-Cycle Magnitude<sup>h</sup></b>	1.07410	0.86454	0.65497	0.44541	0.23585

# Extension & Refinement

$$E(y_t) = \delta^0 + \mathbf{x}_t^0 \mathbf{b}^0 + (\rho_0 + \rho_1 \ln(NoP_t) + \rho_2 \ln(1 + ARwiG_t)) y_{t-1} \\ + \left\{ \left[ \mathbf{x}_t^1 \mathbf{b}^1 + \sum_{i=1}^I p(\mathbf{c}_{it}) \times q_i(\mathbf{x}_t^2) \right] \times [1 + \alpha_1 \ln(NoP_t) + \alpha_2 \ln(1 + ARwiG_t)] \right. \\ \left. \times [1 + \gamma_1 \ln(ENoP_t) + \gamma_2 \ln(1 + SDwiG_t)] \right\}$$

- $\mathbf{x}^0$  = factors that affect policy-outcomes *unless* pol-mkrs act to change *status quo*, i.e., that have effect on pol-out directly.
- $\mathbf{x}^1$  = factors affecting policy-outcomes *if* policymakers act to change status quo, *without* partisan-differentiated response
- $\mathbf{x}^2$  = factors affecting policy-outcomes *if* policymakers act to change status quo, *with* partisan-differentiated response
- $\{NoP, ARwiG\}$  = sources of **veto-actor effects**; as before
- $\{ENoP, SDwiG\}$  = sources of **common-pool effects**; as before
- $\{p(\mathbf{c}_{it}), q_j(\mathbf{x}_t)\}$  = sources of **bargaining & delegation effects**:
  - $p(\mathbf{c}_{it})$ : Effective policy-influence of party  $i$  in context  $t$ . (E.g., as now: cabinet seat-shares, but could become richer model.)
  - $q_j(\mathbf{x}_t)$ : Model of response of party  $i$  to pol-econ conditions  $\mathbf{x}_t$ . (E.g., as now:  $CoG_i \times Macroecon_t$ , but could become richer model.)

# Preliminary Results of Fuller Model

		<b>Coeff.</b>	<b>Std. Err.</b>	<b>t-Stat.</b>	<b>Pr(<math>T &gt;  t </math>)</b>	
Temporal Dynamics	D(t-1)	1.197	0.059	20.144	0.000	
	D(t-2)	-0.139	0.085	-1.629	0.104	
	D(t-3)	-0.121	0.045	-2.698	0.007	
<b>Veto-Actor Effect On Outcome-Adjustment Rate</b>		<b>NoP</b>	<b>0.008</b>	<b>0.004</b>	<b>1.883</b>	<b>0.060</b>
$\mathbf{x}_0$ : Variables with “Direct” Effect on Outcome	Open	16.624	3.758	4.423	0.000	
	Open*ToT	-11.190	3.135	-3.569	0.000	
$\mathbf{x}_1$ : Variables with Effects via Non-Partisan-Differentiated Policy Response	Ele(t)	0.315	0.363	0.867	0.386	
	Ele(t-1)	0.873	0.399	2.186	0.029	
	OY	2.833	1.295	2.187	0.029	
	DXRIG3	-0.073	0.072	-1.009	0.314	
<b>Common-Pool Effect on Policy Response</b>		<b>ln(ENoP)</b>	<b>-0.277</b>	<b>0.071</b>	<b>-3.903</b>	<b>0.000</b>
$\mathbf{x}_2$ : Variables with Effects via Partisan-Differentiated Policy Response	Growth	-0.238	0.084	-2.815	0.005	
	d(UE)	0.749	0.228	3.289	0.001	
	Inflation	-0.137	0.047	-2.947	0.003	
<b>Bargaining-Compromise Effects on Partisan Policy-Responses</b>		<b>CoG</b>	<b>-0.049</b>	<b>0.026</b>	<b>-1.893</b>	<b>0.059</b>
<b>Veto-Actor Effect On Policy-Adjustment Rate</b>		<b>NoP</b>	<b>0.215</b>	<b>0.121</b>	<b>1.773</b>	<b>0.077</b>
<i>Common-Pool Effect on Debt Level</i>		<i>ln(ENoP)</i>	<i>1.128</i>	<i>0.486</i>	<i>2.320</i>	<i>0.021</i>
<b>Summary Statistics</b>						
<b>N (Deg. Free)</b>		735 (697)		$s_e^2$	2.510	
<b>R<sup>2</sup> (<math>\bar{R}^2</math>)</b>		0.991 (0.990)		<b>DW-Stat.</b>	2.090	