

# Alliance Participation and Military Spending

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**How alliance participation affects  
military spending depends on treaty  
scope and state capability.**

**1: Though alliance participation usually increases major power military spending, growth is lower in broad treaties.**

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**2: Though alliance participation usually decreases non-major power military spending, growth is higher in broad treaties.**

# Why Should You Care?



**Does alliance participation  
increase military spending?**

**Does alliance participation  
increase military spending?  
Or decrease it?**

# Competing Results

	Decrease	Increase	Null
Most & Siverson 1987			X
Conybeare 1994	X		
Diehl 1994		X	
Goldsmith 2003			X
Morgan & Palmer 2006		X	
Quiroz-Flores 2011		X	
Digiuseppe & Poast 2016	X		
Horowitz et al 2017		X	



## Omission: Alliance Heterogeneity

- Alliances can *increase or decrease* military spending.

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- Alliances can *increase or decrease* military spending.
- Depends on alliance characteristics and what states use alliances for.

**Treaty scope and state capability are two key sources of differences between alliances.**

I make my claim about alliance participation and military spending in three ways:

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1. Argument: Treaty Scope and State Capability

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2. Statistical Analysis

I make my claim about alliance participation and military spending in three ways:

1. Argument: Treaty Scope and State Capability
2. Statistical Analysis
3. Apply Argument and Statistical Model to NATO

# Argument

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# Assumptions

- States pursue domestic consumption and foreign policy goods.

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- Security and influence are the two main foreign policy goods, which states get through alliances and military spending.
- Military spending has opportunity costs, which decrease with state size.
- Alliances are a costly signal of shared foreign policy interests: reduced freedom of action.

# Enforcement Problems in Alliance Politics

Alliance members have to address opportunistic behavior by their partners.

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1. Abandonment

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1. Abandonment
2. Free-riding

# Treaty Scope

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1. Canonical example is trade.
2. Creates issue linkages.

**In a broad alliance, opportunistic  
behavior risks more than support in  
war.**

# Implications of Treaty Scope

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1. Issue linkages increase the costs of opportunism.
2. Sharpen the tradeoff between:
  - 2.1 Foreign policy gains.
  - 2.2 Freedom of action.

**The implications of treaty scope  
depend on state capability.**



# Capability in General

Capability/Power Status shapes:

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1. Goals.

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# Capability in General

Capability/Power Status shapes:

1. Goals.
2. Constraints.
3. Prevalent Opportunism.

# State Capability: Major Powers

1. Goal: External Influence.

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1. Goal: External Influence.
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4. Alliance participation usually *increases military spending*.



# Treaty Scope and Major Powers

- Broad treaties ↑ influence without ↑ spending.

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- Broad treaties ↑ influence without ↑ spending.
- Issue linkages reassure allies of commitment.
- Greater entanglement abroad.

**Hypothesis 1: As alliance treaty scope increases, growth in major power military spending from alliance participation will decrease.**

# State Capability: Non-Major Powers

- Goal: Security.

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- Goal: Security.
- Constraint: Opportunity Costs of Military Spending.

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# State Capability: Non-Major Powers

- Goal: Security.
- Constraint: Opportunity Costs of Military Spending.
- Opportunism: Free-riding.
- Alliance participation usually *decreases* military spending.



# Treaty Scope and Non-Major Powers

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# Treaty Scope and Non-Major Powers

- Broad treaties restrict freedom of action.
- Alliance is more valuable.
- Allies have more influence through issue linkages.

**Hypothesis 2: As alliance treaty scope increases, growth in non-major power military spending from alliance participation will increase.**

# Empirical Analysis

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I need two things to test these predictions:

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1. Measure of treaty scope— economic cooperation.

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1. Measure of treaty scope— economic cooperation.
2. Connect alliance-level variation with state-level outcomes— multilevel analysis.



# Measuring Treaty Scope

I use a latent variable model to infer treaty scope from observed promises.

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My measure of scope for each alliance is the posterior mean of a latent factor.

# Details of Measure

- Multiple observed indicators of scope (ATOP):
  - *Military Support*: offense, defense, neutrality, consultation, non-aggression, unconditional military support.
  - *Other Cooperation*: bases, integrated command, economic aid, military aid, IO formation, conclude multiple other agreements, no other alliances.

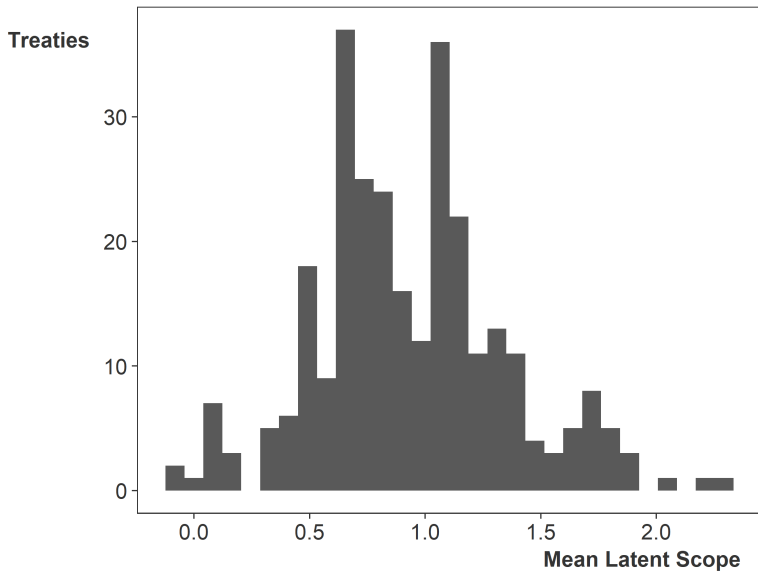
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- Semiparametric mixed factor analysis. (Murray et al 2013)

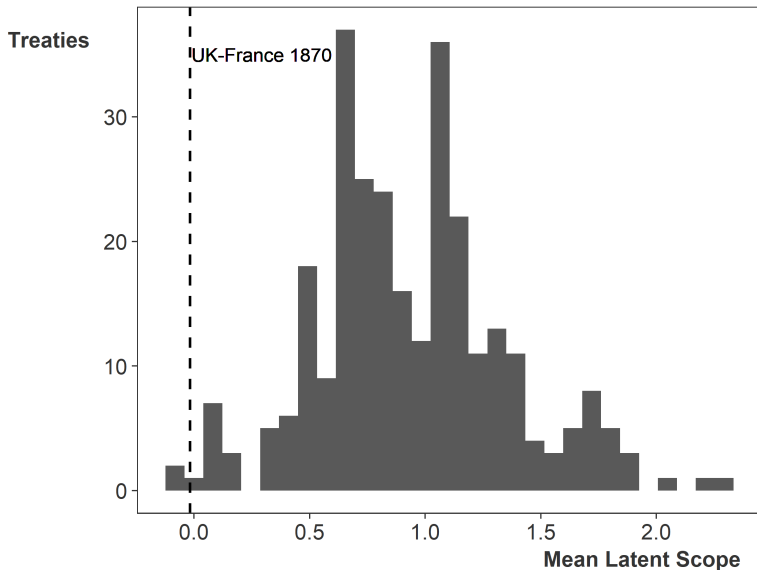
## Details of Measure

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  - *Military Support*: offense, defense, neutrality, consultation, non-aggression, unconditional military support.
  - *Other Cooperation*: bases, integrated command, economic aid, military aid, IO formation, conclude multiple other agreements, no other alliances.
- Semiparametric mixed factor analysis. (Murray et al 2013)
- Generates a posterior distribution of scope for each alliance.

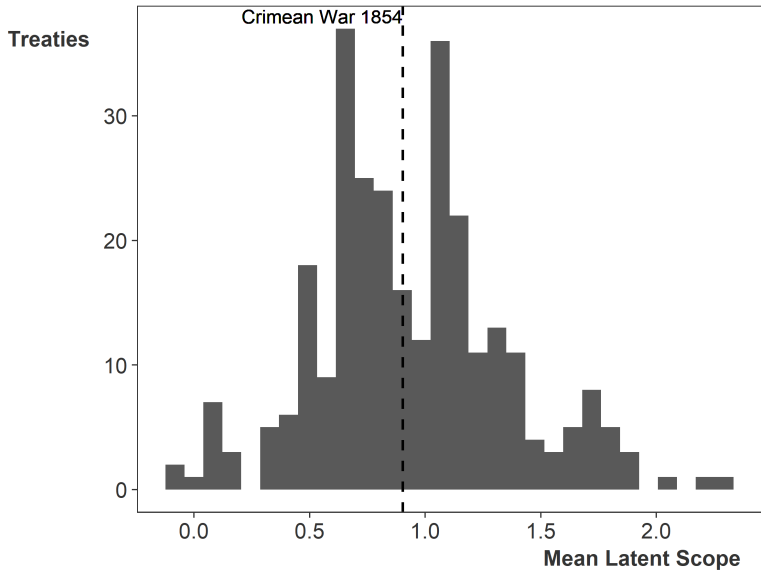
# Latent Measure of Treaty Scope



# Latent Measure of Treaty Scope: Narrow

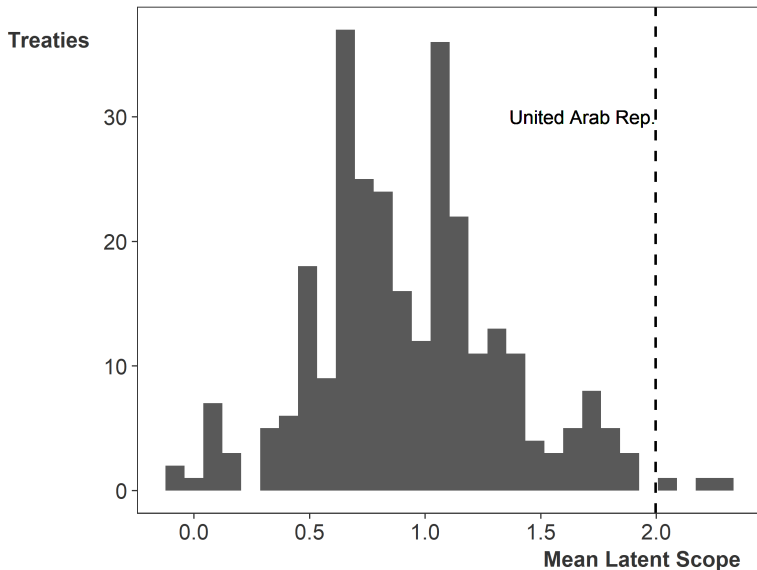


# Latent Measure of Treaty Scope: Typical





# Latent Measure of Treaty Scope: Broad



# Empirical Analysis: Multilevel Model

- Link alliance-level variation with state-level outcomes.

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- Link alliance-level variation with state-level outcomes.
- Two connected regressions: alliance and state-level.
- Alliance characteristics modify the association between alliance membership and spending growth.

$$\begin{array}{ccccccc} \text{Growth} = & & \text{Varying} & + & \text{State} & + & \text{Alliance} \\ \text{Mil. Ex.} & & \text{Intercepts} & & \text{Vars.} & & \text{Participation} \end{array}$$

$$\begin{array}{ccccccc} & & & & & & \text{Alliance} \\ & & & & & & \text{Characteristics} \\ & & & & & & \downarrow \\ \text{Growth} = & \text{Varying} & + & \text{State} & + & & \text{Alliance} \\ \text{Mil. Ex.} & \text{Intercepts} & & \text{Vars.} & & & \text{Participation} \end{array}$$

# ML Model

$$\begin{array}{ccccccc} & & & & & \text{Alliance} & \\ & & & & & \text{Characteristics} & \\ & & & & & \lambda = \alpha_{all} + \beta_1 \text{Scope} + \mathbf{X}\beta & \\ & & & & & \downarrow & \\ \text{Growth} = & \text{Varying} & + & \text{State} & + & \text{Alliance} & \\ \text{Mil. Ex.} & \text{Intercepts} & & \text{Vars.} & & \text{Participation} & \\ y = & \alpha + \alpha^{st} + \alpha^{yr} & + & \mathbf{W}\gamma & + & \mathbf{Z}\lambda & \end{array}$$

# ML Model Specification

$$y \sim \text{student}_t(\nu, \mu, \sigma) \quad (1)$$

$$\mu = \alpha + \alpha^{st} + \alpha^{yr} + \mathbf{W}_{n \times k} \gamma + \mathbf{Z}_{n \times a} \lambda \quad (2)$$

$$\lambda_a \sim N(\theta_a, \sigma_{all}) \quad (3)$$

$$\theta_a = \alpha_{all} + \beta_1 \text{Treaty Scope} + \mathbf{X}_{a \times l} \beta \quad (4)$$



## Example

$$\mu_{it} = \alpha + \alpha^{st} + \alpha^{yr} + W_{it}\gamma + Z_{it}\lambda$$

Example year:

Argentina 1955 = Overall mean

+ Argentine Intercept + 1955 Intercept

+ Argentine Characteristics

+  $\lambda_{OAS}$  \* OAS Expenditure +  $\lambda_{Rio}$  \* Rio Pact Expenditure

$$\lambda_{Rio} = \alpha_{all} + \beta_1 0.717 + \text{Controls}$$

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State-Year	Rio Pact	Warsaw Pact
Argentina 1954	.347	0
Argentina 1955	.418	0
⋮	⋮	⋮



# Sample and Key Variables

- **Split Sample:** major and non-major power states—1816-2007. Alliances with military support.

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- **DV:** Growth in Military Spending =  $\frac{\Delta \text{Mil. Expend}_t}{\text{Mil. Expend}_{t-1}}$

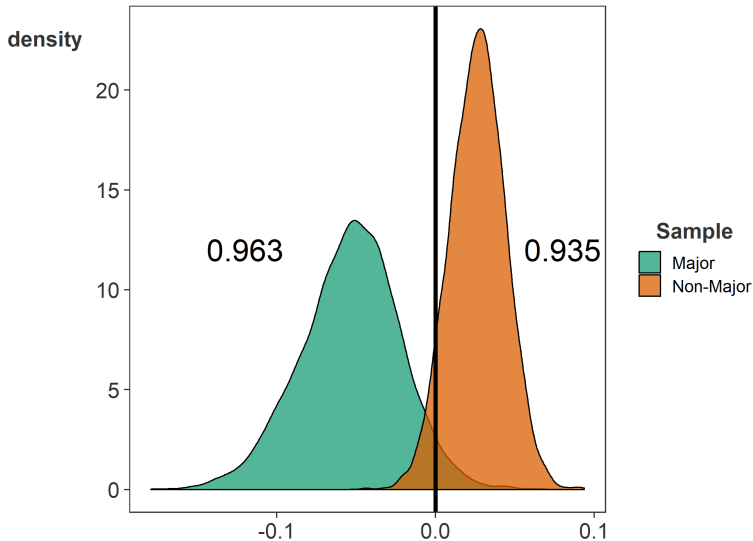
# Sample and Key Variables

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- **Alliance-Level IV:** Mean Treaty Scope

- **State-Level Controls:** Interstate war, Civil War, Annual MIDs, GDP growth, POLITY, Cold War, Rival military expenditures.

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- **Alliance-Level Controls:** Share of Democracies, Number of Members, wartime, asymmetric obligations, US member (Cold War), USSR member.

# Association Between Treaty Scope and Growth in Military Spending



## Importance

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Sample	Post. Mean	Median Growth
Major	-0.05	0.04

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Non-major	0.03	0.06



## Importance

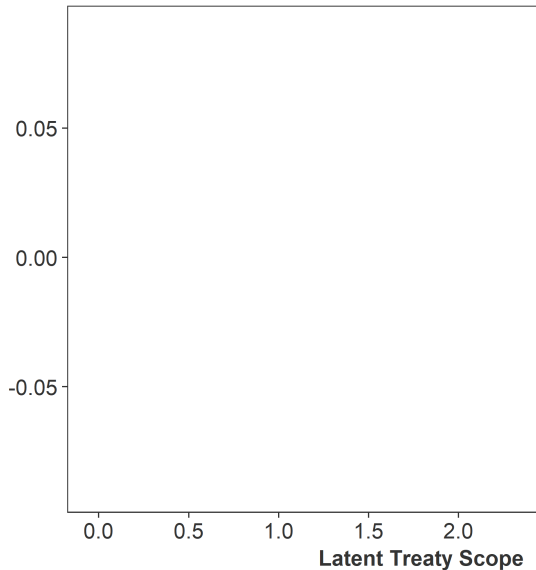
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Sample	Post. Mean	Median Growth
Major	-0.05	0.04
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**US spent \$36.0 billion on NATO in 2018, or 5.5% of the total defense spending.**

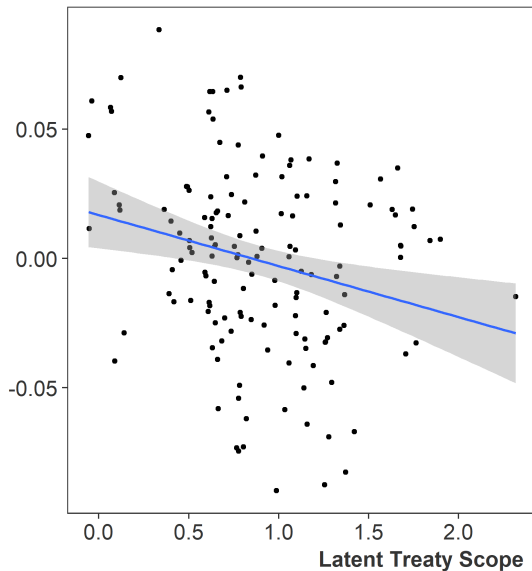
# Treaty Scope and $\lambda$

Alliance Part. Impact



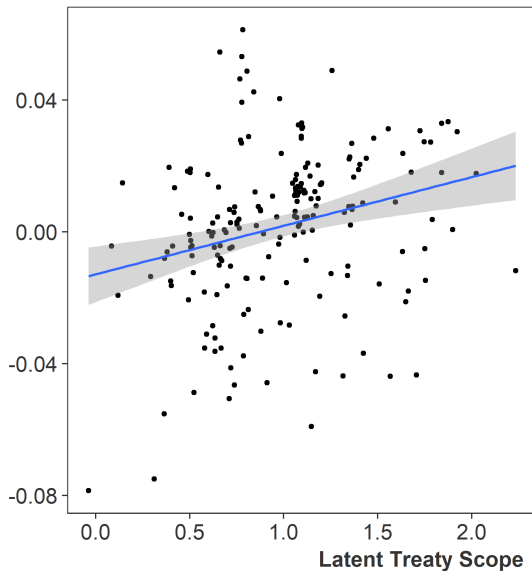
# Treaty Scope and $\lambda$ : Major Powers

Alliance Part. Impact



# Treaty Scope and $\lambda$ : Non-major Powers

Alliance Part. Impact



# NATO

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# Foreign Entanglement and Formal Obligations



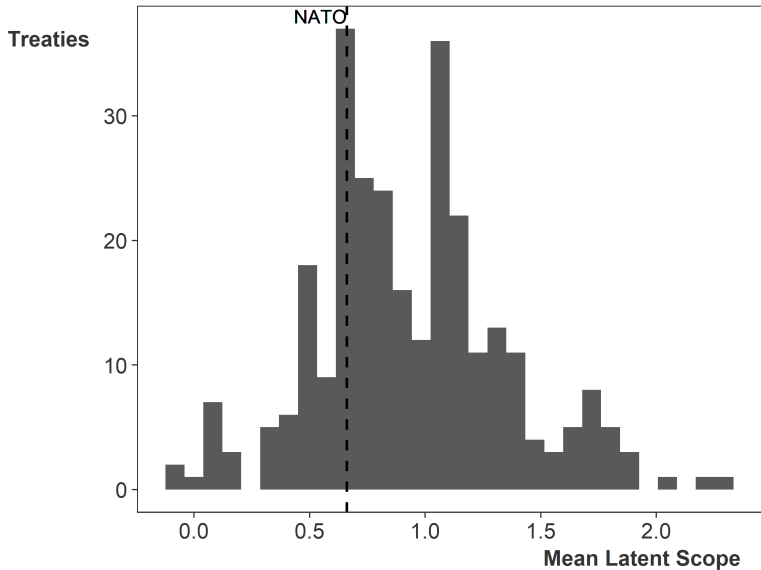
**“The Parties agree that an armed attack  
against one or more of them in Europe or  
North America shall be considered an attack  
against them all...”**

**“assist the Party or Parties so attacked by taking forthwith, individually and in concert with the other Parties, such action as it deems necessary, including the use of armed force”**

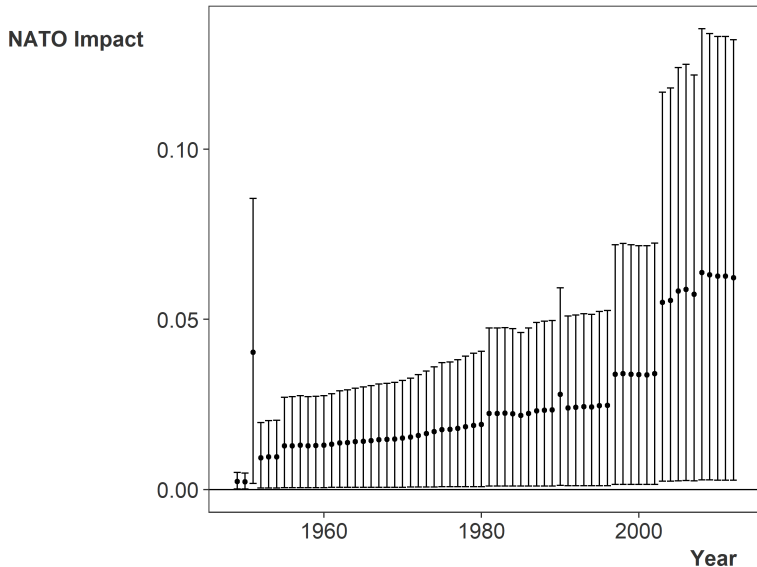


**“such action as it deems  
necessary, including the  
use of armed force”**

# NATO Scope



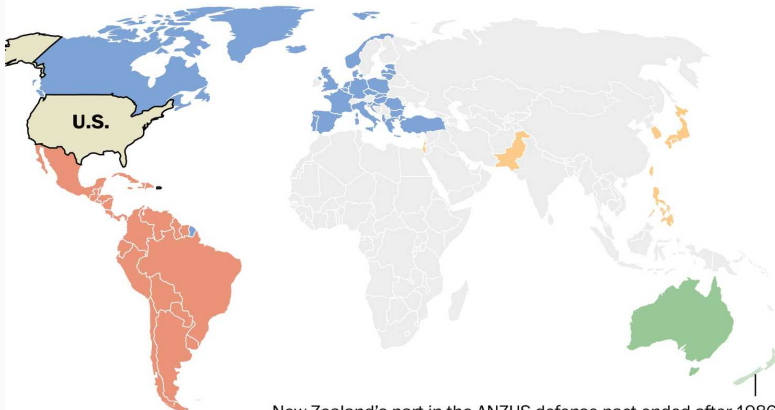
# Impact of NATO on Growth in US Military Spending



# Implication: What to do with US alliances?

## US defense pacts, 1947–2014

● OAS ● NATO ● ANZUS ● Bilateral



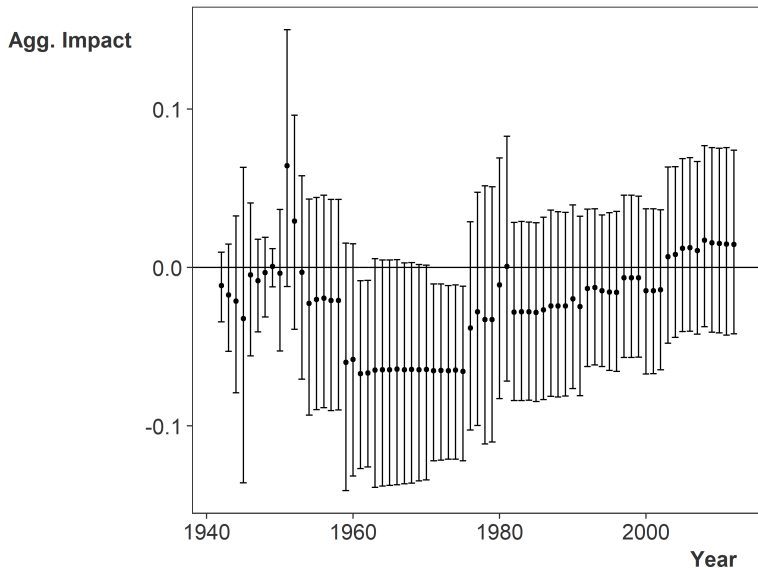
New Zealand's part in the ANZUS defense pact ended after 1986.

Note: OAS stands for Organization of American States; NATO for North Atlantic Treaty Organization; and ANZUS for Australian, New Zealand, United States Security Treaty.

Source: Belfer Center of Harvard University, CIA

THE WASHINGTON POST

# Alliance Participation and US Military Spending



# Conclusion

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**How alliance participation affects  
military spending depends on state  
capability and treaty scope.**

**1: Though alliance participation usually increases major power military spending, growth is lower in broad treaties.**



**1: Though alliance participation usually increases major power military spending, growth is lower in broad treaties.**

**2: Though alliance participation usually decreases non-major power military spending, growth is higher in broad treaties.**

# Looking Ahead

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My dissertation articulates and tests a more general theory of alliance participation and military spending.

# My Research Agenda

The political economy of security, with a focus on formal institutions.

## International Security

- Alliance Participation and Military Spending
- Reassessing the Public Goods Theory of Alliances

## Intra-State Conflict

- Conflict Management Institutions and FDI
- Sanctioning Terrorist Groups: Can it Work?
- Weapon of the Weak?: Rebel Groups' International Law Talk, 1974-2011

**Thank you!**

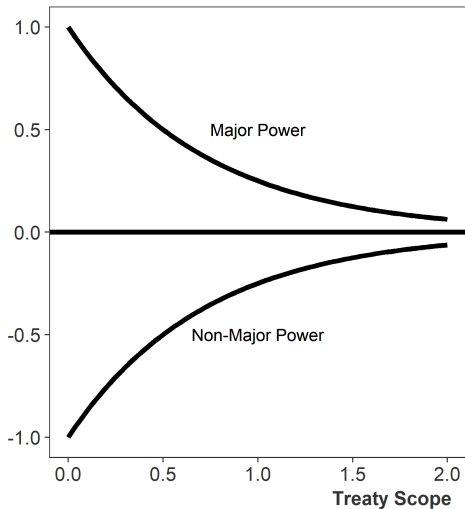
**jkalley14@tamu.edu**

# Limitations

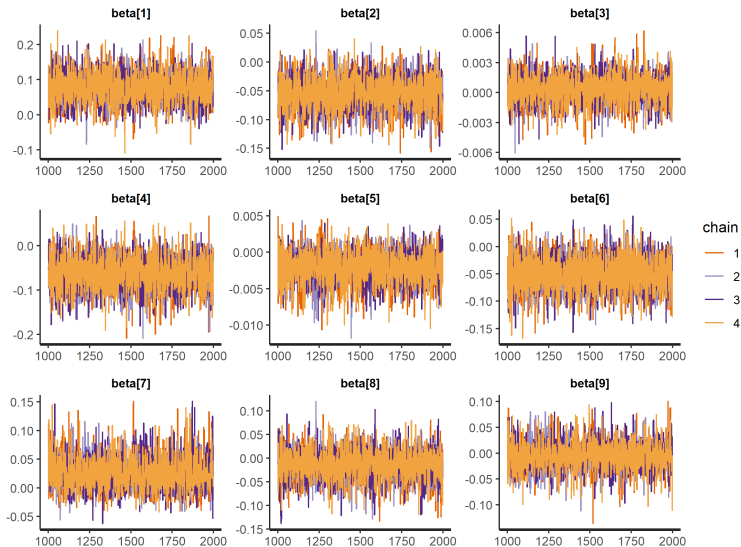
1. Domestic political economy of military spending.
2. Measurement error and missing data.
3. Strategic alliance design

# Spending Growth and the Hypotheses

Impact of Alliance Participation

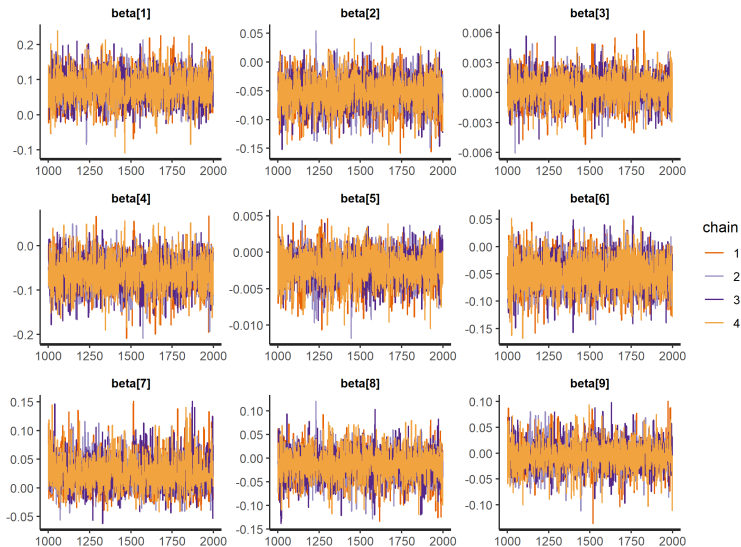


# Trace plots: Major





# Trace plots: Non-Major



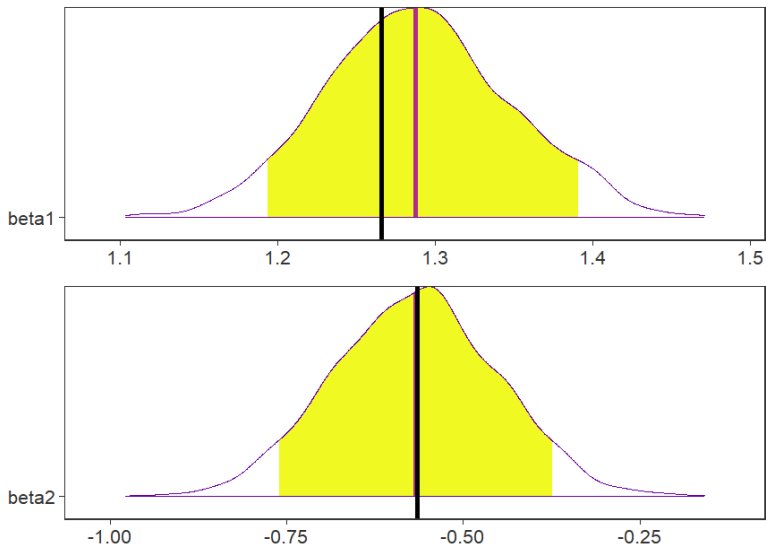
# Model Check: Recovering Known Parameters

Another way to check complicated models is simulating fake data with known parameters, then using the model to recover said parameters.

To check my model, I simulated a fake dataset of 2,000 observations with 50 states, 200 years, 100 alliances and 2 variables at each level.

The 90% credible intervals contain the known value for all regression parameters. 93 of 100 alliance specific parameter intervals contain the known value.

# Simulated Parameters and Credible Intervals



# Alliance-Level Regression Table: Major Powers

930 observations, with 130 alliances.

	mean	S.D.	5%	95%	n_eff	$\hat{R}$
Constant	0.038	0.038	-0.025	0.102	3380.954	1.000
Latent Str.	-0.054	0.031	-0.107	-0.005	3278.923	1.000
Number Members	0.000	0.002	-0.003	0.003	4000.000	0.999
Democratic Membership	-0.009	0.033	-0.065	0.042	4000.000	1.000
Wartime	-0.057	0.035	-0.115	-0.001	4000.000	1.001
Asymmetric	0.053	0.035	0.001	0.115	2218.509	1.000
US Member	0.002	0.031	-0.051	0.051	4000.000	1.000
USSR Member	0.023	0.033	-0.028	0.079	4000.000	1.000
$\sigma$ Alliances	0.066	0.029	0.019	0.117	599.081	1.007

# Alliance-Level Regression Table: Non-Major Powers

8,668 observations and 192 alliances.

	mean	sd	5%	95%	n_eff	$\hat{R}$
Constant	-0.018	0.018	-0.047	0.012	2211.374	1.000
Latent Str.	0.026	0.017	-0.002	0.054	2191.382	1.000
Number Members	0.000	0.001	-0.001	0.001	4000.000	1.000
Democratic Membership	-0.031	0.015	-0.056	-0.009	3213.621	1.000
Wartime	0.041	0.023	0.002	0.078	4000.000	1.000
Asymmetric	-0.031	0.021	-0.065	0.003	4000.000	0.999
US Member	0.013	0.018	-0.016	0.042	2895.419	1.000
USSR Member	0.011	0.031	-0.041	0.062	4000.000	1.000
$\sigma$ Alliances	0.014	0.009	0.002	0.030	1254.268	1.001

# Priors

4 Chains with 2,000 samples and 1,000 warmup iterations.

$$p(\alpha) \sim N(0, 1)$$

$$p(\sigma) \sim \text{half-}N(0, 1)$$

$$p(\alpha^{yr}) \sim N(0, \sigma^{yr})$$

$$p(\sigma^{yr}) \sim N(0, 1)$$

$$p(\alpha^{st}) \sim N(0, \sigma^{st})$$

$$p(\sigma^{st}) \sim \text{half-}N(0, 1)$$

$$p(\sigma^{all}) \sim \text{half-}N(0, 1)$$

$$p(\beta) \sim N(0, 1)$$

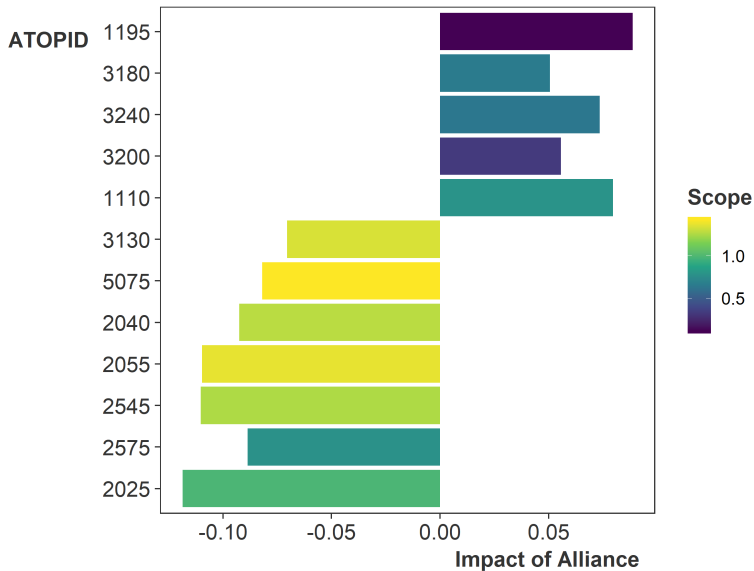
$$p(\gamma) \sim N(0, 1)$$

$$p(\nu) \sim \text{gamma}(2, 0.1)$$

## Details of Measurement Model

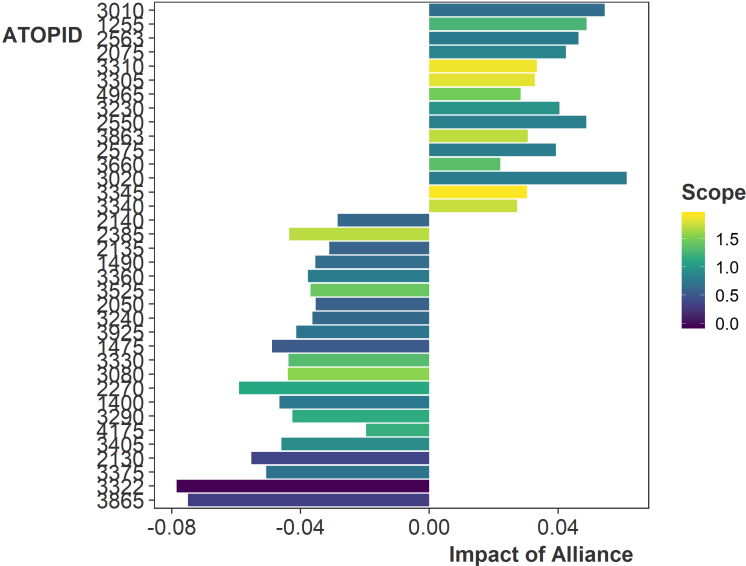
- Bayesian Gaussian Copula Factor Model: for mixed data.
- Uses copulas to break dependence between latent factors and marginal distributions.
- Treats marginals as unknown and keeps them free of dependence.
- IMH proposal, 10,000 iteration warmup, 20,000 samples, thinned every 20 draws.
- Generalized double Pareto prior for the factor loading—flexible generalized Laplace distribution with a spike at zero and heavy tails.

# Notable Major Power Alliances

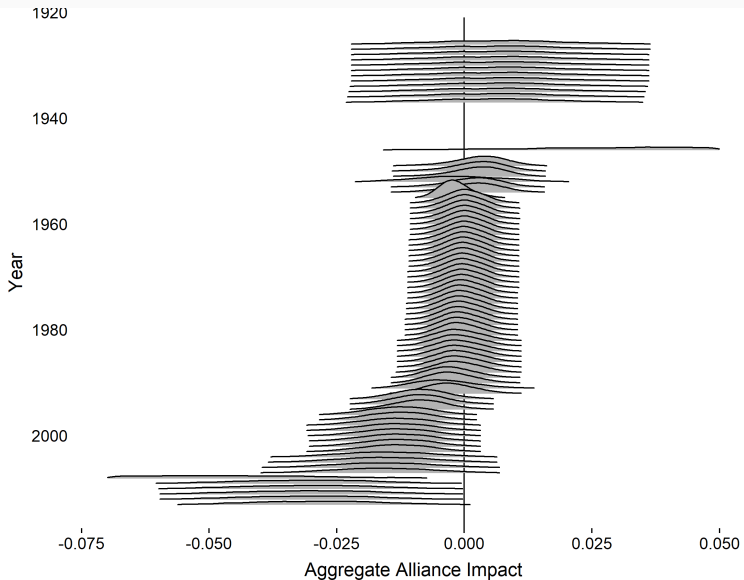




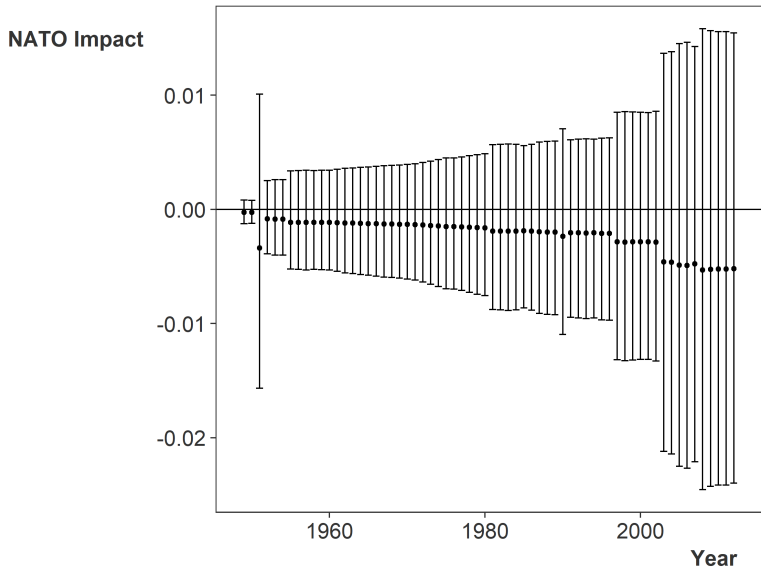
# Notable Non-Major Power Alliances



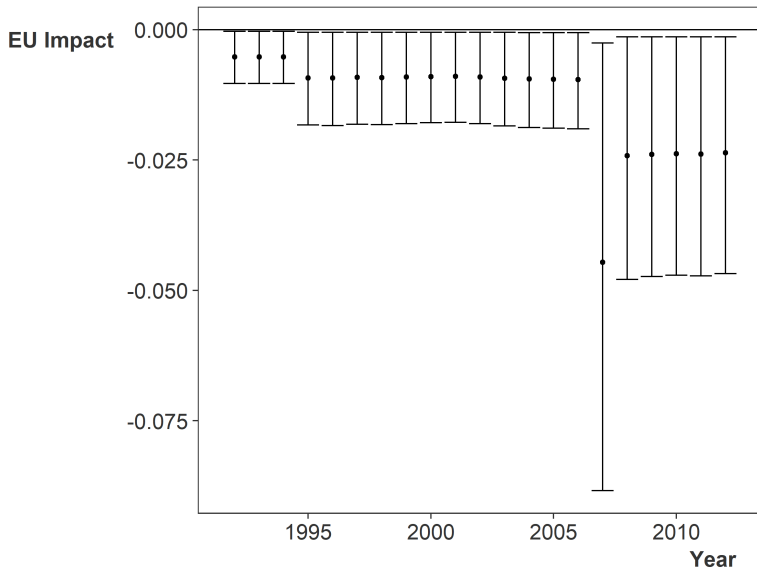
# Non-Major Powers in NATO: Belgium



# Impact of NATO on Belgium



# Impact of EU on Belgium



# Varying Slopes Model

Within each of the  $j$  groups of state capability, for  $i$  in  $1 \dots n_j$ :

$$y_i \sim \text{student}_t(\nu_j, \alpha_j + \alpha^{st} + \alpha^{yr} + \mathbf{W}_i \gamma + \mathbf{Z}_{ji} \lambda_j, \sigma_j)$$

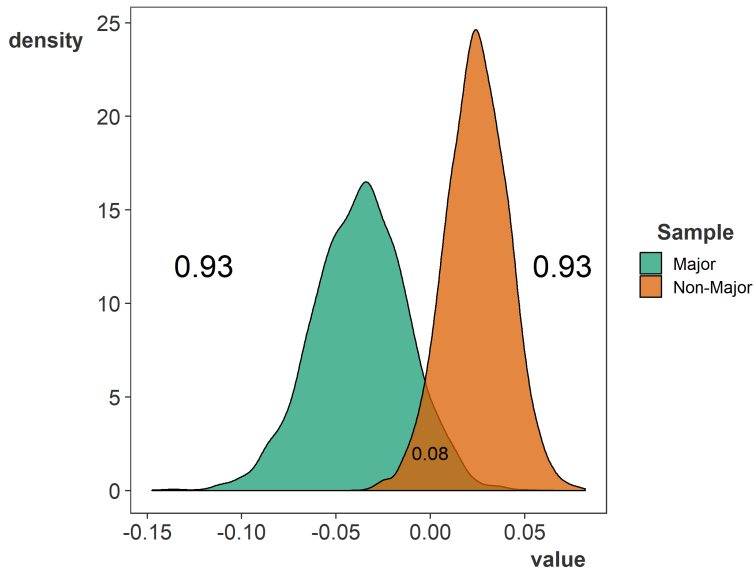
$$\lambda_j \sim N(\theta_j, \sigma_j^{all})$$

$$\theta_j = \alpha_j^{all} + \mathbf{X} \beta_j$$

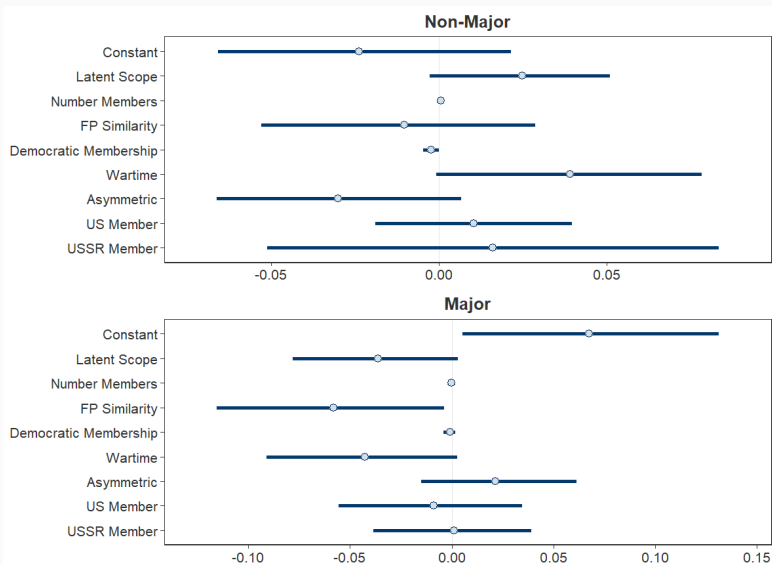
I give  $\beta_j$  a multivariate normal prior with prior scale  $\tau$ :

$$\beta_j \sim \text{MVN}(\mu_{\beta_j}, \Sigma_{\beta})$$

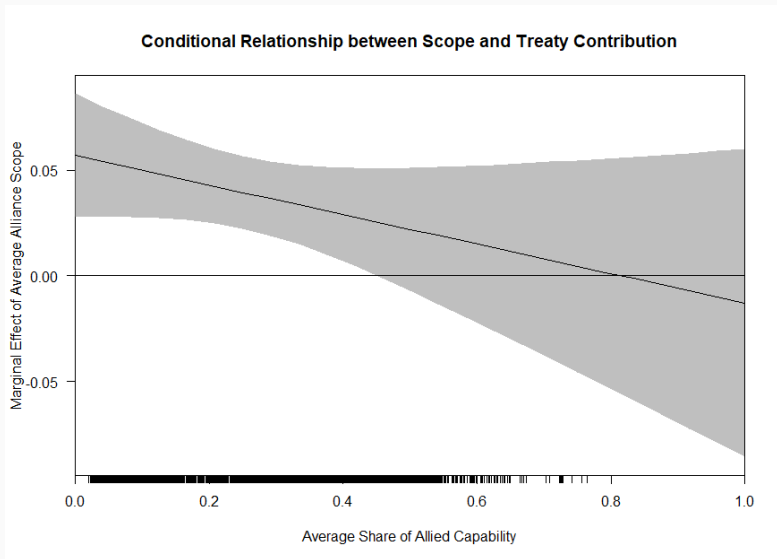
# Varying Slopes Results: Scope



# Full Varying Slopes Results



# Single-Level Robust Regression





# Binning Estimator Check of Interaction

