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## **The Effectiveness of Environmental Provisions in Regional Trade Agreements**

**Ryan Abman, Clark Lundberg, and Michele Ruta**

*Selected presentation for the International Agricultural Trade Research Consortium's (IATRC's) 2022 Annual Meeting: Transforming Global Value Chains, December 11-13, 2022, Clearwater Beach, FL.*

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# The Effectiveness of Environmental Provisions in Regional Trade Agreements

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## Summary

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## Main Findings

- Trade agreements increase net forest loss by approximately 23%
- Provisions in trade agreements aimed at protecting forests and biodiversity **completely offset** these increases
- Effects concentrated in “high-risk” countries: tropics, developing, high biodiversity
- Mitigation appears to be attributable to limiting agricultural extensification: trade agreements increase net area under cultivation by 5.5% which is **entirely offset** by provision inclusion.
- Still gains in total output attributable to intensification and net increases in agricultural exports.

# Introduction

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Gains from trade are not universal—growing evidence that opening trade can lead to negative environmental impacts:

- Natural resources (e.g. Erhardt, 2018; Taylor, 2011; Copeland and Taylor, 2009)
- Deforestation (e.g. Abman and Lundberg, 2020; Leblois et al., 2017; Alix-Garcia et al., 2018)
- Pollution (e.g. Shapiro, 2020; Baghdadi et al., 2013; Managi et al., 2009; Antweiler et al., 2001)

## Regional Trade Agreements

- Arguably the most important trade policy tool: 350 RTAs in the past 30 years (nearly every country in the world)
- Bilateral/multilateral trade liberalization: include free trade agreements, customs unions, partial scope agreements, and economic integration agreements
- Since the 1990s RTAs have deepened to include policy areas well beyond tariffs (Mattoo, Rocha, Ruta, 2021)



## Environmental Protection Provisions in RTAs

- RTAs increasingly include provisions aimed at mitigating environmental impacts
- Are these provisions mitigating environmental degradation or are they a form of veiled protectionism (Frankel, 2009)?
- Specifically, do environmental provisions related to forest conservation mitigate deforestation arising from trade liberalization?

# Data

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# Environmental Provisions and Deforestation

We focus on *deforestation* as a measurable environmental outcome:

- one of the most urgent environmental challenges of the modern era (e.g. biodiversity, climate change)
- spatially explicit and attributable (vs. e.g. emissions), non-administrative
- satellite-derived annual forest loss at 30  $m^2$  resolution (Hansen et al., 2013)

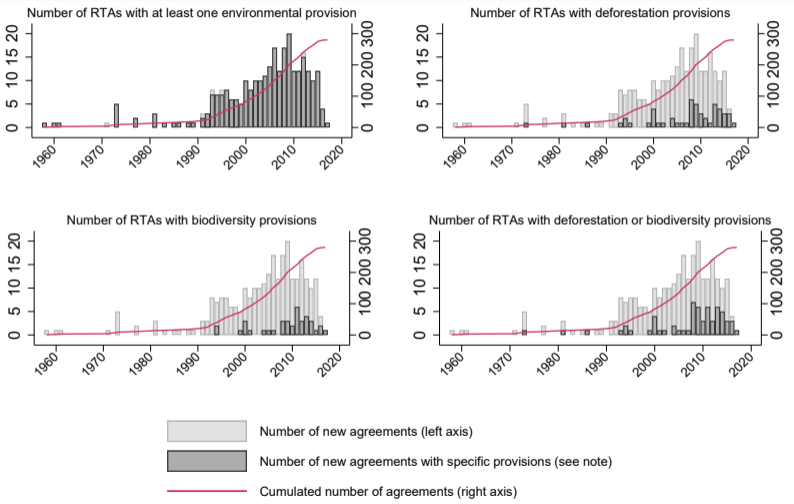
Kenya Example

## Environmental Provisions and Deforestation

Identify provisions germane to deforestation using the Environmental Laws chapter (Monteiro and Trachtman, 2020) of the new World Bank DTA database (Mattoo et al., 2020):

- “Does the agreement require measures to prevent deforestation and/or require sustainable trade practices in forest products?”
- “Does the agreement require states to promote and protect biodiversity?”

# Environmental Provisions in RTAs over time



# Econometric Approach

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## Identification Challenges

Are these provisions effective? Answering presents challenges:

- Agreement content is not exogenous
- Existing approaches in trade literature not well-equipped to address this type of endogeneity (e.g. three-way FE gravity model, country-pair matching, etc.)
- We develop a new approach: a matched RTA-level panel analysis

- Agreement level panel: aggregate outcomes to the RTA level by summing over signatory countries by year:

$$y_{gt} = \sum_{i=1}^n y_{it} \mathbb{1}[i \in G] \quad (1)$$

for RTA  $g$  in year  $t$ , where  $i$  indexes countries and  $\mathbb{1}[i \in G] = 1$  if country  $i$  is in the set of countries  $G$  that are signatories to RTA  $g$  (and 0 otherwise)

- $y_{gt}$  measures *net* outcomes among signatories. i.e. it will account for shifting economic activity, especially in response to RTAs.



## Matched Triple Difference

- Two-way FE Triple difference model on panel of RTAs:

$$y_{gt} = \beta_1 \mathbb{1}[Post\_RTA_{gt}] + \beta_2 \mathbb{1}[Post\_RTA_{gt}] \times \mathbb{1}[Enviro\_RTA_{gt}] + \alpha_g + \gamma_t + \varepsilon_{gt} \quad (2)$$

where  $g$  indexes RTA and  $t$  indexes year.

Match treated units (RTAs with environmental provisions) to similar untreated units—appropriate counterfactuals allow for causal identification (ATT)

Matching Details

## Main Results

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# Matched Triple Difference Results — Deforestation

**Table 1:** Aggregate Forest Loss

	<i>Dependent variable:</i>			
	Log Forest Loss		Deforestation Rate	
	(1)	(2)	(3)	(4)
Post RTA	0.236*** (0.046)	0.019 (0.044)	0.001*** (0.0004)	0.00004 (0.0001)
Post × Enviro RTA	-0.230*** (0.048)	0.067 (0.045)	-0.001† (0.001)	0.001** (0.0003)
Observations	630	1,918	630	1,918
R <sup>2</sup>	0.983	0.990	0.823	0.768
Matched	✓	-	✓	-

# Matched Triple Difference Results — Higher/lower Risk Countries

**Table 2:** Log Forest Loss by High-risk Country Categories

	<i>Higher Risk</i>			<i>Lower Risk</i>		
	Tropical (1)	Developing (2)	High Biodiv (3)	Non tropical (4)	Developed (5)	Lower Biodiv (6)
Post RTA	0.257*** (0.062)	0.233*** (0.065)	0.228*** (0.079)	0.048 (0.111)	0.094 (0.125)	0.219 (0.216)
Post × Enviro RTA	-0.188*** (0.057)	-0.212*** (0.057)	-0.212** (0.090)	-0.092 (0.151)	-0.099 (0.150)	-0.268 (0.286)
Observations	630	630	630	630	630	630
R <sup>2</sup>	0.997	0.994	0.998	0.998	0.997	0.996

## Matched Triple Difference Results — Intermediate Mechanisms

**Table 3:** Trade and Production of Agricultural Output and Forest Products (log)

	<i>Dependent variable:</i>				
	Ag (Ha)	Ag (Ton)	Ag Exports	Timber	Forest Exports
	(1)	(2)	(3)	(4)	(5)
Post RTA	0.055** (0.022)	0.061* (0.036)	0.137** (0.054)	0.037 (0.027)	0.070 (0.089)
Post × Enviro RTA	-0.055** (0.025)	-0.043 (0.054)	-0.100 <sup>†</sup> (0.074)	-0.030 (0.035)	-0.107 (0.086)
Observations	616	616	616	602	616
R <sup>2</sup>	0.999	0.998	0.995	0.997	0.988
Matched	✓	✓	✓	✓	✓

## Conclusion

- Provisions aimed at protecting biodiversity and forests **are** effective at mitigating forest loss from trade liberalization
- Provisions appear to limit agricultural extensification in high-risk countries
- Provisions reduce, but do not eliminate, gains to total agricultural output: suggests increases at the intensive margin too (environmental costs to intensification)
- Important insights for effective policy formation at the nexus of trade, agriculture, and the environment

# Thank you!

Questions/comments/suggestions all very welcome!

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## Alternative Identification Strategy

- Country-level analysis, allows for *country* fixed effects
- Countries enter into multiple RTAs in sample, some have environmental provisions, some do not (identification of provision effects from **within country** variation in RTA content)
- Multiple overlapping treatment precludes DiD or Triple Difference models. Focus on estimating dynamics around entry into force of RTAs: multiple event study

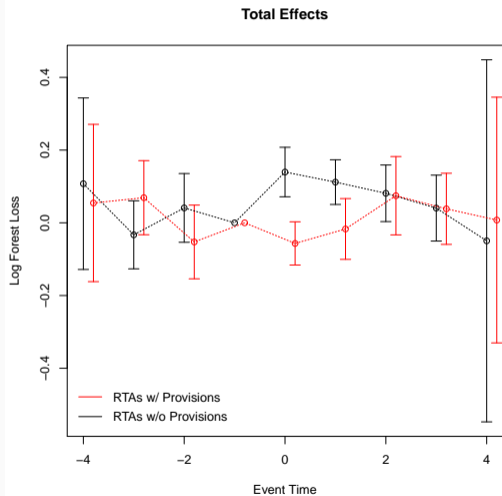


## Multiple Event Study

- Exogenous timing of entry into force (Abman and Lundberg, 2020)
- Allows for multiple overlapping treatments (entry into force of RTA)
- Dummies for leads/lags of entry into force with country and year FE
- Reference unit is year before entry into force at the country level

$$y_{it} = \delta_{LR-} \mathbb{1}[RTA_{(<-3),it}] + \sum_{\substack{s=-3, \\ s \neq -1}}^3 \delta_s \mathbb{1}[RTA_{s,it}] + \delta_{LR+} \mathbb{1}[RTA_{(>3),it}] \\ + \xi_{LR-} \mathbb{1}[enviro_{(<-3),it}] + \sum_{\substack{s=-3, \\ s \neq -1}}^3 \xi_s \mathbb{1}[enviro_{s,it}] + \xi_{LR+} \mathbb{1}[enviro_{(>3),it}] + \alpha_i + \gamma_t + \varepsilon_{it} \quad (3)$$

# Multiple Event Study Coefficient Plot



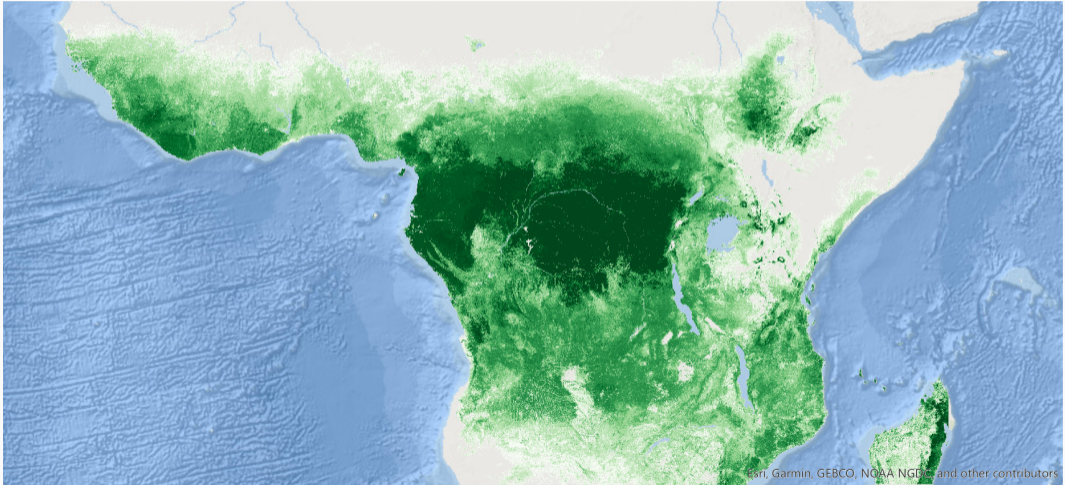
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# Matched Triple Difference Results — Specialized DS

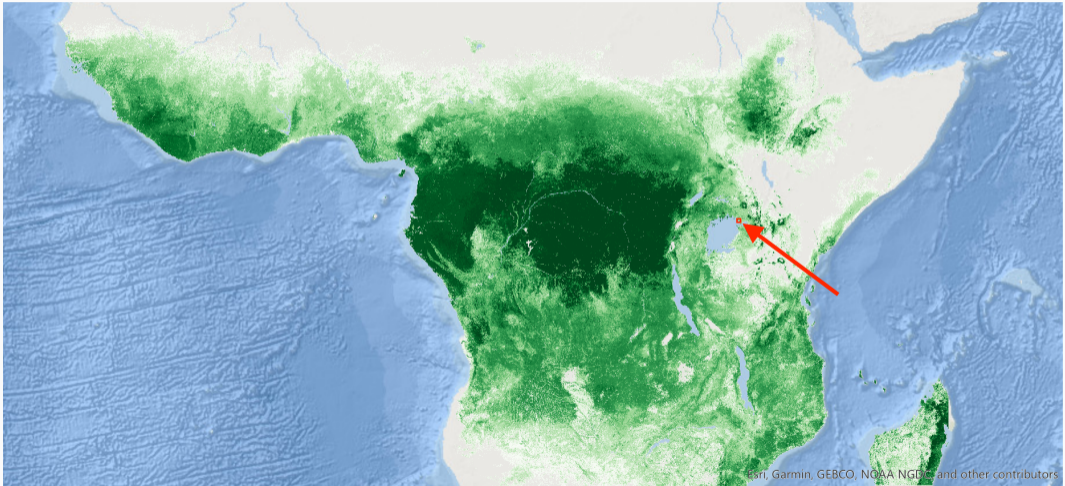
**Table 4:** Provision-specific Dispute Settlement Mechanisms and Aggregate Forest Loss

	<i>Dependent variable:</i>			
	Log Forest Loss		Deforestation Rate	
	(1)	(2)	(3)	(4)
Post RTA	0.236*** (0.046)	0.019 (0.044)	0.001*** (0.0004)	0.00004 (0.0001)
Post × Enviro RTA	-0.230*** (0.051)	0.064 (0.059)	-0.001 (0.001)	0.001* (0.0004)
Post × Enviro RTA × Dispute	-0.001 (0.089)	0.009 (0.130)	-0.001 (0.0005)	-0.001 (0.001)
Observations	630	1,918	630	1,918
R <sup>2</sup>	0.983	0.990	0.832	0.809
Matched	✓	-	✓	-

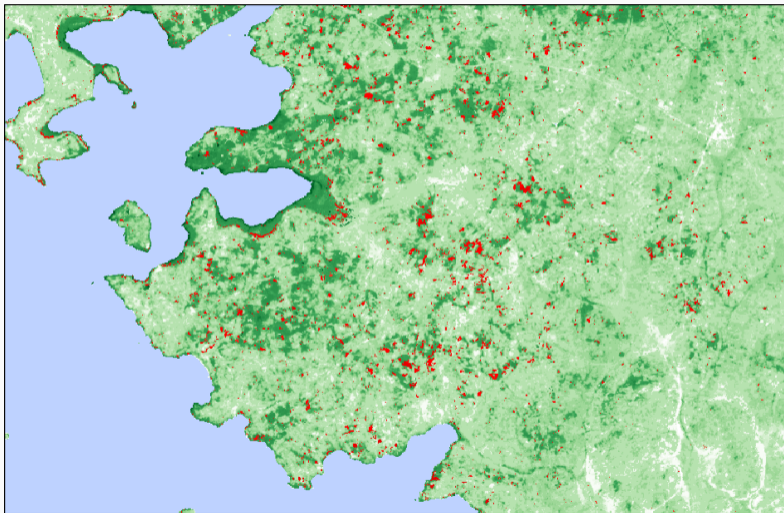
## Deforestation Data – underlying remote-sensing data



## Deforestation Data – underlying remote-sensing data

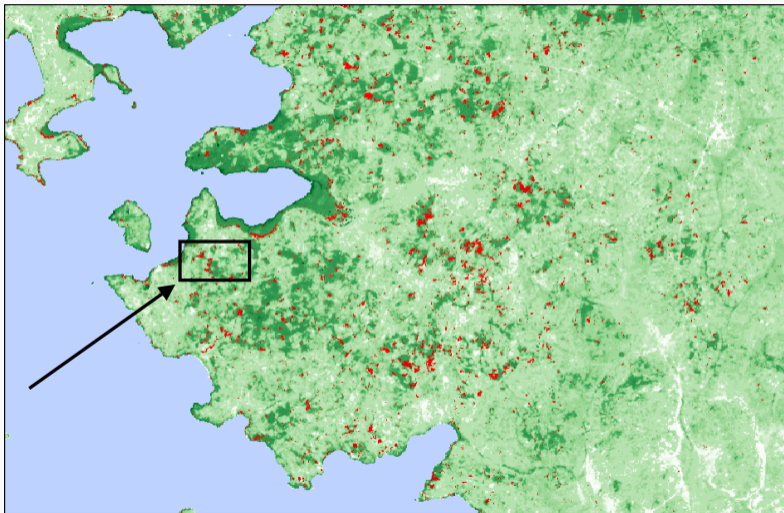


## Deforestation Data – underlying remote-sensing data



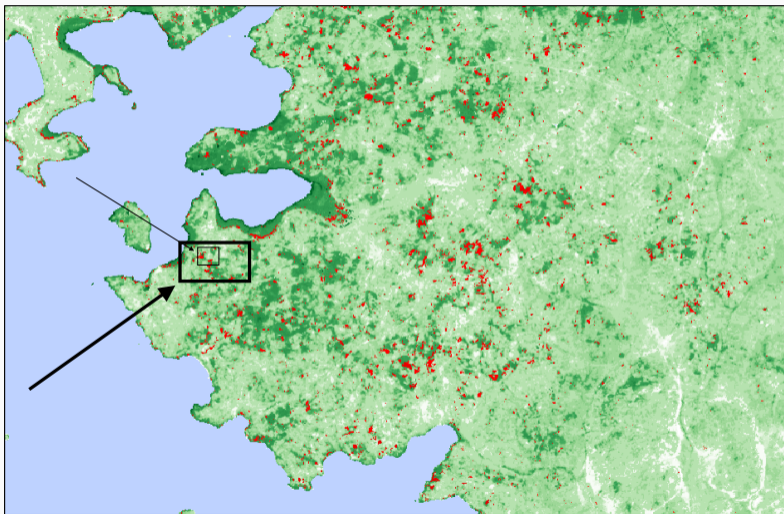
0 2.5 5 10 Kilometers

## Deforestation Data – underlying remote-sensing data



0 2.5 5 10 Kilometers

## Deforestation Data – underlying remote-sensing data



0 2.5 5 10 Kilometers



# Deforestation Data – underlying remote-sensing data



**(a)** 2001



**(b)** 2014

## Propensity Score Matching — Logit LASSO

- LASSO is a *penalized MLE*. Formally, the logit LASSO solves:

$$\max_{\beta_0, \beta} \left\{ \frac{1}{n} \sum_{g=1}^n \ell(\mathbb{1}[\text{Enviro\_RTA}_g], \beta_0 + \beta \mathbf{X}_g \mid \beta_0, \beta) - \lambda \|\beta\|_1 \right\} \quad (4)$$

where  $\ell(\cdot)$  is the logit log-likelihood function,  $g$  indexes RTAs,  $\mathbf{X}_g$  is the set of candidate regressors,  $\beta = \{\beta_1, \beta_2, \dots, \beta_k\}$  and  $\|\beta\|_1$  denotes the  $\ell_1$ -norm of  $\beta$  (i.e.  $\sum_{j=1}^k |\beta_j|$ ).

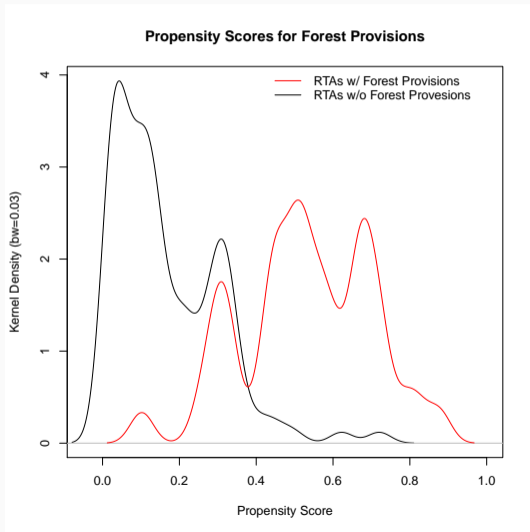
- Penalty term  $\lambda$  ensures that many coefficients are set to zero, omitting those variables from the fitted regression
- $\lambda$  is exogenous in LASSO — endogenize it: use  $\lambda$  that minimizes mean  $k$ -fold cross-validation error

## Reduced-form Empirical Political Economy Model of Provision Inclusion

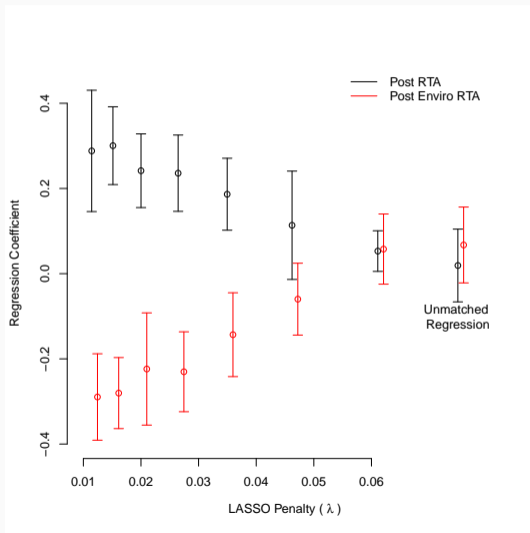
- Relevance: Measures of forest stocks, biodiversity, tropical locations
- Bargaining power & enforcement: Indicators for developed/developing signatory combinations, individual country indicators
- Contracting costs: Number of signatories, individual country indicators, templating indicators, etc.

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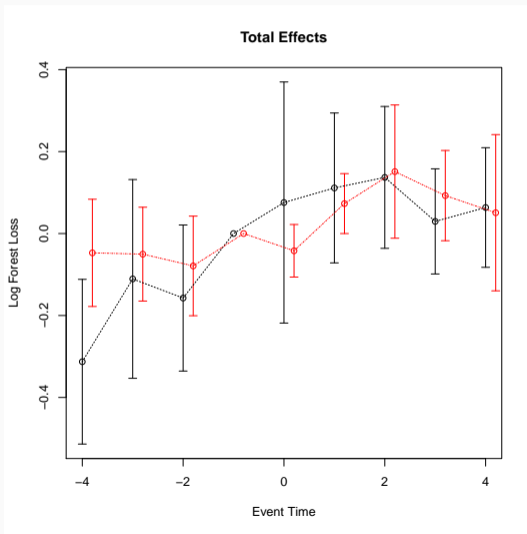
# Estimated propensity score distributions



# Sensitivity Analysis of LASSO Penalty ( $\lambda$ )



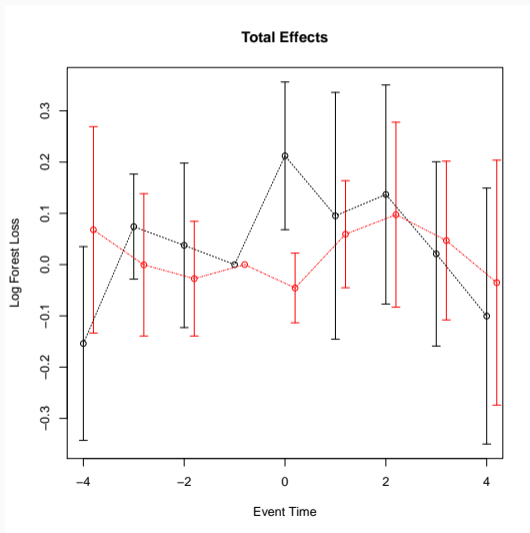
# Triple-difference Event Study



No ASEAN-Korea RTA

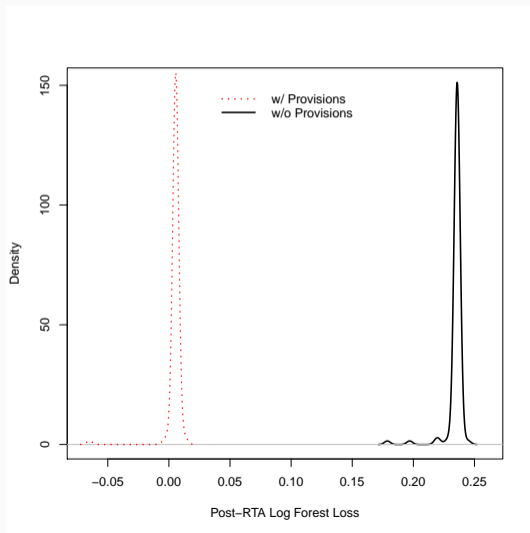
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# Triple-difference Event Study omitting ASEAN-Korea



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# Distribution of Effects from Sequentially Omitting RTAs from Matching Candidates ( $\beta_1, \beta_1 + \beta_2$ )





## SUTVA Discussion

- Shifts in deforestation among RTA signatories would not violate SUTVA, but potential displacement of deforestation outside an RTA trading bloc would
- Ag mechanisms: Asymmetric nature of forest loss from land conversion means that possible spillovers in agricultural trade flows would not violate deforestation SUTVA
- Timber mechanisms: RTAs might cause the import prices of non-member timber exports to rise *relative* to member countries (potentially affecting trade flows), but they should not (strongly) affect the actual *producer price levels* that harvest would respond to
- RTA-level overlap: attenuation towards zero