Political Forbearance and Intensification of Counternarcotics Enforcement

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Columbia University

February 27, 2024

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Source: El Tiempo

- Violence undermines economic growth, social development, public goods, and democracy (Barnes, 2017; Collier, 1999; Daly, 2022; Lessing, 2017; Treio and Lev. 2020)
- Contemporary violence in Latin America linked to drug trade and non-state armed groups
- Latin America holds the highest levels of criminal violence globally (Arjona, 2021)



Source: El Tiempo

- Extensive efforts to combat illicit drugs on the supply side
 - U.S. has spent \$20 billion on foreign counternarcotics enforcement since 2000
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Test using the case of the aerial eradication of coca crops in Colombia

State consolidation requires control through law enforcement

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 - Enforcement decisions will vary based on armed group influence on elections
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 - Enforcement decisions will vary based on armed group influence on elections e.g., allow aligned non-state armed groups to persist for electoral gain
- Enforcement gaps propagate institutional weakness (Brinks, Levitsky and Murillo, 2019)

Forced crop eradication an important outcome itself



Source: Associated Press

Forced crop eradication an important outcome itself

- Health consequences (Camacho and Mejía, 2017)
- Environmental damage (Rincón-Ruiz et al., 2016)
- Loss of trust in government (Torreblanca, 2023)



Source: Associated Press



Two neighboring coca-growing municipalities



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 - State capacity? Both contain airstrips and military bases

• Paramilitary influence in Ituango,

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- Use a difference-in-differences design to demonstrate patterns of forbearance and intensification of counternarcotics enforcement after the election of Álvaro Uribe
 - Forbearance: less eradication in paramilitary areas (aligned with government)
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 - Forbearance: less eradication in paramilitary areas (aligned with government)
 - Intensification: more eradication in guerrilla areas (opposed to government)
- Enforcement gaps not only reflect a lack of state capacity but also complicity (Yashar, 2018)

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Asymmetric benefits and costs to counternarcotics

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Source: Washington Post

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- National actors control and accrue benefits from enforcement
 - International politics, U.S. bilateral aid
 - Domestic electoral benefits from unaffected voters
- The burden of enforcement is local
 - Direct costs are geographically concentrated



Source: Washington Post

Strategic implementation of counternarcotics

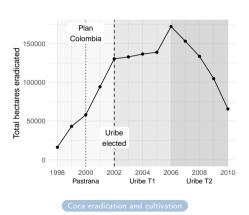
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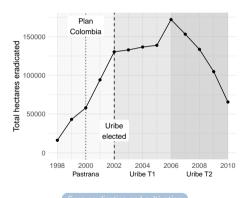
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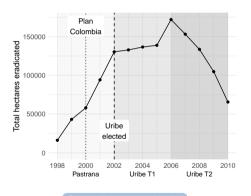
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- H1. Governments will **reduce** enforcement of drug laws in areas influenced by non-state armed groups with which they have **aligned** political preferences
- H2. Governments will **intensify** enforcement of drug laws in areas under the influence of non-state armed groups with which they have **opposing** political preferences



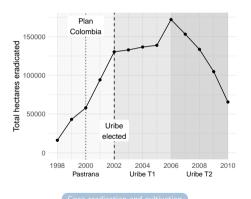
Aerial eradication valuable at the national level



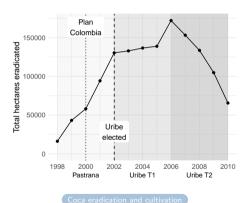
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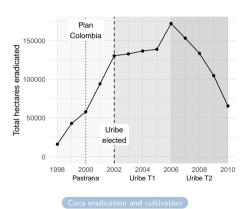
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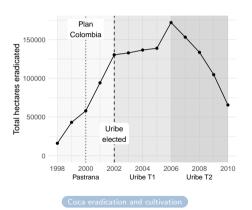
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 - ightarrow incumbent government uses eradication to reward and punish armed groups, who function as electoral brokers (Acemoglu, Robinson and Santos, 2013)

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- Paramilitary groups such as the AUC explicitly favored Uribe
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 - Politicians who supported term limit removal arrested for ties to paramilitaries (Daly, 2016)

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Expectations for eradication

Forbearance toward paramilitary areas, intensification toward guerrilla areas

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Leverage temporal variation in government incentives to forbear or intensify enforcement alongside cross-sectional variation in historical armed group presence

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Monthly municipal panel 1998-2010

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- Armed group influence proxied by aggregating violence over many years Violence map
 - Standard practice in literature (Acemoglu, Robinson and Santos, 2013; Ch et al., 2018)
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- Estimation sample: 318 of 1,122 municipalities Sample map

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Main estimating equation

Eradication_{i,t} =
$$\beta_1 P_i \times \mathbb{1}[2002-2006] + \beta_2 G_i \times \mathbb{1}[2002-2006] + \beta_3 P_i \times \mathbb{1}[2006-2010] + \beta_4 G_i \times \mathbb{1}[2006-2010] + \gamma_i + \delta_t + \epsilon_{i,t},$$
 (1)

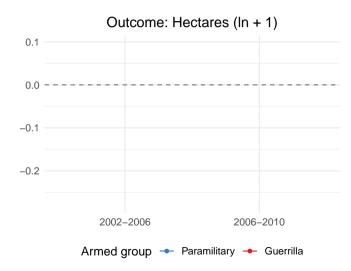
- $Eradication_{i,t}$: measure of eradication in municipality i in year-month t
- \bullet P_i : time-invariant measure of paramilitary attacks in each municipality
- G_i: time-invariant measure of guerrilla attacks in each municipality
- 1[2002-2006]: indicator for months belonging to Uribe's first presidential term
- 1[2006-2010]: indicator for months belonging to Uribe's second presidential term
- γ_i : municipality fixed effects; δ_t : year \times month fixed effects

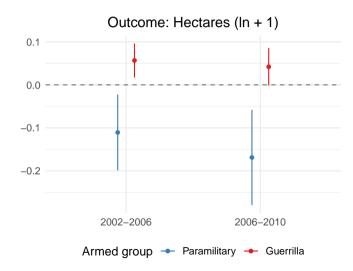
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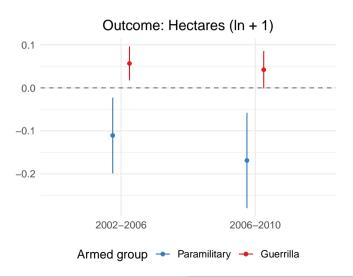
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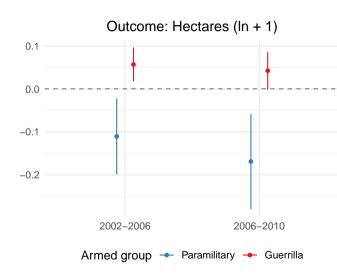
Test differential growth or reduction in eradication to areas of armed group influence







- For a given municipality, a 1 std. dev. increase in historical paramilitary violence is associated with a $\approx 5.82\%$ reduction in the average number of monthly hectares eradicated
 - About 500 hectares over a 4-year term

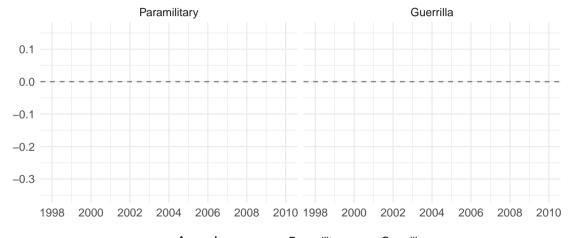


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 - About 500 hectares over a 4-year term
- Standardized effect is similar in magnitude but positive for guerrilla violence

(1 std. dev $\rightarrow \approx 7.03\%$ increase)

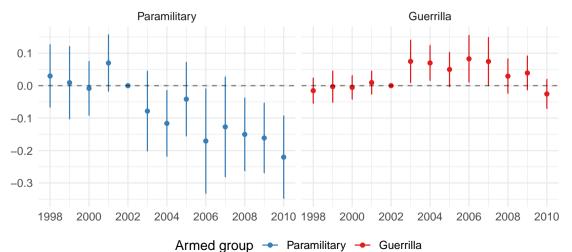
Year-by-year results Estimating equation

Outcome: Hectares (In + 1)



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Summary of main results

- Eradication patterns under Uribe reflect electoral motivations
 - Less eradication in areas with more historical paramilitary violence

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Next, test electoral influence more directly, focusing on Uribe's term (2002-2010)

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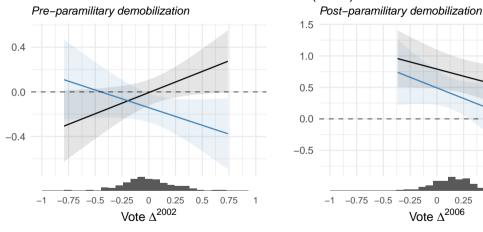
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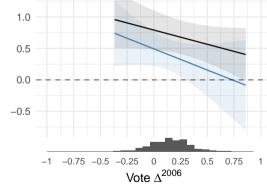
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- Measuring electoral overperformance
 - Define Δ_i^{2002} as Uribe 2002 vote share minus Pastrana 1998 vote share in municipality i
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 - Define Δ_i^{2006} as Uribe 2006 vote share minus Uribe 2002 vote share in municipality i
- Expect less eradication in paramilitary areas where Uribe overperformed only in 2002
 - Paramilitaries mostly demobilized under favorable conditions in 2005, supported by Uribe

Electoral overperformance Additional results

Outcome: Hectares (ln + 1)





Paramilitary attacks

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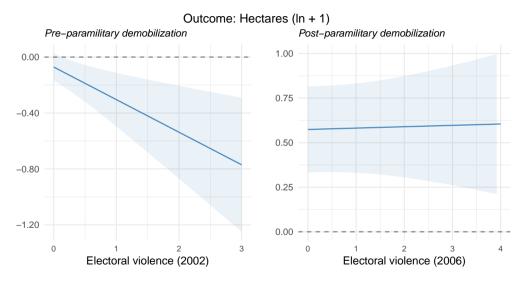
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 - Reports of threats to use armed violence against voters to support a particular candidate
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- Expect less eradication in areas with electoral violence in 2002 but not 2006
 - Significant paramilitary electoral violence in 2002, less so in 2006 (Nieto-Matiz, 2019)

Electoral violence



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Political incentives drive supply-side approaches to drug enforcement

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Thanks!

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Fixed factors leave much explained variation in eradication

National coca eradication and cultivation

Drugs, crime, and security at the forefront of public opinion

Geographies of cultivation and eradication

Geographies of violence

Event study estimating equation

Formal test of parallel trends

Controlling for baseline coca cultivation

Controlling for lagged coca cultivation each year

Proportion of yearly hectares aerially eradicated

Binary measure of violence data

Full set of main results

Full set of event study results

In + 1 transformed violence data

Pre-baseline violence data (1988-1997)

Using all municipalities

Cross-sectional results

Electoral overperformance table

Electoral violence table

Cultivation model

Coca hectares full image

Public opinion figure

Sample maj

Violence map

Estimating equation

July 2001 placebo July 2000 placebo

Baseline cultivation contro

Lagged cultivation contro

Eradication proportion

Binary treatment

All main results

All event study resu

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Cross-sectional results

Additional overperformance results

Additional violence results

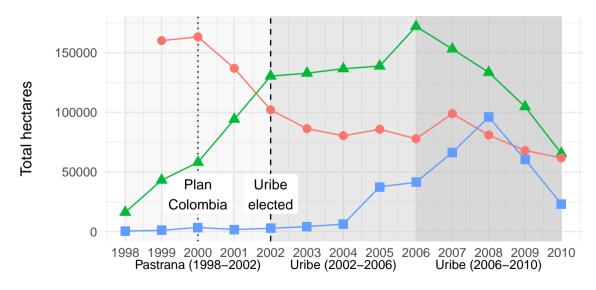
Geographies of production Back to appendix contents

Table: The relationship between coca cultivation and aerial coca eradication.

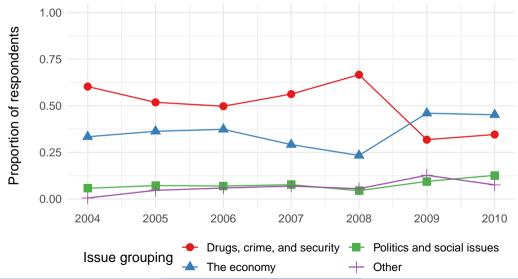
	Hectares (1)	Hectares (ln + 1) (2)	Hectares (> 0) (3)
Coca cultivation	0.042*** (0.008)		
Coca cultivation (ln $+$ 1)		0.065*** (0.009)	
Coca cultivation (>0)		` ,	0.014*** (0.002)
\mathbb{R}^2	0.15	0.25	0.23
Observations	142,494	142,494	142,494
Municipalities	1,122	1,122	1,122

Notes: All specifications are estimated using OLS and include municipality and year \times month fixed effects. Robust standard errors clustered by municipality are in parentheses. * p < 0.1, *** p < 0.05, *** p < 0.01.

Coca eradication and cultivation (Back to context) (Back to appendix contents

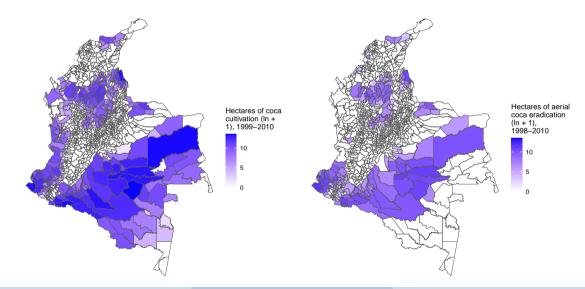


Public opinion figure Back to context Back to appendix contents

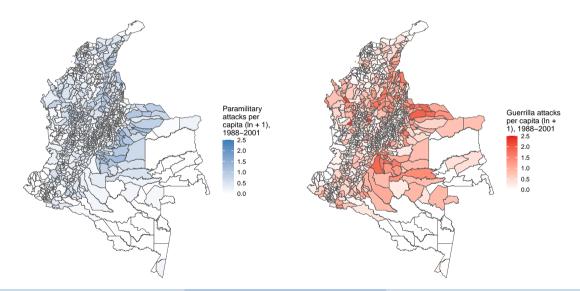


Geographies of cultivation and fumigation Back to data Back to appendix contents





Geographies of violence Back to data Back to appendix contents



$$Eradication_{i,t} = \sum_{j \neq 2002} \beta_j P_i \times \mathbb{1}[y = j] + \sum_{j \neq 2002} \zeta_j G_i \times \mathbb{1}[y = j] + \gamma_i + \delta_t + \epsilon_{i,t}$$
 (2)

- Eradication; t: measure of eradication in municipality i in year-month t
- P_i: time-invariant measure of paramilitary attacks
- G_i: time-invariant measure of guerrilla attacks
- $\mathbb{1}[y=i]$: year indicators
- γ_i : municipality fixed effects
- δ_t : year × month fixed effects

Parallel trends: July 2001 placebo Back to results summary Back to appendix contents

Table: Formal test for parallel trends (Plan Colombia placebo), continuous treatment.

	Hectares (1)	Hectares $(\ln +1)$ (2)	Hectares (> 0) (3)
Paramilitary attacks × 2001-2002	-7.338	-0.009	0.001
	(6.095)	(0.036)	(0.007)
Guerrilla attacks $ imes$ 2001-2002	3.021	0.007	0.000
	(2.572)	(0.014)	(0.003)
R ²	0.10	0.28	0.29
Observations	15,264	15,264	15,264
Municipalities	318	318	318

Notes: All specifications are estimated using OLS and include municipality and year × month fixed effects. Robust standard errors clustered by municipality are in parentheses. * p < 0.1, ** p < 0.05, *** p < 0.01.

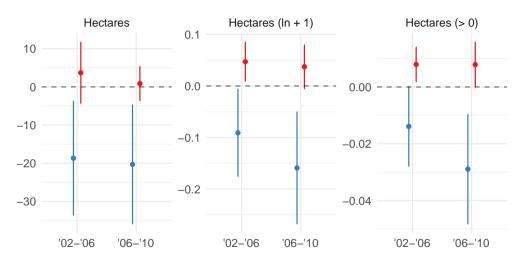
Parallel trends: July 2000 placebo (Back to results summary) (Back to appendix contents)

Table: Formal test for parallel trends (July 2000 placebo), continuous treatment.

	Hectares (1)	Hectares $(ln +1)$ (2)	Hectares (> 0) (3)
Paramilitary attacks × 2000-2002	-4.924	0.017	0.004
	(7.335)	(0.039)	(0.007)
Guerrilla attacks $ imes$ 2000-2002	6.046*	0.013	0.001
	(3.602)	(0.017)	(0.003)
R ²	0.10	0.28	0.29
Observations	15,264	15,264	15,264
Municipalities	318	318	318

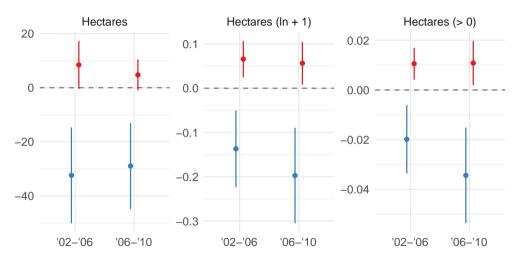
Notes: All specifications are estimated using OLS and include municipality and year × month fixed effects. Robust standard errors clustered by municipality are in parentheses. * p < 0.1, ** p < 0.05, *** p < 0.01.

Controlling for baseline coca cultivation Back to results summary Back to appendix contents

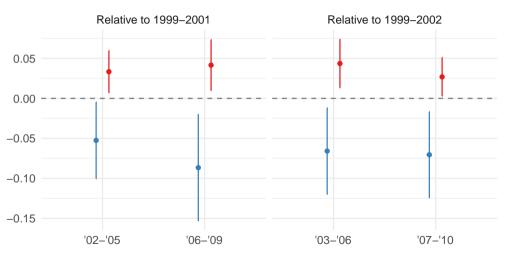


Controlling for lagged coca cultivation Back to results summary

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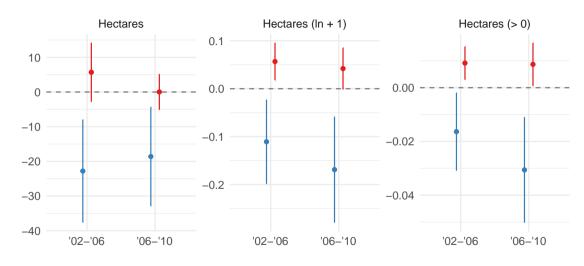
Proportion of yearly hectares eradicated Back to results summary Back to appendix contents



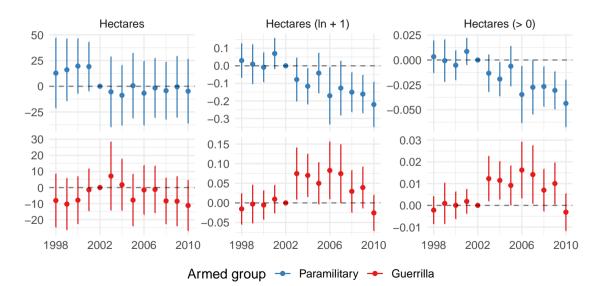




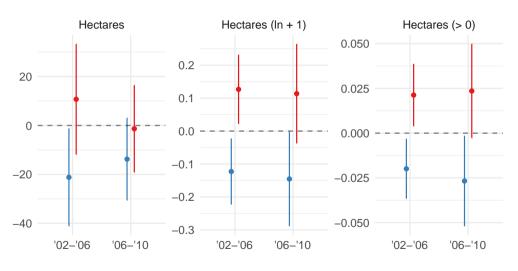
Full set of main results (Back to results summary) (Back to appendix contents



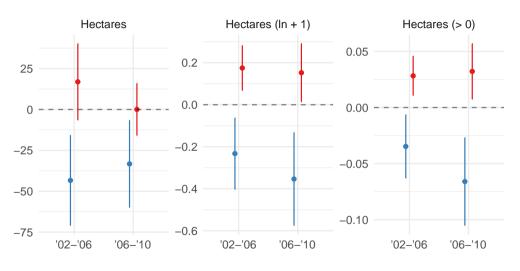
Full set of event study results (Back to results summary) (Back to appendix contents)



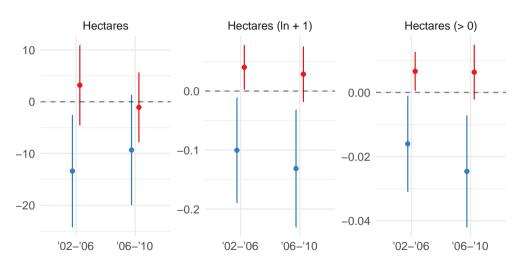
Binary measure of violence data Back to appendix contents



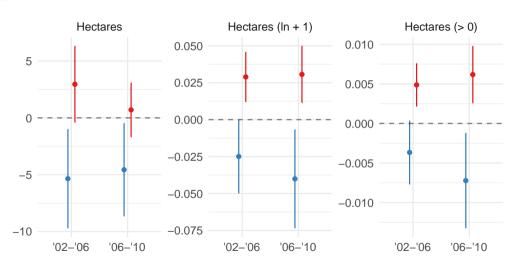
In + 1 transformed violence data Back to appendix contents



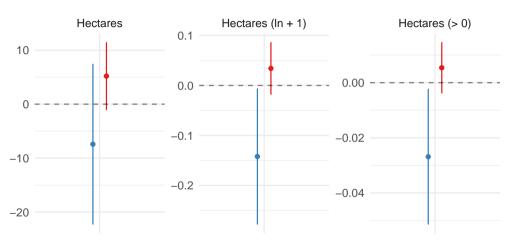
Pre-baseline violence data (1988-1997) Back to appendix contents



Using all municipalities Back to appendix contents



Cross-sectional results Back to appendix contents



Electoral overperformance (Back to results) (Back to appendix contents)

	Hectares (1)	Hectares $(\ln +1)$ (2)	Hectares (> 0) (3)
Panel A: Aerial eradication (2002-2006)			
$\Delta^{2002} imes$ Paramilitary attacks	-100.954*	-0.419*	-0.066*
-	(58.624)	(0.233)	(0.036)
R ²	0.04	0.10	0.09
Observations	13,680	13,680	13,680
Municipalities	285	285	285
Panel B: Aerial eradication (2006-2010)			
$\Delta^{2006} imes$ Paramilitary attacks	-3.182	-0.133	-0.022
	(38.673)	(0.446)	(0.082)
R ²	0.05	0.10	0.10
Observations	13,824	13,824	13,824
Municipalities	288	288	288

Notes: All specifications are estimated using OLS and include department and year \times month fixed effects. Predictors are based on Ch et al. (2018) data for paramilitary and guerrilla attacks from 1988-2001 from Restrepo, Spagat and Vargas (2003) and updated by the Universidad del Rosario. Robust standard errors clustered by municipality are in parentheses. * p < 0.1, ** p < 0.05, *** p < 0.01.

	Hectares (1)	Hectares $(\ln +1)$ (2)	Hectares (> 0) (3)		
Panel A: Aerial eradicat	Panel A: Aerial eradication (2002-2006)				
Electoral violence (2002)	-42.064	-0.235**	-0.037***		
	(30.472)	(0.092)	(0.014)		
R^2	0.04	0.11	0.10		
Panel B: Aerial eradicat	Panel B: Aerial eradication (2006-2010)				
Electoral violence (2006)	-5.210	0.008	0.007		
	(4.591)	(0.050)	(0.010)		
R^2	0.05	0.10	0.10		
Observations	14,208	14,208	14,208		
Municipalities	296	296	296		

Notes: All specifications are estimated using OLS and include department and year \times month fixed effects. Predictors are based on Ch et al. (2018) data for paramilitary and guerrilla attacks from 1988-2001 from Restrepo, Spagat and Vargas (2003) and updated by the Universidad del Rosario. Robust standard errors clustered by municipality are in parentheses. * p < 0.1, ** p < 0.05, *** p < 0.01.