Economic Determinants of the Maoist Conflict in India

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India's Maoist movement is often thought to be rooted in economic deprivation. A review of the emerging literature and descriptive evidence from a district-level data set on Maoist conflict indicates that the relationship between underdevelopment and Maoist activity cannot be explained in simple economic terms. At the state level, Maoist conflict-affected states have similar growth trends and do not score lower on development measures. In a cross section of districts, the most robust predictor of Maoist activity is forest cover, which could reflect the importance of strategic terrain factors as well as the relevance of forest rights and forest produce.

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The continued violence highlights the challenge of balancing development and security-driven responses to the centre of the public debate. It is widely accepted that the Maoist-affected regions are trapped within a vicious circle in which economic hardship and conflict reinforce each other (Planning Commission 2008). Development programmes undertaken by the centre and the affected states hold the promise of breaking this circle. But a number of key questions can be raised: are economic factors among the root causes of the Naxalite movement? Does Naxalite activity weigh on the economic performance of the affected states? Which development outcomes and economic sectors should be targeted? What is the economic logic of violence that development efforts need to take into account?

This article presents a snapshot of how economic factors interact with the Maoist movement at the state and district levels. These findings are somewhat at odds with recent studies that show the relevance of rural incomes and mining revenues for changes in the intensity of Maoist conflict. We note that Naxalite activity does not correlate robustly with certain key measures of socio-economic underdevelopment, with the exception of forest cover. We use this observation as a starting point for an in-depth discussion of the existing economic literature on the Maoist movement.

As detailed data on the Maoist conflict have gradually become available, an emerging empirical literature has attempted to shed light on the questions around the conflict. In the last five years, economists and quantitative political scientists have written many articles and working papers on the Maoist conflict. Research on this topic is an ongoing effort, but important conclusions can be drawn. First, Naxalite activity does not correlate robustly with certain key measures of socio-economic underdevelopment such as literacy. Second, patterns of Naxalite violence suggest a strong vulnerability of the affected population to shocks in agricultural and forest output. Third, Naxalite activity is closely related to the tendu leaf trade and mining activity. Fourth, development programmes hold promises and dangers in Maoistaffected areas.

The findings of the existing literature may appear to be at odds with the correlations that give no clear role to measures of underdevelopment. We argue that the level of analysis is important for understanding the role of economic determinants. In particular, within-district inequalities could account for patterns that are consistent with severe underdevelopment in Maoist-affected pockets even if there are few signs of underdevelopment at the district level.

There is a limitation of this article and the literature it relies on. Most of the empirical studies on India's Maoist movement use statistics that are directly or indirectly provided by the government. As a result, this body of research cannot investigate police brutality against civilians explicitly, in spite of the descriptive work that confirms its importance (for example, see Human Rights Watch 2012). The relative lack of attention to this side of the conflict from the economic literature should not be interpreted as an implicit statement about its importance. To the contrary, it is an area in which other disciplines can complement the work of economists.

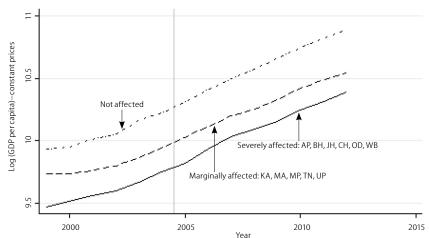
The structure of the article is as follows. First, we show how Maoist-affected states fare, relative to non-affected states in terms of aggregate development outcomes. We then move to the district level to investigate the role of socioeconomic and environmental characteristics in more detail. Then, we use this descriptive analysis as a starting point for a review of recent work in economics and political science. Finally, we will discuss priorities for future research on this topic and summarise the lessons learned for policymakers.

Data Description

To review the dimensions of the Naxalite movement that have been studied in the literature, we summarise what can be learned from glancing at what sets Naxalite districts apart. We first identify the Naxalite-affected districts based on the incident records of the South Asia Terrorism Portal (SATP).² The SATP collects newspaper reports from local and national English-speaking press and paraphrases these into daily records. These records describe the district in which the incident took place and the number of deaths on each side of the conflict (whether civilians, Maoists or security forces). One concern common to all work on civil conflict is that there may be reporting bias. We will rely mainly on the discrete measures of whether a region suffered any fatalities in the conflict between 2005 and 2010; this should limit the sensitivity of findings to misreporting.

We illustrate the role of a limited set of variables, each of which summarises a key dimension of the economic environment. From the 2001 Census data, we use information on population density, the size of the tribal and the Scheduled Caste (sc) population, and the literacy. Data on mineral output were obtained from the Ministry of Labour and Employment (for output of coal in 2001) and the Ministry of Mines (bauxite and iron ore, 2000-01), and concern three key minerals: iron, bauxite, and coal. We use a dummy variable for the presence of these minerals rather than actual production figures to allay concerns that Maoist activity may depress mineral





Based on state gross domestic product figures from the Planning Commission, for constant 1999 prices, normalised by the 2001 population.

output. Furthermore, we collect forest cover information and area data from the Ministry of Environment and Forests.³ Our set of variables is deliberately limited, and proxy for the broad economic dimensions studied by the indepth work that we discuss next.

State-level Results

While the Maoist movement is active in a contiguous set of states, the extent to which the states are affected varies starkly. While Maoist violence has affected almost all districts of Chhattisgarh and Jharkhand and has claimed a large number of lives even in proportion to the total state population, other states like Tamil Nadu, Madhya Pradesh, and Uttar Pradesh have seen a small number of incidents in a limited number of districts.

The state is the lowest administrative level at which the (erstwhile) Planning Commission reports gross domestic product (GDP) figures.⁴ This makes it the natural unit of analysis for assessing the relationship between the Maoist movement and economic growth. In Figure 1, we compare growth trends between affected and non-affected states. While the states that are most severely affected by Maoist activity are clearly poorer, the growth patterns are remarkably similar. At the state level, there is no evidence that the Maoist-affected regions have been "left out" of India's growth experience.

Still, to make any progress in understanding any causal connection between the Naxalite movement and economic conditions in the relevant regions, one must define a counterfactual for the growth path of Naxalite-affected states. To construct an alternative counterfactual, we can compare the growth of Naxaliteaffected states before and after the 2004 merger of the main far left parties (the Maoist Communist Centre and the People's War Group) to form the Communist Party of India (Maoist) [CPI (Maoist)]. The timing is indicated by a vertical line in Figure 1. The similarity of the growth paths before 2004 adds credibility to the interpretation that changes in the relative growth of Naxaliteaffected states after 2004 could be due to the establishment of the CPI (Maoist). However, in spite of the intensification of

Table 1: Affected States

	Total	Total	Affected	Total	Author's
	Deaths	Deaths per	Districts	District	s Classi-
	(2005-	1,00,000	(at least		fication
	10)	(2005-	one		
		10)	death)		
	(1)	(2)	(3)	(4)	(5)
Andhra Pradesh	625	0.82	20	23	Severe
Bihar	424	0.51	23	37	Severe
Chhattisgarh	1679	8.06	12	16	Severe
Jharkhand	840	3.12	16	18	Severe
Karnataka	29	0.05	5	27	Marginal
Madhya Pradesh	ı 1	< 0.01	1	45	Marginal
Maharashtra	256	0.26	3	35	Marginal
Odisha	383	1.04	17	30	Severe
Tamil Nadu	1	< 0.01	1	29	Marginal
UP	13	<0.01	4	70	Marginal
West Bengal	683	0.85	11	18	Severe

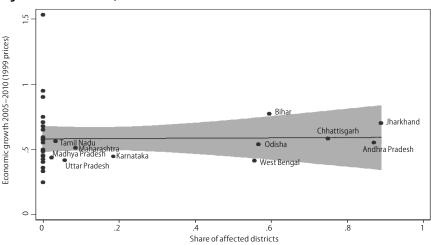
Based on SATP timelines as described in the text. The classification in column (5) is based on the share of casualties in the population, using a threshold of 0.51 per 1,00,000 (the median for the affected states). the conflict (Kujur 2008), the growth patterns of the affected states do not seem to have suffered relative to those of other states.

In a recent contribution, Nilakantan and Singhal (2016) explicitly formulate an alternative growth counterfactual. They use Andhra Pradesh's police efforts to develop such a counterfactual. Relying on a synthetic control approach, in which they compare Andhra Pradesh to a control state that is constructed on the basis of observable characteristics, these authors argue that Andhra Pradesh's specialised anti-Naxalite force (the Greyhounds) contributed to higher economic growth in the state. Using this approach, the authors estimate that the economic cost of the Maoist movement is close to 12% of the state GDP. Sill, more research is needed to assess the magnitude of this cost beyond Andhra Pradesh.

In general, any estimate of the causal effect of Maoist activity on state-level economic growth will rely on particular assumptions about counterfactual growth patterns and will be restricted by the small number of affected states.

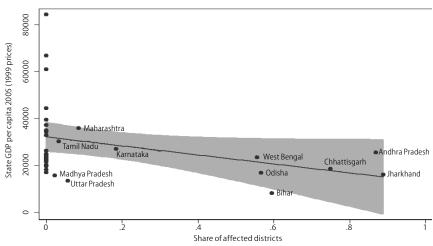
Returning to our current descriptive analysis, the absence of a distinct growth pattern is confirmed in Figure 2. There is evidence of slightly higher growth in states with a higher number of Maoistaffected districts, but the pattern is not very pronounced. Figure 3 confirms that affected states are characterised by lower levels of GDP per capita at the start of our period of analysis (2005), but the patterns are again not clearly marked. In Figure 4, we show the correlation between the share of Maoist-affected districts and the index of state-level underdevelopment from the Raghuram Rajan Committee Report (GoI 2013). In line with the relationship for the state GDP, a higher share of Maoist-affected districts is associated with higher scores on the underdevelopment measure, but the wide confidence intervals do not permit strong statements.5

An inspection of individual states facilitates the interpretation of these results. A small number of urban areas (such as Goa and Delhi) clearly outperform all other states and union territories, but the plotted regression lines give less Figure 2: Economic Growth, 2005–10

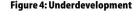


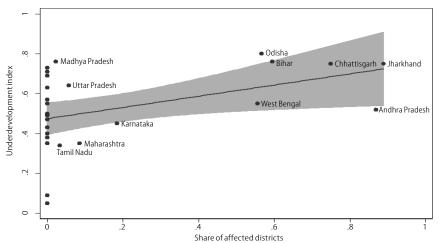
Based on state gross domestic product figures from the Planning Commission, for constant 1999 prices and normalised by the 2001 population. The linear fit includes weights for the state population, and shows 95% confidence intervals as a shaded area.





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weight to these observations due to their relatively low population numbers. Importantly, there is a set of three large states—Madhya Pradesh, Rajasthan and Uttar Pradesh—that are almost not affected by the Maoist conflict but look similar to the affected states in terms of development outcomes. These states offer a powerful counterargument to the view that underdevelopment is deterministically linked to violent conflict.

In general, an analysis of state-level economic indicators appears to offer little insights into the concentration of the Maoist movement or conclusive evidence on its impacts. Hence, to understand the Maoist movement, it is important to consider both within state inequalities and a richer set of characteristics. We will do this in the next section, where we conduct an analysis at the district level.

District-level Analysis

Tables 2, 3 and 4 offer a statistical introduction to the Naxalite-related violence at the district level. Table 2

Table 2: Characteristics of Naxalite Districts

At Least No p-value No p-value					
		Casualties			
	(2005-	(Affected	(1) (2)	(India)	5 (1) (5)
	2010)	States)		(
	(1)	(2)		(3)	
Literacy (share) 0.57	0.63	0.00	0.66	0.00
	(0.12)	(0.12)		(0.12)	
Scheduled					
Tribe					
population	0.17	0.08	0.00	0.16	0.50
(share)	(0.20)	(0.13)		(0.27)	
Scheduled	0.16	0.17	0.07	0.14	0.10
Caste	(0.07)	(0.07)		(0.09)	
population					
(share)					
Mining dumm	y 0.33	0.11	0.00	0.08	0.00
(iron, bauxite,	(0.32)	(0.29)		(0.27)	
coal)					
Forest	0.24	0.13	0.00	0.23	0.49
cover					
(share)#	(0.19)	(0.10)		(0.26)	
Population	0.46	0.90	0.02	0.98	0.00
density	(0.38)	(2.91)		(3.74)	
(1000 pop/km	²)				
Electricity	0.35	0.53	0.00	0.59	0.00
use by	(0.25)	(0.27)		(0.26)	
household					
(share)					
Paved road	0.46	0.61	0.00	0.63	0.00
to village	(0.23)	(0.23)		(0.26)	
(share)#					
Number of	110	235		478	
observations					

*The number of observations for this comparison is 233 in (2) and 469 in (3); for # 231 in (2) and 470 in (3). presents summary statistics for each variable, and it compares averages in Naxalite districts and in non-Naxalite districts, both limited to the Naxaliteaffected states only and for India as a whole. Table 3 presents regression results, both comparing across Naxalite-affected states (column 1) and controlling for state-fixed effects (column 2). Table 4 repeats the analysis for the intensity of the conflict, measured as the logarithm of the number of deaths per 1,00,000 population, within the subset of affected districts with at least one death.

Table 2 confirms that Maoist-affected districts suffer from underdevelopment. They are significantly less literate, have less access to electricity, and lower road connectivity. They are also more forested, less densely populated, and have a higher share of the Scheduled Tribe (sT) population.

However, these patterns become much less stark in a multivariate regression approach. Once we control for the complete set of variables (in column 1), only literacy appears to explain the intensity of Maoist violence, and only electricity access the incidence of Maoist activity. Even in these regressions, an important concern remains the fact that we are comparing districts both within and between states. Hence, if states with higher Maoist activity have different

Table 3: Characteristics of Naxalite-affected Districts (Regression)

<u> </u>	Maoist-a	fected
	(Within Affected States)	
	(1)	(2)
Literacy	-0.44	4.64
	(1.55)	(4.09)
Share of Scheduled Tribes	0.22	4.85*
	(1.01)	(2.56)
Share of Scheduled Castes	-1.69	1.88
	(2.17)	(4.05)
Population density (1000 pop/km ²) 0.37	-0.27
	(0.40)	(0.76)
Mineral dummy	1.30***	0.91
	(0.39)	(0.63)
Share of forest area	4.06***	4.60***
	(1.11)	(1.74)
Share of households	-3.00***	-0.00
with electricity	(1.11)	(2.60)
Percentage of villages	-0.06	-1.55
with paved road	(0.78)	(1.66)
State FE	No	Yes
Observations	339	339

Conditional logit regression. Standard errors are robust to state-level clustering in column (2). *** p<0.01, ** p<0.05, * p<0.1.

profiles in terms of the variables we study, we could misinterpret the role of these characteristics. Therefore, we include state-fixed effects in column 2 of Tables 3 and 4, so that we only explore the variation in Maoist activity within each of the affected states.

Under this approach, it is even harder to identify correlates of Maoist activity. Across specifications, the only robust correlate of Naxalite presence is forest cover. This descriptive analysis confirms that Naxalite districts are distinctive in terms of socio-economic characteristics, but not always in the dimensions that one would expect. If we ask the question "how different are the Maoist-affected districts?" the answer depends crucially on the comparison group, and whether we are interested in the separate impact of a given characteristic or an unconditional correlation.

In the next section, we will discuss how the emerging literature has explored the mechanisms underlying these correlations.

Human Development and Social Status

Our empirical exercise is close to Borooah (2008), who highlights that Naxalite districts have poor educational outcomes when compared to all Indian districts, and Hoeschler et al (2012), who argue that the interaction between mining resources and sc/sts is a powerful

Table 4: Intensity of Maoist Violence (Regression)

_	Log (Deaths/Population)		
	(1)	(2)	
Literacy rate	-5.50***	-4.28**	
	(1.80)	(2.08)	
Share of scheduled tribe	-0.65	0.86	
	(1.09)	(1.45)	
Share of scheduled caste	-4.12	-2.45	
	(2.35)	(3.23)	
Population density (1000 pop/km ²	?) -1.03**	-1.28*	
	(0.41)	(0.74)	
Mineral dummy	0.34	0.17	
	(0.32)	(0.36)	
Share of forest area	2.25**	3.20***	
	(1.01)	(1.11)	
Percentage of households	0.002	0.01	
with electricity	(0.010)	(0.01)	
Percentage of villages	-1.50	-1.45	
with paved road	(0.98)	(1.15)	
State FE	No	Yes	
Observations	109	109	
Ordinary least square regression He	toroskodasti	city robust	

Ordinary least square regression. Heteroskedasticity robust standard errors in parentheses. *** p<0.01, ** p<0.05, * p<0.1

predictor of Maoist activity within a subset of affected states. However, these authors do not compare between- and within-state analyses. Poor literacy does not seem associated with increased Naxalite activity once all differences between districts at state level are accounted for (Table 2, column 2), while the coefficient on mining activity loses its significance once we compare districts within the same state.

Hence, our examination calls for careful consideration of the level of analysis and choice of sample. While it is clear that Naxalite districts are less literate than the average district, this is true for the Naxalite-affected states as well. However, within those states, districts with better literacy outcomes appear to be no less likely to escape Naxalite violence.

One way to read this finding is that certain district-level characteristics such as literacy do not really capture the different conditions in communities that are directly affected by Naxalism. It is common knowledge that Naxalism is strongest among sT communities, and several authors have presented results that point in this direction (Borooah 2008; Planning Commission 2008; Mukherjee 2016; and Gomes 2015). However, the evidence is not entirely clear-cut. A higher sT share does not appear to predict Naxalite activity within the broader Naxalism-affected region. once other controls are accounted for. Yet, within each of the affected states, the share of STS is significantly related to Naxalite violence. Historians have indeed observed the deliberate effort to radicalise disadvantaged tribal communities by exploiting their economic hardship and grievances against the government (Kujur 2008). The fact that the ST share is not significant across the contiguous region of 10 states, strongly suggests that other factors could determine where the Maoist movement became strong in the first place.

The deepest roots of the Maoist movement could in fact be a set of specific colonial institutions. Banerjee and Iyer (2008) point out that the Red Corridor tended to have revenue collection through zamindars during British colonial rule. While these authors do not explore this link directly, they show that landlord-based tenure had persistent negative impacts on investment in agriculture and public goods. A recent paper by Mukherjee (2016) tests this hypothesis explicitly, and concludes that both princely states and (to a lesser extent) zamindari land tenure (the two most important forms of indirect colonial rule) are still associated with increased Naxalite activity. However, the legacies of princely states are the subject of academic debate. Teitelbaum and Verghese (2014) agree with Mukherjee (2016) on the role of the zamindari system, but unlike the latter author, they argue that direct colonial rule (as opposed to princely states) planted the seeds of the present-day Maoist conflict.⁶ Regardless of the nature of these colonial legacies, both papers suggest that its impacts are not limited to social and economic underdevelopment.

While the historical causes of the Maoist movement could be deep-rooted, recent work suggests a role for policies that reinforce political institutions. In Jharkhand, Pasquale (2014) finds that reservation for sTs in the gram panchayats did contribute to a reduction in reported Maoist violence at the village level. However, decentralising the government may not help to reduce conflict in general. Nandwani (2015) finds that the Panchayats Extension to the Scheduled Areas Act, 1996 increased conflict in tribal ("Schedule 5") districts. The author argues that impartial implementation of this act led to elite capture of economic rents and spurred conflict through this channel.

We conclude this section by noting the lack of robust effects of each single measure of social underdevelopment at the district level in our data, although there is a broad relationship between underdevelopment and Maoist activity when we focus on the unconditional correlations (as in Table 1, p 70). One way to read these results is that districtlevel indicators fail to tell an accurate story about the reality of the relatively small, affected communities. The lack of robust relationships indicates that development programmes aimed at reducing Naxalite violence could be mistargeted if they focus at entire districts or states or if they use statistics at this level as the only measure of the Maoist threat.

Forest Resources and Agriculture

A clearly distinctive characteristic of Naxalite districts appears to be their high forest cover. This relationship could reflect the tactical advantages for the rebels of operating from inhospitable areas, as highlighted by Fearon and Laitin (2003) based on a large set of countries. However, in the context of the Naxalite movement, recent work by Raian et al (2013) emphasises another dimension of forest cover. These authors find that tendu leaf production is associated with increased Navalite violence. The tendu leaf trade could provide a source of income for Maoists and could also generate disputes between the tribal population and the forest department.

Moreover, the tribal population in India's Naxalite belt relies heavily on forest resources and on subsistence agriculture (through slash and burn agriculture). This dependence could generate a strong link between forest cover and Naxalite activity through two channels. Forest department policies that limit access of the tribal population to forests may have generated grievances and economic hardship that has generated support for the Maoist movement.

Subsistence agriculture, in and outside of the region's forests, may in itself provide a fertile recruitment ground for the Naxalites. Vanden Eynde (forthcoming) and Gawende et al (2017) both find that violence outcomes respond to rainfall shocks through proxies of forest resource output or agricultural production, in confirmation of this mechanism. The sensitivity of violence to rainfall shocks points at severe underinvestment in agriculture. As mentioned earlier, this underinvestment could have deep colonial roots. While certain development programmes (including the Mahatma Gandhi National Rural Employment Guarantee Scheme or MGNREGS) should make the income of the communities in the Maoist-affected areas less dependent on agricultural or forest resource shocks (Banerjee and Saha 2010), the consistent implementation of these programmes is

hard to guarantee in the affected zones. It appears that there is scope for smallscale agricultural extension efforts that address the vulnerability of agricultural techniques more directly.

The importance of climate shocks for the intensity of violence points indirectly at severe economic deprivation in Maoistaffected areas. This observation could appear in contradiction with the district and state level evidence presented in this article. However, these findings can easily be reconciled because the Maoist movement tends to be concentrated in particular geographical pockets within each district (and in particular districts within each state). In this context, the level of analysis is important, and it is clear that future work would greatly benefit from efforts to measure events related to the Maoist movement at a level below the district.

Mineral Resources

A predictor of Naxalite activity that stands out in our empirical analysis is mining activity. It is strongly correlated with Maoist activity, although the variable loses its significance (but not its magnitude) in column (2) of Table 2. Mining activity could affect Naxalite violence through a set of channels: (i) the increased financing opportunities for the Maoist movement; (ii) grievances stemming from displacement as a result of mining activity; (iii) and higher stakes for conflict over mining zones.

The capacity of mineral resource shocks to fuel violence directly has been studied in a variety of contexts (for across countries see, Michaels and Lei 2014; for Colombia, see, Dube and Vargas 2013). Nevertheless, the robustness of the correlation between mining activity and violence has recently been challenged by Rajan et al (2013). These authors compare the Naxalite-affected districts to all other Indian districts (a much larger and more diverse comparison group than the one in our empirical exercise), and conclude that the production of tendu leaves is a stronger predictor of Maoist violence than the production of mineral resources. Of course, the relationship between mining activity and conflict is not a deterministic one: among the

heavily affected districts we can easily give examples of districts with important mining activity (for example, Dantewada) and districts with a small mining sector (for example, Gaya, West Midnapore).

Analysts and policymakers alike have pointed to the mining sector as an important source of income for the Naxalites (Srivastava 2009; Singh and Diwan 2010). By threatening to disrupt mining activities, the Maoists are thought to attract contributions from the mining sector. It is worth pointing out that, even if mineral resources do not cause the conflict or affect the intensity of violence directly, they could still have an important impact on the dynamics of violence through an indirect mechanism. As an example of such an indirect influence, Vanden Eynde (forthcoming) finds that poor rainfall is associated with increased violence against security forces, but only in those districts that are sufficiently rich in mineral resources. This finding reflects that access to income collected from local mining activity could make it easier for the Maoist groups to mobilise support in response to local agricultural shocks.

While the mining sector could offer financial benefits to the Naxalite movement, the sector is also responsible for the displacement of civilian population and soil degradation (Planning Commission 2008). Kennedy and King (2009) criticise the displacement mechanism and point towards the limited number of people affected by these displacements, although displacement and environmental degradation are hard to measure in this context. In theory, the grievances generated by the mining sector could represent a windfall to the Maoist movement that is similar to direct financial benefits-the anger at mining activity could clearly mobilise communities against the state. The Maoist movement benefits from this environment, and is much involved in the organisation of protests against the mining sector (Kujur 2008).

In a theoretical paper that is inspired by India's Maoist conflict, Munshi (2017) characterises an equilibrium in which a "nexus" between the government and industry actors sparks resistance from indigenous groups. Finally, mineral resource wealth could raise the stakes of the conflict from the perspective of government actors. Azam and Bhatia (2017) argue that state governments use their anti-Naxalite efforts to provoke violence and attract support from central forces. According to these authors, central support could facilitate the clearance of tribal lands for mining activity. Their empirical analysis reveals a positive relationship between the intensity of the conflict and mineral deposits.7 Vanden Eynde (2015) further confirms the hypothesis that mining resources shape the way in which the state intervenes in the conflict. After the introduction of a 10% ad valorem tax on iron ore in 2009. the author observes a sharp increase in police operations in districts containing iron ore deposits, but not in other (mining or non-mining) districts.

While the relationship between mining activity and Naxalite violence is complex, there is little doubt over the importance of the sector in shaping the strategies of the actors in the conflict. For that reason, it is striking that progress on the sharing of mining profits has been limited. Profit sharing schemes that benefit the local community could make it harder for the Maoists to use mining activity to its benefit. In fact, one can question whether the state's development efforts and security operations will be successful as long as Maoist-related violence can be fuelled directly and indirectly by mineral resources.

Bringing Development to Affected Communities

Observers of the Naxalite movement have long emphasised the plight of the civilian population, which is literally caught "between two sets of guns" (Human Rights Watch 2012). Civilian victims (inflicted by the Maoists) account for more than one-third of all recorded fatalities related to Maoist groups (SATP 2017), and there are no systematic data on civilian casualties inflicted by the security forces.

As Maoist fighters need to be able to strike and hide, civilian cooperation is indispensable for either party to achieve its goals. Arguably, the civilian population is the most important asset in the conflict between state actors and Maoists. Patterns of Maoist violence underline this interpretation. Vanden Eynde (forthcoming) finds that killings of suspected police informers could respond to local economic shocks, and argues that this pattern could reflect strategic victimisation.

The scale of violence against the civilian population has profound implications: any development intervention that disturbs the equilibrium between the parties holds the risk of backfiring against local communities. This possibility has been underlined by recent work on the Philippines, where eligibility for a development fund led to an intensification of violence (Crost et al 2014). A number of recent papers take these predictions to India's Naxalite movement. First, Khanna and Zimmerman (2017) report similar findings to those in the Philippines. They argue that the introduction of MGNREGA has actually boosted Naxalite violence. These authors compare violence outcomes in districts that are on the margin of being selected or not in the different phases of MGNREGA. The mechanism through which MGNREGA could intensify the conflict is through the increased polarisation of the civilian population between the government and the Maoist supporters. Based on villagelevel evidence, Pasquale (2014) offers an alternative interpretation: poor implementation of rural infrastructure programmes could upset the local population and make them more sympathetic to the Maoist movement. Finally, Srivastava (2014) finds that MGNREGA increases rural wages, and he argues that these higher wages boosted conflict because it lowered the risk aversion of potential rebels.

However, the argument that development programmes like MGNREGA increased Maoist violence goes against the findings of Fetzer (2014). He finds that MGNREGA has reduced violent conflict, and reduced its sensitivity to rainfall shocks in particular. The methodology adopted is a difference-in-difference approach, in which sets of districts in the different implementation phases of MGNREGA are compared before and after the introduction of the programme (as in Imbert and Papp 2015).⁸ The finding that MGNREGA reduces violence in the Maoist-affected districts is consistent with the work of Banerjee and Saha (2010). These authors report survey findings from Bastar which suggest that the Maoists do generally allow MGNREGA work to take place (although they consistently attempt to block road construction).

In a study along the same lines as Fetzer (2014), Dasgupta et al (2017) highlight that the positive effects of MGNREGA are more pronounced in wellperforming states. This heterogeneity in impacts can account for the contradictory findings on the impact of MGNREGA by different research teams: each methodology implicitly relies on a subsample to estimate the effect of the programme, and causal impacts in these subsample can be different. Moreover, no empirical strategy can rule out bias. More research is needed to understand these sources of heterogeneity better and reconcile the evidence on the conflict-mitigating impact of MGNREGA in particular, and development programmes in general.

It seems fair to conclude that much has yet to be learned about how development programmes affect violence in Maoist-affected districts. The wider economic literature has so far identified at least two contexts in which local development efforts were effective. Based on evidence from Iraq, Berman et al (2011) find that small-scale development projects that were implemented directly by the United States Army helped to reduce violence. It goes without saying that the war in Iraq is very different from Indian Maoism. Yet, if the recipe for successful development in conflict zones is one in which projects are small-scale, flexible, responsive to local needs, and implemented by or in close cooperation with local security forces, it is worth pointing out that some of the most ambitious development projects undertaken in rural India are large scale and offer limited flexibility.

One exception to this rule is the adopted Integrated Action Plan, under which smaller scale infrastructure programmes are carried out at the initiative of the district collector. Still, it is interesting to note that relevant programmes are typically implemented at the district level (for administrative reasons), even if, within district, inequalities could be relevant for the conflict environment. This could justify a greater role for panchayats, although several authors highlight the risk that the resources of local governments are captured by rebel groups (Dube and Vargas 2013; Nandwani 2015).

A second, recent contribution to the conflict literature in which a development programme helps to reduce violence is Crost et al (2016). Relying on a randomised control trial carried out by the World Bank, these authors find that a conditional cash transfer programme helped to reduce Maoist violence in the Philippines. Again, one should be careful in extrapolating these findings to the Indian context, but the article appears particularly relevant given the current debate on a "universal basic income." The authors argue that the cash transfer programme helped reduce violence in part because payments were made directly in the bank accounts of beneficiaries. This helped to limit corruption by officials and extortion by insurgents.

Conclusions

Economists and political scientists have used violence data to understand the drivers and dynamics of Maoist-related violence. Their work has confirmed some of the conventional wisdom, but also challenged some of it. In this article, we provide some fresh analysis as well as review the literature to take stock of where we stand.

First, we note that development indicators are less consistently correlated with Maoist activity than we might have expected. Second, recent work has linked the intensity of Maoist violence to rainfall shocks, highlighting the dependence of the affected communities on rain-fed subsistence agriculture and forest resources. Third, there is evidence that tendu leaves trade and mining activities both play an important role in the conflict. Mining activity could affect the strategic behaviour of Maoist groups. Finally, we emphasise that the civilian population is often caught in-between in this conflict. Recent studies point at dangers of introducing development programmes in conflict zones, but have also identified positive effects of MGNREGA

(in the context of the Naxalite movement) in particular.

We believe that these conclusions hold useful lessons for policymakers. The importance of forest cover and (to a lesser extent) the share of the sT population suggests that the Maoist movement is operating under rigid geographical constraints. These conditions could limit the resilience of Maoism in response to targeted development efforts. At the same time, much of the existing work on the conflict highlights the economic vulnerability of the affected areas and an economic logic to the violence. From this angle, the lack of consistent correlations for development indicators at the district level and the state level imply that the movement might find fertile economic conditions outside of its existing strongholds within the currently affected states. This factor could give the movement resilience, unless development efforts can change conditions in a wider set of districts.

The importance of economic factors in explaining changes in the intensity of the conflict might appear at odds with the lack of robust predictors of Maoistrelated violence in a cross section of districts. To make sense of these patterns, it is worth highlighting that the literature to date has almost exclusively worked with violence measures at the district level. Our analysis at the state and district levels, and between and within state comparisons, indicates that carefully considering the level of analysis is particularly important. One reason why our analysis at the district level fails to document the underdevelopment of Maoist-affected areas consistently, is that the relevant outcomes are best measured at a level below the district.

This observation has policy implications. For example, the key programme through which the centre assists states in their stated fight against left-wing extremism (the Integrated Action Plan) is allocated at the district level, whereas the programme could be targeted better if within-district variation was taken into account. There is indeed much scope for future work that offers more detailed assessments of how the conflict operates and the success of government interventions at a micro level.

NOTES

1 This paper will use the terms "Maoism" and "Naxalism" interchangeably.

- 3 "District-Wise Forest Cover," Ministry of Environment and Forests, 2005. For consistency of this measure, we merge Dhamtari and Raipur, as well as Hyderabad and Rangareddy.
- 4 GDP is normalised by population in 2001, but is not adjusted for population growth. Constant 1999 prices are used, and series were merged in 2006–07.
- 5 In a population weighted regression with heteroskedasticity robust standard errors, the coefficient on the share of affected districts fails to gain significance.
- 6 Differences in measurement and the empirical strategy used to identify this effect could account for these conflicting findings.
- 7 Deposits are not always associated with actual production of mineral resources, so this measure is distinct from the one applied in this article.
- 8 This identification strategy has the advantage of considering an exogenous increase in development activity. But it abstracts from an important strategic decision from the government's perspective: how to balance security and development approaches? Kumar and Chowdhury (2015) develop a theoretical framework that highlights how the initial dominance of the conflicting parties affects its response.

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² www.satp.org.