

A Service of



Leibniz-Informationszentrum Wirtschaft Leibniz Information Centre for Economics

Bonnier, Evelina; Poulsen, Jonas; Rogall, Thorsten; Stryjan, Miri

Working Paper Preparing for genocide: Community work in Rwanda

Working Paper, No. 2015:1

Provided in Cooperation with: Department of Economics, Uppsala University

Suggested Citation: Bonnier, Evelina; Poulsen, Jonas; Rogall, Thorsten; Stryjan, Miri (2015) : Preparing for genocide: Community work in Rwanda, Working Paper, No. 2015:1, Uppsala University, Department of Economics, Uppsala, https://nbn-resolving.de/urn:nbn:se:uu:diva-242293

This Version is available at: https://hdl.handle.net/10419/125541

Standard-Nutzungsbedingungen:

Die Dokumente auf EconStor dürfen zu eigenen wissenschaftlichen Zwecken und zum Privatgebrauch gespeichert und kopiert werden.

Sie dürfen die Dokumente nicht für öffentliche oder kommerzielle Zwecke vervielfältigen, öffentlich ausstellen, öffentlich zugänglich machen, vertreiben oder anderweitig nutzen.

Sofern die Verfasser die Dokumente unter Open-Content-Lizenzen (insbesondere CC-Lizenzen) zur Verfügung gestellt haben sollten, gelten abweichend von diesen Nutzungsbedingungen die in der dort genannten Lizenz gewährten Nutzungsrechte.

Terms of use:

Documents in EconStor may be saved and copied for your personal and scholarly purposes.

You are not to copy documents for public or commercial purposes, to exhibit the documents publicly, to make them publicly available on the internet, or to distribute or otherwise use the documents in public.

If the documents have been made available under an Open Content Licence (especially Creative Commons Licences), you may exercise further usage rights as specified in the indicated licence.



WWW.ECONSTOR.EU



Department of Economics Working Paper 2015:1

Preparing for Genocide: Community Work in Rwanda

Evelina Bonnier, Jonas Poulsen, Thorsten Rogall and Miri Stryjan Department of Economics Uppsala University P.O. Box 513 SE-751 20 Uppsala Sweden Fax: +46 18 471 14 78 Working paper 2015:1 January 2015 ISSN 1653-6975

PREPARING FOR GENOCIDE: COMMUNITY WORK IN RWANDA

Evelina Bonnier, Jonas Poulsen, Thorsten Rogall and Miri Stryjan

Papers in the Working Paper Series are published on internet in PDF formats. Download from http://www.nek.uu.se or from S-WoPEC http://swopec.hhs.se/uunewp/

Preparing for Genocide: Community Work in Rwanda*

Evelina Bonnier[†] Jonas Poulsen[‡] Thorsten Rogall[§] Miri Stryjan[¶]

January 2015

Abstract

How do political elites prepare the civilian population for participation in violent conflict? We empirically investigate this question using village-level data from the Rwandan Genocide in 1994. Every Saturday before 1994, Rwandan villagers had to meet to work on community infrastructure, a practice called *Umuganda*. This practice was highly politicized and, in the years before the genocide, regularly used for spreading political propaganda. To establish causality, we exploit cross-sectional variation in meeting intensity induced by exogenous weather fluctuations. We find that an additional rainy Saturday resulted in a five percent lower civilian participation rate in genocide violence. These results pass a number of indirect tests of the exclusion restriction as well as other robustness checks and placebo tests.

JEL classification: D74, N47 Keywords: Conflict, Rainfall

^{*}We thank Tom Cunningham, Jonas Hjort, Juanna Joensen, Magnus Johannesson, Erik Lindqvist, Eva Mörk, Suresh Naidu, Torsten Persson, Cristian Pop-Eleches, David Strömberg, Jakob Svensson, Erik Verhoogen and Miguel Urquiola, as well as seminar participants at SUDSWEc 2013, the Aswede Conference on Development Economics, the Stockholm School of Economics, and the Columbia Development Colloquium for many helpful comments.

[†]Stockholm School of Economics, evelina.bonnier@hhs.se

[‡]Uppsala University, jonas.poulsen@nek.uu.se

[§]Stockholm University, IIES, thorsten.rogall@iies.su.se

[¶]Stockholm University, IIES, miri.stryjan@iies.su.se

1 Introduction

In many civil wars and conflicts, ordinary civilians choose to participate in violent activities. During the Rwandan Genocide in 1994, around 430,000 Hutu civilians joined the army and militiamen in violent activities killing an estimated 800,000 Tutsis and moderate Hutus in only 100 days. ¹ In light of this high death rate and the large number of civilian perpetrators, it is crucial to understand the causes of the civilian participation in the Rwandan genocide. Anecdotal evidence suggests that in the years prior to the Rwandan genocide, the weekly-held community meetings called Umuganda were used to sensitize and mobilize the civilian Hutu population, and believed to have been one of the reasons why the genocide could be carried out so quickly. While Umuganda was originally designed as mandatory work meetings to improve village infrastructure, earlier research suggests that in the early 1990s these meetings were abused by the political elites to spread anti-Tutsi sentiments and prepare the population for genocide (Cook 2004, Straus 2006, Thomson 2009, Verwimp 2013). Despite the specific focus of this paper, we argue that examining the possibly negative effect of these meetings is of more general importance. There is a widely held notion that community meetings have a beneficial effect on fostering social capital (Knack and Keefer 1997; Putnam 2000; Grootaert and van Bastelaer, 2002; Guiso, Sapienza and Zingalez, 2008), by providing arenas for people to meet, exchange ideas, solve free-rider problems, and create public goods. This notion has considerable influence on the work of important developing agencies, expressed in their increasing focus on 'community driven' development projects in which deliberative forums and grassroot participation pay a central role (see Mansuri and Rao, 2012 for a recent overview). We investigate whether there is a 'dark side' to Umuganda where social capital does not bridge the societal divides but rather enforces bonding within the Hutu population (see Satyanath, Voigtlaender and Voth, 2013). Understanding this process is even more important since the practice of Umuganda was formally reintroduced in Rwanda in 2008, and similar practices have been installed in Burundi and discussed in the Democratic Republic of Congo (DRC).

This paper provides the first empirical analysis of how important local *Umuganda* meetings might have been in inducing the civilian population to participate in genocide. Identifying the causal effect of these meetings on participation in genocide is difficult for two reasons. First, we lack data on the number of people participating in *Umuganda* or the number of meetings taking place in a given locality. Second, even if data existed our estimates would likely suffer from omitted variable bias. On the one hand, village-specific unobservable characteristics that affect both genocide violence and *Umuganda* intensity, for instance local leader quality, could produce a spurious positive correlation between the two, biasing the estimate upwards. On the other hand, if *Umuganda* meetings were strategically used in areas where

¹In 1990, Rwanda had 7.1 million inhabitants out of which 6 million were Hutus.

genocide participation would have been unobservably low, the estimate would be downward biased.

To overcome these data and endogeneity issues, we use exogenous rainfall variation to estimate the effect of *Umuganda* meetings on participation in civil conflict. The idea is simple: we expect the meetings to be less enjoyable when it rains and furthermore to be cancelled altogether in the case of heavy rain (Madestam et al., 2013; Madestam and Yanagizawa-Drott, 2011). The fact that the community-work took place on every Saturday makes it possible to isolate the effect of *Umuganda* from general rainfall effects (e.g. affecting income through agriculture) by only using variation in Saturday rainfall while controlling for average daily rainfall during our period of interest.

We use the number of Saturdays with heavy rainfall during the pre-genocide period as our variable of interest. After the outbreak of the civil war in October 1990, tensions between Hutus and Tutsis intensified and the approach of the Hutu-dominated government became more aggressive. Therefore, we will focus on the period from October 1990 up until the outbreak of the genocide in April 1994.

To control for local characteristics we include 142 commune indicators. Furthermore, we can provide a strong placebo check by controlling for heavy rainfall on the other six weekdays. We thus ensure that identification only stems from local variation in rainfall on Saturdays, which is arguably exogenous and should only affect genocide participation through its effect on *Umuganda* meeting intensity.

There is, however, one major concern regarding the exclusion restriction. In particular, the effect we estimate might not be due to the political element of *Umuganda* per se, but merely a consequence of people getting together in general. We devote an ample amount of care to corroborate that this concern is unwarranted. In particular, we will show that neither rainfall on Sundays, a church day where people traditionally meet, nor rainfall on public holidays, affect participation. Moreover, the estimates are robust to excluding Kigali, the Rwandan capital.

We proxy for genocide violence by the number of people prosecuted in the Gacaca courts, normalized by village Hutu population in 1991. There were about 10,000 of these local courts set up all over the country to prosecute the crimes committed during the genocide. Using prosecution instead of actual participation rates might introduce some bias. However, as shown in Friedman (2013), the Gacaca data is strongly correlated with other measures of violence from other various sources. Moreover, we take into account that the Gacaca courts potentially prosecuted not only genocide perpetrators, but also perpetrators who committed violence during the preceding civil war, by excluding communes where major violent events

took place during that period. We also show that the results are robust to dropping areas where mass graves were discovered after the genocide (indicating high death rates).

Our reduced-form results indicate a negative relationship between *Umuganda* intensity and civilian participation in genocide: one additional rainy Saturday is associated with a 5 percent decrease in the civilian participation rate. The results are robust to controlling for rainfall on all other weekdays. Importantly, the coefficients for the other weekdays are small and insignificant. The effect is similar although smaller and statistically weaker for organized participation. This is not surprising since militia and army men often came from outside the village where they committed crimes, and should thus not have been affected by pre-genocide rainfall in the village.

Our results have important policy implications and are also relevant for other cases. In 2008, the Rwandan government reintroduced *Umuganda*. Our results show that these meetings can easily be abused and that caution is warranted, in particular since tension between the Tutsi and the Hutu is still present in Rwanda. Furthermore, similar practices have been installed in Burundi and are being discussed in the Democratic Republic of Congo (DRC). Both Burundi and the DRC have a long history of violent conflict along ethnic lines, which calls for caution when establishing an authoritarian institution such as mandatory community meetings.

Our paper contributes to the literature in several ways. First of all, it adds to the vast conflict literature. Blattman and Miguel (2010) give an excellent review of this literature, vehemently calling for well-identified studies on the roots of individual participation in violent conflict. This paper adds to the conflict literature by providing novel evidence on the strong effects local community meetings, controlled by the political elite, can have on preparing a population for genocide. Recent studies on the determinants of conflict and participation in violence consider institutions, government policy, income, foreign aid and propaganda (Besley and Persson, 2011; Dell, 2012; Dube and Vargas, 2013; Mitra and Ray, forthcoming; Nunn and Qian, forthcoming; Yanagizawa-Drott, 2013, respectively). Furthermore, our paper complements the literature on the Rwandan Genocide (Straus, 2004; Verpoorten, 2012a-c; Verwimp, 2003, 2005, 2006; Yanagizawa-Drott, 2013) by providing novel evidence on its careful preparation. Thus, the study adds to results showing how Hutu unemployment and education (Friedman, 2013), propaganda through the RTLM hate radio (Yanagizawa-Drott, 2014), local state capacity (Heldring, 2014), and elite-supported armed groups (Rogall, 2014) affected civilian participation in the genocide.

On the methodology side, our findings speak to the recent discussion on the effects of rainfall on conflict

other than through the income channel (Iyer and Topalova, 2014; Rogall, 2014; Sarsons, 2011). Prominent studies that use rainfall as an instrument for income in Africa include Brückner and Ciccone (2010), Chaney (2013) and Miguel, Satyanath and Sergenti (2004). Our results suggest that rainfall might have negative direct effects on conflict. Moreover, the estimation strategy we use is similar to the ones used in Madestam et al. (2013) and Madestam and Yanagizawa-Drott (2011), who also use rainfall as a proxy or instrument for participation in outdoor events.

Finally, our results are in line with Satyanath, Voigtlaender and Voth (2013) who speak for a "dark side" of social capital, in contrast to several contributions highlighting its positive effects (Knack and Keefer, 1997; Grootaert and van Bastelaer, 2002; Guiso, Sapienza and Zingalez, 2008).

The remainder of the paper is organized as follows. Section 2 provides some background information on the Rwandan genocide. Section 3 presents the data used for the analysis and Section 4 lays out our empirical strategy. Section 5 presents the results and tests their robustness. Section 6 concludes with possible policy implications.

2 Background

2.1 A History of Conflict

A long chain of events lead up to the 1994 Rwandan genocide.² German and Belgian colonizers promoted the Tutsi minority and gave them supremacy over the Hutu majority.³ This division created a strong tension between the two groups and culminated in the Rwandan revolution, or the Social revolution of 1959, where the Tutsi monarchy was dissolved in favor of a republic led by the Hutus. Many Tutsi civilians were killed; others fled Rwanda for neighboring countries such as Burundi, Tanzania and, in particular, Uganda. Thus, after gaining independence in 1962, Rwanda was ruled by a Hutu government. During the following decade the country faced several attacks from exiled Tutsi rebel groups with following Hutu retaliation.

In 1974 - paramount to the introduction of a modern version of *Umuganda* - Juvénal Habyarimana took power in Rwanda through a coup d'état. His subsequent rule was based on a pro-Hutu ideology ("Hutu power"), further discussed in the next section. During the same period, a rebel group called the Rwandan

²For insightful accounts of this period, see for example Prunier (1995), Gouveritch (1998), Des Forges (1999), Dallaire (2003), Hatzfeld (2005, 2006) and Straus (2006).

³In the 1991 census data used in this paper, the average reported share of Hutus per commune is 87%

Patriotic Front (RPF) had emerged in exile, mostly comprised of Tutsi refugees. In October 1990, the RPF invaded Rwanda from Uganda, starting the Rwandan civil war. Fighting between the Hutu-led government and the Tutsi rebels continued until the Arusha Accords were signed in August 1993.⁴ While a multi-party system had been installed in the early phase of the peace talks, this had little (or no) effect on reducing societal tension and conflict. In April 1994, President Habyarimana's plane was shot down over Kigali. This event is widely seen as the starting point of the Rwandan genocide, which was carried out during approximately 100 days, with the result of around 800,000 Tutsis and moderate Hutus being killed.

A vast number of civilian Hutus took part in the genocide violence, directed by the interim government (Dallaire, 2005). In our sample, there are approximately 416,000 civilian perpetrators.

2.2 Umuganda

The practice of *Umuganda* dates back to pre-colonial times. During a day of community service, villagers would get together to build houses for those not able to, or help each other out on the fields in times of economic hardship such as sickness or death within families (Mukarubuga, 2006). Rather than being mandatory, *Umuganda* was initially considered a social obligation (Melvern, 2000). This changed during the the colonial period, when the Belgian colonizers used *Umuganda* for organizing compulsory work. Consistently, the local term for *Umuganda* was now *uburetwa*, or *forced labor* (IRDP 2003). All men had to provide communal work 60 days per year. Most of the manual labor was hereby carried out by members of the ethnic majority (Hutu) under the supervision of Tutsi chiefs (Pottier 2006): a first sign of *Umuganda*'s potential to create a division between the two ethnic groups.

During the post-colonial era from 1974 and onwards, the meaning of *Umuganda* changed again when the newly elected Hutu president Habyarimana turned it into a political doctrine (Mamdani, 2001). Verwimp (2000, pp. 344) cites Habyarimana:

The doctrine of our movement [Movement for Development, MRND] is that Rwanda will only be developed by the sum of the efforts of its people. That is why it has judged the collective work for development a necessary obligation for all inhabitants of the country.

The program combined a practical motivation - achieving development objectives with weak state finances - with a strong ideological element. Participation was again compulsory through government

⁴The essence of this treaty was a power-sharing government, including representatives from both sides of the conflict.

coercion, and failure to participate usually involved paying a fine.⁵ The local leaders of the neighborhood who preceded over a group of ten households were responsible for the weekly *Umugandas* and had the power to decide who were to participate and to demand fines from those failing to participate (Verwimp, 2000). The state chose the projects on which at least one adult male per family had to work on *every* Saturday morning (Uvin, 1998). According to a report from 1986: 56% of the work performed during *Umuganda* was concerned with various types of anti-erosion measures, such as terracing and digging ditches; 15% was construction of communal buildings; 21% consisted in maintenance work of communal roads; 3% was related to construction of water supply systems, and another 3% was related to agriculture. In this period, *Umuganda* substantially contributed to Rwanda's GDP (Guichaoua 1991).

Habyarimana's ideology stressed the importance of the cultivator as the true Rwandan (Straus, 2006). This view clearly embraced the Hutu population with their history as cultivators, as opposed to the Tutsi who were said to be pastoralists. In fact, during the period leading up to the genocide, *Umuganda* was used to strengthen group cohesion within the "indigenous" ba-Hutu and marginalize the "non-indigenous" ba-Tutsi (Lawrence & Uwimbabazi 2013). The patriotic focus of *Umuganda* became particularly salient in the early 1990's when "government propaganda gave no choice to Rwandans other than to attend Umuganda for political mobilization" (Lawrence & Uwimbabazi 2013, pp. 253). Furthermore, "..those who could not attend were regarded as enemies of the country who ran the risk of being brutalised and killed" (ibid.).

Although little is known about the link between participation in *Umuganda* before the genocide and participation in violence during the genocide - a link which we hope to shed new light on in this paper - anecdotal evidence speaks to the importance of *Umuganda* as an instrument for local party and state officials to mobilize the peasant population. The fact that all Rwandans of working age, be it farmers or intellectuals, were required to participate in *Umuganda* (Guichaoua ,1991) made it a potential arena for reaching out broadly to the entire population. Verwimp (2013, pp. 40) notes:

Umuganda gave the local party and state officials knowledge and experience in the mobilization and control of the labor of the peasant population. A skill that [would] prove deadly during the genocide.

Although a correlation, Straus (2006) shows that 88 percent of the perpetrators he interviewed took part in *Umuganda* on a regular basis before the genocide broke out. The practice of *Umuganda* was also used during the genocide itself but it was then replaced by *gukorn akazi*, or "do the work", which meant the

⁵In today's Rwanda, the fine for not participating in *Umuganda* is slightly less than \$10.

killing of Tutsis (Verwimp, 2013). Other slogans related to *Umuganda* used before the genocide such as "clearing bushes and removing bad weeds" now had a completely altered connotation (Lawrence & Uwimbabazi, 2013). By equating the participation in genocide violence with participation in *Umuganda*, the Hutu elite could signal that participation in genocide violence, just like participation in *Umuganda*, was a social obligation for all 'true' Rwandans.

In 2008, the Tutsi-led government re-introduced *Umuganda* in Rwanda with the general aim to promote development and reduce poverty in the aftermath of the genocide (Uwimbabazi, 2012). Participation is again mandatory for all able-bodied individuals between 18 and 65 years of age, and typical tasks include cleaning streets, cutting grass and trimming bushes along roads, repairing public facilities or building houses for vulnerable persons on the last Saturday of every month.

3 Data

We combine several datasets from different sources to construct our final dataset, which comprises 1433 Rwandan sectors. Sectors are the second smallest administrative level, and the level for which the outcome data on perpetrators is available.⁶

3.1 Participation Rates

Our two key measures are participation in civilian violence and organized violence. Since no direct measure of participation rates is available, we use prosecution rates for crimes committed during the genocide as a proxy (Yanagizawa-Drott, 2014; Friedman, 2013; Heldring, 2014; Rogall, 2014). These data are taken from a nation-wide sector-level dataset, provided by the government agency "National Service of Gacaca Jurisdiction", which records the outcome of the almost 10.000 Gacaca courts set up all over the country. Depending on the role played by the accused and on the severity of the crime, two different categories of perpetrators are identified.

The first category which we refer to as "organized participants" concerns: (i) planners, organizers, instigators, supervisors of the genocide; (ii) leaders at the national, provincial or district level, within political parties, army, religious denominations or militia; (iii) the well-known murderer who distinguished himself because of the zeal which characterized him in the killings or the excessive wickedness with which killings were carried out; (iv) people who committed rape or acts of sexual torture. These perpetrators mostly belonged to army and militia or were local leaders. There were approximately 77.000 people

⁶See Section 3.3 for a further discussion on matching the data.

prosecuted in this category.⁷

The second category which we refer to as "civilian participants" concerns: (i) authors, co-authors, accomplices of deliberate homicides, or of serious attacks that caused someone's death; (ii) the person who - with intention of killing - caused injuries or committed other serious violence, but without actually causing death; (iii) the person who committed criminal acts or became accomplice of serious attacks, without the intention of causing death. People accused in this category are not members of any of the organized groups listed for the first category and are thus considered to be civilians in this paper. Approximately 430.000 people were prosecuted in this category. As mentioned, the second category is our main outcome variable since civilian participation in the killings is more likely to have been affected by *Umuganda* than organized participation.

The reliability of the prosecution data is a key issue for the analysis. One concern when using prosecution data instead of actual participation is the presence of survival bias: in those sectors with high participation rates, the violence might have been so widespread that no witnesses were left, or the few remaining too scared to identify and accuse the perpetrators, resulting in low prosecution rates. This concern is, however, unlikely to be warranted: Friedman (2013) shows that the Gacaca data is positively correlated with several other measures of violence from three different sources.⁸ Furthermore, Friedman (2013, pp. 19-20) notes that "*the Gacaca courts have been very thorough in investigating, and reports of those afraid to speak are rare, so this data is likely to be a good proxy for the number of participants in each area"*. Nevertheless, to be cautious, in the following analysis we will show that our results are robust to dropping those sectors with mass graves (an indication of high death rates).

Another concern is that some of those prosecuted in the Gacaca courts committed their crimes not during the genocide, but rather during the period of civil war preceding the genocide (October 1990 until August 1993). Although the bulk of the crimes treated in the Gacaca courts concerns acts committed during the genocide, we cannot rule out that (a) some perpetrators may in fact have been accused for participation in massacres and other violence during the civil war (and not during the genocide), and (b) that individuals who had previously participated in violent acts during the civil war were more likely to have been recognized and trialled for genocide crimes than individuals who participated "only" in the genocide. In order to mitigate this concern, we also present results where we exclude communes where major violent

⁷Since we lose some observations for category 1 and category 2 in the matching process, our sample consists of 415,935 category 2 perpetrators and 74,168 category 1 perpetrators.

⁸These sources are a 1996 report from the Ministry of Higher Education, Scientific Research, and Culture (Kapiteni, 2006); the PRIO/Uppsala data on violent conflicts (Gleditsch et al, 2002); and a database of timing and lethality of conflict from Davenport and Stam (2007).

events occurred during Oct 1990-Mar 1994 (Viret, 2010). We use only the acts of violence directed toward Tutsis since violent crimes by Tutsis directed toward Hutus were not trialled in the Gacaca courts (Human Rights Watch, 2011; Longman, 2009).

3.2 Rainfall Data

We use the recently released National Oceanic and Atmospheric Administration (NOAA) database of daily rainfall estimates, which stretches back to 1983, as a source of exogenous weather variation. The NOAA data relies on a combination of actual weather station gauge measures and satellite information on the density of cloud cover to derive rainfall estimates at 0.1-degree (~ 11 kilometers at the equator) latitude-longitude intervals. Considering the small size of Rwanda this high spatial resolution data, to our knowledge the only one available, is crucial to obtaining reasonable rainfall variation. Furthermore, the high temporal resolution, i.e. daily estimates, allows us to confine variation in rainfall to the exact days of *Umuganda*. Since Rwanda is a very hilly country there is considerable local variation in rainfall. Also, these sectors criss cross the various rainfall grids and each sector polygon is thus likely to overlap with more than one rainfall grid. The overall rainfall in each sector is thus obtained through a weighted average of the grids, where the weights are given by the relative areas covered by each grid.

The true functional form relating rainfall to attendance and participation in mandatory community work is unknown. However, we argue that it is reasonable to assume that in the case of heavy rainfall it is difficult to perform outdoor work such as terracing and road construction, and we will therefore use the number of Saturdays with heavy rainfall to capture the relationship between rainfall and participation in *Umuganda*. This is a similar approach to that used in Madestam et al. (2013) where they argue that areas with more than 0.1 inches (2.5 millimeter) of rainfall had lower attendance in the Tea Party Tax Day rally held in the U.S. on April 15, 2009. While a 2.5 mm threshold may be appropriate to capture lower participation in a voluntary rally in the U.S., we believe that our context requires a higher threshold, which corresponds to heavy rainfall rather than a light drizzle.⁹ We will therefore use the number of Saturdays (and all other weekdays), in October 1990 through March 1994, each sector received more than 10 mm of rainfall as a our main explanatory variable.¹⁰ The choice of 10 mm as our rainfall threshold is based on the definition for extreme weather shocks used in Harari and La Ferrera (2013), where an

⁹Madestam et al. (2013) also use 0.35 inches (\approx 9 mm) as a robustness check for a higher threshold of rainfall. In Table 2, we show that our results are robust to using this threshold as well.

¹⁰Our results are robust to controlling for the sum of all weekdays (Sun-Sat) with rainfall above 10 mm, instead of, as in our main specification, controlling separately for each weekday. The effect of heavy rainfall on Saturdays is then slightly larger. These results are available upon request. In Appendix, Table 11, we show that our results are also robust to estimating a linear specification with average daily rainfall on Saturdays and all other weekdays as our main explanatory variables.

extreme weather shock is defined as two standard deviations from the long-term average.¹¹ However, as a robustness check, we will also examine other thresholds. More specifically, we will present our main results and sensitivity checks using the number of Saturdays and all other weekdays with rainfall above 6 mm, 8 mm and 12 mm, respectively. In addition to this, Figure 2 in Appendix shows the sensitivity of the point estimate in our main specification as we change the threshold from 5 mm to 15 mm.¹²

3.3 Matching of data and summary statistics

The different data sets are matched by sector names within communes. Unfortunately, the matching is imperfect, since some sectors either have different names in different data sources, or use alternate spelling. It is not uncommon for two or more sectors within a commune to have identical names, and this prevents successful matching. However, overall only about 5 percent of the sectors cannot be correctly matched across all sources. Furthermore, as these issues are idiosyncratic, the main implication for our analysis is lower precision in the estimates than otherwise would have been the case. Table 6 in the Appendix reports the summary statistics for our variables.

4 Empirical Strategy

To identify the effect of *Umuganda* meetings on participation in genocide violence, we use local variation in rainfall as a proxy. Since we lack data on the number of people participating in *Umuganda*, we will focus on the reduced form effect.

4.1 Identifying assumptions

Our identification strategy rests on two assumptions. First, sectors with heavier rainfall on Saturdays experienced fewer or less intensive *Umuganda* meetings (first stage). Second, conditional on our control variables, rainfall on Saturdays does not have a direct effect on genocide violence other than through the *Umuganda* meetings (exclusion restriction).

¹¹The long-term average daily rainfall in Rwanda, 1984-1994, was 2.6 mm with a standard deviation of 3.8 mm. This is calculated taking the average across all sectors in Rwanda for each day, and then taking the average across all days in 1984-1994. Two standard deviations from the long-term average corresponds to 10.24 mm.

¹²The thresholds 8 mm and 12 mm correspond to the average of the 95th and the 99th value of daily rainfall in Rwanda over the period 1984-1994. This follows the methodology used by Dyson (2009) who, in order to understand the characteristics of heavy rainfall over the Guateng province in South Africa, defines heavy and very heavy rainfall as the average of the 95th and 99th value of daily rainfall, respectively.

4.1.1 First Stage

Ideally, we would like to directly test a first stage relationship using data on the number of people participating in *Umuganda* before the genocide. Since such data does not exist, we will instead provide indirect evidence for expecting a strong first stage.

Several other studies have documented and exploited negative relationships between rainfall and participation in open-air events. The estimation strategy used in this paper is similar to the ones used in Madestam et al. (2013), and Madestam and Yanagizawa-Drott (2011). The first of these two studies evaluates the effect of the Tea Party movement's protests during Tax Day in the US on several policy outcomes, and instruments for lower participation using rainfall on that particular day. The second study uses rainfall during 4th of July in the US as a proxy for lower participation in the celebrations and estimates the effect of participation on political values and voting behavior later in life. In a similar vein, Collins and Margo (2007) use rainfall in April 1968 as an instrument for participation in the riots that erupted in the US after Martin Luther King was murdered. Moreover, there are many studies which use rainfall and other weather phenomena for exogenous variation in voter turnout on election days (Gomez et al., 2007; Horiuchi and Saito, 2009; Hansford and Gomez, 2010; Fraga and Hersh, 2011; Eisinga et al., 2012). However, in these cases, rain has an effect both on the direct cost of voting and on the opportunity cost of voting. Lind (2014) for example finds that voter turnout in Norway increases due to rain on the election day, explained by the lower opportunity cost of going to the polling station when weather is bad. The presence of such a mechanism is however highly unlikely when it comes to Umuganda due to its mandatory nature. Rather, rainfall would make the meetings and the work less productive, or even lead to cancellations. Furthermore, the typical tasks carried out during Umuganda would have been hard to perform during heavy rainfall. The meetings, as well as the work, took place outside, and as mentioned above, the bulk of the tasks were related to landscaping, road maintenance, construction, and agriculture (Guichaoua, 1991).

Since we cannot know whether rainfall affected the extensive or the intensive margin of *Umuganda* meetings, we account for these possible nonlinearities by counting the number of Saturdays for which total rainfall was above a certain threshold. Varying these thresholds will give us an indication of whether rainfall lead to cancellations or rather made the meetings less enjoyable. On the one hand, if we see effects at low thresholds, it speaks to less enjoyable meetings. If, on the other hand, the effects set in only at higher levels, cancellations are more likely to be driving the results.¹³ Average daily rainfall

 $^{^{13}}$ Figure 2 in Appendix shows the sensitivity of the point estimate in our main specification as we change the threshold from 5 mm to 15 mm.

in Rwanda is however low (see Table 6 in Appendix), which means that for very high thresholds, the variation will be too small to detect any effects.

4.1.2 Exclusion Restriction

Our empirical strategy relies on the counterfactual assumption that, absent the *Umuganda* meetings, rainfall on Saturdays had no effect on genocide violence. This is unlikely to be true without further precautions. Since rainfall affects agricultural output and this in turn has an important impact on socioeconomic outcomes in a context like Rwanda where the vast majority of the population is subsistence farmers, our proxy is likely to be correlated with household income which Friedman (2013) showed to be correlated with genocide participation. In addition to affecting agricultural outcomes, heavy rainfall might destroy infrastructure such as roads or housing, which is also likely to affect households' economic well-being. Income, in return, potentially affects genocide participation as reasons for participating were often driven by material incentives and genocide perpetrators were given an opportunity to loot the property of the victims, or through enabling people to bribe themselves out of participating (Hatzfeld, 2005).

To address this problem, and to solely isolate the Saturday rainfall effect, we control for average daily rainfall during January 1984 through September 1990, and our period of interest: October 1990 - March 1994. Furthermore, we also control for rainfall on the other six weekdays. The absence of systematic, significant effects for other days than Saturdays would be a strong placebo test. To account for local characteristics we also add 142 commune indicators. Thus, the results shown only use local variation.

At this point, we still need to argue that no other events potentially happening parallel to *Umuganda* on Saturdays could be driving our results. In particular, one might worry that people meeting and interacting in general might affect participation in genocide violence. In the results section below, we will provide several tests alleviating this concern. First, we will show that neither heavy rainfall on Sundays, the weekday when people traditionally meet in church, nor heavy rainfall on public holidays, have an effect on genocide violence. Second, we will show that our results are robust to excluding the province Kigali Ville, where the capital is located. This is the most densely populated area of Rwanda and the economic and political center of the country, and therefore likely to have seen more public events.

4.2 Specifications

We run the following reduced-form regression to estimate the effect of *Umuganda* meetings on participation in genocide violence

(1)
$$\frac{P_{ic}}{H_{ic}} = \alpha + \beta \# Saturdays(rain > t mm) + \mathbf{X}_{ic}\pi + \gamma_c + \varepsilon_{ic}$$

where P_{ic}/H_{ic} is the share of Hutu prosecuted in either category 1 or category 2, i.e. our proxy for genocide violence in sector *i* in commune *c*. #*Saturdays*(*rain* > *t mm*) is our explanatory variable of interest: the number of Saturdays in October 1990-March 1994 with total rainfall above *t* mm. **X**_{*ic*} is a vector of sector-specific controls, including average daily rainfall January 1984-September 1990, average daily rainfall October 1990-March 1994, and the number of all other weekdays with rainfall above *t* mm during October 1990-March 1994. Finally, γ_c are commune indicators, and ε_{ic} is the error term. We allow the error terms to be correlated across sectors within the same commune by clustering the standard errors on commune level, and also use specifications where we allow for correlation across sectors within a 25, 50 and 75 km radius, following Conley (1999). Moreover, since the prosecution rates are heavily skewed to the right, we weight our observations based on total sector population size before the genocide, but our results do not rely on this weighting scheme.

Running a weighted least squares (WLS) regression, with the share of prosecuted Hutus as the dependent variable and population size as weights, the coefficient β will capture the percentage point change in genocide participation following an additional Saturday with rainfall above *t* mm. Our main specification uses 10 mm as a measure of heavy rainfall, but our results are robust to using other rainfall thresholds.

5 Results

5.1 Main Effects

The reduced-form relationship between the number of civilian perpetrators per Hutu and the number of Saturdays with rainfall above 10 mm in each sector is strongly negative and statistically significant at the one percent significance level (Column 1 in Table 1). This relationship holds when adding the number of other weekdays with rainfall above 10 mm as controls (Column 2 in Table 1). Regarding magnitude, one more Saturday with rainfall above 10 mm corresponds to a 0.41 percentage points reduction in the civilian participation rate. If we assume a one-to-one relationship between the number of rainy Saturdays and the number of cancelled *Umuganda* meetings, then an additional cancelled meeting reduces the average civilian participation rate by 5.4 percent (interpreted at the mean number of civilian perpetrators per

Hutu, which is 7.7 percent). Reassuringly, none of the other weekdays is systematically and significantly related to violence, and an F-test confirm the hypothesis that all other weekdays are jointly equal to zero. The p-value of this F-test is equal to 0.937, indicating that the other weekdays explain very little of the variation in civilian participation.

The results for organized perpetrators are weaker. This is not surprising. Since this category (organized perpetrators) to a large extent consists of members of the militia, it is not clear that the sector where they committed their genocide crimes (and were subsequently prosecuted in) is the same sector as the one where they lived before the genocide (October 1990-March 1994). This would then mean that they will not have been exposed to the same number of *Umugandas* as the inhabitants of that sector. If this is the case, it will have the same effect on our analysis as if our rainfall variables were measured with error and our estimate would suffer from attenuation bias.¹⁴

Dependent variable:	Cat 2 p	er Hutu	Cat 1 p	er Hutu
	(1)	(2)	(3)	(4)
Number Sat>10	-0.00426***	-0.00410***	-0.00067**	-0.00059**
	(0.00126)	(0.00128)	(0.00033)	(0.00030)
Number Sun>10		0.00037		-0.00040
		(0.00104)		(0.00031)
Number Mon>10		0.00079		0.00096***
		(0.00110)		(0.00031)
Number Tue>10		0.00019		-0.00049*
		(0.00085)		(0.00029)
Number Wed>10		0.00030		0.00003
		(0.00114)		(0.00028)
Number Thu>10		-0.00011		-0.00065
		(0.00134)		(0.00041)
Number Fri>10		-0.00056		0.00003
		(0.00096)		(0.00026)
Standard controls	yes	yes	yes	yes
Commune FE	yes	yes	yes	yes
\mathbb{R}^2	0.52	0.52	0.36	0.37
Ν	1433	1433	1433	1433

Table 1: Main Specification

* p<0.10, ** p<0.05, *** p<0.01.

Notes: Results from weighted least squares (WLS) estimation use population size as weights, and the number of perpetrators per Hutu as the dependent variable. All models include average daily rainfall Jan 1984-Sep 1990, average daily rainfall Oct 1990-Mar 1994, and 142 commune indicators. Robust standard errors in parentheses are adjusted for clustering at the commune level.

¹⁴Since our main focus in this paper is to examine if *Umuganda* can explain local variation in civilian violence, we will focus on this category in our following sensitivity analysis. We will however, report the corresponding results for organized perpetrators in the Appendix.

5.1.1 Sensitivity Check of Rainfall Threshold

To understand whether rainfall lead to cancellations, or rather made the *Umuganda* meetings less enjoyable, we vary the threshold in increments of 2 mm; from 6 mm to 12 mm. Following Madestam et al. (2013), we also use 0.35 inches (which corresponds to 9 mm) as a threshold. Table 2 reports the results for civilian participation. Heavy rainfall on Saturdays is negatively related to civilian participation and significant on at least the 5 percent significance level for all thresholds above 6 mm, suggesting that it was rather cancellation that lead to a decrease in violence. Again, we find no other significant effects for other weekdays. The p-value of the F-test that the coefficients of all other weekdays are equal to zero ranges from 0.34 to 0.97, i.e. we cannot reject that they are jointly equal to zero for all different thresholds.

Dependent variable:			Cat 2 per H	lutu	
Number rainy days above:	6 mm	8 mm	9 mm	10 mm	12 mm
	(1)	(2)	(3)	(4)	(5)
Saturday	-0.00142	-0.00241*	-0.00250*	-0.00409***	-0.00385***
	(0.00115)	(0.00140)	(0.00141)	(0.00128)	(0.00132)
Sunday	0.00080	0.00068	0.00073	0.00041	-0.00043
	(0.00084)	(0.00124)	(0.00117)	(0.00102)	(0.00137)
Monday	0.00069	0.00009	0.00079	0.00080	-0.00053
	(0.00088)	(0.00118)	(0.00117)	(0.00112)	(0.00120)
Tuesday	-0.00020	0.00000	0.00069	0.00023	0.00135
	(0.00128)	(0.00123)	(0.00099)	(0.00084)	(0.00123)
Wednesday	0.00003	0.00043	-0.00065	0.00031	-0.00058
	(0.00093)	(0.00111)	(0.00106)	(0.00111)	(0.00118)
Thursday	0.00129	0.00004	0.00140	-0.00007	-0.00233**
	(0.00096)	(0.00107)	(0.00123)	(0.00134)	(0.00107)
Friday	-0.00048	0.00106	-0.00079	-0.00057	-0.00216
	(0.00086)	(0.00094)	(0.00086)	(0.00099)	(0.00137)
Standard controls	yes	yes	yes	yes	yes
Commune FE	yes	yes	yes	yes	yes
\mathbb{R}^2	0.51	0.51	0.51	0.52	0.52
Ν	1433	1433	1433	1433	1433

Table 2: Robustness - Different Rain Thresholds - Category 2

* p<0.10, ** p<0.05, *** p<0.01.

Notes: Results from weighted least squares (WLS) estimation use population size as weights, and the number of category 2 perpetrators per Hutu as the dependent variable. All models include average daily rainfall Jan 1984-Sep 1990, average daily rainfall Oct 1990-Mar 1994, and commune indicators. Main explanatory variables are number of weekdays in Oct 1990-Mar 1994 with rainfall above 6, 8, 9, 10, and 12 mm, respectively. Robust standard errors in parentheses are adjusted for clustering at the commune level.

5.2 Exclusion Restriction

Throughout our period of interest (1990-94), violent acts targeted at Tutsis and moderate Hutus were already taking place. If these pre-genocide perpetrators are included in the Gacaca data, and there is a

relationship between rainfall before the genocide and targeted violence during this period, our estimates might be biased. To rule out that the estimates are not picking up the effects of rainfall in 1990-94 on violent events during the same time period, we exclude communes where targeted violence took place before the genocide, identified from Viret (2010). Reassuringly, our results for civilian participation are robust to excluding these pre-violence communes (Column 1 in Table 3).

In addition to this, there is a concern that our estimate is picking up other events that potentially also take place on Saturdays. While we cannot perfectly test this concern, we perform several robustness checks aiming to exclude this possibility. First, as seen in Table 1, we find no significant effect for Sunday rainfall. Since people traditionally attend church on Sundays, this rules out that our effect is solely the result of people meeting and thus driven by events other than *Umuganda*. Second, in similar vein, when we rerun our main specification, but also control for the number of public holidays (excluding Saturdays since these might still be subject to *Umuganda*) with rainfall above 10 mm, the coefficient on Saturday rainfall remain significant and none of the coefficients on public holidays (column 2 in Table 3) and public holidays separated into religious and non-religious holidays (column 3 in Table 3). The estimated coefficients might appear large at first, however when expressed in term of standard-deviations the numbers are small. While a one-standard deviation increase in the number of rainy Saturdays reduces civilian violence only by 0.1 percentage points.

Dependent variable:	Ca	at 2 per Hutu	
Sample:	Excl. Pre-Violence	Full S	ample
	(1)	(2)	(3)
Number Sat>10	-0.00483***	-0.00408***	-0.00391***
	(0.00148)	(0.00124)	(0.00121)
Number Sun>10	0.00051	0.00040	0.00045
	(0.00123)	(0.00105)	(0.00107)
Number Mon>10	0.00117	0.00081	0.00076
	(0.00127)	(0.00107)	(0.00107)
Number Tue>10	0.00002	0.00026	0.00036
	(0.00098)	(0.00097)	(0.00095)
Number Wed>10	-0.00023	0.00029	0.00030
	(0.00122)	(0.00115)	(0.00113)
Number Thu>10	0.00121	-0.00010	-0.00004
	(0.00153)	(0.00134)	(0.00134)
Number Fri>10	-0.00013	-0.00049	0.00007
	(0.00113)	(0.00115)	(0.00132)
Num Public Holidays >10		-0.00541	
		(0.02395)	
Num Non-Religious Public Holidays >10			-0.01340
			(0.01768)
Num Religious Public Holidays >10			-0.05314
			(0.03878)
Standard controls	yes	yes	yes
Commune FE	yes	yes	yes
R ²	0.49	0.52	0.52
N	1213	1433	1433

Table 3: Exclusion Restriction

Notes: Results from weighted least squares (WLS) estimation use population size as weights, and the number of perpetrators per Hutu as dependent variable. All models include average daily rainfall Jan 1984-Sep 1990, average daily rainfall Oct 1990-Mar 1994, and commune indicators. Column 1 and 3 control for number of public holidays with rainfall above 10 mm, excluding public holidays that fell on a Saturday. Column 1 excludes communes where violent acts have been reported for the period Oct 1990-Mar 1994. Column 2 includes number of public holidays with rainfall above 10 mm during the same period, excluding those on a Saturday. Column 3 separately controls for the number of religious and non-religious public holidays with rainfall above 10 mm. Robust standard errors in parentheses are adjusted for clustering at the commune level.

5.3 Robustness Checks

Next, we perform a number of robustness checks, all reported in Table 4. To make sure that our results are not driven by potential survival bias in the prosecution data, we exclude villages where mass graves have been found (since this is an indication of high death rates). We also exclude the sectors in Kigali Ville. This is the province where the capital city of Rwanda, Kigali, is located. The coefficients on Saturday rainfall are virtually identical to our baseline results and similarly significant at 99 percent confidence (Columns 2-3 in Table 4).

Dependent variable:		Cat 2 per Hutu	
Sample:	Full Sample	Excl. Mass graves	Excl. Kigali Ville
	(1)	(2)	(3)
Number Sat>10	-0.00410***	-0.00403***	-0.00419***
	(0.00128)	(0.00130)	(0.00128)
Number Sun>10	0.00037	0.00051	0.00031
	(0.00104)	(0.00105)	(0.00104)
Number Mon>10	0.00079	0.00056	0.00078
	(0.00110)	(0.00106)	(0.00111)
Number Tue>10	0.00019	0.00072	0.00021
	(0.00085)	(0.00086)	(0.00086)
Number Wed>10	0.00030	0.00028	0.00019
	(0.00114)	(0.00109)	(0.00120)
Number Thu>10	-0.00011	-0.00013	0.00011
	(0.00134)	(0.00128)	(0.00128)
Number Fri>10	-0.00056	-0.00013	-0.00037
	(0.00096)	(0.00094)	(0.00099)
Standard controls	yes	yes	yes
Commune FE	yes	yes	yes
R ²	0.52	0.51	0.52
Ν	1433	1367	1422

Table 4: Robustness - Excl. Massgraves and Kigali Ville

Notes: Results from weighted least squares (WLS) estimation use population size as weights, and the number of perpetrators per Hutu as the dependent variable. All models include average daily rainfall Jan 1984-Sep 1990, average daily rainfall Oct 1990-Mar 1994, and commune indicators. Column 1 is our main specification for category 2 per Hutu. Column 2 excludes 66 sectors where at least one mass grave has been found. Column 3 excludes the 11 sectors in the province Kigali Ville. Robust standard errors in parentheses are adjusted for clustering at the commune level.

Finally, as a placebo check, we re-estimate the reduced-form regressions by replacing pre-genocide rainfall with rainfall in the period of October 1994-March 1998 (from here on denoted post-genocide period), and by adding the post-genocide rainfall to our main specification. To account for possible seasonality in the rainfall data, we have chosen the exact same calendar period as our period of interest (i.e. October 1, 1990 until March 31, 1994). Table 5 reports the results. Reassuringly, we see that the coefficients on Saturdays are small and insignificant throughout.

Dependent variable:		Cat 2 per Hutu	l
	(1)	(2)	(3)
Number Sat>10	-0.00410***		-0.00449***
	(0.00128)		(0.00126)
Number Sun>10	0.00037		0.00050
	(0.00104)		(0.00112)
Number Mon>10	0.00079		0.00111
	(0.00110)		(0.00101)
Number Tue>10	0.00019		0.00062
	(0.00085)		(0.00087)
Number Wed>10	0.00030		0.00058
	(0.00114)		(0.00136)
Number Thu>10	-0.00011		0.00054
	(0.00134)		(0.00144)
Number Fri>10	-0.00056		-0.00031
	(0.00096)		(0.00102)
Number Sat> 10 1994-1998	. ,	-0.00017	0.00002
		(0.00105)	(0.00109)
Number Sun> 10 1994-1998		0.00122	0.00101
		(0.00111)	(0.00109)
Number Mon> 10 1994-1998		-0.00275**	-0.00317**
		(0.00119)	(0.00140)
Number Tue> 10 1994-1998		-0.00155	-0.00101
		(0.00110)	(0.00106)
Number Wed> 10 1994-1998		-0.00173	-0.00237
		(0.00153)	(0.00156)
Number Thu> 10 1994-1998		-0.00125	-0.00115
		(0.00125)	(0.00129)
Number Fri> 10 1994-1998		0.00121	0.00197*
		(0.00110)	(0.00102)
Standard controls	yes	yes	yes
Commune FE	yes	yes	yes
R ²	0.52	0.51	0.52
Ν	1433	1433	1433

 Table 5: Placebo Rainfall Oct 1994-Mar 1998

* p<0.10, ** p<0.05, *** p<0.01.

Notes: Results from weighted least squares (WLS) estimation use population size as weights, and the number of perpetrators per Hutu as the dependent variable. All models include average daily rainfall Jan 1984-Sep 1990, average daily rainfall Oct 1990-Mar 1994, and commune indicators. Column 1 is our main specification for category 2. Column 2 instead uses number of weekdays with rainfall above 10 mm during *Oct 1994-Mar 1998* as the main explanatory variables. Column 3 adds the number of weekdays with rainfall above 10 mm during Oct 1994-Mar 1998 as additional control to our main specification. Robust standard errors in parentheses are adjusted for clustering at the commune level.

6 Discussion and Conclusion

Using heavy rainfall on the day of the mandatory community-work meeting, *Umuganda*, as a proxy for lower intensity in the meetings at the sector level, we find that less intensity in the community work decreased the share of civilian perpetrators in the Rwandan genocide by around 5 percent. Our results

suggest that the political elites in Rwanda used these local-level community meetings to make civilians participate in extraordinary violence. This finding is important for several reasons.

First, a large number of civilians took part in the killings during the Rwandan genocide. It is a common understanding that the genocide was centrally planned and organized. The link between the planning and the wide acceptance of the genocide among the civilian population has however not been much explored, and our paper sheds new light on an important channel.

Second, people getting together to create public goods would foster a sense of belonging and create social capital, generally viewed as positive for development and community building (see for example Knack and Keefer, 1997; Grootaert and van Bastelaer, 2002; Guiso, Sapienza and Zingalez, 2008). As emphasized by Putnam (2000), social capital can bridge the divides in a society. However, similar to Satyanath, Voigtlaender and Voth (2013) who find that a higher density of civic associations in interwar German cities lead to a faster entry by the Nazi Party, we also show evidence of a 'dark side' of social capital. Thus, although the institution of *Umuganda* may have the potential to act as a community building force, our results show that when placed in the wrong hands its effects could become disastrous.

The more optimistic view of this institution might explain why the current Rwandan government reinstalled *Umuganda* in 2008. Indeed, the official statements about *Umuganda* emphasize values such as "solidarity" and "reconciliation", and the practice is said to contribute to fostering a sense of community. These mandatory work days are now held monthly, on the last Saturday of every month. A similar practice is also present in Burundi and is being discussed in DR Congo. Our analysis clearly shows that caution is warranted, perhaps especially in countries with a long history of ethnic tension.

References

- Besley, T. and T. Persson. 2011. The Logic of Political Violence, *Quarterly Journal of Economics*, 126(3): 1411-1445.
- [2] Blattman, C. and E. Miguel. 2010. Civil War, Journal of Economic Literature, 48(1), 3-57.
- [3] **Brückner M. and A. Ciccone.** 2010. Rain and the Democratic Window of Opportunity, *Econometrica*, 79(3): 923-947.
- [4] Chaney, E. 2013. Revolt on the Nile: Economic Shocks, Religion, and Political Power, *Econometrica*, 81(5): 2033-2053.
- [5] Collins W. J. and R. A. Margo. 2007. The Economic Aftermath of the 1960s Riots in American Cities: Evidence from Property Values. *The Journal of Economic History*, 67, 849-883
- [6] **Conley, T. G.** 1999. GMM Estimation with cross sectional Dependence, *Journal of Econometrics*, 92(1):1-45.
- [7] Dallaire, R. 2003. Shake hands with the devil, Random House Canada.
- [8] Davenport, C. and A. Stam. 2009. Rwandan Political Violence in Space and Time, mimeo
- [9] Dell, M. 2011. Trafficking Networks and the Mexican Drug War, mimeo.
- [10] Des Forges, A. 1999. Leave None to Tell the Story: Genocide in Rwanda, Human Rights Watch and the International Federation of Human Rights Leagues, New York, NY, USA. www.hrw.org/legacy/reports/1999/rwanda/
- [11] Dube, O. and J. F. Vargas. 2013. Commodity Price Shocks and Civil Conflict: Evidence from Colombia, *Review of Economic Studies*, 80(4): 1384-1421.
- [12] Dyson, L. L. 2009. Heavy Daily Rainfall Characteristics in the Guateng Province, Water Research Council, 2009-10.
- [13] Eisinga, R., M. Grotenhuis and B. Pelzer 2012. Weather Conditions and Political Party Vote Share in Dutch National Parliament Election, 1971-2010, *International Journal of Biometeorology*, 56, 1161-1165.
- [14] Fraga, B. and E. Hersh 2011. Voting Costs and Voter Turnout in Competitive Elections, *Quarterly Journal of Political Science*, 5, 339-356.

- [15] Friedman, W. 2013. Local Economic Conditions and Participation in the Rwandan Genocide, mimeo.
- [16] Gleditsch, N. P., P. Wallensteen, M. Eriksson, M. Sollenberg, and H. Strand. 2002. Armed Conflict 1946-2001: A New Dataset, *Journal of Peace Research*, 29(5), 615-637.
- [17] Gomez D. P., P. M. Aronow & M.C. McGrath. 2012. Field Experiments and the Study of Voter Turnout, *Journal of Elections, Public Opinion & Parties*.
- [18] Gourevitch, P. 1998. We wish to inform you that tomorrow we will be killed with our families, Farrar, Straus & Giroux, New York
- [19] Frontline, 1999. The triumph of evil, Interview with Philip Gourevitch, http://www.pbs.org/wgbh/pages/frontline/shows/evil/interviews/gourevitch.html and http://www.pbs.org/wgbh/pages/frontline/shows/evil/warning/
- [20] Grootaert, C. and T. van Bastelaer. 2002. Understanding and Measuring Social Capital: A Multi-Disciplinary Tool for Practitioners, Washington, *World Bank*.
- [21] Guichaoua, A. 1991. Les Travaux Communautaires en Afrique Centrale, *Revue Tiers Monde*, t.XXXII, n. 127, July-September, p.551-573.
- [22] Guiso, L., P. Sapienza and L. Zingales. 2008. Alfred Marshall Lecture: Social Capital as Good Culture, *Journal of the European Economic Association*, 6(2-3), 295-320.
- [23] Hansford, T. G. and B. T. Gomez. 2010. Estimating the Electoral Effects of Voter Turnout, American Political Science Review, 104, 268-288.
- [24] Harari, M. and E. La Ferrara. 2013. Conflict, Climate and Cells: A Disaggregated Analysis, C.E.P.R. Discussion Papers, 9277.
- [25] Hatzfeld, J. 2005. Machete season: The Killers in Rwanda speak, Picador, New York.
- [26] Hatzfeld, J. 2006. Life laid bare: The Survivors in Rwanda speak, Other Press, New York.
- [27] Heldring, L. 2014. State Capacity and Violence: Evidence form the Rwandan Genocide, CSAE Working Paper, WPS/2014-08.
- [28] Horiuchi, Y. and J. Saito. 2009. Rain, Election, and Money: The Impact of Voter Turnout on Distributive Policy Outcomes, Yale, mimeo

- [29] Human Rights Watch 2011. Justice Compromised The Legacy of Rwanda's Community-Based Gacaca Courts, Report, May 2011.
- [30] **IRDP** 2003. Sustaining Peace in Rwanda: Voice of the People, *Institut de Recherche et de Dialogue pour la Paix*.
- [31] Iyer, L. and P. Topalova. 2014. Poverty and Crime: Evidence from Rainfall and Trade Shocks in India, mimeo.
- [32] Kapiteni, A. 1996. La Première Estimation du Homre des Victims du Génocide du Rwanda de 1994 Commune par Commune en Fev 1996, *Report of the Ministry of Higher Education, Scientific Research, and Culture.*
- [33] Kirschke, L. 1996. Broadcasting genocide: censorship, propaganda & state-sponsored violence in Rwanda 1990-1994, Article 19.
- [34] Knack, S. and P. Keefer. 1997. Does Social Capital Have an Economic Payoff? A Cross-Country Investigation, *Quarterly Journal of Economics*, Vol. 112, No. 4.
- [35] Lawrence, R. and P. Uwimbabazi. 2013. Indigenous Practice, Power and Social Control: The Paradox of the Practice of Umuganda in Rwanda in Race, Power and Indigenous Knowledge Systems, *Interdisciplinary Journal for the Study of the Arts and Humanities in Southern Africa*, Vol 20, No 1.
- [36] Lind, J. T. 2014. Rainy Day Politics: An Instrumental Variables Approach to the Effect of Parties on Political Outcomes, University of Oslo, mimeo
- [37] Longman, T. 2009. An Assessment of Rwanda's Gacaca Courts, *Peace Review*, 21(3), 304-312.
- [38] Maass, P. 1996. Love Thy Neighbor: A Story of War, London Papermac.
- [39] Madestam A., D. Shoag, Veuger S. and D. Yanagizawa-Drott. 2013. Do Political Protests Matter? Evidence from the Tea Party Movement, *Quarterly Journal of Economics*, 128(4): 1633-1685.
- [40] **Madestam A. and D. Yanagizawa-Drott.** 2011. Shaping the Nation: The Effect of Fourth of July on Political Preferences and Behavior in the United States, mimeo.
- [41] Mamdani, M. 2001. When Victims Become Killers: Colonialism, Nativism, and the Genocide in Rwanda, Kampala, *Fountain*.
- [42] Mansuri, G. and Rao, V. 2012. Localizing development: does participation work?. World Bank Publications.

- [43] Melvern, L. 2000. A People Betrayed: The Role of the West in Rwanda's Genocide, Cape Town.
- [44] Miguel, E., Satyanath, S. and E. Sergenti. 2004. Economic Shocks and Civil Conflict: An Instrumental Variables Approach, *Journal of Political Economy*, 112(4):725-53.
- [45] Mitra, A. and D. Ray. 2014. Implications of an Economic Theory of Conflict: Hindu-Muslim Violence in India, *Journal of Political Economy*, 122(4): 719-765.
- [46] Mueller, J. 1999. The Banality of Ethnic War, *International Security*, Vol. 25, No. 1 (Summer 2000), pp. 4270
- [47] **Mukarubuga, C.** 2006. The Experience of Social Forums Against Poverty: The Case of Rwanda, *Agency for Co-Operation and Research in Development*.
- [48] Présidence de MRND 1990. L'Umuganda dans le Developpement national, Affaires Economique, Paris.
- [49] Nunn, N. and N. Qian. 2014. Aiding Conflict: The Impact of U.S. Food Aid on Civil War, American Economic Review, 104(6): 1630-1666.
- [50] Putnam, R. D. 2000. Bowling Alone, New York, Free Press.
- [51] **Uwimbabazi, P.** 2012. An Analysis of Umuganda: The Policy and Practice of Community Work in Rwanda, College of Humanities, KwaZulu-Natal, South Africa, September.
- [52] Pottier, J. 2006. Land Reform for Peace: Rwanda's 2005 Land Law in Context, *Journal of Agrarian Change*, Vol. 6.
- [53] Prunier, G. 1995. The Rwanda Crisis: History of a Genocide, London, Hurst and Company.
- [54] Rogall, T. 2014. Mobilizing the Masses for Genocide, IIES, Stockholm University, mimeo.
- [55] Rwandan government's website, http://www.rgb.rw/main-menu/innovation/umuganda. html, accessed December 4th, 2013.
- [56] Rwandan Government's webpage, http://www.gov.rw/Umuganda-takes-place-across-Rwanda-marking-20-years-of-Liberation, accessed October 29, 2014.
- [57] Sarsons, H. 2011. Rainfall and Conflict, mimeo.
- [58] Satyanath, S., N. Voigtlaender and H-J. Voth. 2014. Bowling for Fascism, NBER Working Paper.

- [59] **Straus, S.** 2004. How Many Perpetrators Were There in the Rwandan Genocide? An Estimate, *Journal of Genocide Research*, 6(1):85-98.
- [60] **Straus, S.** 2006. The Order of Genocide: Race, Power, And War in Rwanda, *Cambridge University Press*, 1 edition.
- [61] Thomson, S. M. 2009. Resisting Reconciliation: State Power and Everyday Life in Post-Genocide Rwanda, PhD dissertation, Halifax, Nova Scotia, Dalhousie University.
- [62] Uvin, P. 1998. Aiding Violence: the Development Enterprise in Rwanda, Kumarian Press.
- [63] **Verpoorten, M.** 2012. The intensity of the Rwandan genocide: Fine measures from the gacaca records, *Peace Economics, Peace Science and Public Policy*, 18(1).
- [64] **Verpoorten, M.** 2012. Leave None to Claim the Land: A Malthusian Catastrophe in Rwanda?, *Journal of Peace Research*, 49 (4): 547-563.
- [65] Verpoorten, M. 2012. Detecting Hidden Violence: The Spatial Distribution of Excess Mortality in Rwanda. *Political Geography*. 31 (1): 44 - 56.
- [66] **Verwimp, P.** 2000. Development Ideology, the Peasantry, and Genocide: Rwanda Represented in Habyarimana's Speeches, *Journal of Genocide Research*, Vol. 2, No 2.
- [67] Verwimp, P. 2003. Testing the Double-Genocide Thesis for Central and Southern Rwanda, *Journal of Conflict Resolution*, 47(4): 423-442.
- [68] Verwimp, P. 2005. An Economic Profile of Peasant Perpetrators of Genocide: Micro-level Evidence from Rwanda, *Journal of Development Economics*, 77(2):297-323.
- [69] Verwimp, P. 2006. Machetes and Firearms: the Organization of Massacres in Rwanda, *Journal of Peace Research*, 43(1):5-22.
- [70] Verwimp, P. 2013. Peasants in Power: The Political Economy of Development and Genocide in Rwanda, Springer, Heidelberg.
- [71] Viret E. 2010. Rwanda A Chronology (1867-1994), Online Encyclopedia of Mass Violence, published on 1 March 2010, accessed 27 October 2014, http://www.massviolence.org/ Rwanda-A-Chronology, ISSN 1961-9898.
- [72] Yanagizawa-Drott, D. 2014. Propaganda and Conflict: Evidence from the Rwandan Genocide, *Quarterly Journal of Economics*, 129(4), Forthcoming.

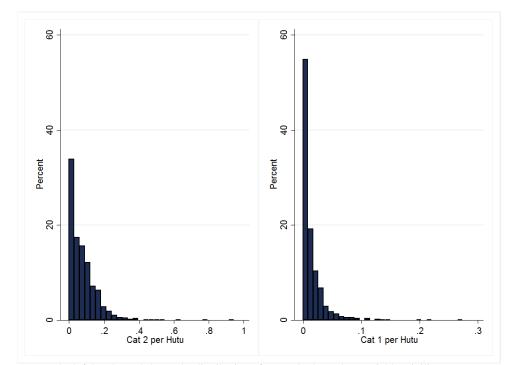
7 Appendix

7.1 Summary Statistics

	Mean	Std. Dev	Min	Max
Perpetrators				
Number of Category 2	290	286	0	2807
Number of Category 1	52	71	0	1145
Category 2 per Hutu	0.08	0.079	0	0.946
Category 1 per Hutu	0.01	0.021	0	0.274
Zero Perpetrators (=1)	0.05	0.223	0	1
Zero Category 2 Perpetrators (=1)	0.06	0.231	0	1
Zero Category 1 Perpetrators (=1)	0.11	0.318	0	1
Population				
Population in Sector 1991	4880	2481	555	32680
Hutu share in Commune (pct) 1991	0.87	0.087	0.49	0.98
Violence				
Pre-Genocide violence (=1)	0.15	0.361	0	1
Massgrave in Sector (=1)	0.05	0.210	0	1
Rainfall				
Avg Daily Rain Jan 1984-Sep 1990 (mm)	2.55	0.480	1.72	4.07
Avg Daily Rain Oct 1990-Mar 1994 (mm)	2.44	0.546	1.48	4.05
Number Sat Rain >10 mm	18.25	4.244	11	32
Number Sun Rain >10 mm	15.14	5.192	5	33
Number Mon Rain >10 mm	15.13	4.216	6	29
Number Tue Rain >10 mm	18.10	3.523	9	31
Number Wed Rain >10 mm	20.51	4.760	12	35
Number Thu Rain >10 mm	21.53	3.972	15	37
Number Fri Rain >10 mm	17.02	4.755	5	32
Num Public Holidays Rain >10 mm	0.85	0.197	0.556	1.369
Num Non-Religious Public Holidays Rain >10 mm	1.56	0.208	1.2	2.2
Num Religious Public Holidays Rain >10 mm	0.10	0.115	0.8	1.4
Administration				
Num of Sectors in Commune	11	3.7	6	27
Observations				
Sectors	1433			
Communes Provinces	142 11			

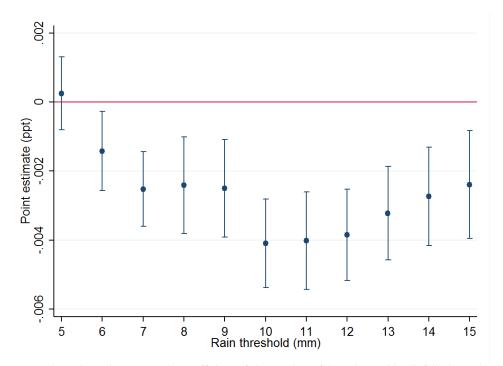
Table 6: Summary Statistics

Figure 1: Distribution of Perpetrators per Hutu



Notes: The left hand panel shows the distribution of our main dependent variable: civilian perpetrators per Hutu. This variable is defined as Category 2 perpetrators divided by the number of Hutus in 1991. The share of Hutus is only available on commune level. Hence, an implicit assumption that we make here is that the share of Hutus is the same in each sector within a commune. The right hand panel shows the distribution of organized perpetrators per Hutu.





Notes: The point estimates are the coefficient of the number of Saturdays with rainfall above the respective thresholds. They are the WLS estimates from our main specification where we use civilian perpetrators per Hutu as the dependent variable, and control for the number of all other weekdays with rainfall above the same threshold, average daily rainfall Jan 1984-Sep 1990, average daily rainfall Oct 1990-Mar 1994, and 142 commune indicators. The confidence intervals are based on the robust standard errors clustered at commune level.

7.2 Sensitivity Analysis for Category 1

Tables 7-10 report our sensitivity analyses for organized participation (category 1). As mentioned earlier, we expect this estimation to be less precise since the variation in this category is much lower than for civilian participation (category 2). Also, it is likely that a sizable fraction of the organized perpetrators did not live in the sector where they committed their genocide crimes and were prosecuted, since this category comprised to a large part of the mobile militia. They would hence not have been exposed to the same number of pre-genocide *Umuganda* meetings as the permanent of that sector. This is equivalent to having measurement error in the Saturday rainfall variable since the pre-genocide location of these individuals is measured with error. Therefore we expect the estimation for organized participation to suffer from attenuation bias. Across specifications, the coefficients on Saturday rainfall is negative, but as expected, the magnitude is small and the significance level varies.

7.2.1 Sensitivity Check of Rainfall Threshold

Dependent variable:			Cat 1 per H	utu		
Number rainy days above:	6 mm	8 mm	9 mm	10 mm	12 mm	
	(1)	(2)	(3)	(4)	(5)	
Saturday	0.00020	-0.00037	-0.00041	-0.00057*	-0.00072**	
	(0.00030)	(0.00032)	(0.00030)	(0.00030)	(0.00034)	
Sunday	-0.00022	0.00005	-0.00009	-0.00037	-0.00014	
	(0.00027)	(0.00034)	(0.00033)	(0.00031)	(0.00038)	
Monday	0.00021	0.00024	0.00051*	0.00100***	0.00060*	
	(0.00039)	(0.00034)	(0.00027)	(0.00031)	(0.00031)	
Tuesday	0.00020	0.00022	0.00011	-0.00046	0.00022	
	(0.00029)	(0.00031)	(0.00026)	(0.00030)	(0.00037)	
Wednesday	-0.00001	-0.00027	-0.00021	0.00007	-0.00016	
	(0.00027)	(0.00037)	(0.00035)	(0.00028)	(0.00036)	
Thursday	-0.00002	-0.00015	-0.00014	-0.00064	-0.00045	
	(0.00024)	(0.00036)	(0.00039)	(0.00041)	(0.00042)	
Friday	0.00023	0.00049	-0.00008	0.00006	-0.00026	
	(0.00031)	(0.00035)	(0.00030)	(0.00027)	(0.00035)	
Standard controls	yes	yes	yes	yes	yes	
Commune FE	yes	yes	yes	yes	yes	
R ²	0.36	0.36	0.36	0.37	0.36	
Ν	1433	1433	1433	1433	1433	

Table 7: Robustness - Different Rain Thresholds - Category 1

* p<0.10, ** p<0.05, *** p<0.01.

Notes: Results from weighted least squares (WLS) estimation use population size as weights, and the number of category 1 perpetrators per Hutu as the dependent variable. All models include average daily rainfall Jan 1984-Sep 1990, average daily rainfall Oct 1990-Mar 1994, and commune indicators. Main explanatory variables are number of weekdays in Oct 1990-Mar 1994 with rainfall above 6, 8, 9, 10, and 12 mm, respectively. Robust standard errors in parentheses are adjusted for clustering at the commune level.

7.2.2 Exclusion Restriction

Dependent variable:	Ca	t 1 per Hutu		
Sample:	Excl. Pre-Violence	Full S	Sample	
	(1)	(2)	(3)	
Number Sat>10	-0.00051	-0.00054*	-0.00055*	
	(0.00032)	(0.00028)	(0.00029)	
Number Sun>10	-0.00023	-0.00033	-0.00036	
	(0.00038)	(0.00031)	(0.00030)	
Number Mon>10	0.00103***	0.00101***	0.00101***	
	(0.00032)	(0.00031)	(0.00031)	
Number Tue>10	-0.00061*	-0.00035	-0.00035	
	(0.00031)	(0.00029)	(0.00031)	
Number Wed>10	0.00002	0.00001	0.00002	
	(0.00029)	(0.00029)	(0.00029)	
Number Thu>10	-0.00032	-0.00063	-0.00062	
	(0.00040)	(0.00043)	(0.00041)	
Number Fri>10	0.00031	0.00016	0.00025	
	(0.00026)	(0.00028)	(0.00030)	
Num Public Holidays >10		-0.01045*		
		(0.00556)		
Num Non-Religious Public Holidays >10			-0.00773**	
			(0.00357)	
Num Religious Public Holidays >10			-0.00829	
			(0.00872)	
Standard controls	yes	yes	yes	
Commune FE	yes	yes	yes	
R^2	0.36	0.37	0.37	
N	1213	1433	1433	

Table 8: Exclusion Restriction

* p<0.10, ** p<0.05, *** p<0.01.

Notes: Results from weighted least squares (WLS) estimation use population size as weights, and the number of perpetrators per Hutu as dependent variable. All models include average daily rainfall Jan 1984-Sep 1990, average daily rainfall Oct 1990-Mar 1994, and commune indicators. Column 1 and 3 control for number of public holidays with rainfall above 10 mm, excluding public holidays that fell on a Saturday. Column 1 exclude communes where violent acts have been reported for the period Oct 1990-Mar 1994. Column 2 includes number of public holidays with rainfall above 10 mm during the same period, excluding those on a Saturday. Column 3 separately controls for the number of religious and non-religious public holidays with rainfall above 10 mm. Robust standard errors in parentheses are adjusted for clustering at the commune level.

7.2.3 Robustness check

Dependent variable:		Cat 1 per Hutu	
Sample:	Full Sample	Excl. Massgraves	Excl. Kigali Ville
	(1)	(2)	(3)
Number Sat>10	-0.00059**	-0.00048*	-0.00061**
	(0.00030)	(0.00028)	(0.00030)
Number Sun>10	-0.00040	-0.00030	-0.00041
	(0.00031)	(0.00031)	(0.00032)
Number Mon>10	0.00096***	0.00084***	0.00096***
	(0.00031)	(0.00028)	(0.00031)
Number Tue>10	-0.00049*	-0.00039	-0.00049
	(0.00029)	(0.00030)	(0.00030)
Number Wed>10	0.00003	0.00007	0.00002
	(0.00028)	(0.00028)	(0.00030)
Number Thu>10	-0.00065	-0.00063	-0.00062
	(0.00041)	(0.00041)	(0.00040)
Number Fri>10	0.00003	0.00012	0.00006
	(0.00026)	(0.00025)	(0.00027)
Standard controls	yes	yes	yes
Commune FE	yes	yes	yes
\mathbb{R}^2	0.37	0.37	0.37
Ν	1433	1367	1422

Table 9: Robustness - Excl. Massgraves and Kigali Ville

* p<0.10, ** p<0.05, *** p<0.01.

Notes: Results from weighted least squares (WLS) estimation use population size as weights, and the number of perpetrators per Hutu as the dependent variable. All models include average daily rainfall Jan 1984-Sep 1990, average daily rainfall Oct 1990-Mar 1994, and commune indicators. Column 1 is our main specification for category 1 per Hutu. Column 2 excludes 66 sectors where at least one mass-grave has been found. Column 3 excludes the 11 sectors in the province Kigali Ville. Robust standard errors in parentheses are adjusted for clustering at the commune level.

7.2.4 Placebo check

Dependent variable:		Cat 1 per Huti	1
	(1)	(2)	(3)
Number Sat>10	-0.00059**		-0.00070**
	(0.00030)		(0.00030)
Number Sun>10	-0.00040		-0.00035
	(0.00031)		(0.00030)
Number Mon>10	0.00096***		0.00102***
	(0.00031)		(0.00032)
Number Tue>10	-0.00049*		-0.00040
	(0.00029)		(0.00030)
Number Wed>10	0.00003		0.00008
	(0.00028)		(0.00027)
Number Thu>10	-0.00065		-0.00054
	(0.00041)		(0.00040)
Number Fri>10	0.00003		0.00016
	(0.00026)		(0.00026)
Number Sat> 10 1994-1998		0.00000	0.00013
		(0.00027)	(0.00028)
Number Sun> 10 1994-1998		0.00076**	0.00073**
		(0.00033)	(0.00031)
Number Mon> 10 1994-1998		-0.00062*	-0.00060**
		(0.00033)	(0.00030)
Number Tue> 10 1994-1998		0.00038	0.00042
		(0.00040)	(0.00036)
Number Wed> 10 1994-1998		-0.00024	-0.00034
		(0.00037)	(0.00034)
Number Thu> 10 1994-1998		-0.00023	-0.00027
		(0.00034)	(0.00034)
Number Fri> 10 1994-1998		0.00037	0.00048*
		(0.00027)	(0.00025)
Standard controls	yes	yes	yes
Commune FE	yes	yes	yes
R ²	0.37	0.36	0.38
Ν	1433	1433	1433

Table 10: Placebo Rainfall Oct 1994-Mar 1998

* p<0.10, ** p<0.05, *** p<0.01.

Notes: Results from weighted least squares (WLS) estimation use population size as weights, and the number of perpetrators per Hutu as the dependent variable. All models include average daily rainfall Jan 1984-Sep 1990, average daily rainfall Oct 1990-Mar 1994, and commune indicators. Column 1 is our main specification for category 1 per Hutu. Column 2 uses number of weekdays with rainfall above 10 mm during Oct 1994-Mar 1998 as main explanatory variables. Column 3 adds the number of weekdays with rainfall above 10 mm during Oct 1994-Mar 1998 as additional controls to our main specification. Robust standard errors in parentheses are adjusted for clustering at the commune level.

7.3 Additional Sensitivity Analysis for Category 1 and 2

Table 11 shows the result of a linear specification using average daily rainfall on Saturdays October 1990-March 1994 as the main explanatory variable, controlling for average daily rainfall on all other weekdays during the same period, average daily rainfall in January 1984-September 1990, and 142 commune indicators. The point estimate on Saturday rainfall for civilian violence suggests that the participation rate, on average, decreased by 4.1 percentage points for each additional mm of rainfall. This effect is larger than the estimated effect in our main specification: a one standard deviation increase in average rainfall on Saturdays is estimated to reduce the average civilian participation rate by 2.5 percentage points, while a one standard deviation increase in the number of Saturdays with rain above 10 mm is estimated to reduce the average civilian participation rate by 1.7 percentage points.

Table 12 reports the results from unweighted OLS regressions with clustered standard errors on commune level (column 1-2), and with standard errors allowing for spatial correlation within a certain radius of the sector following Conley (1999) (column 3-8). Results are presented using a radius of 25 km, 50 km, and 75 km, respectively. The statistical significance of the coefficient on Saturday rainfall is stronger for civilian participation for all three radii compared to using robust standard errors adjusted for clustering on commune level. For organized participation, the statistical significance of the point estimate of Saturday rainfall is more sensitive to the choice of radius.

Table 13 reports the results of estimating our main specifications for civilian and organized participation using unweighted OLS, with and without clustered standard errors. The results are basically unchanged.

As a final robustness check, Table 14-16 report the results of separately excluding areas with pregenocide violence (column 2), including public holidays (column 3), excluding areas with mass graves (column 4), and excluding the sectors in Kigali Ville (column 5), using the number of weekdays with rainfall above 8 mm, 9 mm, and 12 mm, respectively, as the main explanatory and control variables. The point estimates for the number of Saturdays with rainfall above these different thresholds are basically the same across all thresholds and robustness checks.

Dependent variable:	Cat 2 per Hutu	Cat 1 per Hutu
	(1)	(2)
Avg rain Sat	-0.04088**	-0.00562
-	(0.01604)	(0.00353)
Avg rain Sun	0.00522	-0.00181
-	(0.01863)	(0.00475)
Avg rain Mon	0.00296	0.00500
	(0.01534)	(0.00434)
Avg rain Tue	0.01357	0.00277
	(0.01321)	(0.00427)
Avg rain Wed	0.01707	-0.00100
	(0.01437)	(0.00300)
Avg rain Thu	-0.00091	-0.00056
	(0.01071)	(0.00279)
Avg rain Fri	0.00250	-0.00007
	(0.01010)	(0.00233)
Standard controls	yes	yes
Commune FE	yes	yes
R ²	0.51	0.36
Ν	1433	1433

Table 11: Linear Specification

Notes: Results from weighted least squares (WLS) estimation use population size as weights, and the number of perpetrators per Hutu as the dependent variable. All models include average daily rainfall Jan 1984-Sep 1990, and 142 commune indicators. Robust standard errors in parentheses are adjusted for clustering at the commune level.

Model:	OLS with C	Clustered SE			OLS with C	Conley SE		
Dependent variable:	Cat 2 per Hutu	Cat 1 per Hutu	Cat 2 per Hutu			Cat1 per Hutu		
_	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
Number Sat>10	-0.00382** (0.00153)	-0.00055 (0.00038)	-0.00382*** (0.00129)	-0.00382*** (0.00135)	-0.00382*** (0.00135)	-0.00055 (0.00035)	-0.00055* (0.00030)	-0.00055** (0.00027)
Number Sun>10	0.00052 (0.00124)	-0.00035 (0.00036)	0.00052 (0.00099)	0.00052 (0.00090)	0.00052 (0.00082)	-0.00035 (0.00032)	-0.00035 (0.00033)	-0.00035 (0.00031)
Number Mon>10	0.00139 (0.00117)	0.00117*** (0.00036)	0.00139 (0.00097)	0.00139 (0.00109)	0.00139 (0.00110)	0.00117*** (0.00034)	0.00117*** (0.00038)	0.00117***
Number Tue>10	0.00063 (0.00092)	-0.00053 (0.00033)	0.00063 (0.00105)	0.00063 (0.00119)	0.00063 (0.00114)	-0.00053* (0.00029)	-0.00053* (0.00028)	-0.00053** (0.00026)
Number Wed>10	0.00078 (0.00128)	0.00005 (0.00037)	0.00078 (0.00108)	0.00078 (0.00093)	0.00078 (0.00088)	0.00005	0.00005 (0.00024)	0.00005 (0.00021)
Number Thu>10	0.00018 (0.00152)	-0.00048 (0.00049)	0.00018 (0.00126)	0.00018 (0.00136)	0.00018 (0.00150)	-0.00048 (0.00036)	-0.00048 (0.00036)	-0.00048 (0.00034)
Number Fri>10	-0.00047 (0.00118)	0.00000 (0.00032)	-0.00047 (0.00112)	-0.00047 (0.00105)	-0.00047 (0.00091)	0.00000 (0.00027)	0.00000 (0.00029)	0.00000 (0.00029)
Standard controls	yes	yes	yes	yes	yes	yes	yes	yes
Commune FE Radius	yes	yes	yes 25 km	yes 50 km	yes 75 km	yes 25 km	yes 50 km	yes 75 km
Ν	1433	1433	1433	1433	1433	1433	1433	1433

Table 12: Robustness check - Conley Standard Errors

*significant at 10 percent, **significant at 5 percent, ***significant at 1 percent.

Notes: Column 2-3 report the results from ordinary least squares (OLS) estimation without population weights, using the number of perpetrators per Hutu as dependent variable, and robust standard errors in parentheses are adjusted for clustering at the commune level. Column 4-6 report the results from OLS estimation with Conley standard errors allowing for spatial correlation within a radius of 25, 50 and 75 km respectively, using Cat 2 per Hutu as the dependent variable. Column 7-9 report the results from OLS estimation with Conley standard errors for the same three radii, using Cat 1 per Hutu as the dependent variable. All models include average daily rainfall Jan 1984-Sep 1990, average daily rainfall Oct 1990-Mar 1994, and 142 commune indicators.

Model:	Unweigh	nted OLS	Unweighted OLS no clustering		
Dependent variable:	Cat 2 per Hutu	Cat 1 per Hutu	Cat 2 per Hutu	Cat 1 per Hutu	
	(1)	(2)	(3)	(4)	
Number Sat>10	-0.00382**	-0.00055	-0.00382***	-0.00055	
	(0.00153)	(0.00038)	(0.00126)	(0.00035)	
Number Sun>10	0.00052	-0.00035	0.00052	-0.00035	
	(0.00124)	(0.00036)	(0.00111)	(0.00031)	
Number Mon>10	0.00139	0.00117***	0.00139	0.00117***	
	(0.00117)	(0.00036)	(0.00100)	(0.00034)	
Number Tue>10	0.00063	-0.00053	0.00063	-0.00053*	
	(0.00092)	(0.00033)	(0.00090)	(0.00031)	
Number Wed>10	0.00078	0.00005	0.00078	0.00005	
	(0.00128)	(0.00037)	(0.00107)	(0.00033)	
Number Thu>10	0.00018	-0.00048	0.00018	-0.00048	
	(0.00152)	(0.00049)	(0.00104)	(0.00034)	
Number Fri>10	-0.00047	0.00000	-0.00047	0.00000	
	(0.00118)	(0.00032)	(0.00103)	(0.00027)	
Standard controls	yes	yes	yes	yes	
Commune FE	yes	yes	yes	yes	
R ²	0.48	0.37	0.48	0.37	
Ν	1433	1433	1433	1433	

Table 13: Robustness check - Unweighted OLS with and without Clustered SE

Notes: Column 2-3 report the results from ordinary least squares (OLS) estimation without population weights, using the number of perpetrators per Hutu as the dependent variable. Robust standard errors are adjusted for clustering at commune level. Column 3-4 report the same results as in Column 1-2 with the only difference that the robust standard errors in parentheses are not adjusted for clustering at the commune level. All models include average daily rainfall Jan 1984-Sep 1990, average daily rainfall Oct 1990-Mar 1994, and 142 commune indicators.

Dependent variable:	Cat 2 per Hutu					
	Full Sample	Excl. pre-vio	Incl. pub. hol.	Excl. mass grave	Excl. Kigali Ville	
	(1)	(2)	(3)	(4)	(5)	
Number Sat>8	-0.00241*	-0.00261	-0.00245*	-0.00249*	-0.00240*	
	(0.00140)	(0.00171)	(0.00134)	(0.00138)	(0.00140)	
Number Sun>8	0.00068	0.00018	0.00064	0.00080	0.00071	
	(0.00124)	(0.00152)	(0.00124)	(0.00126)	(0.00127)	
Number Mon>8	0.00009	0.00074	0.00007	-0.00022	0.00025	
	(0.00118)	(0.00142)	(0.00116)	(0.00115)	(0.00119)	
Number Tue>8	0.00000	0.00007	-0.00000	0.00055	-0.00003	
	(0.00123)	(0.00145)	(0.00123)	(0.00120)	(0.00123)	
Number Wed>8	0.00043	0.00061	0.00041	0.00065	0.00058	
	(0.00111)	(0.00131)	(0.00112)	(0.00109)	(0.00113)	
Number Thu>8	0.00004	0.00110	0.00004	-0.00013	0.00001	
	(0.00107)	(0.00128)	(0.00107)	(0.00106)	(0.00109)	
Number Fri>8	0.00106	0.00140	0.00101	0.00119	0.00117	
	(0.00094)	(0.00113)	(0.00098)	(0.00095)	(0.00094)	
Num Public Holidays >8			0.00491			
			(0.01629)			
Standard controls	yes	yes	yes	yes	yes	
Commune FE	yes	yes	yes	yes	yes	
R ²	0.51	0.48	0.51	0.51	0.51	
Ν	1433	1213	1433	1367	1422	

Table 14: Robustness	s checks for	threshold 8 mm
----------------------	--------------	----------------

Notes: Results from weighted least squares (WLS) estimation use population size as weights, and the number of category 2 perpetrators per Hutu as the dependent variable. The rainfall measures are the number of weekdays with daily rainfall above 8 mm in the period Oct 1990-Mar 1994. All models include average daily rainfall Jan 1984-Sep 1990, average daily rainfall Oct 1990-Mar 1994, and 142 commune indicators. Robust standard errors in parentheses are adjusted for clustering at the commune level.

Dependent variable:	Cat 2 per Hutu					
	Full Sample	Excl. pre-vio	Incl. pub. hol.	Excl. mass grave	Excl. Kigali Ville	
	(1)	(2)	(3)	(4)	(5)	
Number Sat>9	-0.00250*	-0.00250	-0.00248*	-0.00251*	-0.00259*	
	(0.00141)	(0.00178)	(0.00139)	(0.00139)	(0.00143)	
Number Sun>9	0.00073	-0.00006	0.00078	0.00099	0.00082	
	(0.00117)	(0.00136)	(0.00119)	(0.00118)	(0.00120)	
Number Mon>9	0.00079	0.00113	0.00080	0.00034	0.00083	
	(0.00117)	(0.00137)	(0.00115)	(0.00122)	(0.00119)	
Number Tue>9	0.00069	0.00085	0.00075	0.00122	0.00078	
	(0.00099)	(0.00118)	(0.00099)	(0.00102)	(0.00101)	
Number Wed>9	-0.00065	-0.00124	-0.00063	-0.00081	-0.00063	
	(0.00106)	(0.00121)	(0.00105)	(0.00105)	(0.00107)	
Number Thu>9	0.00140	0.00271*	0.00141	0.00141	0.00135	
	(0.00123)	(0.00149)	(0.00124)	(0.00122)	(0.00123)	
Number Fri>9	-0.00079	-0.00054	-0.00074	-0.00047	-0.00070	
	(0.00086)	(0.00105)	(0.00095)	(0.00089)	(0.00089)	
Num Public Holidays >9			-0.00649			
			(0.02057)			
Standard controls	yes	yes	yes	yes	yes	
Commune FE	yes	yes	yes	yes	yes	
R ²	0.51	0.49	0.51	0.51	0.51	
Ν	1433	1213	1433	1367	1422	

Table 15: Robustness checks for threshold 9 m	ım
---	----

Notes: Results from weighted least squares (WLS) estimation use population size as weights, and the number of category 2 perpetrators per Hutu as the dependent variable. The rainfall measures are the number of weekdays with daily rainfall above 9 mm in the period Oct 1990-Mar 1994. All models include average daily rainfall Jan 1984-Sep 1990, average daily rainfall Oct 1990-Mar 1994, and 142 commune indicators. Robust standard errors in parentheses are adjusted for clustering at the commune level.

Dependent variable:	Cat 2 per Hutu					
	Full Sample	Excl. pre-vio	Incl. pub. hol.	Excl. mass grave	Excl. Kigali Ville	
	(1)	(2)	(3)	(4)	(5)	
Number Sat>12	-0.00385***	-0.00403**	-0.00387***	-0.00375***	-0.00390***	
	(0.00132)	(0.00165)	(0.00129)	(0.00135)	(0.00133)	
Number Sun>12	-0.00043	-0.00061	-0.00050	-0.00027	-0.00066	
	(0.00137)	(0.00157)	(0.00146)	(0.00139)	(0.00148)	
Number Mon>12	-0.00053	-0.00072	-0.00054	-0.00044	-0.00040	
	(0.00120)	(0.00141)	(0.00119)	(0.00112)	(0.00121)	
Number Tue>12	0.00135	0.00071	0.00131	0.00180	0.00147	
	(0.00123)	(0.00139)	(0.00123)	(0.00126)	(0.00122)	
Number Wed>12	-0.00058	-0.00093	-0.00061	-0.00050	-0.00091	
	(0.00118)	(0.00138)	(0.00115)	(0.00117)	(0.00135)	
Number Thu>12	-0.00233**	-0.00186	-0.00236**	-0.00235**	-0.00234**	
	(0.00107)	(0.00113)	(0.00108)	(0.00112)	(0.00111)	
Number Fri>12	-0.00216	-0.00229	-0.00224	-0.00189	-0.00232*	
	(0.00137)	(0.00184)	(0.00153)	(0.00133)	(0.00137)	
Num Public Holidays >12			0.00487			
			(0.02632)			
Standard controls	yes	yes	yes	yes	yes	
Commune FE	yes	yes	yes	yes	yes	
R ²	0.52	0.49	0.52	0.51	0.52	
Ν	1433	1213	1433	1367	1422	

Table 16: Robustness checks for threshold 12 mm	1
---	---

Notes: Results from weighted least squares (WLS) estimation use population size as weights, and the number of category 2 perpetrators per Hutu as the dependent variable. The rainfall measures are the number of weekdays with daily rainfall above 12 mm in the period Oct 1990-Mar 1994. All models include average daily rainfall Jan 1984-Sep 1990, average daily rainfall Oct 1990-Mar 1994, and 142 commune indicators. Robust standard errors in parentheses are adjusted for clustering at the commune level.

WORKING PAPERS^{*} Editor: Nils Gottfries

- 2013:3 Michihito Ando, Estimating the effects of nuclear power facilities on local income levels: A quasi-experimental approach. 44 pp.
- 2013:4 Matz Dahlberg, Karin Edmak and Heléne Lundqvist, Ethnic Diversity and Preferences for Redistribution: Reply. 23 pp.
- 2013:5 Ali Sina Önder and Marko Terviö, Is Economics a House Divided? Analysis of Citation Networks. 20 pp.
- 2013:6 Per Engström and Eskil Forsell, Demand effects of consumers' stated and revealed preferences. 27 pp.
- 2013:7 Che-Yuan Liang, Optimal Inequality behind the Veil of Ignorance. 26 pp.
- 2013:8 Pia Fromlet, Monetary Policy Under Discretion Or Commitment? -An Empirical Study. 57 pp.
- 2013:9 Olof Åslund and Mattias Engdahl, Open borders, transport links and local labor markets. 41 pp.
- 2013:10 Mohammad Sepahvand, Roujman Shahbazian and Ranjula Bali Swain, Time Investment by Parents in Cognitive and Non-cognitive Childcare Activities. 31 pp.
- 2013:11 Miia Bask and Mikael Bask, Social Influence and the Matthew Mechanism: The Case of an Artificial Cultural Market. 13 pp
- 2013:12 Alex Solis, Credit access and college enrollment. 54 pp
- 2013:13 Alex Solis, Does Higher Education Cause Political Participation?: Evidence From a Regression Discontinuity Design. 48 pp.
- 2013:14 Jonas Kolsrud, Precaution and Risk Aversion: Decomposing the Effect of Unemployment Benefits on Saving. 37 pp.
- 2013:15 Helena Svaleryd, Self-employment and the local business cycle. 28 pp.
- 2013:16 Tobias Lindhe and Jan Södersten, Distortive Effects of Dividend Taxation. 22 pp.
- 2013:17 Jonas Poulsen, After Apartheid: The Effects of ANC Power. 42 pp.
- 2013:18 Magnus Gustavsson, Permanent versus Transitory Wage Differentials and the Inequality-Hours Hypothesis. 11 pp.
- 2013:19 Lovisa Persson, Consumption smoothing in a balanced budget regim. 35 pp.

^{*} A list of papers in this series from earlier years will be sent on request by the department.

- 2013:20 Linuz Aggeborn, Voter Turnout and the Size of Government. 50 pp.
- 2013:21 Niklas Bengtsson, Stefan Peterson and Fredrik Sävje, Revisiting the Educational Effects of Fetal Iodine Deficiency. 48 pp
- 2013:22 Michihito Ando, How Much Should We Trust Regression-Kink-Design Estimates? 69 pp.
- 2013:23 Bertil Holmlund, What do labor market institutions do? 25 pp.
- 2014:1 Oscar Erixson and Henry Ohlsson, Estate division: Equal sharing as choice, social norm, and legal requirement. 45 pp.
- 2014:2 Eva Mörk, Anna Sjögren and Helena Svaleryd, Parental unemployment and child health. 35 pp.
- 2014:3 Pedro Carneiro, Emanuela Galasso and Rita Ginja, Tackling Social Exclusion: Evidence from Chile. 87 pp.
- 2014:4 Mikael Elinder och Lovisa Persson, Property taxation, bounded rationality and housing prices. 38 pp.
- 2014:5 Daniel Waldenström, Swedish stock and bond returns, 1856–2012. 51 pp.
- 2014:6 Mikael Carlsson, Selection Effects in Producer-Price Setting. 34 pp.
- 2014:7 Ranjula Bali Swain and Fan Yang Wallentin, The impact of microfinance on factors empowering women: Differences in regional and delivery mechanisms in India's SHG programme. 28 pp.
- 2014:8 Ashim Kumar Kar and Ranjula Bali Swain, Competition, performance and portfolio quality in microfinance markets. 33 pp.
- 2014:9 Shyam Ranganathan, Ranjula Bali Swain and David J.T. Sumpter, A DYNAMICAL SYSTEMS APPROACH TO MODELING HUMAN DEVELOPMENT. 42 pp.
- 2014:10 Shyam Ranganathan and Ranjula Bali Swain, Analysing Mechanisms for Meeting Global Emissions Target - A Dynamical Systems Approach. 40 pp.
- 2014:11 Chuan-Zhong Li and Ranjula Bali Swain, Growth, Water Resilience, and Sustainability: A DSGE Model Applied to South Africa. 21pp.
- 2015:1 Evelina Bonnier, Jonas Poulsen, Thorsten Rogall and Miri Stryjan, Preparing for Genocide: Community Work in Rwanda. 40 pp.

See also working papers published by the Office of Labour Market Policy Evaluation http://www.ifau.se/ ISSN 1653-6975