

We have a theory!

Abstract

We do many things with imaginary models and useless data.

Introduction

Central puzzle: why do armed groups victimize?

Pull anecdotes from data

Novel contribution:

Civilian Victimization During War

The study of civilian victimization has largely focused on key characteristics of armed groups, such as a group's fighting capability Wood (2010), resource base Azam and Hoefler (2002*a*) and external support (Idean Salehyan and Wood, 2015). Yet these studies also acknowledge that an armed actor's relationship with civilians is conditional on the conflict landscape at large, wherein the decisions of armed actors are informed by the actions of other armed challengers and the civilian population. As (Wood, 2010, p. 612) explains, "Unraveling these dynamics is particularly important if scholars wish to fully understand the dense web of interactions that guide insurgent's decisions to use violence." Drawing on the intuition that the networked dynamics of armed actors influence violence against civilians, we develop an agent-based model that incorporates insights about how the interdependent nature of multi-party intrastate conflicts influences armed actors' decision to harm civilians.

In this model, a country is composed of territories, filled with two types of actors: civilians and armed actors. Armed actors represent both rebel groups and governments. The main difference between the two groups is that the government controls more territory than non-state actors. Armed actors' primary motivation is to hold territory containing resources that can be mobilized (Kalyvas, 2006). Failing this, actors prefer that territory be held by groups with similar preferences. The other main actors in this model are civilians. Civilians are primarily motivated by their personal safety; their secondary

motivation is ideological. The inclusion of civilian preferences follows research on rebel-civilian relationships which underscore civilian agency in conflict areas Mampilly (2011); Kasfir (2015); Arjona (2017). *Ceteris paribus*, civilians would prefer that their territory be held by groups with similar political preferences. When political preferences align, even if weakly, all actors experience the benefits of political stability and resource sharing.

In our model, we characterize armed groups using two variables, a measure of their ideal point (x_i) on a one-dimensional preference space, and a measure of how ideological they are (ϕ_i). Groups that are more ideological benefit (suffer) more from having other groups with similar (dissimilar) preferences controlling territory, and thus have less (more) motivation to fight them.¹ In particular, we define the utility group i gets from things that affect group j as:

$$\alpha_{i,j} = 2\phi * (.5 - |x_i - x_j|) \quad (1)$$

Civilians are similarly characterized by their ideal point (η_i), but whereas the ideal points of the armed groups are public, armed groups cannot directly observe the preferences of the civilian population.

In this game, armed actors draw resources from civilian mobilization. This “instrumentalist” perspective follows from research highlighting victimization as a strategic choice shaped by the desire to control resources and territory while influence civilian support and undermining support for opponent groups (Wood, 2014).² To extract resources, armed actors try to mobilize support from the civilian population and gain more resources as

¹We treat the government actor as non-ideological, because in most cases a government will not allow a strong challenger to hold territory simply because they have politically congenial views.

²A modification of the game would be to allow for groups to have natural resources or foreign support which depends on territorial control but not civilian support) [add literature on different types of resources here]

support increases. Furthermore, when the territory civilians are inhabiting is under attack from another harmed actor, civilians can choose to support the attacking group in order to increase their likelihood of victory.

Each type of actor in the game has two potential actions they can take. Civilians, as discussed above, choose whether to support an armed group and which group to support. In addition, civilians can choose to move from one territory to another one in search of a more congenial (or less indiscriminately violent) government, though the cost is high, and civilians are more likely to do so as the conflict drags on. Armed actors can choose to attack other armed actors in order to conquer additional territory, and gain more resources, and they can victimize civilians in territory they control.

When an armed actor attacks another territory, each group involved in the territory has a probability of winning based on their share of spatially weighted resources. To calculate resources, we award full credit to areas where armed actors have both control of the territory and civilian support. Armed actors are given partial credit for territories with non-supporters, except in regions where fighting is on-going in which case a group loses resources based on civilians supporting the opposing armed actor in the territory. The nexus of civilian-armed group relations follows previous scholarship on the incentives for civilian abuse which argues that both governments and non-state actors target the population in order to gain support or shift support away from their opponent (Valentino, 2014; Azam and Hoeffler, 2002*b*; Kalyvas, 2006; Wood, 2010).

A group decides which territory to attack by looking at all territories they border, and compares their utility for attacking that territory compared to doing nothing. If the group wins, they take control of the territory, and in any case, resources are lost and civilians die in all territories that are the source or target of an attack.³.

³We can think of the civilians killed in the source of attack as civilians that are mobilized and

Armed actors can choose to victimize civilians in territories they control. The likelihood that they will victimize a non-supporter is based on how much information they are able to obtain from their supporters in the population (Lyall, Shiraito and Imai, 2015). Groups are more likely to accurately (selectively) victimize as the number of supporters in the territory increases.⁴ In this model selective violence is effective at coercing civilians into giving support, whereas indiscriminate violence (killing ones' own supporters) is counterproductive – when an actor kills a supporter, the range of ideologies that will provide support to the actor shrinks (since the safety provided by supporting the actor is illusory) and when they kill a non-supporter, the range of ideologies grow.⁵

Each actor in the game chooses their behavior based on decision rules that correspond to their priorities. When civilians choose whether or not to support an armed group, they do so fully cognizant of the risk of violence. In particular, if the territory is not the site of a battle, civilian's decision on who to support is based on their expectation of who other civilians will support. This is because if they believe other civilians will support the incumbent power in a region, it becomes more necessary to “go along” with it in order to avoid the risk of violence. Each other civilian is assumed to support the incumbent with probability based on their inverse ideological distance (so civilians will support a maximally close group all of the time, and never support the maximally distant group). Civilians will then support the group if their ideological distance, modified by the effect of past victimizations, is less than half of the expected number of other supporters of

participate in the attack, or victims of counterattacks

⁴An exception here is when they have either all supporters, or no supporters. In the first case, the decision rule prohibits them from victimizing. In the second case, there is no risk of unintentionally killing a supporter since there are no supporters to kill.

⁵Fjelde and Hultman (2014) show that that the number of civilians targeted by armed groups (government and non-state alike) is higher in areas populated by the enemy's ethnic constituency.

the armed group (so again *ceteris paribus*, civilians will support a maximally close group regardless of the number of other supporters. If the civilian is half the preference space away, then she will only support the armed group if they are supported by the rest of the population, or if they have a history of very effective victimization). If a territory is the site of a battle, the calculations for civilians change. Now civilians seek to trade off between ideological distance and the chance a group will triumph. In particular, civilians choose to support the group that has the greatest product of inverse ideological distance and expected probability of victory.

[\[We need to follow this up with plain language or an example/lit\]](#)

When civilians decide whether to remain in a territory they are not simply looking for the best armed actor controlling a territory, they are also dislocating and often paying serious material costs. Thus, we model the decision to flee as beginning with a high threshold and becoming more plausible over the course of the conflict.

When armed actors choose to victimize civilians, their decision is influenced by the likelihood that this victimization will be successful. We define this probability⁶ as:

$$\zeta_q \equiv P(\text{selective victimization in territory } q) = 1 - \epsilon \frac{||\text{nonsupporters}|| + 1}{||\text{civilians}||} \quad (2)$$

where ϵ is the baseline rate of error in the case where all but one civilian supports the armed actor. The decision rule for whether to commit victimization depends in part on the risk of battle in the region. If no armed actor in a neighboring region would prefer attacking the region at hand, then the armed actor chooses to victimize in order to maximize resources extracted. Thus, they victimize if the expected increase in supporters

⁶Except in the edgcase where there are no supporters or no nonsupporters.

from victimizing outweighs the benefit of having a non-supporter still providing some resources. On the other hand, if there is a risk of battle in the next period, the same calculus instead applies to how in expectation victimization will effect the probability of victory in a potential battle.

Finally, when it comes to the decision to attack a territory, armed actors compare the expected probability of victory, the resources gained, and the costs to the status quo. The status quo includes positive utility that ideological groups might obtain from having ideologically proximate groups still in control of a territory. The cost of conflict is that civilians will be killed in both the attacking and target territory regardless, and that will reduce a groups stock of resources.

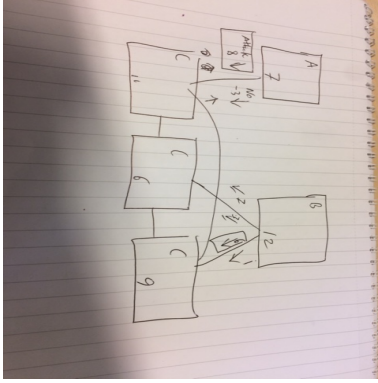
A given round of this game will proceed as follows:

1. Armed actors choose which territories to invade.

When an armed actor attacks another territory, each group involved in the territory has a probability of winning based on their share of spatially weighted resources. In particular, we call the local resources of group i in territory L :

$$\Gamma_{i,L} = \sum_l \delta^{d_{l,L}} (x_{s,i,l} + cx_{ns,i,l} - kx_{o,i,l}) \quad (3)$$

where δ is the spatial discount factor – how much less useful distant resources are than proximate ones – $d_{l,L}$ is the distance from region l to L , $n_{s,i,l}$ are the number of supporters of group i in territory l , $n_{ns,i,l}$ are non-supporters of i in l , and $n_{o,i,l}$ are the number of opponents of group i in territory l as long as territory l is part of the “battlefield” – the set of territories that are either the source or the target of the battle in question. To calculate resources, we award full credit to areas where armed actors have both control of the territory and civilian support. Armed actors are given partial credit for territories with non-supporters, except in regions where fighting is on-going in which case a group loses resources based on civilians supporting the opposing armed actor in the territory. The nexus of civilian-armed group relations follows previous scholarship on the incentives for civilian abuse which argues that both governments and non-state actors target the population in order to gain support or shift support away from their opponent (Valentino, 2014; Azam and Hoeffler, 2002b; Kalyvas, 2006; Wood, 2010).



For each group in the battle, the probability of winning is:

$$p_{i,L} \equiv P(i \text{ wins in territory } L) = \frac{\Gamma_{i,L}}{\sum_j \Gamma_{j,L}} \quad (4)$$

A group decides which territory to attack by looking at all territories they border, and compares their utility for attacking that territory compared to doing nothing. In particular, for each territory, they look at:

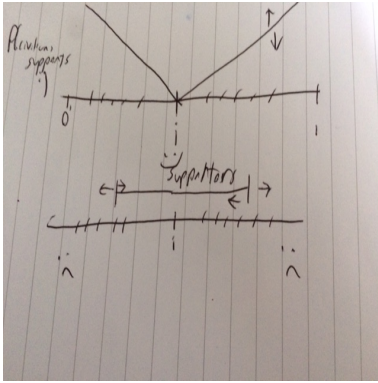
$$\sum_{g \in G} E(p_{g,L}|G) \alpha_{i,j} (R - c) \quad (5)$$

where G are the groups already committed to battle within a territory, R is the number of civilians within a territory, c is the cost of war. Specifically, what is going on, is that the potential attacker is looking at how much utility they will gain from attacking a territory compared to how much utility they will gain from the territory if they do nothing. We include the expectation here because at the time of the choice, who civilians will support are unknown⁷, and so armed groups estimate this likelihood of victory using either their prior beliefs about the distribution of civilian preferences, or the past actions taken by civilians in a territory towards a particular armed group. The difference between these two factors is their payoff for attacking that territory. They then choose to attack in the territory where there will be the biggest improvement from attacking compared to the status quo (or if none of these are positive, they attack nowhere).

2. Civilians choose whether to support armed actors.

When civilians choose who to support, they assume that other civilians will make support decisions probabilistically based on their proximity to armed groups, such

⁷We will determine this in equations 7 and 8 in the next stage.



that:

$$E(P(\text{Civilian } l \text{ supports Group } i)) \equiv \max(\min(1 - |x_i - \eta_l| + v * \chi_j, 1), 0) \quad (6)$$

If no battle is taking place in territory l , civilians will support an armed group i if:

$$\frac{E(n_{s,i,l}^-)}{2} > |x_i - \eta_j| + v * \chi_j \quad (7)$$

where χ_i is the net discriminatory of victimization by group i , which decreases (increases) when they victimize a (non-)supporter and v is the penalty for indiscriminately victimizing civilians. On the other hand when a battle is taking place in a territory l , civilian h will support group g such that:

$$\operatorname{argmax}_{(g \in G)} E(p_{g,l}) * (1 - |x_g - \eta_h| + v * \chi_g) \quad (8)$$

Choosing the group that gives them the best combination of plausibly winning the battle and ideological congruence.

3. Battles take place and winners are determined.

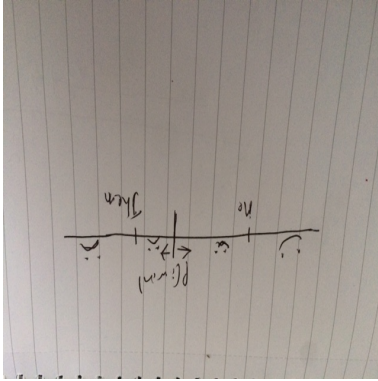
This occurs as discussed above in equation 4, in each territory, c civilians at random are removed.

4. Armed actors choose in which territories to victimize.

Armed actors first determine if each territory is at risk of an attack next period. This means a group i will evaluate, for each neighbor j and territory they control q , whether:

$$\alpha_{j,i} R_q < E(p_{i,q}) \alpha_{j,i} (R_q - c) + E(p_{j,q}) (R_q - c) \quad (9)$$

any territory where this is true for all neighbors j , the armed group will victimize



to maximize their potential of winning in a future period. If it is not true, they will victimize in order to maximize the resources they get in a future period.

Armed groups believe that the percent of the preference space made by their supporters is $s \equiv \frac{x_{s,i,q}}{x_{ns,i,q} + x_{s,i,q}} + v * \chi_i$. The percent believed to be composed by non-supporters is of course $1 - s$. If the territory is not at risk of attack, the group will victimize if:

$$\zeta_q * \left(\frac{v * (1 - c) * n_{ns,i,q-1}}{(1 - s)} - c \right) - (1 - \zeta_q) * \left(\frac{v * (1 - c) * n_{s,i,q-1}}{s} - 1 \right) > 0 \quad (10)$$

Here $\frac{v * n_{ns,i,q-1}}{1 - s}$ is the expected number of non-supporters pushed to support the armed group in the event of selective victimization, $(1 - c)$ is the benefit of pushing non-supporters into support, and $\frac{v * n_{s,i,q-1}}{s}$ are the number of supporters pushed to non-support in the event of indiscriminate victimization. In addition, victimization has a direct effect of either killing a supporter or a non-supporter.

When considering victimization in a territory at risk of an attack, the armed group needs to separate civilians into potential supporters of the attacker and non-supporters. Their belief is that the division for group i and group j , defined such that $x_i > x_j$ is that a civilian f will support group i if:

$$\eta_f > x_i E(p_{i,q}) + x_j E(p_{j,q}) \equiv \lambda_q \quad (11)$$

this, combined with their beliefs about the distribution of supporters and non supporters allow an armed group to estimate the number of supporters of them and the attacking group, as well as the range of preferences occupied by each group, which,

are of length λ_q and $1 - \lambda_q$ respectively. They then victimize if:

$$\zeta_q * \frac{v * (1 + k) * E(n_{o,i,q})}{\lambda_k} + k) - (1 - \zeta_q) * \left(\frac{v * (1 + k) * E(n_{s,i,q})}{(1 - \lambda_k)} + 1 \right) > 0 \quad (12)$$

Similar to the case where there is no risk of battle, this is the net effect on local resources on victimization – the probability of driving groups from supporting the enemy into supporting you, and the direct effect on resources of a civilian dying.⁸

The game will continue until one of three end conditions are met: a) the government controls all the territories, b) the government controls no territories, c) the game reaches the predetermined turn limit and ends in a stalemate.

Hypotheses

As we model it, the decision for armed groups to victimize civilians is a strategic action. Armed groups target civilians to help extract resources from the population and to increase their likelihood of prevailing in expected conflicts with other groups. Civilians likewise act strategically to minimize their personal likelihood of being killed by armed

⁸After victimization, two further events happen. First civilians choose whether or not to flee from a territory into an adjacent territory. Civilian k will choose to flee a territory controlled by group i for a territory controlled by group j if these territories are contiguous and:

$$|x_i - \eta_k| + v * V H_i < e^{3-t*3/T} (|x_j - \eta_k| + v * \chi_j) \quad (13)$$

The exponential decay function is such that in the first turn of a game (t) another group needs to be at least e^3 times better than the incumbent in a civilians territory for the civilian to move, but by the final turn of the game (T) the group will move to whichever territory has a more congenial incumbent.

Second, in each territory, there will be new civilians added to the game based on the global growth rate parameter G (rounded down to the nearest integer).

groups. Thus, to understand when and where civilian victimization is likely to take place, we need to evaluate the strategic environment.

To do this, we conceptualize the overall strategic environment as a social network, wherein the nodes in this network are armed groups, and the edges are battles between these groups. To understand the strategic environment, consider three ideal types of conflict networks.

The first type of conflict network is the empty network. Here, while there are a number of groups that have the capacity to attack, no actual conflict takes place. In this network, territorial control is fixed, and the strategic decision to victimize civilians is simple – victimization takes place if the coercive effect (causing more non-supporters to begrudgingly support the group in charge) outweighs the resources that could be mobilized from non-supporters. In this environment, while there may be some initial victimization, we will pretty quickly approach an equilibrium where most civilians support the groups in control of their territory, and no victimization occurs.

A second stylized network we could see is a polarized network. In this type of network, we have (usually) two groups of actors who are clustered so that all of their interactions are with the groups in the other cluster. For example, in many civil conflicts, we see this dynamic where a number of different separatist groups are all fighting the central government and are not fighting each-other. In this game, this will be especially likely if we see ideologically oriented groups that cluster at two points on the spectrum. Here, some territories groups control will be at risk of attack, and so these groups will have incentive to victimize civilians not just to coerce them into support, but also to avoid the risk of civilians supporting an attacking group. This will lead to a rise in the likelihood of victimization in these border territories. Similarly, there will be territories that trade back and forth between groups, and when control of a territory changes hands, we can expect to see increased victimization because supporters of the old controlling group were

likely in the majority. That being said, victimization due to both causes should only be moderate, because many territories will not be at risk of attack, and when territory changes hands, it will usually alternate between two groups.

The final stylized network is the full network. This conflict network functions as a Hobbesian war of all against all, where each armed group is ready to attack each other armed group. In these cases, the dynamics that led to victimization in the polarized network are intensified. Almost all territories are at risk of an attack, and they are at risk of an attack from multiple sources leading to even stronger incentives towards victimization, since even if victimization is counterproductive against some opponents, it will be beneficial against others. There will also likely be a fluid control of territory and frequent changes in the ruling groups leading to even more incentives for violence against civilians.

To determine the macro-level effects of the strategic environment in this game, we ran 10000 simulations of this game, with parameters chosen at random, and recorded 3 main network statistics – the number of armed groups in the network, the overall level of violence in the network, and the density of the conflict network. Returning to our three stylized networks, the empty network would have both a low density and a low level of conflict, and the full network would be more dense, but not necessarily have a higher level of conflict than the polarized network.

As you can see in figure ??, even when controlling for the level of violence between armed groups and the number of actors, more dense conflict networks had both a higher likelihood and a higher frequency of civilian victimization. This leads to our main hypothesis for the empirical investigation.

Hypothesis: Even when controlling for the overall level of violence, a more dense conflict network will lead to a higher level of civilian victimization.

Empirical setup

Empirical Results

Discussion

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