

Money can't buy love but can it buy peace? Evidence from the EU Programme for Peace and Reconciliation (PEACE II)

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Abstract

Efforts to evaluate third-party peacebuilding interventions are welcome but many studies rely on experimental approaches that might be at odds with the theories that underpin the discipline. Rigorously evaluating interventions ill-suited to experimental analyses is just as important, however, especially when programmes adopt novel approaches. In this article, we employ an instrumental variables approach to evaluate one such intervention – the EU Programme for Peace and Reconciliation (PEACE II). Following contemporary peacebuilding theories, PEACE II disseminated funds to grassroots organizations via unique intermediate funding bodies and an innovative open competition. Splitting Northern Ireland into 582 wards, we merge panel data on individuals' perceptions of neighbourhood quality with PEACE II's accounts. One-stage analyses show that individuals in treatment regions report significantly elevated perceptions. Two-stage approaches, accounting for biases arising from the rollout method, show no significant relationship. Post-estimation analyses imply that funding did not reach areas with the poorest observable indicators. We thus remain agnostic on the effectiveness of the funded projects but conclude that, despite solid theoretical foundations, weaknesses in the application of these theories hampered potential positive impacts. Future interventions can learn from this and should ensure stronger ties between the theoretical base and how these theories are applied to funding disbursement.

JEL Codes: O18; F35

Keywords

Civil society, grassroots, impact evaluation, instrumental variables, Northern Ireland, peacebuilding, political violence, randomized control trial

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Introduction

In recent years, the number of third-party peacebuilding interventions has grown markedly (Scherrer, 2012) as has the breadth of programming that comes under the peacebuilding umbrella (UN, 2009). The uptick in attempts to rigorously analyse the impact of these interventions is also welcome, yet the literature most commonly defaults to one of two typologies: those that focus on 'aid' as a whole (Azam and Thelen, 2008; Böhnke and Zürcher, 2013; Gutting and Steinwand, 2017; Nielsen et al., 2011; Savun and Tirone, 2011; Young and Findlay, 2011); or those using experimental approaches that require, amongst other things, randomized programme rollout¹ (Ackett et al., 2011; Blattman and Annan, 2011; Blattman et al., 2014, 2017; Fearon et al., 2008; Gaarder and Annan, 2013; Gilligan et al., 2013; Malhotra and Liyanage, 2005; Puri et al., 2017). Although these studies are incredibly useful, the former group lacks nuanced information on what works or why it works at the programme level. The latter group relies on approaches that might be at odds with the programmatic application of contemporary peacebuilding theories that espouse the idea that peacebuilding should come from the bottom up (Belloni, 2001; Byrne, 2001; Lederach, 1997; Saunders, 2000).

Although bottom-up programmes do not inherently contradict the requirements of experimental impact evaluations, practical implementation features of these programmes often do.² Intermediate bodies, for example, that play an important role linking beneficiary communities with donors are likely to interact with the communities they serve. Therefore, a trade-off may exist between the quality of the intervention and the quality of the learning that can be developed from it. On the one hand, there remains a need for robust impact evaluations (Blum, 2011; Nelson, 2008; Wittkowski, 2014). On the other, optimal programme design complicates, or even renders impossible, the analytical approaches that have most commonly facilitated such evaluations.

In this article, we tackle this trade-off by conducting an *ex post* impact evaluation of a large-scale peacebuilding programme in Northern Ireland (the EU Programme for Peace and Reconciliation, or PEACE II), which focussed on integrating Track III grassroots and civil society actors into the country's peace process (Byrne et al., 2009; Byrne, 2001; Racioppi and O'Sullivan See, 2007). This aim to involve civil society matches peacebuilding theories but implies three considerations at the operational level: that individuals and/or organizations must self-select their participation in the intervention; that they must be involved in designing and implementing the projects that receive funding; and that intermediate bodies linking donors and beneficiaries may be required to bridge cultural, social and trust gaps. Although the first two requirements are achievable within a randomized framework, it is less obvious how practical or desirable randomizing such intermediate bodies would be in. As per Deaton (2009, 2010), this should not deter the development of impact evaluations, however, especially when the programme has unique features and may act as a model for future interventions. It is therefore important to understand whether or not PEACE II achieved its aims, not just in terms of the programme itself or its scale³ but also in terms of how these novel design features performed and of how they could be expected to perform in other scenarios.

Specifically, PEACE II used a bespoke mechanism that identified and funded projects through the adoption of decentralized and multi-tiered decision making and the creation of intermediate funding organizations (Potter and Egerton, 2011). Intermediate funding organizations solicited applications for support from a wide range of civil society actors before evaluating them against objective criteria. Not only does this ensure the involvement of non-

elite actors in the peace process but it should mean that funding is granted to the strongest proposals. This approach has frequently been mooted as a model for the implementation of peacebuilding programmes elsewhere (Racioppi and O'Sullivan See, 2007).⁴ Against this backdrop, PEACE II has largely been ignored or mentioned only in passing in the academic literature (Arthur, 2000; Byrne, 2001; Hayward, 2007a, b; O'Dowd and McCall, 2007; Tannam, 2006, 2007) and empirical analyses of its impact are entirely absent.⁵ To close these knowledge gaps, we explore the impact of PEACE II on individuals living in treated communities. We first ask whether or not PEACE II resulted in a measureable positive impact on the communities that received funding. In doing so, we are the first to rigorously analyse the impact of PEACE II. Subsequently, we contextualize how – if at all – the bottom-up funding mechanisms and intermediate funding bodies influenced outcomes.

We use a unique database built from panel data on individuals' perceptions of neighbourhood quality from the British Household Panel Survey (BHPS) matched to a record of PEACE II spending by year in each of Northern Ireland's 582 electoral wards. We conduct one-stage analyses using fixed effects (FE) and random effects (RE) estimators and show a positive and significant relationship between receipt of treatment and perceptions of neighbourhood quality. Noting the potential biases that arise from selection into the funding competition, the evaluation of funding applications and potential quality differences across intermediate funding bodies, we employ a novel instrumental variables approach using the spatial distribution of historical violence in Northern Ireland (Ferguson, 2017; Ferguson and Michaelsen, 2015). Disaggregating violence to electoral ward level and using RE2SLS models, we show no significant relationship between PEACE II programmes and perceptions of neighbourhood quality once biases arising from the rollout method are accounted for. In combination with post-estimation analyses focussing on observable regional 'hardships' such as deprivation, this implies that the elevated perceptions of neighbourhood quality were pre-existing. Not only does this call into question the success of PEACE II but it also highlights weaknesses in the bottom-up rollout methodology used. Funds often did not reach the neediest neighbourhoods and, even when they did, structural weaknesses in the capacities of organizations in those neighbourhoods may have limited the performance of the treatment.

Our results are of obvious importance to the peacebuilding literature as we present one of the first quantitative impact evaluations of a theoretically developed intervention. Further, we do so in the context of a unique programme with features that are likely to be used in future, both in continuing programming in Northern Ireland and in new programmes elsewhere. More generally the results are also of interest to other fields where this bottom-up programming and intermediate funding organizations are desirable. Specifically, the concerns raised in this article with regard to targeting and funding mechanisms are analogous to those in a wide range of other environments and to programmes with a wide range of other motivations, for example, community-driven development programmes (CDD) programmes (see King et al., 2010; Wong, 2012), which aim to build community cohesion from grassroots and often involve the use of intermediate organizations that encourage individual participation in the process.⁶

In the case of PEACE II, despite a strong theoretical motivation, the application of bottom-up programming was not a guarantor of success. In peacebuilding settings, this gap between theory and implementation should be of particular concern. Given the difficulty of measuring peace as an outcome (Fearon et al., 2008), it is likely that it is also difficult to measure its absence as an input in funding decisions. Similarly, given the damage that

conflict can do to social cohesion (Colletta and Cullen, 2000), concerns arise with the assumptions that underpinned PEACE II's approach. Those neighbourhoods worst affected by violence and most in need of funding are also likely to be those with the weakest social cohesion and are thus also those least capable of identifying their problems or providing solutions to them. Differences may have been present in management and implementation capacity between the recipients of funds in different conflict exposure strata. In turn, structural biases may have arisen in the process that reduced the capacity of the most damaged neighbourhoods to participate in the competition at all, prevented funds reaching the most damaged neighbourhoods and limited the effectiveness of the programmes in the neighbourhoods that did receive funding. Future interventions using this kind of funding mechanism, should therefore carefully consider how they can more strongly tie together academic theories with real-life funding decisions. Furthermore, checks should be built into these processes to ensure that funding gets to the areas where it is needed most and that recipients receive the required guidance to successfully use the funds and to implement their plans.

The rest of this article is set out as follows. In the next section we discuss the background to PEACE II and the features of the intervention that make it worthy of evaluation as well as making a short review of the wider findings of third-party peacebuilding interventions. In the third section we present our data and methodological approach. In the fourth section we present our results and in the final section we provide our conclusions.

Background

Following multiple paramilitary ceasefires in 1994 and the signing of the Belfast (Good Friday) Agreement in 1998, the state of the Northern Irish conflict was probably 'ripe' (Zartman, 1985, 2000) for pro-peace interventions. At the same time, significant distrust remained, both between the nationalist and unionist communities and between grassroots and elites, implying a need for social, as well as political, renewal. In part to benefit from the ripeness of the moment and in part to deal with the social and psychological legacy of the conflict on Northern Ireland's citizens, the EU developed the Special Support Programme for Peace and Reconciliation in Northern Ireland. In combination, these programmes, which split into PEACE I and PEACE II,⁷ contributed over €1 billion towards building peace through a unique decentralized funding mechanism (Racioppi and O'Sullivan See, 2007). This decentralization of funding was designed to ensure that civil society was involved in efforts to address the legacy of conflict by ensuring that non-governmental organizations (NGOs), voluntary groups, community groups and individuals were included in the peace process. Such approaches build on major peacebuilding theories (Lederach, 1997; Saunders, 2000), which note that in the long term, programmes are only likely to succeed when they involve stakeholders in all strata and at all levels of society. PEACE I and then PEACE II were specifically implemented with these goals in mind and their funding mechanisms designed to ensure, not only that funding reached non-elite actors, but also that these actors were involved at multiple stages of the funding and programming process.

In many ways, these concerns share at least some overlaps with the motivation behind so-called community-driven development interventions (King et al., 2010; Wong, 2012). Like PEACE II's programming, CDD programmes aim to put their beneficiaries at the centre of the decision-making process. As King et al. (2010) note, this is established through three specific design components. The first is that beneficiary communities are involved in the

‘selection, design and implementation’ of the intervention. The second is that programmes include funding for the implementation of the intervention. The third is that they work through new or pre-existing community organizations in order to establish community participation.

At the same time, the PEACE programmes were designed to be innovative in responding to three particular peacebuilding challenges (Racioppi and O’Sullivan See, 2007) that go beyond typical CDD programming: the timing of the intervention when the conflict was ripe for third party engagement; encouragement of multilevel engagement across all social strata; and addressing of the social and psychological aspects of the conflict, as well as its structural impacts. The second and third of these aims required harnessing voluntary actors to engage in the peace process and to support the efforts of political elites. In turn, these requirements necessitated the development of a unique funding mechanism. These funding schemes involved not only the EU but also the national British and Irish governments, local governments in Northern Ireland and a range of non-governmental bodies. A number of pioneering intermediary sub-national funding bodies were subsequently developed in order to bridge the gaps between elite funders and grassroots beneficiaries, as well as to overcome contestations about funding decisions made at the state level.⁸

This began with the development of District Partnerships (DPs) during PEACE I. These DPs were composed of trade unionists, business people, community and voluntary leaders and politicians from Northern Ireland’s local councils. Within the general focuses of the programme, DPs could set their own strategies and make their own funding decisions, which often involved aiding communities in setting their own priorities and developing their own solutions. Within PEACE II, these DPs formed into more permanent Local Strategy Partnerships (LSPs), which served a similar purpose, although were compositionally slightly different. LSPs maintained a role in distributing funds but had significantly more autonomy and were able to set their own goals and objectives. Finally, throughout the funding period, Intermediate Funding Bodies (IFBs) were developed to focus specifically on the wider aims of sustained involvement of grassroots actors. IFBs were set up to work directly with a range of NGOs on specific projects and were charged with ensuring the inclusion of marginalized populations. In combination, DPs, LSPs and IFBs formed a highly decentralized and unique funding delivery system. Thus, whilst similar to CDD programmes in that these local organizations aimed to harness community participation, the roles, powers and responsibilities of these organizations are significantly broader. The performance of these bodies, therefore, merits deeper study.

Particularly given the strong links of these mechanisms to key peacebuilding theories and their specific aim to engage a broad spectrum of actors, this multi-tiered and decentralized approach is likely to act as a model for future third-party interventions. As such, it is important to understand both the impact of the funded projects themselves and the role of these unique funding mechanisms and intermediate bodies in those outcomes. Given the assumptions implicit in the design of these bodies, such evaluations are doubly important. First, decentralization implies that there are no structural differences in the capacities of local individuals and groups to engage with the funding bodies, to identify their needs or to provide solutions to them. This contrasts with the impacts of conflict literature, which implies that the communities most affected by violence are those that suffer the greatest psychological, economic and social damage (Blattman and Miguel, 2010). Similarly, assumptions are made that the worst affected communities can be *a priori* identified by these intermediate bodies, which may not be the case given the notorious difficulty in objectively observing abstract

concepts like peace. Finally, it also implies that there are no structural differences across conflict-exposure strata in the capacity of recipient groups to organize and manage their grants and to ensure funds are optimally spent to deliver their aims. In this context, the general lack of attention paid to these programmes, is of significant concern.

More generally, however, the idea that peace can be built through third-party interventions is supported by a growing body of literature (see Gaarder and Annan (2013) for a review of sorts). Blattman and Annan (2011), for example, show significantly improved outcomes in a programme focussing on the reintegration of ex-militants in Liberia. Gilligan et al. (2013) show similar effects in Burundi, with participants showing significantly lower incidences of poverty and, accordingly, probably having fewer incentives to engage in antisocial behaviour. Fearon et al. (2008) show the positive impact of a CDD programme in DRC, whilst King et al. (2010) suggest that there are weakly positive impacts of CDD on social cohesion in their study of eight programmes. Malhotra and Liyanage (2005) show positive effects on empathy towards outgroups owing to attendance at peace workshops in Sri Lanka. See, also, Avdeenko and Gilligan (2015) and Fearon et al. (2008) for more evidence on CDD programmes.

Blattman et al. (2017) show positive and significant effects from a joint cognitive behaviour therapy and cash transfer programme in Liberia, whilst Lyall et al. (2017) show potential positive outcomes in an analysis of an employment for peacebuilding programme in Afghanistan.⁹ Okunogbe (2016) shows positive effects on attitudes towards outgroups from a programme that randomly assigns university students to places in Nigeria where their own ethnicity is not a majority. Cilliers et al. (2016) show strengthened social relationships from a reconciliation programme in Sierra Leone, yet note that this came at the expense of participants' psychological wellbeing. Ahmed (2017) shows positive economic and peace outcomes from the programming of a number of international NGOs in the Blue Nile area of Sudan.

In this context, this evaluation adds to the growing body of evidence on the effectiveness of peacebuilding programmes, whilst shedding light on the performance of a programme with a grouping of unique and highly integrated intermediate bodies that linked communities and their needs to donors.

Data and methods

In the absence of inbuilt quantitative data collection within PEACE II, we create a large database, collected from multiple sources, in order to evaluate the programme. This database is the result of three large-scale data collection/collation efforts. First, we collect survey data at the individual level from the British Household Panel Survey (BHPS) from its inception in Northern Ireland in 2001 until the end of PEACE II programmes in 2007. We match this to a unique and detailed record of all applications for PEACE II funding, which includes the location of the programme, the range of its expected impact, its budget and the success or failure of the application. This data was provided to us upon special request by the PEACE II programme monitoring committee and, to our knowledge, has never before been used in quantitative research. Finally, we develop highly disaggregated data of historical violence in Northern Ireland based on the work of Sutton (1994) and codified to electoral ward level in Ferguson (2017) and Ferguson and Michaelsen (2015). In combination, this database constitutes an unmatched record of data pertinent to post-conflict Northern Ireland. To this we

add local economic and deprivation data available from the Northern Ireland Statistics and Research Agency (NISRA).

As per Fearon et al. (2008), the use of secondary data poses certain problems in a peace-building context. Chief amongst these is the determination of a suitable outcome variable for empirical analysis. This variable must satisfy two constraints: that it is reasonable to believe that it (latently) captures peace-related outcomes; and that it can reasonably be expected to move in response to the programme's targets. In the case of PEACE II, this is complicated by the fact that the intervention aimed to build peace via two distinct impact channels: improved economic performance and increased social cohesion. Any outcome variable, therefore, must be expected to move equally with improvements in either of these channels, or in both, as very few funded projects can be linked to a single impact channel. Furthermore, however, we argue that establishing economic or social cohesion effects, alone, is insufficient to measure 'peace'. Rather, a successful impact on peace should improve this outcome variable over and above the direct but narrower programme effects.

In this way, we consider 'peace' first in terms of positive peace, which implies effective social systems and norms that allow constructive management of disagreements (Galtung, 1969), rather than merely the absence of violence. Therefore, peace is considered as the maintenance of the social contract and the commitment to it by the state, sub-national groups and individuals. We view this definition as encompassing, therefore, not just Track I political talks but also the Track III processes that underpin the approaches taken to the PEACE interventions.

We propose that latent perceptions of neighbourhood quality is a suitable proxy¹⁰ as both economic opportunity and social cohesion are robust correlates (Clark and Hunter, 1992; Ellaway et al., 2001). At the same time, however, it is easy to believe that more (positively) peaceful neighbourhoods are more desirable places to live. As such, we have prior expectations that perceptions of neighbourhood quality should improve were the PEACE II interventions successful but that changes in this indicator should not be fully explained by only economic and social outcomes. More generally, it is plausible that people prefer living in peaceful neighbourhoods, satisfying the first constraint.

We source information on these latent perceptions from the first seven waves of the BHPS survey in Northern Ireland. The BHPS is an annual survey of individuals living in the UK, with Northern Ireland oversampled to ensure representativeness in the country. The survey is conducted with approximately 3500 individuals in 2000 households in Northern Ireland. Using data from 2001, the first year for which BHPS data is available, to 2007, the first year after PEACE II ended, we generate an unbalanced panel of $n \times T = 11,664$ individual-years in 523 of Northern Ireland's 582 electoral wards. As PEACE II aimed to improve the entire community in which a project was funded, rather than just impacting on the project's participants, the use of secondary survey data is, more appropriate than data from participants.

We focus on two questions of interest in the survey. The first asks individuals whether or not they like the neighbourhood in which they live; the second asks about whether or not they would like to move house.¹¹ Owing to incredibly low variation in the first of these questions, we use the latter for our main analyses.¹² In doing so, we follow the residential mobility literature, stretching back to Speare (1974). Speare (1974) shows that residential satisfaction – including perceptions of latent neighbourhood quality – act as intervening variables in individuals' desire to move house. Furthermore, he suggests that, once all other intervening variables are accounted for, the residual will measure individuals' perceptions about the quality of their neighbourhood. Throughout this literature, a number of other

intervening variables are mooted, which we include as control variables. These include employment status (Böheim and Taylor, 2003), housing quality (Clark and Huang, 2004) and individual characteristics, such as age, gender and education (Zaiceva and Zimmermann, 2009). By controlling for these individual and locational heterogeneities, individuals' desire to move home becomes a solid proxy for latent perceptions of neighbourhood quality.¹³ The BHPS includes data on these other variables of interest. We thus garner information on: age; gender; employment status; education; housing tenure type; housing quality; previous moves; and variables of observable neighbourhood quality from the survey. To this data, we add: regional deprivation data sourced from the NISRA multiple deprivation index; regional employment rates; local average incomes; population density; and the proportion of young males (Urdal, 2006) in each ward. We match this information to the ward in which an individual lived in each wave of the survey.

We link these perceptions and control variables to the spatial variation in PEACE II spending (Figure 1). Our PEACE II database includes information on all 12,000+ applications for PEACE II funding, including: the success of the application; the amount of funding delivered; the start and end dates of the funding period; and the location(s) where the project expected to have impacts. We restrict our interest to successful applications from Northern Ireland and to those whose impact was expected to have an impact within a single electoral ward.¹⁴ This constitutes some 85% of the projects that were funded in Northern Ireland.¹⁵ Given the nature of funded projects, there are few good reasons to believe that impacts should spill over in space. Most projects focus on developing very local infrastructure within the ward, or even within sub-ward areas.¹⁶ Our main analyses, therefore, do not consider the potential for spatial effects.¹⁷

We derive our main treatment variable of interest from this data: the total project expenditure, by project start year, in each ward. For robustness of results, we generate three further definitions of treatment: the number of funded projects by ward-start year; total expenditure by ward-end year; and the number of projects of ward-end year. As shown in Table 1, total spending by ward-start year varies between €0 and €4 million, whilst the number of projects varies between 0 and 9. Of Northern Ireland's 582 wards, approximately 80% received some form of funding. In line with the Special EU Programmes Body's suggestion that impacts may only become obvious in the longer term, we generate further treatment variables that look at spending lagged over the previous three years.

We write the basic relationship between PEACE II and individual-level perceptions of neighbourhood quality as a hierarchical model:

$$STAY_{ijkt} = \beta_1 TREAT_{kt} + \beta_2 X_{it} + \beta_3 Y_{jt} + \beta_4 Z_{kt} + u_{it} + v_{jt} + w_{kt} + \epsilon_{ijkt} \quad (1)$$

where i is the subscript for individual-level variables, j for house-level variables and k for ward-level neighbourhood variables. $STAY$ is a binary variable that determines whether or not an individual wishes to move house at time t , whilst $TREAT$ indicates the degree of treatment a neighbourhood as received. X , Y and Z are vectors of exogenous control regressors at individual, household and ward level, respectively, whilst u , v and w are unobserved heterogeneities at each level.

Owing to the bottom-up nature of PEACE II's funding decisions, it is difficult to believe that expenditure was randomly distributed throughout Northern Ireland. Significant biases are therefore likely to arise should we employ only linear models. For example, should

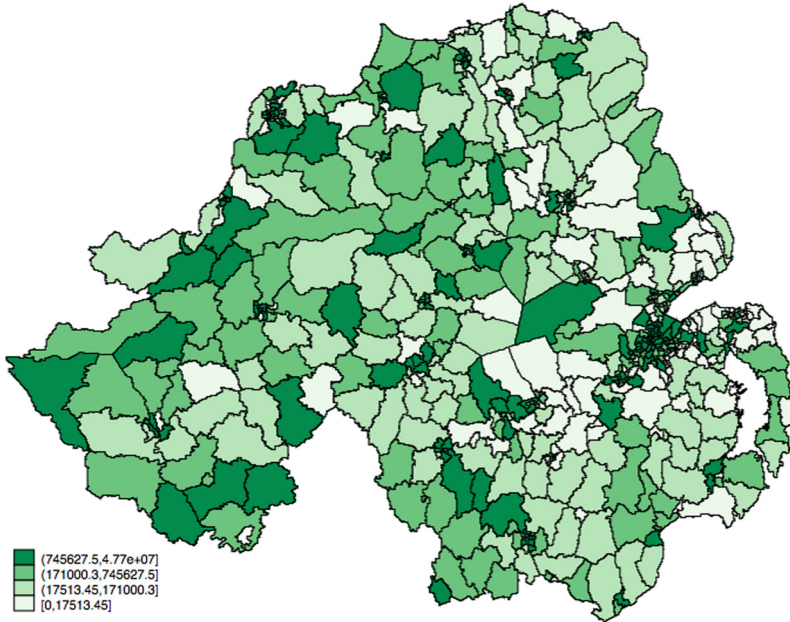


Figure I. PEACE II spending by electoral ward. Source: authors' construction of PEACE II monitoring committee data.

Table I. Descriptive statistics of PEACE II and violence data

	Mean	Standard deviation	Minimum	Maximum
Spending (€000s)	154.85	283.63	0	3346
Treatments	1.54	1.18	0	9
Deaths	3.67	7.88	0	81
Deaths/1000 inhabitants	1.21	2.40	0	25
Deaths \geq 1 (median)	0.61	0.49	0	1
Deaths \geq 4 (mean)	0.27	0.44	0	1
Deaths \geq 9 (top decile)	0.11	0.31	0	1
N	11,664			
I	1704			

Note: Data based on authors' construction of Sutton (1994).

spending have successfully targeted the neighbourhoods most in need, ordinary least squares models may report a false negative impact of the programmes as, although perceptions may have improved, they are likely to remain lower than in unaffected neighbourhoods. Alternatively, by asking people to come together, some threshold of neighbourhood cohesiveness may have been required, leading to upwardly skewed ordinary least squares estimates as funding only reached neighbourhoods with already elevated quality perceptions. At individual and neighbourhood levels, other concerns arise. These include unobserved

preferences and unobserved indicators of neighbourhood quality. To overcome these biases, we follow an instrumental variables approach (see Angrist and Pischke, 2009). This approach requires at least one ‘instrument’ that is correlated with the endogenous treatment variable but not with the regression error term. Such approaches are common in impact evaluation (see Abadie et al., 2002; Atoyán and Conway, 2006; Deaton, 2009; Chen and Ravallion, 2003; Duryea and Morrison, 2004; Khandker et al., 2010; Maredia et al., 2000).

We construct two instruments based on the spatial variation of historical violence in Northern Ireland. This is a geo-coded event count database of all fatal events directly related to The Troubles, based on Sutton (1994). This database links each event to an electoral ward in Northern Ireland and then sums deaths in that ward over the entire period of the conflict and includes approximately 3000 fatalities. As shown in Table 1 the mean number of fatalities in an electoral ward is just under four but with significant variation: almost 200 wards experienced no fatal violence at all, whilst some experienced in excess of 75 fatalities. From this data we generate the *deaths* instrument, which is total fatalities in a given electoral ward. We also generate *sldeaths*, which is a spatially weighted lag of violence that occurred elsewhere in Northern Ireland¹⁸ (see Figure 2).

We implement the *IV* approach by regressing the endogenous variable on all exogenous regressors and on the instruments, denoted *IV*:

$$TREAT_{kt} = \alpha_0 + \alpha_1 X_{it} + \alpha_2 Y_{jt} + \alpha_3 Z_{kt} + \alpha_4 IV_k + \eta_k \quad (2)$$

where η is the regression error term and α_i the regression coefficients.

In order for the instruments to be valid, α_4 must be correlated with *TREAT* but not with the regression error term. Put differently, $\alpha_4 \neq 0$ and $COV(IV, \epsilon) = 0$. As we have two instruments and only one endogenous regressor, our analysis is overidentified and the validity of the instruments can be shown statistically. At the same time, given the use of two instruments derived from the spatial distribution of historical violence, it is prudent to discuss this qualitatively. First, as violence ended a decade before the beginning of our analysis, we see no reason to believe that it should be a direct determinant of individuals’ perceptions about the current quality of their neighbourhood.¹⁹ As such, any residual effects are indirect. Violence could cause persistent regional deprivation, low-quality services, higher crime, poor social relations and so on. We control for these effects using data from the Northern Ireland Multiple Deprivation Measure (NIMDM), which includes ward-level information on seven domains of deprivation: income deprivation; employment deprivation; health deprivation and disability; education, skills and training deprivation; proximity to services; living environment;²⁰ and crime and disorder. As such, the inclusion of these additional controls and the use of violence that ended long before our sample period offer evidence that refutes the conceivable sources of bias from our *deaths* instrument. As *sldeaths* relates to violence that takes place elsewhere in the country, it is more obviously exogenous. As shown in Table A2, our instruments pass the Sargan–Hansen *J*-test of instrument validity, further reinforcing the appropriateness of our empirical strategy.²¹

We estimate our one-stage analyses using typical RE and FE approaches and our two-stage models using simple two-stage least squares (2SLS) and random effects two-stage least squares (RE2SLS) owing to Balestra and Varaharajan-Krishnakumar (1987).

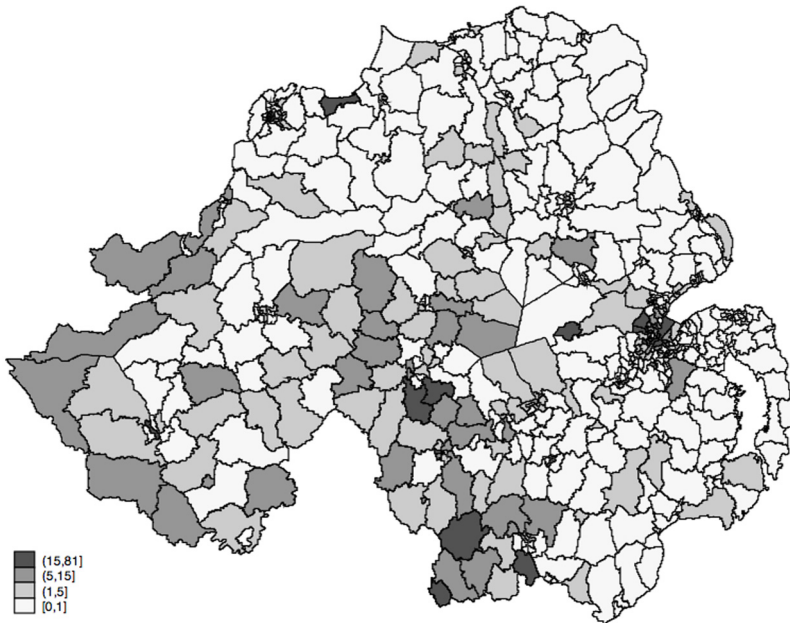


Figure 2. Spatial distribution of historical violence in Northern Ireland. Source: authors' construction of Sutton (1994).

Results

Our first results link the spatial variation of PEACE II funding to historical regional violence. The results of these artificial first stages are presented in row 1 of Tables A1 and A2 for the *deaths* instrument and row 2 for the *sldeaths* instrument. Table A1 shows the first stage of our 2SLS specification and Table A2 for the RE2SLS models. These results show that both instruments are strong predictors of all formations of our treatment variable. The Cragg–Donald *F*-statistics for all models are higher than the 1% Stock–Yogo thresholds, showing the strength of the estimates and suggesting that minimal bias will arise from their use. We are unable to reject the null hypothesis of valid over-identifying restrictions in the Sargan–Hansen *J*-test, supporting the exogeneity of our instruments. Unsurprisingly, historical intensity of violence and its spatial lag are positive and accurate predictors of the locations that received the largest proportions of PEACE II expenditure.

Truncated results from the main analyses are presented in Table 1 for spending by ward-start year and in Table 2 for the number of funded projects. Columns 1 and 2 show the results from the one-stage FE analysis, column 2 for the one-stage RE and columns 3 and 4 from the 2SLS and RE2SLS analyses, respectively. The one-stage analyses suggest a positively and strongly significant impact of PEACE II expenditure on perceptions of neighbourhood quality. Taken in isolation, this would imply that the programmes were successful in delivering their goals. In the two-stage analyses, however, the sign of the coefficient changes and when individual-, house- and ward-level unobservables are accounted for in the RE2SLS approach, the coefficients become insignificant. This implies that PEACE II had

Table 2. Baseline analysis – effect of total expenditure by start year

	(1) FE	(2) RE	(3) 2SLS	(4) RE2SLS
Spending	$1.50 \times 10^{8***}$ (4.55×10^9)	$1.2 \times 10^{8***}$ (4.40×10^9)	$-4.15 \times 10^{8*}$ (2.23×10^8)	-3.13×10^9 (2.57×10^8)
Individual	Yes	Yes	Yes	Yes
House	Yes	Yes	Yes	Yes
Ward	Yes	Yes	Yes	Yes
N			11,664	
I			1704	

Note: Standard errors in parentheses. *** $p < 0.01$; ** $p < 0.05$; * $p < 0.1$. N = Observations; I = individuals.

no discernible causal impact on individuals' perceptions of neighbourhood quality. Given that economic and social cohesion, as well as peace factors, are expected determinants of this variable, this implies that PEACE II did not achieve its broad or narrow aims.

The full results from the analysis by spending in start year can be found in Table A6. By and large, the controls display anticipated signs and levels of significance anticipated in the literature to date. Only marital status and employment status buck this trend. Individuals prefer to stay in higher-quality houses and in higher-quality locales. Individuals with higher education are more likely to desire mobility than less-educated counterparts. Those who own their homes and those in larger residences are more likely to wish to stay than those who feel that their homes lack space. Local factors such as high deprivation and higher population density are also correlated with preferences to move. Given the work stemming from Speare (1974), these results embed our findings within this wider literature, whilst also supporting the validity of our approach.

Results are robust to alternative specifications of the treatment variable, showing no deviations from the headline results in our preferred RE2SLS analyses (see Tables A3–A5). These results also show that lagged spending is insignificant in all specifications. These findings stand in contrast to theoretical priors, which would anticipate stronger peacebuilding results from bottom-up grassroots-focussed interventions. Given the upward skew on the coefficients stemming from rollout-related biases, however, the most likely driver of these results is that funds did not make it to the neighbourhoods with the lowest levels of latent quality. Simple post-estimation analyses confirm this. The unconditional correlation between PEACE II spending and the NIMDM is only 16%, despite the most deprived wards in Northern Ireland experiencing the worst of the violence (Ferguson and Michaelsen, 2015).

In this context, we remain agnostic on whether or not the funded projects were inherently flawed. Rather, we note that our results are most likely a direct result of failures in the rollout methodology employed during PEACE II. At best, this implies difficulties in identifying the areas most in need but, at worst, it implies a structural issue that systematically excluded applications from the communities most in need.

Conclusions

PEACE II was a six-year multi-million Euro programme designed to build on the Track I political process to bring a long-term and sustainable peace to Northern Ireland. During the

Table 3. Effect of number of projects by start year

	(1) FE	(2) RE	(3) 2SLS	(4) RE2SLS
Treatments	0.004** (0.002)	0.003* (0.002)	-0.013* (0.008)	-0.0001 (0.010)
Individual	Yes	Yes	Yes	Yes
House	Yes	Yes	Yes	Yes
Ward	Yes	Yes	Yes	Yes
N			11,664	
I			1704	

Note: Standard errors in parentheses. *** $p < 0.01$; ** $p < 0.05$; * $p < 0.1$. N = observations; I = individuals.

programme, almost €1 billion was spent on community-instigated projects with the aim of reconciling past differences and developing Northern Ireland economically and socially. Despite the huge outlay, the programme's unique features and the idea that it should act as a model for future peacebuilding programming, however, impact evaluations and specific focus on it in any academic literature have been largely absent. In this article, we close this gap but show no significant impact of the intervention once we control for potential sources of bias and other intervening variables. Our post-estimation analyses suggest that this occurred, at least in part, because spending did not reach the communities most in need. This relates to three critical assumptions built into PEACE II's rollout method: that the communities most in need were equally capable of identifying their needs and the solutions to those needs; that they were equally capable of putting together successful applications for funding; and that they are equally capable of managing and using funds received.²² Given the damage conflict is known to cause in exposed communities, any one of these assumptions could seem strong. Thus, despite being built on solid peacebuilding theories, the application of these theories in real-life scenarios limited potential impacts.

This finding provides important information for future programmes, both in Northern Ireland and elsewhere, especially if PEACE II's approach is to be used as a model for other interventions. Caution must be urged in the application of bottom-up programming, particularly when there is a competitive aspect to how funds are disseminated. Despite the strong theoretical grounds, targeted spending can only maximize benefits if it reaches those it intends to target. This is uniquely difficult in peacebuilding settings, not least because peace itself is so difficult to observe or measure. In turn, future programmes not only need to *ex ante* target the regions or individuals most in need but must also have appropriate inbuilt checks and balances. These checks and balances should ensure at least three things: first, that spending is reaching the communities most at need; second, that those communities are not excluded by the rollout competitions employed; and third, that those communities have access to appropriate forms of help in identifying their problems, in designing projects to overcome them, and in suitably managing funds that are successfully received.

More generally these results also show that more evidence is also required on the links between peacebuilding theories and their application in the field, particularly when that application applies to large-scale third-party peacebuilding interventions. Specifically, this work should focus on what these theories imply for programme design and, in turn, on how programme design can incorporate these theories without jeopardizing performance.

Development of practical advice that bridges academic research and programme implementation in the field, therefore, is required. Such work will further strengthen the development of bottom-up peacebuilding programmes and ensure that the next generations of interventions are capable of delivering stronger and more robust outcomes.

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Supplemental material

All data, replication materials, and instructions regarding analytical materials upon which published claims rely, along with the Online Appendix, are available online through the SAGE *CMPS* website: <https://journals.sagepub.com/doi/suppl/10.1177/0738894218766865>

Notes

1. We do not doubt that such evaluation methods are statistically useful but note that their setup may impose restrictive limitations on intervention design in peacebuilding scenarios. As these debates are much better dealt with elsewhere (Alderman, 2002; Barrett and Carter, 2010; Basu, 2005; Conning and Kevane, 2002; Deaton, 2010) we do not rehash these arguments here, other than to say that, in combination with theories of peacebuilding, they provide a convincing argument that randomized control trials are not a one-size-fits-all panacea of impact evaluation in conflict settings.
2. We do not say this to imply that randomized control trials and other forms of programme rollout or evaluation are substitutes. Rather, we view the full spectrum of impact evaluations as an important and interactive set of complimentary approaches.
3. In total, the budget for PEACE II exceeded the UN's entire peacebuilding budget for the same period. See <http://www.unpbf.org/donors/key-figures/>
4. These sentiments were echoed by Seamus Mallon in a newspaper interview in 2000 during his time as the Deputy First Minister in the Northern Ireland Assembly.
5. Potential exceptions are: the Northern Ireland Attitudinal Study (NISRA, 2005); and Potter and Egerton (2011) and Potter (2013). The analysis in NISRA (2005) suffers severe selection biases; the work of Potter and Egerton (2011) and Potter (2013) focuses more on programme audit than what is commonly understood to be an impact evaluation. Byrne et al. (2009) conduct a qualitative impact evaluation through interviews with community representatives and suggest positive impacts resulting from PEACE II. An important differentiation, however, is that our research focuses on people living in treated neighbourhoods, who are not the target of Byrne et al.'s (2009) work.
6. We note, however, that the motive of undertaking CDD programmes is often different from the theoretical foundations of PEACE II's rollout methodology, in that CDD programmes are often used to reduce stress on governments in fragile situations as much as it is to empower local actors. At the same time, placing communities at the heart of planning decisions is a key component to both strands of programming.

7. In this article, we focus only on PEACE II owing to the absence of fine-grained household-level panel survey data in Northern Ireland during the years in which PEACE I was implemented.
8. These contestations could include, for example, perceptions or accusation of bias in the regional, socio-economic, political or religious splits in spending.
9. In contrast to these relatively positive findings, however, Blattman et al. (2014) and Mercy Corps (2015) generally fail to show similar peacebuilding outcomes in other evaluations (in Uganda and Afghanistan, respectively).
10. For this article, we considered two further left-hand side variables: crime rates and voting patterns. The literature (see Deglow, 2016 for a review and its application in Northern Ireland) shows that crime rates are higher in the areas that experienced the highest conflict. In turn, were PEACE II successful it may be expected that reductions in crime rates would follow. Deglow (2016) shows that the relationship between conflict and crime is not straightforward, with different kinds of crime affected. In the case of PEACE II this is further complicated by the joint economic and social cohesion aims to the intervention. Following the crime and punishment literature (Becker, 1968), economic improvements may affect different forms of crime than increased social cohesion. Our analyses show that different crime rates in Northern Ireland move together, resulting in multicollinearity issues. Similar problems beset the use of voting patterns. Although 'economic voting' (Anderson, 2000; Powell and Whitten, 1993) provides some theoretical grounds, there are no strong priors from this literature to believe that improved social cohesion and improved economic performance should lead to changes in voting patterns that move in the same direction. Accordingly, we determine that neither of these approaches are suitable for our purposes.
11. The exact wordings of these questions are as follows: 'Overall, do you like living in this neighbourhood?' and 'If you could choose, would you stay here in your present home or would you prefer to move somewhere else?'
12. The lack of variation in this questions means that it does not correlate with objective measures of house or neighbourhood quality, implying technical problems with the survey instrument, rather than concern with the general usability of these proxies.
13. The mean of our outcome variable in the control group in 2001 is 0.780284, increasing to 0.8509397 in 2007; for the treatment group, these values are 0.7388393 and 0.8474576, with a sample standard deviation of 0.3793809. By comparing the evolution of this outcome variable between 'treatment' wards (that is, wards that received some assistance during the study period) and 'control' wards (those that did not) between the first and last year of our study, our sample $n \times T = 11,664$ gives a statistical power of over 99% using a one sample mean test. This ensures that the risk of Type II error is incredibly low.
14. Although a 'placebo analysis' of unsuccessful projects would have also been desirable in any impact evaluation of PEACE II, this is prevented owing to high correlations between the locations of successful and unsuccessful submissions.
15. A very small number of projects were expected to have impacts in more than a single ward but were still very geographically restricted to small clusters (circa 4) of locations. The remainder aimed to have national-level impacts and cannot therefore be studied.
16. To elucidate this point, we include two specific programme description examples from our database: The Devenish Study Support Programme –'The Devenish Study Support Programme has arisen from recognition of a gap in provision for young people in the Devenish area aged 13–25 years in terms of study support and employment related skills'; and Building Blocks –'A two-year project which seeks to engage directly the local business base within the Shankill and Springfield area in the absorption of new technology and practices in their day-to-day business operation'.
17. We include a spatial lag in the analysis in Table A7 to ensure that these qualitative assertions hold. As can be seen, the spatial lag of spending itself is insignificant in all of these models and has no impact on the scale or significance of the coefficient of expenditure.

18. Owing to Northern Ireland's small geographic size, we employ a non-truncated inverse distance weighting matrix. Owing to potential collinearity between the instruments (see Ferguson and Michaelsen, 2015) we use a third-order polynomial of *sldeaths* to maximize variation.
19. An analogue can be taken from the crime literature. Although high levels of historical crime affect current perceptions of neighbourhood quality (Baston and Monnat, 2015; Ludwig et al., 2012; Sirgy and Cornwell, 2002) it is not crime *per se* that is the cause but its associated impact on other neighbourhood-level interpersonal factors (Baston and Monnat, 2015). Thus, any long-term adverse effects of crime are indirect. In the conflict analogue, this implies that historical conflict should also not be directly linked to perceptions of neighbourhood quality and therefore acts as a valid instrument, so long as we control for these indirect linkages.
20. This domain includes information on the kinds of interpersonal factors, such as low trust in others, that arise in the impact of crime literature.
21. As the main dependent variable is binary, biases could arise in their use in 2SLS-style models. We therefore conduct a robustness check using a 'special regressor' method (see Lewbel, 2012). The results can be seen in Table A8 in the Online Appendix. We implement this using the 'specialreg' command in Stata (Baum, 2012). As the results show, the introduction of this approach has no material effect on our main findings.
22. See Racioppi and O'Sullivan See (2007), which discuss examples of how some recipients struggled to manage projects once funding had been received and on how there may have been structural determinants that influenced which groups were best at administering their projects.

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Appendix

Table A1. 'First stage' of 2SLS IV analysis

	1 Baseline	2 Treatments	3 End	4 Controls
deaths	1.72×10^4 *** (1089.28)	0.056*** (0.003)	1.31×10^4 *** (849.0)	1.55×10^4 *** (1096.16)
sldeaths	4.06×10^7 (2.55×10^6)	99.50*** (6.83)	2.27×10^7 *** (1.98×10^6)	4.30×10^7 *** (2.57×10^6)
N	11,664			
l	1704			
CD	295	341	216	281
Sj	1.073	1.585	1.628	2.066

Note: Standard errors in parentheses. *** $p < 0.01$; ** $p < 0.05$; * $p < 0.1$.

N, Observations; l, individuals; CD, Cragg–Donald Wald F-statistic; Sj, Sargan–Hansen J-statistic; SC, χ^2 threshold for Sj; baseline, sum of expenditure by start year; treatments, number of treatments by start year; end, sum expenditure by end year; controls, restricted subset of controls.

Table A2. 'First stage' of RE2SLS IV analysis

	1 Baseline	2 Treatments	3 End	4 Controls
deaths	2.03×10^4 *** (1860.96)	0.059*** (0.005)	1.30×10^4 *** (1418.06)	1.86×10^4 *** (1869.06)
sldeaths	6.10×10^7 *** (4.50×10^6)	132.68*** (11.82)	2.67×10^7 *** (3.42×10^6)	2.79×10^7 *** (4.50×10^6)
N	11,664			
l	1704			
CD	176	158	85	188
Sj	1.253	1.268	1.269	1.642

Note: Standard errors in parentheses. *** $p < 0.01$; ** $p < 0.05$; * $p < 0.1$.

Table A3. Robustness checks – effect of total expenditure by end year

	(1) FE	(2) RE	(3) 2SLS	(4) RE2SLS
spending	-5.95×10^{-9} (5.88×10^{-9})	-9.21×10^{-9} (5.69×10^{-9})	$-5.71 \times 10^{-8*}$ (3.33×10^{-8})	-1.17×10^{-9} (4.77×10^{-8})
Individual	Yes	Yes	Yes	Yes
House	Yes	Yes	Yes	Yes
Ward	Yes	Yes	Yes	Yes
N	11,664			
I	1704			

Note: Standard errors in parentheses. *** $p < 0.01$; ** $p < 0.05$; * $p < 0.1$.

Table A4. Robustness checks – total spending with new controls

	(1) FE	(2) RE	(3) 2SLS	(4) RE2SLS
spending	$1.65 \times 10^{-8***}$ (4.54×10^{-9})	$1.2 \times 10^{-8***}$ (4.40×10^{-9})	$-6.2 \times 10^{-8***}$ (2.30×10^{-8})	-1.70×10^{-8} (2.49×10^{-8})
Individual	Yes	Yes	Yes	Yes
House	Yes	Yes	Yes	Yes
Ward	Yes	Yes	Yes	Yes
N	11,664			
I	1704			

Note: Standard errors in parentheses. *** $p < 0.01$; ** $p < 0.05$; * $p < 0.1$.

Table A5. Effect of total expenditure by start year and lags

	(1) FE	(2) RE	(3) 2SLS	(4) RE2SLS
spending	$1.49 \times 10^{-8***}$ (4.55×10^{-9})	$1.2 \times 10^{-8***}$ (4.43×10^{-9})	-3.50×10^{-7} (3.61×10^{-7})	-2.97×10^{-7} (3.25×10^{-7})
summed_lag	3.42×10^{-9} (2.67×10^{-9})	-1.04×10^{-9} (2.39×10^{-9})	1.05×10^{-7} (1.22×10^{-7})	1.02×10^{-7} (1.17×10^{-7})
Individual	Yes	Yes	Yes	Yes
House	Yes	Yes	Yes	Yes
Ward	Yes	Yes	Yes	Yes
N	11,664			
I	1704			

Note: Standard errors in parentheses. *** $p < 0.01$; ** $p < 0.05$; * $p < 0.1$.

Table A6. Full baseline analysis – effect of total expenditure by start year

	(1) FE	(2) RE	(3) 2SLS	(4) RE2SLS
spending	$1.50 \times 10^{-8***}$ (4.55×10^{-9})	$1.2 \times 10^{-8***}$ (4.40×10^{-9})	$-4.15 \times 10^{-8*}$ (2.23×10^{-8})	-3.13×10^{-9} (2.57×10^{-8})
job_status	0.013 (0.012)	0.013 (0.010)	0.012 (0.009)	0.013 (0.010)
marital_status	-0.057*** (0.018)	-0.038*** (0.011)	-0.033*** (0.008)	-0.039*** (0.011)
age	0.005 (0.006)	0.003*** (0.0004)	0.003*** (0.0003)	0.003*** (0.0004)
gender	—	-0.004 (0.012)	-0.005 (0.007)	-0.005 (0.012)
education	-0.020*** (0.006)	-0.010*** (0.003)	-0.006*** (0.002)	-0.010*** (0.003)
time	0.006 (0.02)	0.024* (0.014)	-0.046*** (0.012)	-0.024* (0.014)
move_1	0.136*** (0.017)	0.132*** (0.017)	0.119*** (0.021)	0.134*** (0.017)
move_2	—	-0.141*** (0.016)	-0.133*** (0.010)	-0.140*** (0.016)
tenure	0.075*** (0.020)	0.039*** (0.013)	0.016* (0.009)	0.038*** (0.013)
rooms	0.010** (0.004)	0.014*** (0.003)	0.016*** (0.003)	0.014*** (0.003)
space	-0.079*** (0.011)	-0.086*** (0.010)	0.097*** (0.010)	-0.086*** (0.010)
environ	0.029*** (0.006)	0.045*** (0.005)	0.072*** (0.005)	0.045*** (0.005)
house	0.018*** (0.006)	0.019*** (0.005)	0.022*** (0.005)	0.019*** (0.005)
unemp	0.011 (0.010)	0.004 (0.006)	0.001 (0.004)	0.005 (0.006)
lgva	0.020 (0.421)	0.620** (0.299)	1.00*** (0.252)	0.619** (0.300)
young_males	0.202 (0.244)	-0.025 (0.172)	0.019 (0.150)	0.041 (0.204)
deprivation	-0.006*** (0.001)	-0.002*** (0.0005)	-0.0002 (0.0003)	-0.002*** (0.0005)
density	-0.0008* (0.0005)	-0.0006** (0.0002)	-0.0006*** (0.0002)	-0.006** (0.0002)
constant	0.184 (3.90)	-5.44* (2.801)	-9.16*** (2.36)	-5.44* (2.81)
N	11,664			
I	1704			

Note: Standard errors in parentheses. *** $p < 0.01$; ** $p < 0.05$; * $p < 0.1$.

Table A7. Inclusion of spatial lag of expenditure

	(1) FE	(2) RE	(3) RE2SLS
spending	$1.43 \times 10^{-8}***$ (4.69×10^{-9})	$1.2 \times 10^{-8}***$ (4.54×10^{-9})	9.10×10^{-9} (4.27×10^{-8})
slspending	5.47×10^{-7} (9.51×10^{-7})	-4.75×10^{-7} 8.94×10^{-7}	-3.15×10^{-7} (2.26×10^{-6})
Constant	0.151 (3.900)	$-5.356**$ (2.800)	$-5.358*$ (2.815)
N	11,664		
I	1704		

Note: Standard errors in parentheses. *** $p < 0.01$; ** $p < 0.05$; * $p < 0.1$.