Addressing Identification Challenges in Neighbourhood Effects Research: A critical review of the empirical literature

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'Neighbourhood effects'

- Spatial variation in individual-level outcomes that cannot be explained by individual and family background characteristics (nor by selective migration)
- o Individual outcomes affected:
 - Voting; Schooling (incl. truancy and dropping-out); Welfare receipt and (un)employment, teenage pregnancy; Morbidity and mortality; Crime and illicit behaviour
 - Life satisfaction; Self-rated health; General health

Neighbourhood effects – mechanisms and outcomes

o Potential causal pathways (Galster 2012):

- Social interactive: social contagion, collective socialisation, social networks, social cohesion and control, competition, relative deprivation, and parental mediation;
- Environmental: exposure to violence, physical surroundings, and toxic exposure;
- Geographical: spatial mismatch of jobs and workers and a lack of quality public services;
- Institutional: stigmatisation, local institutional resources, and local market actors

Neighbourhood effects – critiques and challenges

 Major reviews of the literature in the early 2000s, re-iterated and complemented by van Ham & Manley (2012)

Neighbourhood effects research needs to:

(1) test specific causal mechanisms; (2) be explicit about relationship between neighbourhood context and individual outcomes; look at (3) subjective well-being, (4) neighbourhood dynamics and (5) intergenerational transmission; (6) neighbourhood selection; (7) define neighbourhoods meaningfully;
(8) consider geographical contexts other than residential neighbourhoods; (9) construct bespoke data; (10) combine quantitative and qualitative methods.

• What is the state-of-the-art in addressing the issues?

o Very extensive literature;

- Multiple disciplines: economics, human geography, sociology, urban studies, etc.;
- o Differences in main focus;
- o Differences in language, concepts, theories and methods across disciplines;





Screening and Selection

Extraction and Analysis

- 0. Read existing surveys and review studies
- 1. Define search criteria and identify candidate literature
- 2. Screen studies and select those considered relevant
- 3. Extract data for main study dimensions and build harmonised database

• • 1.Search criteria

- Existing surveys and review studies informed search criteria (Round 0)
- Identification of new studies through Google Scholar to capture grey literature
- o Search period covered: 2002-2018
- Searching keywords in title carried out in two consecutive rounds (Round 1, Round 2)

1	Neighbourhood Effects Research: New Perspectives Maarten van Ham, David Manley, Nick Bailey, Ludi Simpson, and Duncan Maclennan	
2	The Mechanism(s) of Neighbourhood Effects: Theory, Evidence, and Policy Implications George C. Galster	23
3	Ethnographic Evidence, Heterogeneity, and Neighbourhood Effects After Moving to Opportunity Mario Luis Small and Jessica Feldman	57
4	Understanding Neighbourhood Effects: Selection Bias and Residential Mobility Lina Hedman and Maarten van Ham	79
5	Social Mix, Reputation and Stigma: Exploring Residents' Perspectives of Neighbourhood Effects Kathy Arthurson	101
6	Theorising and Measuring Place in Neighbourhood Effects Research: The Example of Teenage Parenthood in England Ruth Lupton and Dylan Kneale	121
7	Neighbourhood Effects, Housing Tenure and Individual Employment Outcomes David Manley and Maarten van Ham	147
8	Neighbourhood Social Capital and Individual Mental Health Gindo Tampubolon	175
9	The Notable and the Null: Using Mixed Methods to Understand the Diverse Impacts of Residential Mobility Programs Stefanie DeLuca, Greg J. Duncan, Micere Keels, and Ruby Mendenhall	195
10	School Outcomes and Neighbourhood Effects: A New Approach Using Data from Finland Venla Bernelius and Timo M. Kauppinen	225
11	Recasting Research on 'Neighbourhood effects': A Collaborative, Participatory, Trans-National Approach Michael Darcy and Gabrielle Gwyther	249
12	Are Mixed Community Policies Evidence Based? A Review of the Research on Neighbourhood Effects Paul Cheshire	267

Maarten van Ham - David Manley Nick Bailey - Ludi Simpson Duncan Maclerinan - Editors

Neighbourhood Effects Research: New Perspectives



2012





Chapter 50: Neighbourhood effects, Steven Durlauf (2004)



Chapter 9: Neighbourhood and network effects G. Topia & Y. Zenou (2015)



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Does Neighborhood Matter? Assessing Recent Evidence

Ingrid Gould Ellen New York University

Margery Austin Turner The Urban Institute



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Sector Sector

Science/Street

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Social Science Research 31 (2002) 539-575

www.academicpress.com

The estimation of neighborhood effects in the social sciences: An interdisciplinary approach ☆

Robert D. Dietz¹

• • 1.Search criteria

Round 1

Neighbo(u)rhood effect(s) OR *community effect(s)* **AND**

 Employment 	(n=50)
 Unemployment 	(n=20)
• Income	(n=203)
• Earnings	(n=14)
 Social mobility 	(n=10)
• Well(-)being	(n=33)
 Life satisfaction 	(n=7)
 Happiness 	(n=0)
 Self-rated/self-reported health 	(n=18)
• SF12	(n=0)
• GHQ	(n=0)
Total identified: N=355	
Date accessed: 08 Feb 2018	

Round 2

Search terms used: Neighbo(u)rhood

AND

• Well(-)being	(n=227)
• Life satisfaction	(n=42)
• Happiness	(n=17)
 Self-rated/reported health 	(n=132)
• SF12	(n=0)
• GHQ	(n=0)
Total identified: N=418	
Date accessed: 09 Feb 2018	

• • 2. Screening & study selection



N=2

N=9

N=46

N=15

N=15

N=4

• • 3. Data extraction: database

- 1. Outcome indicator(s) used
- 2. Neighbourhood boundaries / spatial scale
- 3. Causal mechanism(s) studied
- 4. Causal mechanism(s) indicator(s)
- 5. Longitudinal nature of data (yes/no)
- 6. Source of individual data
- 7. Temporal dynamics of neighbourhood indicators (dynamic vs. fixed in time)
- 8. Type of neighbourhood data: Census/administrative, survey, geomarketing
- 9. Estimation method: OLS, FE, RE, CRE, FD, IV, PSM, etc.
- 10. Model estimation and specification challenges addressed (yes/no)
 - Neighbourhood condition factors (if yes, list which)
 - Residential selection (if yes, how?)
 - Family background context/factors (if yes, which)
- 11. Results: statistically significant (yes/no); positive/negative impact; strong/weak
- 12. Study identification (year; authors; publication; discipline; citations)

• Summary of main findings

By type of well-being outcomes:

- o Causal mechanisms of NB effects
- Most popular indicators for NB effects causal mechanisms
- o Neighbourhood spatial scales and boundaries
- Dealing with selection bias and other identification issues

Mechanisms studied

Causal mechanism	Objective	outcomes	Subjective outcomes			
	Employment	Earnings	Life satisfaction	Self-rated health		
Social interactive						
Environmental	•	•				
Geographical			•			
Institutional			•			
Catch-all						

• • Frequently chosen Indicators: Social-interactive mechanisms



• • Frequently chosen indicators: Environmental & geographical mechanisms



Perception of environment

Neighbourhood satisfaction

Objective environment

• • Frequently chosen indicators: Institutional mechanisms

Hirschman-Herfindahl index	1	6.25
average / median income	1	6.25
employment density	1	6.25
housing price	1	6.25
n/a	1	6.25
others: political climate, composite	1	6.25
others: transport wealth, composite	1	6.25
others: transport, composite	1	6.25
proportion of co-ethnic	1	6.25
proportion of low-income	1	6.25
public service, objective	3	18.75
public service, subjective	2	12.5
social cohesion / control / trust	1	6.25

• • Frequently chosen indicators: Catch-all mechanisms



Types of neighbourhood data

	Objectiv	e outcomes	Subjective outcomes		
Data types	Employment	Earnings	Life satisfaction	Self-rated health	
Administrative					
census	9	6	5	13	
registers	4	8	0	4	
survey	0	0	3	5	
geo-marketing	0	0	1	1	
Respondent-centred	0	0	7	9	
Bespoke					
population-based	3	3	0	0	
size-based	4	1	1	0	

• • • Neighbourhood scales in administrative data

■Consistent	Areas Through	Cluster	s, 2.9k , ZA		Zip codes ranging 3-5	, 9.8k , 8.8k, DE			
Time, 503 , 50	0-18k, UK	■IRIS, <mark>2.4k</mark>	, FR		Postcode a 8.5k, UK	reas,	2	Commuting 2	Zones,
Census district 200-250 hh, AU Enumeration dist	s, EAro Cer ricts, areas	ea units, <mark>2.2k</mark> , nsus tracts/res	NZ idential	■Wards, from 2k to	<mark>5-7k</mark> , ranging 20k, UK		■Dist	rict, 125k , ZA (street), rang	\ ina
150-200 hh, Wales	s, UK			ostal codes, <mark>5k</mark> , isterdam, NL			20k-200k, Beijing, CN		
 Output areas, 140, Streets, 25 hh, DE Small neighbourhoods, Stockholm, SE 	UK 1k-4k, T Lower Supe Areas, 1.5k, U	W W IK US ■C	■Wards ■SAMS, 4. Stockholm, ensus tract	;, 4.2k , BE <mark>2k</mark> , SE s. 4k , US//	24	 Pari Stock Tertiary 21.4k, H 	₋ocal authori ish, 26.6k , tholm, SE ^r Planning Ui K	ties, UK nits,	
(people) 1k	2k	4k	6k	8k	10k <u>(</u>	20k	50k	100k	→ _
Very small	Small		Interme	diate		Large		Very large	

Neighbourhood scales in administrative data

Scales	Objec outco	tive mes	Subjective outcomes		
	Employment	nployment Earnings		Self-rated health	
Very small	1	2	3	2	
Small	3	2	2	9	
Intermediate	7	7	3	10	
Large	0	3	2	1	
Total number	10	14	10	22	





• • Addressing selection bias



	Objective (Dutcomes	Subjective outcomes		
Method	Employment	Earnings	Life satisfaction	Self-rated health	
Not addressed	4	5	4	10	
Control for individual characteristics	0	0	1	2	
Individual fixed effects / correlated random effects	1	5	1	0	
Neighbourhood fixed effects	1	3	7	12	
Sample restriction	4	3	2	1	
Instrumental variables / Propensity score matching	3	2	1	1	
Explicit modelling of residential choice	0	1	0	0	
Total	13	19	16	26	

• • Conclusion

- There has been some progress addressing selection bias, but it remains limited to (only some) register data countries;
- o Understanding of causal mechanisms, and their relative importance, remains a challenge;
- Choice of spatial scale dependent on outcome and focus of study, generally flexible scales more appropriate and meaningful.



Thank you!







