The association between childhood relocations and subsequent risk of suicide attempt, psychiatric problems, and low academic achievement

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Background. Given the frequency with which families change residences, the effects of childhood relocations have gained increasing research attention. Many researchers have demonstrated that childhood relocations are associated with a variety of adverse outcomes. However, drawing strong causal claims remains problematic due to uncontrolled confounding factors.

Method. We utilized longitudinal, population-based Swedish registers to generate a nationally representative sample of offspring born 1983-1997 ($n=1\,510\,463$). Using Cox regression and logistic regression, we examined the risk for numerous adverse outcomes after childhood relocation while controlling for measured covariates. To account for unmeasured genetic and environmental confounds, we also compared differentially exposed cousins and siblings.

Results. In the cohort baseline model, each annual relocation was associated with risk for the adverse outcomes, including suicide attempt [hazard ratio (HR) 1.19, 95% confidence interval (CI) 1.19–1.20]. However, when accounting for offspring and parental covariates (HR 1.08, 95% CI 1.07–1.09), as well as genetic and environmental confounds shared by cousins (HR 1.07, 95% CI 1.05–1.09) and siblings (HR 1.00, 95% CI 0.97–1.04), the risk for suicide attempt attenuated. We found a commensurate pattern of results for severe mental illness, substance abuse, criminal convictions, and low academic achievement.

Conclusions. Previous research may have overemphasized the independent association between relocations and later adverse outcomes. The results suggest that the association between childhood relocations and suicide attempt, psychiatric problems, and low academic achievement is partially explained by genetic and environmental confounds correlated with relocations. This study demonstrates the importance of using family-based, quasi-experimental designs to test plausible alternate hypotheses when examining causality.

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Introduction

Due to rates in developed countries demonstrating that people change residences more frequently in child-hood than in adulthood (Jelleyman & Spencer, 2008), the ramifications of childhood relocation has gained increasing research attention. A growing body of literature suggests that children who have changed residences are at higher risk for adverse outcomes, including suicidal behavior (Qin *et al.* 2009), psychiatric disorders (Adam, 2004; Jelleyman & Spencer, 2008),

substance use (Dewit, 1998; Brown et al. 2012), criminal convictions (Gasper et al. 2010), and academic difficulties (Chen, 2013; Hutchings et al. 2013). Several hypotheses exist as to why relocation is associated with adverse outcomes. Relocation may result in the severing of social ties and a disruption in familiar surroundings (Durkheim, 1951; Wray et al. 2011), which could, for example, increase one's risk for subsequent suicidal behavior (Stack, 2000). Or, relocations may be a marker of confounding pre-existing parental psychiatric disorders, parental unemployment, disorganized family life, or low family income (Pribesh & Downey, 1999; Leventhal & Brooks-Gunn, 2003; Dong et al. 2005; Fomby & Cherlin, 2007; Dupere et al. 2008; Jelleyman & Spencer, 2008). Despite the frequently assumed

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causal relation (Haynie *et al.* 2006; Jelleyman & Spencer, 2008), drawing causal inferences between relocations and adverse outcomes remains problematic (Scanlon & Devine, 2001; Adam, 2004). Previous studies examining the effect of childhood relocation are limited primarily by: (1) small sample sizes that limit the statistical power and generalizability (Jelleyman & Spencer, 2008; Nock *et al.* 2008*a*), (2) a lack of rigorous control of measured covariates (Jelleyman & Spencer, 2008), and (3) inferring a causal relation without sufficiently exploring plausible genetic and environmental confounding factors (Rutter, 2007).

Given the importance of rigorously examining plausible alternative explanations when causal claims have been made (Shadish et al. 2002; Rutter, 2007), this paper aims to examine the relation between childhood relocations (i.e. before age 12 years) and a variety of adverse outcomes by including more extensive measured covariates and comparing differentially exposed cousins and siblings using data collected in population-based, longitudinal, Swedish registers. Although previous studies have highlighted the vulnerability of relocations in adolescence (Qin et al. 2009; Paksarian et al. 2015), we focused specifically on childhood relocations due to the minimal literature examining this age range. We examined the extent to which relocations are independently associated with suicide attempt, severe mental illness, substance abuse, criminal convictions, and academic achievement. We hypothesized that the population-wide risk for adverse outcomes associated with relocations would be attenuated after accounting for numerous offspring (i.e. sex, birth parity, maternal smoking during pregnancy, mothers' cohabitation at offspring birth, parental age at childbearing) and parental covariates (i.e. educational attainment, country of origin, suicide attempt, suicide, severe mental illness, substance abuse, criminal history, and ranked, average family income) and controlling for unmeasured environmental and genetic confounds shared by cousins and siblings.

Method

Data

After approval from the Institutional Review Boards at Indiana University and the Regional Ethical Review Board in Stockholm, Sweden, we generated a dataset linking information from ten longitudinal, population-based and healthcare registers using a personal identification number assigned to all Sweden residents at birth. The registers were: (1) the Medical Birth Register, which provides detailed birth information for more than 95% of pregnancies in Sweden beginning

1 January 1973 (Swedish Centre for Epidemiology, 2003), as well as offspring antenatal and perinatal information; (2) the Multi-Generation Register, which can be used to determine biological and adoptive familial relationships for all individuals born after 1932 or have been living in Sweden since 1961 (Statistics Sweden, 2010); (3) the Statistics Sweden Regional Register (SSRS), which records an annual dichotomous change in residence beginning in 1983 (Statistics Sweden, 2013); (4) the Integrated Database for Labor Market Research (LISA), which provides longitudinal market labor information (e.g. income level, marital status, unemployment status, social welfare status, disability status, etc.) on all individuals over the age of 16 beginning in 1990 until the end of 2008, as well as an annual count of residential changes (Statistics Sweden, 2011); (5) the Cause of Death Register, which contains the date and contributing cause(s) of deaths since 1 January 1952 (Statistics Sweden, 2010); (6) the National Patient Register, which includes International Classification of Diseases Eighth, Ninth, and Tenth Revisions (ICD-8, ICD-9, ICD-10) codes (Janssen & Kunst, 2004) and dates for hospital inpatient admissions since 1 January 1969 (Jacobsson, 2009); (7) the Migration Register, which records dates for immigrations to and emigrations from Sweden since 11 September 1901 (Statistics Sweden, 2010); (8) the National Crime Register, which records all criminal convictions (i.e. for both non-violent and violent offenses), the date, and the sentence since 1 January 1973 for all citizens aged ≥15 years (Fazel & Grann, 2006); (9) the Education Register, which includes information since 1970 on the highest level of completed formal education, divided into seven ordinal groups from fewer than 9 years of education to postgraduate education (D'Onofrio et al. 2010); and (10) the National School Register, which includes a continuous measure of academic performance aggregated across 16 subjects since 1989, and Swedish language tests since 1987 for all students graduating from 9th grade at approximately age 16 years (the Swedish National Agency for Education, 2011). Additional information about the registers can be found elsewhere (e.g. D'Onofrio et al. 2013a).

Sample

The population cohort in this study included individuals who were born in Sweden between 1 January 1983 and 31 December 1997. Using this time-frame enabled us to define childhood relocations in terms of residential address changes occurring before the age of 12 and follow individuals on our main outcomes through 2009. Specifically, we wanted to ensure exposure to the risk factor (i.e. childhood relocations)

occurred before any measured outcome to more accurately assess the independent association between relocation and later adverse outcomes (Kraemer et al. 1997). In addition, previous research has demonstrated that the validity of suicide attempt and severe mental illness younger than age 12 is unknown (D'Onofrio et al. 2013a).

Starting with 1594532 observations from the Medical Birth Register, we excluded individuals sequentially starting with stillbirths (n = 3608), offspring with any congenital malformation (n = 63790), and those with missing or invalid information for sex (n = 65). We then excluded individuals who had no relocation data in SSRS (n = 10227), as well as one individual born after 1990 who was missing relocation data from LISA. Next, we dropped all recorded cases of suicide attempt (n = 3892) or suicide (n = 2) that occurred before the age of 12. Due to the lack of documented information on predictor and outcomes variables during time spent outside of the country, we also excluded those who migrated before age 12 but subsequently returned to Sweden and had a later recorded suicide attempt (n=473) or suicide (n=9). Finally, we excluded individuals for whom the maternal age at childbearing was under 9 years (n=6), the age of death was less than 0 (n = 1), and the recorded date of suicide did not match the date of death (n = 1). In total, we excluded 5.27% (n = 84069) of individuals born from 1983 to 1997, leaving a final cohort of 1 510 463 individuals, which included 2.38% (n = 35940) from multiple births. Table 1 presents a summary of offspring-specific characteristics for the study cohort.

Measures

Relocation predictors

We operationally defined relocations using information recorded in two different registries: (1) SSRS, and (2) LISA. Table 2 presents the distribution of SSRS and LISA relocations. The first (SSRS) began in 1983 and records relocations to and from homogenous, geographic clusters called Small Areas for Market Statistics (SAMS) areas. Statistics Sweden defines SAMS areas as either sub-divisions of municipalities nested within large municipalities or electoral districts nested within small municipalities (Statistics Sweden, 2015). There are ~1000 people in each SAMS area in Sweden with the exception of Stockholm, which averages ~2000 people per area (Sundquist et al. 2004). It should be noted that data in SSRS are collected annually and can account only for a move between two different SAMS areas from one year to the next. Thus, we assumed that the number of SSRS relocations was an underestimate of the actual number of relocations for an individual and used data from a second register,

LISA, for our sensitivity analyses. The LISA register contains a count of the total number of moves between different residential addresses within the same year starting in 1990. For each individual in the cohort, we used two different predictor variables indexing childhood relocations by summing each measure from ages 0 to 11 years. Because SSRS has a longer time span, we used the summed SSRS variable in the main analyses and the summed LISA variable for the sensitivity analyses. An ROC analysis using relocations as measured using LISA data as the reference variable indicated that relocations estimated using SSRS data from 1990 to 2008 has both high sensitivity (0.82) and very high specificity (0.99).

Adverse outcomes

The five main outcomes under study were: (1) suicide attempt, defined as the first uncertain or certain attempt requiring inpatient hospital admission at age ≥12 years (Tidemalm, 2008); (2) severe mental illness (i.e. either schizophrenia or bipolar disorder), defined as the first inpatient hospitalization at age ≥12 years (Lichtenstein et al. 2009); (3) substance abuse, defined as the first inpatient hospitalization at age ≥12 years (Tidemalm, 2008; D'Onofrio et al. 2013c); (4) criminal conviction, defined as the first criminal conviction at age ≥ 15 years (Fazel et al. 2009a); and (5) low grade point average (GPA) in 9th grade, which consisted of a continuous measurement of GPA ranked into quintiles and further dichotomized, with the first quintile considered 'low GPA' (Lambe et al. 2006). Note that individuals who were born after 31 December 1994 were missing criminal conviction data, as these individuals were not yet 15 years of age at the conclusion of the study. Likewise, individuals born after 1992 were not used in the analyses of low grades, which indexed performance at age 16. Finally, if offspring had not received a diagnosis or conviction within the study period, they contributed person-time at risk until death, emigration, or the end date of follow-up (31 December 2009), whichever came first. Thus, the risk period began at age 12 for all outcomes except criminal convictions, which began at age 15.

Appendix A lists the ICD codes and provides further information about the outcomes. Appendix B shows the tetrachoric correlations among the main outcome variables, while Appendix C lists Kaplan-Meier estimates of survival outcomes, including death by suicide. (See Supplementary online material for Appendices A-M.)

Covariates

Measured offspring-specific covariates were sex, birth parity, maternal smoking during the beginning of

Table 1. Descriptive summary of offspring and parental covariates for cohort with individuals born between 1 January 1983 and 31 December 1997

Variable	N (%) ^b	
Offspring-specific covariates ^a		
Female sex	737 135 (48.80)	
Birth parity		
First ^c	614 136 (40.66)	
Second	544 985 (36.08)	
Third	245 676 (16.26)	
Fourth or higher	105 666 (7.00)	
Maternal smoking during beginning of pregnancy		
No ^c	1 078 039 (71.37)	
Yes	340 847 (22.57)	
Missing	91 577 (6.06)	
Mother's cohabitation status at time of offspring birth		
Living with father ^c	1 336 498 (94.61)	
Not living with father	76 197 (5.39)	
Missing	97 768 (6.47)	
Father's age at childbearing		
<19	9949 (0.66)	
20–24	165 217 (10.94)	
25–29 ^c	467 115 (30.91)	
30–34	467 478 (30.95)	
35–39	254 812 (16.87)	
40–44	94 811 (6.28)	
≥45	39 351 (2.61)	
Missing	11 730 (0.78)	
Mother's age at childbearing		
<19	41 181 (2.73)	
20–24	328 462 (21.75)	
25–29 ^c	561 224 (37.15)	
30–34	396 993 (26.28)	
35–39	154 352 (10.22)	
40–44	27 278 (1.81)	
≥45	973 (0.06)	
Parental-specific covariates ^d	Mother, N (%) ^b	Father ^e , N (%) ^b
Highest level of education		
Primary/lower (<9 years) ^c	20 503 (2.32)	38 374 (4.40)
Primary/lower (9 years)	83 122 (9.42)	124 496 (14.11)
Upper/secondary (1–2 years)	299 725 (33.96)	328 700 (37.24)
Upper/secondary (3 years)	147 991 (16.77)	116 316 (13.18)
Post-secondary (<3 years)	139 541 (15.81)	118 413 (13.42)
Post-secondary (≥3 years)/postgraduate	186 615 (21.14)	142 236 (16.12)
Missing	5077 (0.58)	13 465 (1.53)
Born in Sweden ^c	752 539 (85.27)	742 065 (84.08)
Missing	0	7764 (0.88)
Suicide attempt ^f	24 049 (2.72)	18 054 (2.05)
Suicide ^f	1049 (0.12)	3246 (0.37)
Bipolar/schizophrenia ^f	9177 (1.04)	6553 (0.74)
Inpatient substance abuse ^f Criminal conviction ^f	18 663 (2.11)	36 151 (4.10)
CHIHIHAI CONVICTION	112 174 (12.71)	373 250 (42.29)

^a Based off 1510463 unique offspring born 1983–1997.

^b Denotes percentages that are rounded to nearest hundredths and thus may not equal 100.

^c Indicates the reference group.

^d Based off 882 574 distinct mothers and 882 000 distinct fathers.

^e Based on fathers of the mother's first-born child.

 $^{^{\}rm f}$ Indicates a covariate with no missing variables, and thus the reference group was 'No'.

Table 2. Grouped frequency distributions of the total number of childhood relocations (ages 0-11) as measured by SSRS- and LISA-based data

Within-Sweden relocations	N (%) ^a
SSRS ^b	
$0^{\mathbf{d}}$	653 090 (43.24)
1–2	651 628 (43.14)
3–5	184 759 (12.23)
6–10	20 814 (1.39)
11–12	172 (0.01)
Average annual moves (s.d.)	1.11 (1.38)
LISA ^c	
0^{d}	224 297 (14.85)
1–2	383 423 (25.38)
3–5	180 079 (11.92)
6–10	43 361 (2.87)
11–15	4206 (0.28)
≥16	708 (0.05)
Average annual moves (s.d.)	1.88 (2.06)

SSRS, Statistics Sweden Regional Register; LISA, integrated database for labor market research.

pregnancy, maternal cohabitation status with biological father at time of offspring birth, and parental age at childbearing. The parental-specific covariates for this study were highest level of completed formal education, country of birth, suicide attempt, death by suicide, lifetime history of severe mental illness (i.e. either schizophrenia or bipolar disorder), inpatient substance abuse, and criminal convictions. Details of all measured covariates are provided in Table 1. We additionally controlled for the average familial income, measured using percentile ranks that were computed annually to account for inflation and/or transient unmeasured disturbance. For those born before 1990 (i.e. the first year of LISA), calculation of ranked average familial income began in 1990 and ended when the individual reached age 12 years. All offspring in the cohort had at least 3 years of income data available.

Analyses

We first calculated Pearson product-moment and tetrachoric correlations to quantify the bivariate association between number of relocations and the offspring and parental covariates. Next, for each outcome, we fit four regression models (described below) that sequentially adjusted for measured confounders and

unmeasured familial confounders. We estimated all models using SAS v. 9.3 (SAS Institute Inc., USA) and Stata v. 13.1 (StataCorp., USA). We used Cox regression to estimate the effect of childhood relocations on the age at the first diagnosis or criminal conviction where age was measured in units of years rounded to the nearest 0.001; to estimate the effect of childhood relocations on low GPA, we used binary logistic regression. Model 1 (i.e. cohort baseline model) estimated the association between the number of childhood relocations and each outcome while accounting for both sex and birth parity. Model 2 (i.e. adjusted model) additionally included all offspringand parental-specific covariates. We used robust (sandwich) estimation, clustering on the maternal identifier, in both models 1 and 2 to account for the nonindependence of observations at the nuclear family level. Model 3 (i.e. fixed-effect, cousin comparison model) compared differentially exposed cousins to account for genetic and environment factors shared by cousins. Before fitting this model, we created a subset of the main cohort by identifying all pairs of offspring who had the same maternal grandmother identifier but different maternal identifiers. Each pair was then assigned a unique numeric identifier code. There were 1 271 618 observations (i.e. 635 809 distinct cousin pairs) from 530 809 distinct offspring in the cousin cohort subset. We obtained fixed-effects estimates by: (1) using the cousin pair identifier as a strata variable during Cox and logistic model estimation, and (2) using robust standard errors to account for repeated data from individuals belonging to more than one cousin pair. Although model 3 does not completely eliminate genetic and environmental confounding, it accounts for 6.25% or 12.5% of genetic contributions from halfand full-cousins, respectively (D'Onofrio et al. 2013b). To account for additional genetic confounding, model 4 (i.e. fixed-effect, sibling comparison model) compared differentially exposed siblings by stratifying on the maternal identifier. Note that the intraclass correlation (ICC) between siblings measured using SSRS-based relocations variable was considerably higher compared to cousins (i.e. 77% v. 18%, respectively). The sample includes 425 833 discordant cousin pairs for relocations and 350 910 discordant sibling pairs.

After fitting the population and covariate-adjusted models for the survival outcomes, we evaluated the proportional-hazards assumption by testing for a nonzero slope in the linear regression of the scaled Schoenfeld residuals on time. If the covariate-specific or global tests indicated that the assumption did not hold, we fit additional models that included parameters representing the interaction between relocations and categorical age (i.e. <19 as the reference, 20-23, and

a Denotes a variable in which the percentages are rounded to the nearest hundredths and thus may not equal 100.

^b Based off 1510463 unique individuals born 1983–1997.

^c Based off 836 074 unique individuals born 1990–1997.

^d Reference group.

Table 3. Sample bivariate correlations between relocations (measured by SSRS and LISA) and offspring and parental covariates

	SSRS		LISA		
Variable	Correlation coefficient	Sample size	Correlation coefficient	Sample size	
Offspring-specific covariates					
Birth parity	-0.10	1 510 463	-0.12	836 074	
Mother not living with father at time of offspring birth	0.14	1 412 695	0.18	766 245	
Smoking during beginning of pregnancy	0.14	1418886	0.17	792 429	
Maternal-specific covariates					
Born in Sweden	-0.04	1 510 463	-0.06	836 074	
Criminal conviction	0.18	1 510 463	0.18	836 074	
Suicide attempt	0.13	1 510 463	0.14	836 074	
Death by suicide	0.01	1 510 463	0.01	836 074	
Severe psychopathology	0.06	1 510 463	0.07	836 074	
Inpatient substance abuse	0.14	1 510 463	0.15	836 074	
Age at childbearing	-0.25	1 510 463	-0.32	836 074	
Highest level of education	-0.07	1 494 424	-0.13	828 426	
Paternal-specific covariates					
Born in Sweden	-0.06	1 498 733	-0.09	829 586	
Criminal conviction	0.16	1 510 463	0.16	836 074	
Suicide attempt	0.08	1 510 463	0.09	836 074	
Death by suicide	0.02	1 510 463	0.03	836 074	
Severe psychopathology	0.03	1 510 463	0.03	836 074	
Inpatient substance abuse	0.12	1 510 463	0.13	836 074	
Age at childbearing	-0.20	1 498 733	-0.24	829 586	
Highest level of education	-0.03	1 491 115	-0.08	827 604	
Family-specific covariates					
Rank average family income age 0–11	-0.21	1 507 860	-0.29	836 056	

SSRS, Statistics Sweden Regional Register; LISA, integrated database for labor market research. All correlation coefficients p < 0.05 for the test H_0 : $\rho = 0$. Offspring sex is not included in the table.

≥24 years). We also performed an extensive set of sensitivity analyses to address limitations inherent to our definitions of particular constructs and to our dataset.

Ethical standards

The authors assert that all procedures contributing to this work comply with the ethical standards of the relevant national and institutional committees on human experimentation and with the Helsinki Declaration of 1975, as revised in 2008.

Results

Table 3 presents the correlations estimates between the covariates and the relocation data from SSRS and LISA. While all the covariates were associated with the frequency of relocations, the magnitudes of correlation were largest for maternal (r = -0.25) and paternal (r = -0.20) age at childbearing, closely followed by

familial average income (r = -0.21), maternal (r = 0.18) and paternal criminality (r = 0.16), and maternal (r = 0.14) and paternal substance abuse (r = 0.12). Thus, frequent relocations are associated with younger parental age at childbearing, lower socioeconomic status, and more parental substance use problems and criminality.

Table 4 and Fig. 1 present the results of the Cox regression models predicting suicide attempt, severe mental illness, substance abuse, and criminal convictions from continuous SSRS relocations. For model 1 (i.e. cohort baseline model), the observed hazard ratio (HR) for relocations predicting suicide attempt was 1.19 [95% confidence interval (CI) 1.12–1.18], indicating that each additional annual relocation increases the risk for attempting suicide by 19%. After adjusting for measured covariates in model 2, the magnitude of the association was attenuated (HR 1.08, 95% CI 1.07–1.09), but remained robust. The association was slightly weaker in model 3, which compared differentially exposed cousins (HR 1.07, 95% CI 1.05–1.09).

Table 4. The association between number of childhood relocations as measured by SSRS and suicide attempt, severe mental illness, inpatient hospitalization for substance abuse, criminal conviction and low GPA

Outcome	Model 1		Model 2		Model 3		Model 4	
	b	S.E.	b	S.E.	b	S.E.	\overline{b}	S.E.
Suicide attempt	0.18 ^a	<0.01	0.08 ^a	<0.01	0.07 ^b	0.01	0.002 ^a	0.02
Severe mental illness	0.19^{a}	0.01	0.11 ^a	0.01	0.07^{b}	0.03	-0.03^{a}	0.06
Inpatient substance abuse	0.22^{a}	< 0.01	0.14^{a}	< 0.01	0.08^{b}	0.01	0.02 ^a	0.02
Criminal convictions	0.20^{a}	< 0.01	0.12^{a}	< 0.01	$0.07^{\rm b}$	< 0.01	0.00^{a}	0.01
Low GPA	0.30^{c}	< 0.01	0.14^{c}	< 0.01	$0.08^{\rm d}$	0.01	-0.02^{c}	0.01

SSRS, Statistics Sweden Regional Register; GPA, grade point average; b, estimated regression coefficients; s.e. standard error.

^d Based off cohort size of 865 983.

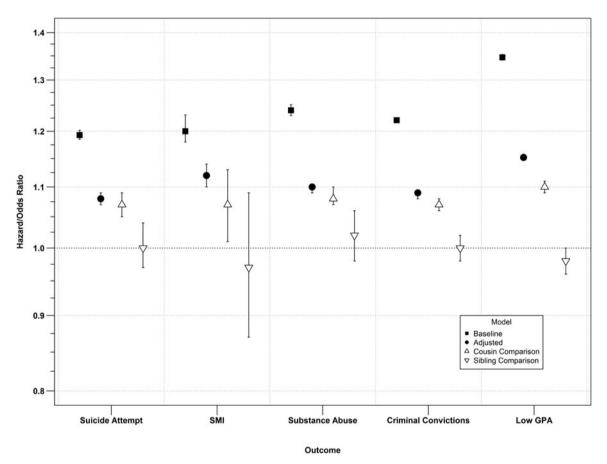


Fig. 1. Point estimates and 95% confidence intervals for the association between childhood relocations and adverse outcomes across models.

Only in model 4, which compared differentially exposed siblings, was the association fully attenuated (HR 1.00, 95% CI 0.97-1.04). A similar pattern of results was observed for severe mental illness, substance abuse, criminal convictions, and low GPA (i.e. the cohort-wide associations were attenuated when accounting for offspring and parental covariates, and attenuated even further when controlling for genetic and environmental factors shared by cousins and siblings). Appendix D provides the exact HRs and

^a Based off cohort size of 1510463.

^b Based off cohort size of 1 271 618.

^cBased off cohort size of 974 008.

odds ratios (ORs) and 95% CIs that are presented in Fig. 1. Appendix E lists the parameter estimate and standard error for each covariate for the main outcomes in models 2 and 4 (i.e. the adjusted population and sibling comparison model, respectively).

We found no evidence that the proportional-hazards assumption was violated for the models predicting suicide attempt and severe mental illness. By contrast, tests rejected the null hypothesis of zero slope for both criminal convictions and inpatient substance abuse, indicating that the log HR function is not constant over time. To address this further, we estimated the baseline and covariate-adjusted models including two additional parameters representing the interaction between relocations and categorical age. Although the interaction terms were statistically significant, the magnitudes of the differences in estimates for criminality and substance abuse were quite small (see Appendix F for details).

We used sensitivity analyses to examine several alternative explanations of our main findings and to address generalizability issues across different measures of the exposure and outcomes. First, we fit the full covariate-adjusted model 2 to a subset of the data that excluded individuals who were missing a maternal grandmother identifier (n = 153515, see Appendix G) to determine whether or not those with missing maternal grandmothers systemically differed from those without missing maternal grandmothers. Results were analogous to model 2 on the full sample (see Appendix D). Second, we fit models 1-3 predicting (1) death by suicide (determined with certainty using ICD codes) to compare with previous literature regarding the effect of relocations and death by suicide specifically (Qin et al. 2009), and (2) four continuous measures of academic performance (i.e. GPA, achievement in Swedish, mathematics, and English tests) to examine the validity of our derived dichotomous outcome indexing low GPA. The results (see Appendix H) of the models predicting suicide, GPA, and achievement test scores all mirrored the pattern of findings in the main analyses. Third, we re-estimated models 1-3 on a subset of the cohort for the main outcomes (see Appendix I) and for death by suicide and academic performance (see Appendix J) using the LISA-based relocations variables to explore the extent to which findings using the more detailed measurement for relocations agreed with the analyses based on SSRS data. Although LISA spanned fewer years, we observed the same pattern of attenuation in risk association with relocations across models as in the main analyses. Fourth, we categorized the continuous, SSRS-based measurement of childhood relocations into three groups representing no moves (reference category), 1–2 moves (dummy coded 0/1), and $\geqslant 3$ moves

(dummy coded 0/1). We used the re-parameterized models to detect potential nonlinear associations between relocations and the outcome. Results for models 1-3 using categorical relocations (see Appendix K) are consistent with those from the main analysis using a continuous representation of relocations as a predictor - the risks associated with more relocations were attenuated with additional statistical and methodological controls for confounding factors. Fifth, due to the fact that SAMS areas are sub-divisions of municipal districts, we analyzed an annual change in municipality to capture relocations across broadly defined geographical areas (see Appendix L). Results were similar regardless of whether we defined relocation as a change in SAMS area or municipal district. Finally, we analyzed two separate age ranges (i.e. 0-5, 6-11) to explore sensitive periods of childhood relocation (i.e. early and late childhood; see Appendix M) because relatively few studies examined developmental periods in relation to childhood relocations (Anderson et al. 2014). Offspring who moved between the ages of 6-11 were at an increased risk compared to offspring who moved before age 6, although risk progressively attenuated across the four models, consistent with the results of the main analyses. In sum, the results of each sensitivity analysis were commensurate with those in the main analyses and followed a similar pattern of risk attenuation.

Conclusions

The current study sought to address the limitations of past literature by examining the associations between relocations specifically in childhood and later adverse outcomes using an extensive list of measured covariates and family-based, quasi-experimental designs (D'Onofrio et al. 2013b). We first showed that an increase in the frequency of relocations was associated with numerous other risk factors. Those who relocated in childhood were more likely to have been born to young parents and have parents who abuse substances, have lower incomes, and engage in criminal which supports previous (Dohrenwend et al. 1992; Karriker-Jaffe, 2013; U.S. Census Bureau, 2013). We then utilized analyses to incorporate both measured covariates and family-based comparisons, including the comparison of differentially exposed cousins and siblings. Overall, the findings suggest that previous studies may have overstated the magnitude of the independent association between relocation and later adverse outcomes. Instead, our findings suggest that the associations are more likely due to: (1) the correlates of relocation (Jelleyman & Spencer, 2008) and (2) genetic and shared environmental factors associated with suicide attempt, severe mental illness, substance abuse, criminal convictions, and

academic achievement (Bondy et al. 2006; Brent & Melhem, 2008: Lichtenstein et al. 2009: Kendler et al. 2012). The risk for adverse outcomes attenuated when controlling for genetic and shared environmental confounds, regardless of the sensitive period in which a child moved. However, future studies should further explore the role of sensitive periods when examining risk factors for a variety of adverse outcomes.

This study was strengthened by the use of multiple approaches and designs to more precisely examine the independent associations between relocation and suicide attempt, psychiatric problems, and low academic achievement. The ICCs between cousins and siblings (i.e. 18% v. 77%, respectively) demonstrate the likelihood that siblings move together within family units, and thus siblings are less likely to be differentially exposed to relocations. Thus, the cousin comparison model strengthens the external validity of the findings (i.e. the siblings may not be representative of the entire population), while the sibling comparison model strengthens the internal validity because the design controls for more genetic and environmental factors (D'Onofrio et al. 2013b). Additionally, the large sample size enabled us to estimate associations for outcomes with low base rates (Saha et al. 2005; Nock et al. 2008a) and provide a more diverse cross-section of the population (Adam, 2004). The inclusion of extensive sensitivity analyses reduced the possibility that our results were influenced by our construct definitions or limitations inherent to the registers. For example, results were unaffected regardless of our definition of relocations. In addition, this study examined relocations before age 12, thus expanding upon previous studies that have highlighted the vulnerability of relocations specifically in adolescence (Qin et al. 2009; Paksarian et al. 2015).

Conversely, there are several limitations to this study. First, the register-based measurements of the psychiatric outcomes reflect more 'severe' outcomes (e.g. suicide attempt and substance abuse), although we replicated results with a variety of other outcomes that covary with suicide attempt and substance abuse (Fazel et al. 2009b; Lichtenstein et al. 2009; Webb et al. 2011). Second, we were unable to explore moderating factors, such as the motive behind relocating (e.g. if relocation is due to a 'crisis,' the effect may be more detrimental) (Tucker et al. 1998), or the population density and neighborhood deprivation of the post-relocation area (Pedersen & Mortensen, 2001). Despite this, previous research has demonstrated that the association between relocations to more dense or deprived neighborhoods and schizophrenia, for example, is negligible when controlling for unmeasured familial risk factors shared by cousins and siblings (Sariaslan et al. 2015). Third, the results are based solely on Swedish

data, which may not generalize to other countries or cultures. However, current research suggests that the associations between risk factors and suicidal behavior, for example, are relatively consistent crossnationally despite socioeconomic, racial, ethnic, and cultural diversity amongst a variety of countries (Nock et al. 2008b). Fourth, while the main analyses demonstrate a pattern of attenuation with increased control for measured and unmeasured covariates, sibling comparison analyses suggested that offspring who relocate more may actually be at a decreased risk for low grades (see Appendix D) but remains an open research question for future studies. However, previous literature parallels our findings suggesting that students who perform poor in school are exposed to disadvantages that better explain the relation between relocations and poor grades (Pribesh & Downey, 1999). Finally, we were unable to measure school mobility. While we analyzed moves amongst municipal districts, and thus captured a greater geographical area possibly indicating school changes, our measure of residential mobility was only an indirect measure of school mobility.

The results suggest that clinicians should not discount relocation as a risk factor for adverse outcomes (as there is still an association in the population model) but rather refocus intervention and prevention programs. Inquiring about relocations may serve as an indicator of exposure to co-occurring risk factors (e.g. parental substance abuse). Importantly, federal programs that aid children who frequently change residences (e.g. in military families or children in foster care) focus on educational transition, such as ensuring a timely high school graduation (Anderson et al. 2014). We argue that these programs should not only consider educational outcomes, but a wide range of risk factors that are associated with both relocations and other adverse outcomes.

Future studies will need to replicate this study, particularly in other countries. Additionally, because we did not include possible interactions among childhood relocations and adverse outcomes (e.g. the role of socioeconomic status), future research would benefit from these analyses. In sum, this study illustrates the importance of using rigorous research designs to test plausible alternative hypotheses, especially when studying early risk factors (D'Onofrio et al. 2013b); studies that are unable to apply such designs may overestimate the magnitude of causal influences (Academy of Medical Sciences Group, 2007).

Supplementary material

For supplementary material accompanying this paper visit http://dx.doi.org/10.1017/S0033291715002469.

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Declaration of Interest

None.

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