

ORIGINAL ARTICLE

Common psychiatric disorders share the same genetic origin: a multivariate sibling study of the Swedish population

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Recent studies have shown that different mental-health problems appear to be partly influenced by the same set of genes, which can be summarized by a general genetic factor. To date, such studies have relied on surveys of community-based samples, which could introduce potential biases. The goal of this study was to examine whether a general genetic factor would still emerge when based on a different ascertainment method with different biases from previous studies. We targeted all adults in Sweden ($n = 3\,475\,112$) using national registers and identified those who had received one or more psychiatric diagnoses after seeking or being forced into mental health care. In order to examine the genetic versus environmental etiology of the general factor, we examined whether participants' full- or half-siblings had also received diagnoses. We focused on eight major psychiatric disorders based on the *International Classification of Diseases*, including schizophrenia, schizoaffective disorder, bipolar disorder, depression, anxiety, attention-deficit/hyperactivity disorder, alcohol use disorder and drug abuse. In addition, we included convictions of violent crimes. Multivariate analyses demonstrated that a general genetic factor influenced all disorders and convictions of violent crimes, accounting for between 10% (attention-deficit/hyperactivity disorder) and 36% (drug abuse) of the variance of the conditions. Thus, a general genetic factor of psychopathology emerges when based on both surveys as well as national registers, indicating that a set of pleiotropic genes influence a variety of psychiatric disorders.

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INTRODUCTION

Although psychiatric disorders are treated as distinct entities in clinical praxis,¹ comorbidity is the rule rather than exception in psychiatry.² For example, in a representative sample of over 9000 individuals in the United States, over half of those who met criteria for one disorder in a given year also met criteria for another disorder.³ This extensive overlap may indicate that ostensibly discrete disorders partly share similar origins. Two broad factors, internalizing and externalizing, have been found to explain much of the co-occurrence among psychopathologies.^{2,4,5} The internalizing dimension puts individuals at risk for depression and anxiety, and the externalizing dimension puts individuals at risk for drug abuse and conduct problems.

More recently, it has been observed that because the internalizing and externalizing dimensions are also positively associated, it may be that an even broader dimension—a general factor of psychopathology—puts individuals at risk for developing all forms of psychopathologies.^{6–9} Indeed, models of psychiatric disorders that include a general factor tend to fit data better, compared with models that do not include a general factor.¹⁰ In a community-based study of over 30 000 individuals representative of the United States population, a model based on common mental disorders assessed through diagnostic interviews fit significantly better when a general factor was included.⁷ This indicates that risk for mental illness may not only be shared across internalizing and externalizing forms of psychopathology, but also across all disorders to some extent.

Twin studies have demonstrated that the general factor of psychopathology primarily has a genetic origin.^{8,9} This suggests that a set of pleiotropic genes influence a variety of disorders and

problems, which has implications for nosology and molecular genetic approaches. For example, aside from identifying genes that are specific to particular disorders, there may also be merit in searching for genetic risk variants that influence all forms of psychiatric diagnoses.

However, to date, all twin studies of the general factor have targeted the general population with a battery of questions about mental illness. Such survey studies could be biased. First, some may decline to participate (selection bias). For example, poorer and more psychiatrically troubled individuals appear less likely to participate in survey research.^{11,12} Second, people may not report accurately about their symptoms (presentation bias). For example, retrospective evaluations may underestimate lifetime prevalence rates.^{13,14}

The aim of the current study was to explore whether a general genetic factor would emerge when based on individuals in treatment, as identified by registers. Although register data are also vulnerable to biases (for example, not all troubled individuals may seek help and individuals with multiple diagnoses are more likely to come into contact with the mental health system), these differ from those of survey designs. Thus, if different study designs come to similar conclusions, it will strengthen the hypothesis that a general genetic factor is important in psychiatry.

MATERIALS AND METHODS

Participants

Using personal identification numbers unique to each individual living in Sweden, we created a population-based cohort by linking together several longitudinal population registers. The National Patient Register captures all

Table 1. Frequencies of diagnoses

| Diagnoses | Full siblings | | | Maternal half-siblings | | | Paternal half-siblings | | |
|---|---------------|--------|-------------|------------------------|--------|-------------|------------------------|--------|-------------|
| | No | Yes | Percent (%) | No | Yes | Percent (%) | No | Yes | Percent (%) |
| Schizophrenia | 2 921 658 | 11428 | 0.39 | 258 145 | 1285 | 0.50 | 281 141 | 1455 | 0.51 |
| Schizoaffective | 2 929 627 | 3459 | 0.12 | 259 093 | 337 | 0.13 | 282 186 | 410 | 0.15 |
| Bipolar | 2 916 456 | 16630 | 0.57 | 257 616 | 1814 | 0.70 | 280 695 | 1901 | 0.67 |
| Depression | 2 856 451 | 76635 | 2.61 | 249 161 | 10 269 | 3.96 | 272 147 | 10 449 | 3.70 |
| Anxiety | 2 827 955 | 105131 | 3.58 | 243 888 | 15 542 | 5.99 | 267 061 | 15 535 | 5.50 |
| Attention-deficit/hyperactivity disorder (ADHD) | 2 923 667 | 9419 | 0.32 | 256 937 | 2493 | 0.96 | 280 281 | 2315 | 0.82 |
| Drug abuse | 2 889 568 | 43518 | 1.48 | 249 646 | 9784 | 3.77 | 273 239 | 9357 | 3.31 |
| Alcohol abuse | 2 845 565 | 87521 | 2.98 | 245 008 | 14 422 | 5.56 | 268 716 | 13 880 | 4.91 |
| Convictions of violent crimes | 2 835 889 | 97197 | 3.31 | 237 892 | 21 538 | 8.30 | 261 902 | 20 694 | 7.32 |

public psychiatric inpatient admissions in Sweden since 1973 and outpatient diagnoses since 2001, classified by the attending physician using a non-hierarchical diagnostic structure in accordance with version eight (1969–1986), nine (1987–1996) or ten (1997–present) of the International Classification of Diseases¹⁵ (ICD) system. Diagnoses were recorded as life-time prevalence rates, thus participants could receive a different diagnosis at any point in time.

The Multi-Generation Register enabled identification of all siblings (including twins, however, these were excluded due to power reasons) registered as living in Sweden since 1961 and born in Sweden since 1932. We focused on two siblings per family to simplify the analyses. In order to maximize the follow-up time (and thereby power), we selected the oldest pair. In order to maximize the probability that they experienced a similar shared environment, we only included pairs who were born within 5 years of each other. The final sample consisted of 1 466 543 pairs of full siblings, 129 715 pairs of maternal half-siblings, 141 298 pairs of paternal half-siblings.

Disorders and conditions

ICD-10 groups mental disorders into 11 broad categories.¹⁵ We focused on a subset of these, including drug and alcohol abuse disorders (F10–F19), disorders with psychotic features (F20–F29), mood disorders (F30–F39), anxiety disorders (F40–F48), physiological disturbances (where we only included eating disorders, F50, because the other diagnoses, such as problems with sleep and sex, seemed less related to the major psychiatric disorders), and behavioral and emotional disorders with a childhood onset (where we only focused on hyperkinetic disorders, F90, because the other diagnoses, such as conduct disorder and attachment difficulties, are expected to emerge as different problems in adulthood). We excluded organic disorders (F00–F09), mental retardation (F70–F79) and developmental disorders (F80–f89) because these are generally considered to have different etiologies. We also excluded personality disorders (F60–F69) for power reasons. Because there was no overlap between obsessive compulsive disorder and schizophrenia, or between schizoaffective and eating disorder, in the maternal half-sibling subgroup, we subsumed obsessive compulsive disorder under the anxiety cluster, and opted to retain schizoaffective rather than eating disorder because, to our knowledge, this diagnosis has not been studied as extensively in relation to other disorders. In addition, though not a mental disorder, we also included violent criminal convictions because it may relate to behavioral disorders. The prevalence rates for each subsample are displayed in Table 1, the ICD codes related to each diagnosis and a description of convictions classified as violent are displayed in Supplementary Appendix 1, and the correlations within and between full siblings, maternal half-siblings and paternal half-siblings are presented in Supplementary Appendices 2, 3 and 4, respectively.

Statistical analyses

We used Exploratory Factor Analysis (EFA) to examine the potential presence of a general factor, which describes the overlap among the disorders (operationalized as tetrachoric correlations) with a fewer number of factors. We relied on EFA rather than confirmatory approaches because (a) although we expected internalizing and externalizing dimensions to emerge, we were uncertain how disorders with psychotic symptomatology might pertain to these; (b) we did not expect the data to have simple

structure; and (c) we were unable to rely on the log-likelihood function, which is useful when comparing nested confirmatory models.

By imposing restrictions on how the factors correlate across siblings, one can explore their genetic and environmental etiology. Specifically, by fixing one set of factors to correlate at their expected average genetic overlap across siblings (that is, 0.5 for full siblings and 0.25 for half siblings), such factors will have 100% heritability, assessing the additive effects of different alleles (that is, genetic factors). To assess the shared environment, that is, non-genetic components making pairs of siblings similar, one fixes another set of factors to correlate at unity across full and maternal half-siblings (because they grow-up in the same household) and at zero for paternal half-siblings (because they grow-up in different households). Lastly, by fixing a set of factors to correlate at zero across all siblings, such factors will measure the non-shared environment, that is, non-genetic components making siblings within a pair dissimilar. This type of EFA is called an Independent Pathway Model (described in general¹⁶ and in detail^{17,18}), which we used to explore whether the general factor had a genetic etiology.

In the first step of an EFA, one must determine how many factors to extract. Because we wanted to explore genetic, shared environmental and non-shared environmental factors, we used a Cholesky decomposition to examine how many dimensions existed in each of these three parts separately¹⁹ by relying on four different indices of dimensionality. First, the Eigenvalue-greater-than-one index specifies that a factor should explain more than one variable.²⁰ Second, parallel analysis simulates random (uncorrelated) data with the same number of observations and variables as the original data, and the number of factors emerging from the random data is used as a lower baseline for how many factors to extract from the original data.²¹ Third, the scree plot involves plotting the Eigenvalues against the number of extracted dimensions, and identifying a break, or an 'elbow,' in the plot, after which ensuing factors presumably capitalize on random noise that does not replicate across samples.²² Fourth, the Minimum Average Partial Index involves iteratively extracting successive Eigenvectors from the observed correlation matrix, and identifying after how many extractions the average of the residual correlations reaches a minimum.²³

Although estimator and modeling constraints prevented a direct chi-square comparison, a Cholesky decomposition without the shared environment (root-mean-square error of approximation = 0.001, 90% confidence interval: 0.000–0.001; Confirmatory Fit Index = 0.997; Tucker–Lewis Index = 0.996) appeared to fit no worse compared with a Cholesky decomposition that included the shared environment (root-mean-square error of approximation = 0.001, 90% confidence interval: 0.001–0.001; Confirmatory Fit Index = 0.996; Tucker–Lewis Index = 0.995). Therefore, variation attributable to the shared environment was removed from further analyses.

On the basis of the Eigenvalue-greater-than-one rule, indicated by the dashed line in Figure 1, there were two genetic and one non-shared environment factor. The parallel analysis indicated the same number of dimensions (indicated by the same dashed line) because this index approximates the Eigenvalue rule as the sample size grows large. Likewise, the scree plot in Figure 1 also indicated that a break occurred after two genetic and one non-shared environment factor. In contrast to these indices, the Minimum Average Partial Index suggested that there was one genetic and one non-shared environment factor. Because three of the four tests indicated that there were two genetic dimensions, we focused on

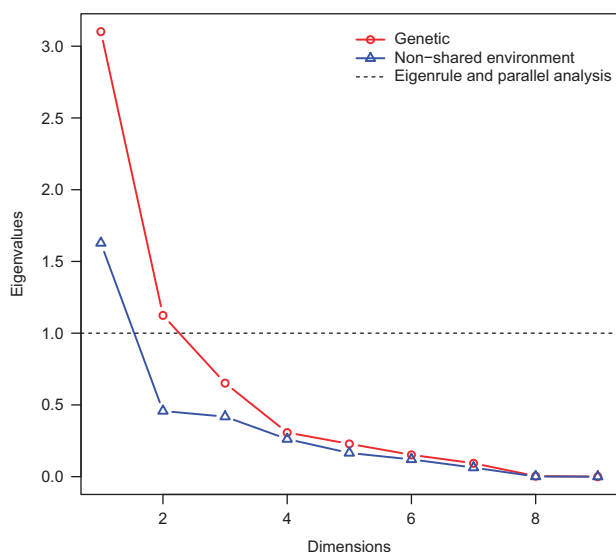


Figure 1. Scree plot of the genetic and non-shared environment variance.

Table 2. Factor structure of common mental disorders

| Diagnosis | Genetic factors | | | Non-shared environment factor |
|-----------------|-----------------|--------------------|------------------------|-------------------------------|
| | General factor | Psychotic problems | Non-psychotic problems | Mood problems |
| Schizophrenia | 0.58 | 0.56 | 0.09 | 0.02 |
| Schizoaffective | 0.55 | 0.67 | -0.05 | 0.29 |
| Bipolar | 0.41 | 0.40 | 0.06 | 0.72 |
| MDD | 0.35 | 0.14 | 0.25 | 0.86 |
| Anxiety | 0.38 | 0.04 | 0.39 | 0.46 |
| ADHD | 0.31 | -0.11 | 0.46 | 0.38 |
| Drug | 0.60 | 0.02 | 0.65 | 0.15 |
| Alcohol | 0.46 | 0.01 | 0.51 | 0.18 |
| Crime | 0.43 | 0.01 | 0.47 | -0.02 |

Abbreviations: ADHD, attention-deficit/hyperactivity disorder; MDD, major depressive disorder. Note: Loadings ≥ 0.30 are bolded.

such a model. Because all four tests indicated that there was only one non-shared environment factor, we did not extract more (or less) than that.

The second step of an EFA concerns how to rotate the factors. We opted to rotate the variance shared between the two genetic factors (which correlated at $r=0.45$ based on the Geomin rotation) toward a single factor.²⁴ This way, the solution consisted of a common (general) genetic factor, and two independent specific genetic factors, referred to as subfactors henceforth. The multivariate analyses were carried out in Mplus.²⁵ Rotations were done in R²⁶ with the GPArotations package,²⁷ and the parallel analysis and Minimum Average Partial Index were conducted using the psych package.²⁸ Because half-siblings tend to display a higher rate of disorders compared with full siblings, thresholds were allowed to vary across the three sibling structures (full, maternal half-siblings and paternal half-siblings). The effect of gender was regressed out of all analyses.

Code availability

The computer code is available in Supplementary Appendix 5.

RESULTS

The EFA solution, displayed in Table 2, fit the data very well (root mean square error of approximation = 0.001, 90% confidence

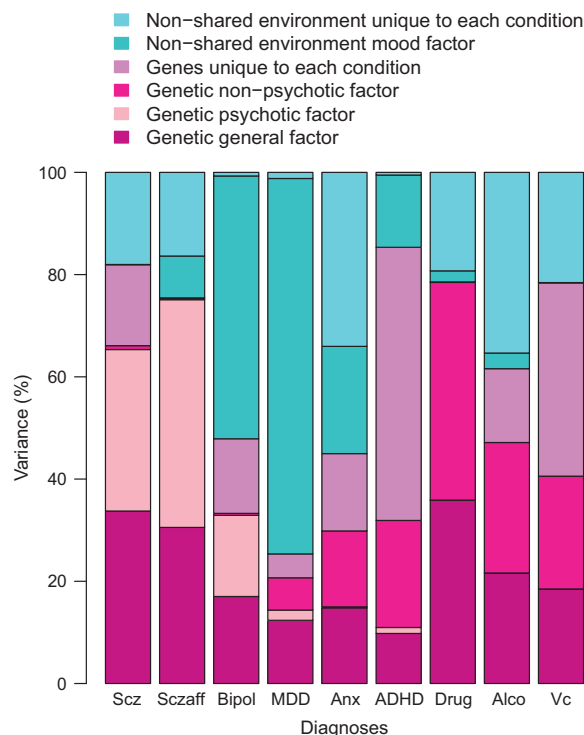


Figure 2. Variance attributable to genetic and non-shared environment sources for each diagnosis. ADHD, attention-deficit/hyperactivity disorder; Alco, alcohol abuse; Anx, anxiety; Bipol, bipolar; Drug, drug abuse; MDD, major depressive disorder; Scz, schizophrenia; Sczaff, schizoaffective disorder; Vc, conviction of violent crimes.

interval: 0.001–0.001; Confirmatory Fit Index = .99; $\chi^2=996.65$, degrees of freedom = 550, $P > 0.001$). As hypothesized, all disorders and violent criminal convictions loaded in the same direction on the general genetic factor (range 0.31–0.60), indicating that all conditions partly shared the same genetic origin. Aside from the general genetic factor, schizoaffective disorder (loading = 0.67), schizophrenia (loading = 0.56) and bipolar disorder (loading = 0.40) loaded together, indicating that psychotic problems shared a genetic pathway independent of the general factor. The second genetic subfactor included loadings on drug abuse (loading = 0.65), alcohol abuse (loading = 0.51), violent criminal convictions (loading = 0.47), ADHD (loading = 0.46) and anxiety (loading = 0.39). Although the strongest loadings were on typical externalizing problems, we interpreted this factor as non-psychotic problems because anxiety also loaded on it. The non-shared environment factor, which we interpreted as mood problems, included loadings on major depression (loading = 0.86), bipolar (loading = 0.72) and anxiety (loading = 0.46).

Figure 2 displays the variance accounted for in each disorder attributable to different sources. As can be seen, between 10 (for ADHD) and 36 percent (for drug abuse) of the observed phenotypic variance could be attributed to genetic effects shared across all disorders. This indicates that if a sibling displayed some kind of psychopathology, the co-sibling was at increased risk for not only the same condition, but also for all other forms of psychopathology. There were also genetic effects unique to each condition, with ADHD and violent criminal convictions exhibiting the greatest influence by genes not in common with the other disorders.

The non-shared environment factor indicated that there was overlap among mood disorders within sibling pairs after controlling for genes. In addition, there were substantial non-shared

environment components unique to each disorder, particularly for alcohol abuse disorder and anxiety.

Sensitivity analyses

We also explored models with one (Supplementary Appendix 6) and three (Supplementary Appendix 7) genetic factors. The general genetic factor emerged in both of these models (loadings ranged from 0.31 to 0.88), indicating the general genetic factor is not merely an artifact based on the number of extracted factors. In Supplementary Appendix 8, we explored the assumptions about the shared environment, especially regarding how it contributed to similarity among paternal half-siblings. In short, regardless of how we parameterized the shared environment, it played a vanishingly small role for the covariation among the disorders, in accordance with our main analyses.

Because the rotation toward a general factor is indeterminate when based on two factors, we examined whether this influenced the general genetic factor in Supplementary Appendix 9. Results demonstrated that a general genetic factor tended to emerge regardless of how this indeterminacy was resolved. Furthermore, the general genetic factor appeared highly similar when based on an indeterminate as well as a determinate solution, indicating that the general genetic factor was not an artifact related to rotational constraints.

DISCUSSION

Results demonstrated that common psychiatric disorders and a history of violent criminal convictions partly shared the same genetic origin, dovetailing with past twin,^{8,9} family²⁹ and genomic studies.^{30,31} Furthermore, independent of a shared genetic origin, there were specific genetic pathways influencing disorders with psychotic and non-psychotic features, respectively. In contrast to the genetic general factor, the non-shared environment factor did not influence all disorders but primarily only those related to mood problems.

General factor interpretation

Although the general factor appears to be an important phenomenon in both psychology and psychiatry and predicts a host of maladaptive outcomes,^{6,32,33} it is difficult to interpret because, by definition, it consists of the variance in common among all conditions. Perhaps as a consequence, researchers have suggested quite different interpretations of the general factor, including that it represents an evolved tendency favoring more cooperative and stable personalities;³⁴ psychotic thinking;⁶ and the personality trait neuroticism,¹⁰ which taps the tendency to experience negative and high arousal emotions.³⁵ We proffer an additional speculation, namely, that the general factor measures overall distress or impairment, akin to the Global Assessment Functioning Index of the Diagnostic Statistical Manual-IV.³⁶ Although similar to neuroticism, general distress represents a broader construct in that it encapsulates unpleasant feelings that are both high and low in arousal.^{35,37}

Limitations and future directions

First, we were unable to explore if the relative contribution of genetic and environmental influences on the general factor differed by sex because, after splitting the sample into men and women, some of the bivariate tables contained zero observations (such that the tetrachoric correlations could not be estimated properly). The registers used in this study continuously add new data; future studies should investigate this possibility.

Second, as noted above, the rotation method we used is underdetermined but this did not appear to influence the results (Supplementary Appendix 9). On a related note, because we

could not use an estimator that maximized the log-likelihood function, we could not compare the dimensionality of the correlation matrices using metrics such as Akaike's Information Criterion.³⁸ However, given that the general genetic factor emerged regardless of whether we extracted one, two or three genetic factors, the results did not appear to hinge on a particular dimensionality index.

Third, assessment of disorders from registers is relatively crude, and do not permit the richness of structured interviews or surveys. Furthermore, register data will not include troubled individuals who chose not to seek help, leading to an underestimation of prevalence rates. Also, individuals with multiple diagnoses are more likely to get in contact with the mental health system, which can lead to an overestimation of associations among disorders. On the other hand, register data could also underestimate comorbidity in comparison with structured interviews. For example, clinicians may rely too heavily on exclusionary criteria in order to identify a diagnosis, favor a particular diagnosis and thereby miss other potential diagnoses, and assign diagnoses partly based on past conditions. Nevertheless, we note that our results of a general genetic factor of psychopathology are consistent with previous survey studies^{8,9} having completely different types of assumptions, suggesting that results are not entirely due to biases.

Fourth, in the main analyses we used the assumption that maternal half-siblings shared all of the shared environment and that paternal half-siblings shared none. We acknowledge that this assumption is a simplification, but sensitivity analyses using different assumptions³⁹ showed that the shared environment had a vanishingly small influence on the observed overlap among the disorders (Supplementary Appendix 8). Thus, for our research question the exact parameterization of the shared environment does not seem to be essential.

Fifth, it is a considerable limitation that we did not have access to the more fine-grained distinctions among different anxiety disorders introduced in ICD-10 over the entire assessment period. If so, we may have identified an internalizing disorders factor. On a related note, even though personality disorders are related to common psychiatric diagnoses,⁴⁰ we were unable to include them due to power reasons. Taken together, it would be important to replicate these findings in an independent sample with more fine-grained diagnoses.

CONCLUSION

Relying on a population-based sibling study, we showed that a variety of common psychiatric conditions partly shared the same genetic origin. This is the first study of its kind to demonstrate such broad genetic overlap among disorders in individuals who sought or were forced to seek mental health care, dovetailing with survey studies of the general population. Given its ubiquitous influence and predictive power, this broad genetic risk factor warrants further investigation and consideration.

CONFLICT OF INTEREST

The authors declare no conflict of interest.

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Supplementary Information accompanies the paper on the Molecular Psychiatry website (<http://www.nature.com/mp>)