1

Oliver Pain et al.

**Title:** Genome-wide analysis of adolescent psychotic-like experiences shows genetic overlap with psychiatric disorders

Short title: Genome-wide analysis of psychotic-like experiences

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Oliver Pain et al.

2

### Abstract

This study aimed to test for overlap in genetic influences between psychotic-like experience traits shown by adolescents in the community, and clinically-recognized psychiatric disorders in adulthood, specifically schizophrenia, bipolar disorder, and major depression. The full spectra of psychotic-like experience domains, both in terms of their severity and type (positive, cognitive, and negative), were assessed using self- and parent-ratings in three European community samples aged 15-19 years (*Final N incl. siblings* = 6,297-10,098). A mega-genome-wide association study (mega-GWAS) for each psychotic-like experience domain was performed. SNP-heritability of each psychotic-like experience domain was estimated using genomic-relatedness-based restricted maximum-likelihood (GREML) and linkage disequilibrium- (LD-) score regression. Genetic overlap between specific psychoticlike experience domains and schizophrenia, bipolar disorder, and major depression was assessed using polygenic risk scoring (PRS) and LD-score regression. GREML returned SNP-heritability estimates of 3-9% for psychotic-like experience trait domains, with higher estimates for less skewed traits (Anhedonia, Cognitive Disorganization) than for more skewed traits (Paranoia and Hallucinations, Parent-rated Negative Symptoms). Mega-GWAS analysis identified one genome-wide significant association for Anhedonia within IDO2 but which did not replicate in an independent sample. PRS analysis revealed that the schizophrenia PRS significantly predicted all adolescent psychotic-like experience trait domains (Paranoia and Hallucinations only in non-zero scorers). The major depression PRS significantly predicted Anhedonia and Parent-rated Negative Symptoms in adolescence. Psychotic-like experiences during adolescence in the community show additive genetic effects and partly share genetic influences with clinically-recognized psychiatric disorders, specifically schizophrenia and major depression.

Oliver Pain et al.

## Keywords

Adolescence, Psychotic-like experiences, Schizophrenia, ALSPAC, GWAS.

Oliver Pain et al.

4

#### Text

#### Introduction

Psychotic-like experiences, also referred to as psychotic-like experiences, are traits in the community that at the extreme resemble symptoms of psychotic disorders, such as schizophrenia. Based on principal component analyses, psychotic-like experiences can be separated into replicable and specific domains, such as positive, cognitive and negative domains [Ronald et al., 2014; Wigman et al., 2012]. Psychotic-like experiences are common in the general population, particularly during adolescence [Freeman, 2006; Ronald et al., 2014]. Evidence suggests that psychotic-like experiences are dimensional: they show varying degrees of severity and taxometric analyses support their continuous nature in adolescence [Ahmed et al., 2012; Daneluzzo et al., 2009; Taylor et al., 2016]. Adolescence is just prior to a peak time of onset for several psychiatric disorders, particularly schizophrenia, bipolar disorder, and major depression [Laursen et al., 2007]. Psychotic-like experiences predict many types of psychiatric disorders and suicidal ideation with significant odds ratios of 1.3-5.6 [Cederlöf et al., 2016; Fisher et al., 2013; Kelleher et al., 2012, 2014; McGrath et al., 2016; Werbeloff et al., 2012; Zammit et al., 2013].

Twin studies report modest heritability of psychotic-like experience domains with typically between a third and a half of the variance explained by genetic influences [Ericson et al., 2011; Hay et al., 2001; Hur et al., 2012; Linney et al., 2003; Polanczyk et al., 2010; Wigman et al., 2011; Zavos et al., 2014]. One study to date has reported SNP-heritability estimates ranging from 0-32%. These results suggest that common genetic variation plays a role in at least some types of adolescent psychotic-like experiences [Sieradzka et al., 2015], but larger studies are needed to offer accurate estimates.

Oliver Pain et al.

5

The one previous genome-wide association study (GWAS) of adolescent psychoticlike experiences assigned 3,483 individuals to high- or low-scoring groups based on a measure of positive psychotic-like experiences that combined paranoia, hallucinations and delusions [Zammit et al., 2014]. No locus achieved genome-wide significance.

The Psychiatric Genomics Consortium 2 schizophrenia GWAS has been previously used twice to test for an association between genetic risk of schizophrenia and adolescent psychotic-like experiences (these followed one study using Psychiatric Genomics Consortium 1 schizophrenia GWAS results [Zammit et al., 2014]). The first of these studies used quantitative measures of individual psychotic-like experiences in adolescence in a sample of N=2,133-2,140 and reported no significant positive association between any of the psychotic-like experience domains and schizophrenia genetic risk [Sieradzka et al., 2014]. This study also reported no significant positive association between schizophrenia genetic risk. A second study with N=3,676-5,444 tested for an association between schizophrenia genetic risk and dichotomous outcomes on several scales: a combined positive psychotic-like experiences scale (which included paranoia, hallucinations, delusions, and thought interference), a negative symptoms scale, a depressive disorder scale, and an anxiety disorder scale [Jones et al., 2016]. This second study reported a significant positive association between schizophrenia genetic risk and both high negative symptoms and high anxiety disorder. There was no association with the positive psychotic-like experiences or depressive disorder scales.

Schizotypal traits are closely related to psychotic-like experiences. Schizotypal traits focus on differences in personality that reflect liability to psychotic disorders rather than the presentation of subclinical psychotic-like experiences. Previous twin studies of schizotypal traits report modest heritability [Ericson et al., 2011; Lin et al., 2007], and studies are starting to explore the link between polygenic risk for schizophrenia and schizotypal traits

Oliver Pain et al.

[Hatzimanolis et al., 2017]. In light of the differences in the constructs of schizotypy and psychotic-like experiences we focused our brief review on psychotic-like experiences.

Our study aimed to test for overlap in genetic influences between specific psychoticlike experience domains in adolescence and psychiatric disorders - specifically, schizophrenia, bipolar disorder, and major depression. Four psychotic-like experience subscales were used, derived from principal component analysis: Paranoia and Hallucinations, Cognitive Disorganization, Anhedonia, and Parent-rated Negative Symptoms. We also present the largest GWAS to date of adolescent psychotic-like experiences using a community sample of 6,297-10,098 individuals (including siblings) from three European studies. As such our study also aimed to identify novel common genetic variants associated with specific psychotic-like experience domains and to estimate their SNP-heritability.

7

Oliver Pain et al.

#### **Materials and Methods**

#### <u>Samples</u>

Three European general population samples of comparable ages were included: TEDS (Twins Early Development Study) [Haworth et al., 2013] a community sample born in England and Wales (mean age 16.32 years); ALSPAC (Avon Longitudinal Study of Parents and Children) [Boyd et al., 2012] a cohort from the United Kingdom (mean age 16.76 years); CATSS (Child and Adolescent Twin Study in Sweden [Anckarsäter et al., 2011]) a twin cohort in Sweden (mean age 18.31 years). Sample descriptions and ethical consent information are available in Supplementary Note 1. Standard exclusion criteria for GWASs of behavioral and cognitive traits were used (Supplementary Table 1)[Docherty et al., 2010].

#### <u>Measures</u>

We established comparable quantitative scales of psychotic-like experience domains across samples. The subscales in the Specific Psychotic Experiences Questionnaire, used in TEDS, were the starting point [Ronald et al., 2014]. The other two samples had used similar self-report items that were mapped onto domains of paranoia, hallucinations, cognitive disorganization and anhedonia, and parent-rated negative symptoms. The original measures available within each sample are listed in Supplementary Note 2. The content of each psychotic-like experience domain used within each sample is given in Supplementary Tables 2-5. Cronbach's alphas (measure of reliability) of each scale within each sample are listed in Table 1.

#### Phenotypic harmonization

Items were inspected to allow for harmonization of psychotic-like experience domains across samples via a two-stage process. First, two expert clinicians (AC and DF)

8

#### Oliver Pain et al.

matched items across samples that were capturing the same underlying construct (to ensure construct and content validity) based on their clinical knowledge and experience with psychotic-like experience measures. Second, the matched items within each sample were analyzed via principal components analysis, a psychometric approach used to determine individual components underlying the items. This process was used to identify the presence of distinct psychotic-like experience domains.

Individuals with >50% missingness for any psychotic-like experience domain were excluded from all analyses. The remaining missing phenotypic data was imputed using multiple imputation in R [Buuren and Groothuis-Oudshoorn, 2011]. Imputation of item level data was carried out separately for each sample and psychotic-like experience domain. Individual scores of the resulting psychotic-like experience subscales were calculated using sum scores. To ensure the equal contribution of each item to the sum score, item response values were rescaled to values between 0 and 1. The phenotypic correlations between specific psychotic-like experiences within each sample and in all samples combined are in Supplementary Table 6. Sum scores for each psychotic-like experience subscale were normalized using inverse rank-based normalization (data ties ranked randomly) and then standardized. The median correlation between a given scale before and after normalization was 0.92 (Supplementary Table 7), dependent on skew of the original scale. The normalized scores were then regressed against the following covariates: sex, age, age<sup>2</sup>, sex\*age, sex\*age<sup>2</sup>, study, and the top 8 principal components of ancestry. Principal components of ancestry were jointly calculated across all three samples using PLINK1.9 (https://www.cog-

genomics.org/plink2) [Chang et al., 2015] based only on observed genetic variation.

*Genotype imputation and quality control procedure* 

Oliver Pain et al.

Genotypic data from each sample was imputed using the 1KG Phase 3 v5 to maximize genome-wide overlap between samples. After imputation, stringent variant and individual level quality control thresholds were applied in all samples before converting to hard-call genotypes (certainty threshold = 0.9) and merging the three datasets for combined analysis. For further information see Supplementary Note 3. Information on DNA collection and genotyping is given in Supplementary Note 4.

#### Estimation of SNP-heritability

SNP-heritability estimates were calculated within each sample and then metaanalyzed to provide meta-SNP-heritability estimates. The meta-analysis of SNP-heritability estimates approach was taken to avoid a downward bias due to possible genetic heterogeneity between samples. Inverse variance weighted meta-analysis was used. Secondary analysis of mega-SNP-heritability, estimated across samples simultaneously, was also performed to estimate the proportion of phenotypic variance that could be explained by the mean genetic effects across sample.

Two methods were used to estimate SNP-heritability: genomic-relatedness-matrix restricted maximum likelihood (GREML) in Genome-wide Complex Trait Analysis (GCTA), and linkage disequilibrium (LD)-score regression. Related individuals were included in both meta- and mega- GREML analyses [Zaitlen et al., 2013]. LD-score regression [Bulik-Sullivan et al., 2015] was also performed within (meta-) and across (mega-) samples. The effective sample size was used in LD-score regression analyses, thus matching the sample in the GWAS. Effective sample size was calculated as follows: (2\*sample size)/(1+correlation between siblings) [Minica et al., 2014]. There was no evidence of confounding from genome-wide association results so the intercept was constrained to 1.

#### Mega-genome-wide association study

Oliver Pain et al.

10

The three samples were combined to enable genome-wide association mega-analysis. Genome-wide association analysis of all four psychotic-like experience domains using related (i.e. monozygotic and dizygotic twin pairs) and unrelated individuals was performed in PLINK (<u>http://pngu.mgh.harvard.edu/purcell/plink/</u>) [Purcell et al., 2007]. Additional covariance arises from related individuals; this was accounted for using the method of generalizable estimating equations (GEE) [Minica et al., 2014; Minică et al., 2015] in R specifying an exchangeable correlation matrix.

#### Replication analysis of rs149957215 association with Anhedonia

After the discovery sample had been prepared and analysed for this project, an independent subsample of TEDS participants were genotyped. Of the newly genotyped individuals, 2,359 (incl. 635 MZ pairs) had reported on self-rated Anhedonia. This independent TEDS sample was used as a replication sample for the validation of the genome-wide significant association between rs149957215 and Anhedonia identified by the mega-GWAS in this study. rs149957215 genotypes were imputed (MACH  $r^2 = 0.93$ ) using the haplotype reference consortium data via the Sanger imputation server [McCarthy et al., 2016]. The genotypic data was converted to hard-call format (certainty threshold of 0.9) and analyzed in PLINK using the same GEE method to account for relatives. This replication analysis had a power of 0.86 to detect an association of the same magnitude ( $r^2 = 0.47\%$ ) at nominal significance.

#### Gene-based association analysis

Two gene-based association analyses were performed. The first aggregates SNP associations within specific gene regions using the MAGMA program [de Leeuw et al., 2015]. The second analysis used PrediXcan [Gamazon et al., 2015] to predict frontal cortex gene

Oliver Pain et al.

expression differences using genotypic data. Further details can be found in Supplementary Note 5.

#### Genetic association between psychotic-like experience domains and psychiatric disorders

Using the software PRSice [Euesden et al., 2015], polygenic risk scores (PRSs) of schizophrenia, bipolar disorder, and major depression were calculated in the adolescent sample using the log of the odds ratios from the latest Psychiatric Genomics Consortium GWAS of schizophrenia (PGC2) [Ripke et al., 2014], bipolar disorder [PGC Bipolar Disorder Working Group, 2011] and major depression [Ripke et al., 2013]. LD was controlled for using LD-based clumping with an  $r^2$ -cutoff of 0.1 within a 250-kb window. For each individual, scores were generated using SNPs with the following *p*-value thresholds (*p*T): 0.001, 0.01, 0.05, 0.1, 0.2, 0.3, 0.4, and 0.5. Linear regressions were performed in R and GEE was used to account for related individuals. Quantile plots were created to further examine the relationships. If there was evidence of a non-linear relationship from the quantile plots, the non-linear relationship was formalized by performing linear regression in a subset of individuals.

To estimate the genetic covariance between psychotic-like experience domains and schizophrenia, bipolar disorder, and major depression, both LD-score regression and AVENGEME (Additive Variance Explained and Number of Genetic Effects Method of Estimation) were used [Bulik-Sullivan et al., 2015; Palla and Dudbridge, 2015]. AVENGEME uses the results of polygenic risk score analyses across multiple significance thresholds to estimate the model parameters including the genetic covariance. AVENGEME estimates 95% confidence intervals using profile likelihood method. There was no evidence of confounding or sample overlap in the mega-GWAS summary statistics, as such the heritability-intercept was constrained to 1 and the genetic covariance intercept was set to 0 in

Oliver Pain et al.

LD-score regression. To improve the accuracy of the estimates of genetic covariance derived from the AVENGEME analysis, the SNP-heritability of liability for schizophrenia, bipolar disorder, and major depression were constrained to the LD-score regression estimates of SNP-heritability (see Supplementary Table 8).

13

Oliver Pain et al.

Table 1 shows the descriptive statistics of psychotic-like experience domains split by sample. The relationship between each psychotic-like experience domain with age and sex are available in Supplementary Tables 9 and 10. After phenotypic harmonization and quality control, the final sample sizes (including siblings) for all subsequent analyses were 8,665 for Paranoia and Hallucinations, 6,579 for Anhedonia, 6,297 for Cognitive Disorganization, and 10,098 for Parent-rated Negative Symptoms.

SNP-heritability estimates from meta-GREML and meta-LD-score regression were between 2.8-8.8% and 6.6-21.5% respectively (Table 2). Results from secondary analysis of SNP-heritability using the mega-analysis approach are given in Supplementary Table 11.

The mega-GWAS identified no genome-wide significant variation for the Paranoia and Hallucinations, Cognitive Disorganization, or parent-rated Negative Symptoms domains. The mega-GWAS of Anhedonia identified one SNP (rs149957215) associated at genomewide significance ( $p = 3.76 \times 10^{-8}$ ) within a gene called indoleamine 2,3-dioxygenase 2 (*IDO2*) (Supplementary Figure 1). This SNP was imputed in both samples included in the Anhedonia GWAS (TEDS and ALSPAC) with an average imputation quality (INFO) of 0.87 and minor allele frequency of 0.015. The minor allele frequency was similar in both TEDS (0.017) and ALSPAC (0.013). Due to limited LD with rs149957215, neighboring genetic variation showed no significant evidence of association. This association between rs149957215 and Anhedonia did not replicate in the independent TEDS replication sample, showing a nonsignificant association (p=0.81) in the opposite direction. Several loci achieved suggestive significance (p<1x10<sup>-5</sup>) across the four psychotic-like experience domains (Supplementary Table 12, Supplementary Figures 2-5). There was no evidence of confounding with lambdas Oliver Pain et al.

14

of 0.99–1.01 and LD-score regression intercept of 1.00 in all analyses (Supplementary Figure 6).

Regional gene-based tests identified no gene that was significantly associated with any psychotic-like experience domain after Bonferroni correction for multiple testing. The top ten most associated genes for each psychotic-like experience domain are listed in Supplementary Table 13.

Analysis of predicted frontal cortex gene expression associated with psychotic-like experience domains showed *HACD2* as significantly differentially expressed for Cognitive Disorganization (Bonferroni corrected  $p = 6.83 \times 10^{-4}$ ). The top ten genes showing differential expression for each psychotic-like experience domain are listed in Supplementary Table 14.

The schizophrenia PRS significantly and positively predicted Anhedonia (p = 0.030 at pT = 0.10), Cognitive Disorganization (p = 0.035 at pT = 0.01) and Parent-rated Negative Symptoms ( $p = 5.41 \times 10^{-3}$  at pT = 0.05) (Table 3; Figure 1). The bipolar disorder PRS significantly and negatively predicted Paranoia and Hallucinations only ( $p = 2.47 \times 10^{-3}$  at pT = 0.010) (Table 3; Figure 1). The major depression PRS significantly and positively predicted Anhedonia (p = 0.010 at pT 0.5) and Parent-rated Negative Symptoms ( $p = 8.29 \times 10^{-3}$  at pT = 0.001) (Table 3; Figure 1). Supplementary Tables 15-17 and Supplementary Figures 7-9 show the full results of these analyses. Logistic regression comparing PRSs in low and high psychotic-like experience domain groups (defined as bottom and top 25% of raw psychotic-like experience sum scores) were congruent with linear analyses (Supplementary Table 18, Supplementary Figure 10).

Quantile plots showing the mean PRS within subsets of the PE distributions highlighted one non-linear relationship between the schizophrenia PRS and Paranoia and Hallucinations, with the point of inflection at the median (Supplementary Figure 11). The

15

#### Oliver Pain et al.

majority of individuals (81%) below the median had a raw score of zero. A single post-hoc analysis was performed to formalize the presence of this non-linear relationship. Post-hoc removal of individuals with a raw Paranoia and Hallucinations score of zero led to the schizophrenia PRS positively predicting Paranoia and Hallucinations ( $p = 7.90 \times 10^{-3}$  at pT = 0.001) (Table 3; Figure 1; Supplementary Table 15). Logistic regression comparing low and high groups of non-zero scoring individuals supported these findings (Supplementary Table 18, Supplementary Figure 10).

Table 4 presents the AVENGEME estimates of genetic covariance, which were highly congruent with the PRS analysis results. AVENGEME pools evidence across *p*-value thresholds tested from PRS analysis. As such, even when there is consistent but nonsignificant evidence of association at individual *p*-value thresholds, AVENGEME genetic covariance estimates can be significant. Consequently, there were two significant results that were not shown by the PRS analyses; between the Anhedonia psychotic-like experience domain and bipolar disorder (genetic covariance = -0.022, 95%CI = -0.041 - -0.002), and the Cognitive Disorganization psychotic-like experience domain and major depression (genetic covariance = 0.033, 95%CI = 0.005 - 0.062).

Table 4 presents estimates of genetic covariance from LD-score regression. LD-score regression mirrored over half of the significant associations shown between the equivalent polygenic risk scores and psychotic-like experience domains in Table 3. The genetic covariance between the schizophrenia PRS and non-zero scorers on Paranoia and Hallucinations could not be estimated because the genome-wide association analysis included zero scorers. Unlike for the equivalent results in Table 3, the genetic covariance between schizophrenia and anhedonia psychotic-like experience domain, and between major depression and parent-rated negative symptoms domain, were not significant.

16

Oliver Pain et al.

#### Discussion

A genetic relationship was identified between clinical schizophrenia and positive, cognitive, and negative psychotic-like experience trait domains in adolescence. A higher genetic risk for schizophrenia significantly predicted adolescents having more cognitive disorganization, anhedonia, and parent-rated negative symptoms, as well as more paranoia and hallucinations (this last finding was in the non-zero scorers). Thus our findings suggest that psychotic-like experience trait domains in adolescence comprise partly of the genetically-influenced phenotypic manifestation of schizophrenia. Furthermore, higher genetic risk for major depression significantly predicted having more self-rated anhedonia and parent-rated negative symptoms as a teenager. Our results discredit the hypothesis that psychotic-like experience trait domains in the general population are epiphenomena that do not share biological pathways with clinically-recognized psychiatric disorders.

Genetic risk for schizophrenia and major depression in adulthood predicted 0.08– 0.09% variance in psychotic-like experience domains in adolescence. The effect sizes are likely downward biased because of the conservative approaches taken here to align different samples and to handle skewed variables. Nevertheless, comparable effect sizes have been reported in equivalent studies on other phenotypes, for example, linking social communication traits to genetic liability for autism [St Pourcain et al., 2017]. Large effect sizes were not expected. The upper limit of prediction is the degree to which polygenic risk scores for schizophrenia and major depression predict themselves (that is, their own phenotype) in an independent sample, which is ~18.4% for schizophrenia [Ripke et al., 2014] and ~0.6% for major depression [Ripke et al., 2013]. It is known from epidemiological studies that the magnitude of phenotypic association between psychotic-like experience domains and schizophrenia is modest [McGrath et al., 2016; Zammit et al., 2013] and far more people report psychotic-like experiences in adolescence than develop disorders such as

17

Oliver Pain et al.

schizophrenia. Furthermore, there is considerable heterogeneity in schizophrenia and depression in terms of age of onset and symptom presentation. The associations were likely to be modest given their cross-phenotype and cross-age nature. The genetic association between psychiatric disorders and psychotic-like experience traits in the community may increase with age or with longitudinal assessments.

A notable result was that paranoia and hallucinations during adolescence are associated with schizophrenia common genetic risk if individuals report at least some degree of paranoia or hallucinations, that is, the association was only present in the non-zero scorers. Individuals reporting no paranoia and hallucinations can exist anywhere on the schizophrenia genetic liability spectrum. Previous studies did not find a genetic association between schizophrenia and positive psychotic-like experiences [Jones et al., 2016; Zammit et al., 2014; Sieradzka et al., 2014]. The use of quantitative traits and a large sample allowed the identification of this non-linear effect here. An explanation for the non-linear effect may lie in the variable age of onset of paranoia and hallucinations. Our study was focused on psychotic-like experiences in mid to late adolescence. It is predicted that stronger positive associations between genetic risk for schizophrenia and positive psychotic-like experiences will be found in samples assessed over a longer time frame, when anyone who is going to have paranoia and hallucinations has manifested them.

The significant and positive genetic association between a self-rated anhedonia trait measure in adolescence and major depression in adulthood concurs with a previous report showing that subclinical depressive symptoms (including anhedonia) phenotypically predict major depressive episodes in adulthood [Pine et al., 1999]. Anhedonia is present as a symptom of both schizophrenia and depression in psychiatric diagnoses, and our research

Oliver Pain et al.

18

shows that as a trait dimension in adolescence it shares common genetic underpinnings with both schizophrenia and depression.

The significant negative association between paranoia and hallucinations and bipolar disorder genetic risk also deserves discussion. Previous research reported the presence of paranoia, hallucinations, and delusions prior to the onset of bipolar disorder [McGrath et al., 2016]. However, our results suggest that genetic influences on paranoia and hallucinations as traits during mid-adolescence are negatively associated with known common genetic risk associated with diagnosed bipolar disorder. The common genetic relationship between adolescent paranoia and hallucinations and bipolar disorder requires replication in an independent sample. Further insight into this relationship will also be gained as more powerful polygenic predictors for bipolar disorder become available.

Although in many cases the SNP-heritability estimates were not significantly nonzero, the point estimates of SNP-heritability indicate that common genetic variation influences psychotic-like experience domains during adolescence. This concurs with results from twin studies reporting significant twin heritability estimates [Zavos et al., 2014].

The SNP that achieved genome-wide significance in the mega-GWAS for anhedonia lies within the protein-coding gene *IDO2*. IDO2 is a key enzyme in the regulation of the kynurenine pathway, which upon stimulation by proinflammatory cytokines, converts tryptophan into kynurenine. It has been reported that increased metabolism of tryptophan to kynurenine is associated with increased depressive symptoms via the increased production of cytotoxic kynurenine metabolites [Wichers et al., 2005; Dantzer et al., 2011; Myint et al., 2007]. In fact, a previous study has reported a significant correlation between kynurenine production and anhedonia in an adolescent sample [Gabbay et al., 2012]. These previous studies suggest the association between *IDO2* and anhedonia is plausible. However, this

19

Oliver Pain et al.

association should be interpreted with caution as rs149957215 was imputed in all three samples, has a low minor allele frequency of 0.013, and appears to be uncorrelated with surrounding common genetic variation. Furthermore, this association failed to replicate in a sufficiently powered independent sample.

Some methodological details deserve consideration. A key strength of the study is the derivation of psychometrically-sound quantitative individual psychotic-like experience domains: these were derived using principal component analysis and have content validity. It is noted that our terminology of psychotic-like experiences, like others [Stefanis et al., 2002; Wigman et al., 2011; Alemany et al., 2013], includes positive, cognitive and negative psychotic-like experiences, for the reason that at the extreme these experiences are characteristic of clinical psychotic disorders. Greater power was achieved compared to past research through combining independent samples. At the same time, slight variations in measure items across samples impacts the amount of phenotypic variance that can be explained by common genetic variation. The correlation between specific psychotic-like experiences were typically consistent within each sample, however the relationship between Paranoia and Hallucinations and other psychotic-like experiences did vary to some degree (Supplemental Table 6). For the more skewed psychotic-like experience domains with larger numbers of tied individuals, the process of randomly ranking tied individuals during normalization was essential but will have introduced noise and thus downward biased SNPheritability estimates. This study used multiple PRS selection thresholds (referred to as *p*Ts), however the *p*-values for each selection threshold result have not been corrected for multiple testing. Due to the high correlation between PRS selection thresholds, even when considering all possible selection thresholds, it has been estimated that a significance threshold of p =0.001 is appropriate [Euesden et al., 2015]. This threshold would be overly conservative in our study as we only tested a limited number of thresholds. Genetic covariance estimates

#### Oliver Pain et al.

20

obtained by AVENGEME (Table 3) take all selection thresholds into account simultaneously, and therefore need no adjustment for multiple testing. We note that the significance of the PRS associations are supported by the confidence intervals of the AVENEMGE genetic covariance estimates. This study has identified significant common genetic covariance between several psychotic-like experiences and psychiatric disorders. It remains possible that the genetic covariance estimates could be partly explained by the presence of adolescents with diagnosed relatives. If an adolescent has a relative with schizophrenia for example, the adolescent may have increased psychotic-like experiences due to their shared environment with the relative. However, twin and adoption studies of schizophrenia and psychotic-like experiences do not support this mode of transmission. Finally, each psychotic-like experience domain was viewed as a single phenotype of interest in its own right. As such, this study was treated as a series of self-contained individual trait studies, rather than as a single exploratory study across traits. Therefore we did not formally correct for multiple testing of traits, similar to other studies of this nature [Consortium, 2007; Cross-Disorder Group of the Psychiatric Genomics Consortium, 2013]. Note however that nearly all of our associations would remain significant after correction for testing four PE domains, while the association of rs149957215 with Anhedonia (p=3.76e-8) did not replicate.

Collectively, these findings reveal novel evidence for some shared common genetic etiology between psychotic-like experience domains in mid to late adolescence and clinically-recognized psychiatric disorders in adulthood. Evidence is accruing that psychoticlike experiences manifested prior to adulthood form part of a wider phenotype or prodrome related to psychiatric disorders such as schizophrenia and depression. This study joins the existing evidence that individuals with a family history of schizophrenia score higher on psychotic-like experience scales [Zavos et al., 2014; Jeppesen et al., 2014], psychotic-like experiences are associated with the same environmental risk factors as schizophrenia

Oliver Pain et al.

21

[Linscott and Van Os, 2013], psychotic-like experiences are on a phenotypic and etiological continuum across the severity continuum [Zavos et al., 2014; Taylor et al., 2016], and psychotic-like experiences predict later psychiatric disorders [McGrath et al., 2016; Fisher et al., 2013; Zammit et al., 2013; Cederlöf et al., 2016; Kelleher et al., 2014; Werbeloff et al., 2012; Kelleher et al., 2012]. The next step is to consider how psychotic-like experiences can be harnessed in a practical sense as a (small effect size) red flag for risk in early intervention and prevention strategies. Similar to family history, psychotic-like experiences might be a useful heuristic even if the majority of individuals with psychotic-like experiences will remain unaffected by psychiatric disorders.

Oliver Pain et al.

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### **Conflicts of Interest**

The authors declare no conflict of interest.

Oliver Pain et al.

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Oliver Pain et al.

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Oliver Pain et al.

### **Footnotes**

None.

### **Table/Figure Legends**

*Table I.* Descriptive statistics for psychotic-like experience domains in each sample. These figures are based on the individuals remaining after quality control and were used in all subsequent genetic analyses.

Table II. SNP-heritability estimates for psychotic-like experience domains.

*Table III*. Schizophrenia, bipolar disorder, and major depression polygenic risk scores predicting psychotic-like experience domains in adolescents. This table shows results for polygenic risk scores at the most predictive *p*-value threshold for each trait.

*Table IV.* Genetic covariance between each psychotic-like experience domain and schizophrenia, bipolar disorder, and major depression.

#### **Figure Titles**

*Figure 1*. Polygenic risk scores for schizophrenia, bipolar disorder, and major depression predict adolescent psychotic-like experience domains. This figure shows results for polygenic risk scores at the most predictive *p*-value threshold for each trait. Error bars are 95% confidence intervals (95% CI).

### Oliver Pain et al.

### **Tables**

### Table I

# TEDS

Specific PE	$\mu^{a}$	$\sigma^{b}$	Range	Skew	α <sup>c</sup>	N <sup>d</sup>	N sibs <sup>e</sup>
Paranoia and Hallucinations	0.43	0.51	0 - 3.90	2.03	0.73	2994	827
Anhedonia	3.19	1.54	0 - 9.80	0.53	0.79	2988	821
Cognitive Disorganization	3.83	2.82	0 - 11.00	0.51	0.77	2987	823
Parent-rated Negative Symptoms	0.88	1.19	0 - 9.33	2.35	0.84	2995	833

## ALSPAC<sup>g</sup>

Specific PE	$\mu^{a}$	$\sigma^{b}$	Range	Skew	α <sup>c</sup>	Nd	N sibs <sup>e</sup>
Paranoia and Hallucinations	0.27	0.51	0 - 4.17	2.78	0.67	3591	0
Anhedonia	1.42	1.19	0 - 7.00	1.09	0.73	3591	0
Parent-rated Negative Symptoms	1.57	1.11	0 - 7.00	0.61	0.61	4019	0

# CATSS<sup>h</sup>

Specific PE	$\mu^{a}$	$\sigma^{b}$	Range	Skew	α <sup>c</sup>	N <sup>d</sup>	N sibs <sup>e</sup>
Paranoia and Hallucinations	0.20	0.43	0 - 5.00	3.92	0.73	2080	849
Cognitive Disorganization	1.95	0.98	0 - 5.00	0.35	0.79	3310	1335
Parent-rated Negative Symptoms	0.57	0.95	0 - 8.50	2.64	0.75	3084	1395

<sup>a</sup> Mean,

<sup>b</sup> Standard deviation <sup>c</sup> Standardized Cronbach's alpha <sup>d</sup> Number of genotyped individuals after exclusions <sup>e</sup> Number of siblings pairs within N <sup>f</sup> Twins Early Development Study <sup>g</sup> Avon Longitudinal Study of Parents and Children <sup>h</sup> Child and Adolescent Twin Study in Sweden

Oliver Pain et al.

### Table II

	me	ta-GREN	1L	meta-LDSC				
Specific PE	SNP-h <sup>2 a</sup>	SE	p	SNP-h <sup>2 a</sup>	SE	p		
Paranoia and Hallucinations	0.028	0.050	0.293	0.066	0.068	0.168		
Anhedonia	0.088	0.055	0.057	0.204	0.078	4.51x10 <sup>-3</sup>		
Cognitive Disorganization	0.059	0.063	0.176	0.215	0.085	5.79x10 <sup>-3</sup>		
Parent-rated Negative Symptoms	0.059	0.045	0.096	0.119	0.061	0.026		

<sup>a</sup> Phenotypic variance explained by tagged common genetic variation.

Oliver Pain et al.

### **Table III**

### Schizophrenia

Specific PE	β	SE	р	r <sup>2</sup>	рТ <sup>а</sup>
Paranoia and Hallucinations	-0.005	0.011	0.664	0.002%	0.200
Paranoia and Hallucinations excl. zero-scorers	0.031	0.012	7.90E-03	0.094%	0.001
Anhedonia	0.028	0.013	0.030	0.079%	0.100
Cognitive Disorganisation	0.029	0.014	0.035	0.083%	0.010
Parent-rated Negative Symptoms	0.030	0.011	5.41E-03	0.088%	0.050
Bipolar Disorder					
Specific PE	β	SE	р	<b>r</b> <sup>2</sup>	рТ <sup>а</sup>
Paranoia and Hallucinations	-0.034	0.011	2.47E-03	0.115%	0.010
Anhedonia	-0.017	0.013	0.178	0.030%	0.100
Cognitive Disorganisation	-0.013	0.014	0.333	0.017%	0.001
Parent-rated Negative Symptoms	-0.009	0.011	0.388	0.008%	0.500
Major Depression					
Specific PE	β	SE	р	<b>r</b> <sup>2</sup>	рТ <sup>а</sup>
Paranoia and Hallucinations	0.006	0.011	0.589	0.004%	0.100
Anhedonia	0.033	0.013	0.010	0.109%	0.500
Cognitive Disorganisation	0.018	0.014	0.189	0.033%	0.050
Parent-rated Negative Symptoms	0.028	0.011	8.29E-03	0.078%	0.001

<sup>a</sup> *p*-value threshold used to select when calculating polygenic risk scores

Oliver Pain et al.

### Table IV

### Schizophrenia

	A	VENGEM	E	LDSC			
Specific PE	cov(G) <sup>a</sup>	Low 95% Cl	High 95% Cl	<i>cov</i> (G) <sup>a</sup>	SE	p	
Paranoia and Hallucinations	-0.002	-0.013	0.008	-0.003	0.014	0.844	
Paranoia and Hallucinations excl. zero-scorers	0.019	0.011	0.029	NA	NA	NA	
Anhedonia	0.024	0.013	0.038	0.021	0.016	0.184	
Cognitive Disorganisation	0.025	0.013	0.040	0.054	0.018	3.52x-03	
Parent-rated Negative Symptoms	0.025	0.015	0.036	0.047	0.014	5.57E-04	

# **Bipolar Disorder**

	Δ	VENGEM	E	LDSC			
Specific PE	cov(G) <sup>a</sup>	Low 95% Cl	High 95% Cl	cov(G) <sup>a</sup>	SE	p	
Paranoia and Hallucinations	-0.032	-0.048	-0.018	-0.045	0.022	0.039	
Anhedonia	-0.022	-0.041	-0.002	0.008	0.028	0.767	
Cognitive Disorganisation	0.008	-0.013	0.029	0.021	0.028	0.451	
Parent-rated Negative Symptoms	-0.010	-0.026	0.006	0.009	0.021	0.669	

## Major Depressive Disorder

	Δ	VENGEM	E	LDSC			
Specific PE	cov(G) <sup>a</sup>	Low 95% Cl	High 95% Cl	<i>cov</i> (G) <sup>a</sup>	SE	p	
Paranoia and Hallucinations	0.004	-0.018	0.026	0.013	0.020	0.523	
Anhedonia	0.065	0.037	0.094	0.061	0.023	7.50E-03	
Cognitive Disorganisation	0.033	0.005	0.062	0.015	0.028	0.594	
Parent-rated Negative Symptoms	0.023	0.010	0.042	0.031	0.020	0.119	

<sup>a</sup> Genetic covariance

