Evaluation of the validity and utility of a transdiagnostic psychosis dimension encompassing schizophrenia and bipolar disorder

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Background

In recent years, the Kraepelinian dichotomy has been challenged in light of evidence on shared genetic and environmental factors for schizophrenia and bipolar disorder, but empirical efforts to identify a transdiagnostic phenotype of psychosis remain remarkably limited.

Aims

To investigate whether schizophrenia spectrum and bipolar disorder lie on a transdiagnostic spectrum with overlapping non-affective and affective psychotic symptoms.

Method

Multidimensional item-response modelling was conducted on symptom ratings of the OPerational CRITeria (OPCRIT) system in 1168 patients with schizophrenia spectrum and bipolar disorder.

Results

A bifactor model with one general, transdiagnostic psychosis dimension underlying affective and non-affective psychotic symptoms and five specific dimensions of positive, negative, disorganised, manic and depressive symptoms provided the best model fit and diagnostic utility for categorical classification.

Conclusions

Our findings provide support for including dimensional approaches into classification systems and a directly measurable clinical phenotype for cross-disorder investigations into shared genetic and environmental factors of psychosis.

Declaration of interest

None.

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The dichotomy of dementia praecox/schizophrenia and manic depression has informed diagnostic classification in psychiatry ever since it was first proposed by Emil Kraepelin.1 Although this dichotomy remains in DSM-5,2 the need for a dimensional approach to classification in psychiatry,3 and inclusion of such an approach in updated versions of DSM-54 and the impending ICD-115 continues to be debated in view of calls for research that looks across diagnostic categories3,5 and the persistent challenge of high comorbidity rates.3,6 In recent years, the Kraepelinian dichotomy has been challenged in light of evidence on common aetiological factors in schizophrenia and bipolar disorder.6 Evidence has accumulated that genetic risk is partly shared between schizophrenia and bipolar disorder.9,10 For instance, molecular genetic studies point to common DNA variants that have an impact on the risk of both disorders.11 There is also evidence of shared environmental contributions to schizophrenia and bipolar disorder.12 These include prenatal factors,13,14 childhood adversity,15 substance misuse,16,17 urbanicity18,19 and ethnicity.19 These findings, taken together, challenge Kraepelin’s1 distinction between schizophrenia and bipolar disorder and their classification as separate diagnostic entities. Alternatively, Craddock & Owen10 have proposed a transdiagnostic, mood-psychosis clinical dimension with three overlapping broad domains of psychopathology, namely schizophrenia, schizoaffective disorder and bipolar disorder. However, there is also evidence of genetic and environmental risks that are not shared between schizophrenia and bipolar disorder. Family studies have consistently reported unique genetic contributions to schizophrenia and bipolar disorder.15 Findings further suggest some degree of specificity of environmental exposures.8,18,19

Although, coupled with evidence on differences in course and outcome,8 these findings support the heterogeneity of psychotic disorders, it remains unclear which general and/or specific domains of the clinical psychosis phenotype will be most useful to measure and map onto genetic and environmental factors and their underlying biological and psychological mechanisms.8

Intriguingly, empirical efforts to identify a more fundamental, transdiagnostic phenotype of psychosis at the clinical symptom level remain remarkably limited. Whereas previous factor-analytic work has largely pointed towards a pentagonal model with five dimensions of positive symptoms, negative symptoms, cognitive disorganisation, mania and depression,20 we have reported evidence for a bifactor model that includes one general psychosis dimension underlying affective and non-affective psychotic symptoms as well as five specific psychosis dimensions of positive symptoms, negative symptoms, disorganised, manic and depressive symptoms.21 However, findings were restricted to samples of schizophrenia spectrum disorder and the clinical symptom measure (i.e. the Positive and Negative Syndrome Scale) not directly linked to existing diagnostic classification systems. Also, in contrast to our finding, Russo et al22 reported a model with two distinct factors for non-affective and affective psychosis. Empirical evidence on general and/or specific symptom dimensions, and their diagnostic utility, in both schizophrenia spectrum and bipolar disorder may help psychiatry move towards diagnostic approaches that better match shared and non-shared genetic and environmental risks, on the basis of which treatment and prognosis can be optimised. In this study, we aimed to investigate whether schizophrenia spectrum and bipolar disorders lie on a transdiagnostic spectrum with overlapping non-affective and affective psychotic symptoms using a symptom measure that can be directly used for making clinical diagnosis, i.e. the
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is available in Burns including ethical approval for all relevant aspects of the studies diagnosis of major depression (n = 332), hypomania (n = 143) and unspecified functional psychosis (n = 42) were included in the current study. Patients with a diagnosis of major depression (n = 16) or without diagnosis (n = 1) were excluded.

Patients in the BACCS study were recruited between 2004 and 2007 from the greater London area, UK, through out-patient psychiatric clinics, self-help groups and media advertisements. Inclusion criteria were: (a) aged over 18 years; (b) at least two episodes of illness, at least one of which fulfilled diagnostic criteria for mania/hypomania. During the study period, a total of 512 patients were recruited at the London site. Of these, 477 patients with a current diagnosis of mania/bipolar disorder (n = 332), hypomania (n = 143) and unspecified functional psychosis (n = 2) were included in the current study. Patients with a current diagnosis of major depression (n = 2) and current unspecified diagnosis (n = 33) were excluded. More detailed information including ethical approval for all relevant aspects of the studies is available in Burns et al.24 and Cohen-Woods et al.25

The two samples were combined in a pooled sample to achieve both sufficient numbers in each diagnostic group and a sufficient prevalence of individual symptoms for item-response model analysis to be performed.

Measures

The OPCRIT system was used to assess psychiatric symptoms as described by McGuffin et al.23 OPCRIT consists of a 90-item checklist that allows for structured examination of basic demographic information, disease course and severity (including age at onset, mode of onset, premorbid adjustment), and psychotic symptoms based on all available sources including case records, clinical and research interviews. It provides definitions for each item and algorithms for objective diagnosis of non-affective and affective psychotic disorders based on a range of diagnostic classification systems. A detailed description of the use of OPCRIT in the BACCS and UK700 study is provided in online supplement DS1. For the purposes of this study, psychiatric diagnosis was made based on the Research Diagnostic Criteria (RDC) using the OPCRIT system,26 which has been found to be both feasible and reliable in research settings and has been redesign for use in clinical settings (i.e. OPCRIT+).23,27 We used all OPCRIT items with sufficient prevalence of psychotic symptoms (>10%) in the pooled sample for item-response model analysis.

Statistical analysis

Multidimensional item-response modelling was conducted using the mirt package28 of the R environment29 for model estimation. We assumed data to be missing at random, which allowed for inclusion of the full sample. We examined model fit using the log-likelihood, the Akaike information criterion (AIC), Bayesian information criterion (BIC) and the sample-size adjusted BIC (SABIC).30 For these fit statistics, lower values than for the comparison model indicate a statistically better model fit. To examine whether there is a general psychosis dimension and, in addition, whether there are five specific symptom dimensions (positive symptoms, negative symptoms, disorganisation, mania, depression), we estimated five alternative item-response models (online Fig. DS1): first, a simple unidimensional model with one general factor explaining all OPCRIT symptom ratings (model A; corresponding to a unitary psychosis model); second, a multidimensional model with five uncorrelated specific factors for each specific symptom dimension (model B); third, a multidimensional model with five correlated specific factors (model C; corresponding, as model B, to the pentagonal model of psychosis26); fourth, a bifactor model with two distinct factors for affective and non-affective psychosis and five uncorrelated factors for each specific symptom dimension (model D; corresponding to the Russo et al.22 model); and, fifth, a bifactor model with one general factor independent from five uncorrelated (orthogonal) specific factors (model E; corresponding to the bifactor model reported in our earlier study of patients with schizophrenia spectrum disorder21).

The procedure for fitting these models in the context of psychotic symptom ratings have been described in more detail elsewhere.21 Importantly, the bifactor model with one general and five specific factors constrained each OPCRIT item to have a non-zero loading on the general factor (i.e. psychosis) and a non-zero loading on a specific factor (for example positive symptoms) to examine whether there is a general dimension underlying symptoms of schizophrenia spectrum and bipolar disorder independent from (i.e. non-redundant with) the previously reported specific symptom dimensions. To examine the extent to which factor scores of general and specific psychosis dimensions (as predictor variable) allow for accurate classification of patients into diagnostic categories (as outcome variable), multinomial receiver operating characteristic (ROC) analysis31 were conducted in Stata version 12. Finally, we used linear regression to investigate associations between clinical variables (including age at onset, mode of onset, premorbid work adjustment and premorbid social adjustment) and factor scores of general and specific psychosis dimensions.

Results

Basic sample characteristics

Basic sample characteristics of the pooled sample of 1168 patients are summarised in online Table DS1. The mean age at interview was 42.1 years and approximately half were female (n = 608, 52.1%). The mean age at illness onset was 22.2 years. The most common diagnosis was mania/bipolar disorder (31.3%), followed by schizoaffective disorder (29.5%) and schizophrenia (23.1%). As can be seen in online Table DS2, the prevalence of psychotic symptoms was sufficient in the pooled sample for item-response model analysis. Consistent with inclusion criteria, we observed differences in prevalence of symptoms across studies.
Dimensionality of schizophrenia spectrum and bipolar disorder

Model fit statistics for the five alternative dimensional models of schizophrenia spectrum and bipolar disorder are shown in Table 1. The best model fit was consistently observed across model fit statistics for the bifactor model including one general and five specific symptom factors compared with all other models. This indicated that there was a general psychosis dimension that explained associations among all symptoms of schizophrenia spectrum and bipolar disorder as well as that, over and above this general psychosis dimension, the formation of five specific psychosis dimensions was justified.

Association of symptom ratings with general and specific psychosis dimensions

Online Table DS3 shows standardised factor loadings for the best-fitting model including one general and five specific psychosis dimensions. Factor loadings on the general psychosis factor were moderate to strong for most OPCRIT symptom ratings. OPCRIT ratings of manic symptoms were inversely related to the underlying general psychosis dimension. By contrast, factor loadings of almost all other ratings were in the positive range. Coupled with findings on model fit statistics reported above, this indicated that there is a general psychosis dimension underlying affective and non-affective psychotic symptoms that holds across schizophrenia spectrum and bipolar disorder. We further found weak to moderate factor loadings of OPCRIT ratings on the specific positive, negative and disorganised symptom factor. OPCRIT ratings of manic and depressive symptoms were moderately to strongly associated with the underlying specific symptom dimensions. These findings were first probed in a sensitivity analysis to examine replicability of findings by a bootstrap procedure (online Table DS4). For those parameters for which some relevant bias was detected, absolute values of parameters were estimated to be even larger than the respective point estimate.

Diagnostic utility of general and specific psychosis dimensions

All latent factor scores were strongly and positively associated with weighted OPCRIT sum scores for general and specific psychosis dimensions (Table 2). This indicated that higher weighted sum scores on a particular dimension can be interpreted as representations of higher latent factor scores.

Symptom profiles for, and findings on differences in, general and specific psychosis dimensions by diagnostic categories are shown in Fig. 1 (see online Fig. DS2 for a colour version and a more detailed description of Fig. 1) and Table 2 respectively.

Scores on the general psychosis ($R^2 = 0.81$), specific positive ($R^2 = 0.04$), negative ($R^2 = 0.02$) and disorganised ($R^2 = 0.05$) symptom dimensions were higher for categorical diagnoses of schizophrenia and schizoaffective disorder compared with bipolar disorder. On the manic symptom dimension, scores were lower for schizophrenia than for bipolar disorder ($R = 0.20$). Compared with bipolar disorder, scores on the depressive symptom dimension were higher for schizoaffective disorder and lower for schizophrenia ($R = 0.18$).

We next examined the utility of general and specific psychosis dimensions for predicting categorical diagnoses using multinomial ROC analysis. Findings on classifying patients into diagnostic categories based on general psychosis dimension compared with classifying patients by chance are shown in online Fig. DS3. Factor scores of the general psychosis dimension yielded a higher proportion of correctly classified patients than each of the specific symptom dimensions alone (Fig. DS3(a)). However, the proportion of patients correctly classified into diagnostic categories based on factor scores of both general and specific psychosis dimensions was markedly higher (95% CI 0.69–0.79) than the proportions based on the general psychosis dimension only (95% CI 0.45–0.63), all specific psychosis dimensions combined (95% CI 0.46–0.57), and what would be expected by chance (95% CI 0.24–0.35) (Fig. DS3(b)). Online Table DS5 shows corresponding findings from the multinomial regression model with the highest classification accuracy including both general and specific psychosis dimensions for predicting categorical diagnoses.

General and specific psychosis dimensions by clinical variables

Finally, we examined general and specific psychosis dimensions in relation to clinical variables. Findings on factors scores of general and specific psychosis dimensions by age at onset, mode of onset, premorbid work and social adjustment are shown in Table 2. Scores on the general psychosis dimension were significantly higher for patients with a later age at onset, gradual and insidious (v. acute) mode of onset, poor premorbid work and social adjustment. Table 2 further shows that, compared with patients with an acute onset, those with an insidious onset had lower scores on the positive symptom dimension and higher scores on the negative and depressive symptom dimension. Higher scores on the positive, negative and disorganised symptom dimension and lower scores on the manic symptom dimension were found in patients with poor premorbid work adjustment. Patients with poor premorbid social adjustment also scored higher on the...
<table>
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<th>Table 2</th>
<th>Factors scores of general and specific symptom dimensions by clinical variables</th>
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<tr>
<td></td>
<td>Latent factor scores</td>
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<tr>
<td></td>
<td>General</td>
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<tr>
<td>OPCRIT weighted sum scores, a r (95% CI) P</td>
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<tr>
<td>General</td>
<td>0.93 (0.92 to 0.94)</td>
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<tr>
<td>Positive symptoms</td>
<td></td>
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<tr>
<td>Negative symptoms</td>
<td></td>
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<tr>
<td>Disorganisation</td>
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<tr>
<td>Mania</td>
<td></td>
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<tr>
<td>Depression</td>
<td></td>
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<tr>
<td>RDC diagnosis, b (95% CI) P</td>
<td></td>
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<tr>
<td>Hypomania</td>
<td>-0.15 ( -0.23 to -0.08)</td>
</tr>
<tr>
<td>Schizoaffective disorder</td>
<td>1.50 (1.45 to 1.56)</td>
</tr>
<tr>
<td>Schizophrenia</td>
<td>1.50 (1.44 to 1.56)</td>
</tr>
<tr>
<td>Unspecified functional psychosis</td>
<td>1.27 (1.15 to 1.39)</td>
</tr>
<tr>
<td>Mode of onset, Gradual v. acute onset</td>
<td>0.03 (0.02 to 0.03)</td>
</tr>
<tr>
<td>Insidious v. acute onset</td>
<td>0.24 (0.11 to 0.36)</td>
</tr>
<tr>
<td>Age at onset, b (95% CI) P</td>
<td></td>
</tr>
<tr>
<td>Poor v. good, Premorbid work adjustment</td>
<td>0.86 (0.74 to 0.97)</td>
</tr>
<tr>
<td>Poor v. good, Premorbid social adjustment</td>
<td>0.48 (0.34 to 0.60)</td>
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RDC, Research Diagnostic Criteria.

a. The Operational Criteria (OPCRIT) sum scores were weighted using the sign of factor loadings in the bifactor model (see online Table DS3 as simplified weights to account for negative factor loadings on general and positive symptom dimensions (i.e., an item with a negative factor loading was subtracted, not added). Associations for latent factor scores of the general and specific positive symptom dimension (for which negative factor loadings were found in the bifactor model; see online Table DS3) were markedly attenuated when using unweighted OPCRIT sum scores (general, $r = 0.67$; 95% CI 0.64–0.71, $P < 0.001$; positive symptoms, $r = 0.46$, 95% CI 0.41–0.50, $P < 0.001$).

b. Using bipolar disorder/mania as reference category.
Directly linked to existing diagnostic classification systems, we modelling of psychotic symptom ratings using a clinical measure although this sample allowed for multidimensional item-response bipolar disorder, hypomania and unspecified functional psychosis. We investigated the dimensionality of psychosis in a pooled sample of patients with schizophrenia, schizoaffective disorder, and five specific psychosis dimensions (positive symptoms, negative symptoms, disorganisation, mania, depression) by diagnostic categories (schizophrenia, schizoaffective disorder, hypomania, and bipolar disorder/mania). Factor scores are standardised with a mean of 0 and s.d. = 1. 

Discussion

Principal findings

This study is the first to provide evidence for a general psychosis dimension underlying affective and non-affective psychotic symptoms that holds across schizophrenia spectrum and bipolar disorders. Further, there was evidence to suggest formation of specific psychosis dimensions of positive symptoms, negative symptoms, disorganisation, mania and depression is justified. Symptom profiles revealed that general and specific psychosis dimensions discriminated well between, and were consistent with the typical clinical picture of, categorical diagnoses of psychotic disorders. We also found strong evidence on the diagnostic utility when using both general and specific psychosis dimensions for predicting categorical diagnoses. Finally, there was evidence that general and specific psychosis dimensions were differentially associated with age at onset, mode of onset, premorbid work and social adjustment.

Methodological considerations

We investigated the dimensionality of psychosis in a pooled sample of patients with schizophrenia, schizoaffective disorder, bipolar disorder, hypomania and unspecified functional psychosis. Although this sample allowed for multidimensional item-response modelling of psychotic symptom ratings using a clinical measure directly linked to existing diagnostic classification systems, we were able to include only three OPCRIT items with sufficient prevalence (>10%) on negative symptoms, resulting in reduced coverage of this domain, which likely accounted for the limited predictive value of this dimension for categorical diagnoses. Further, given these restrictions on prevalence, the pooled sample size did not provide sufficient power for cross-validation of findings. However, single cross-validations are known to make inefficient use of the data. Therefore, we used a bootstrap procedure, providing good evidence on the replicability of findings (Table DS4). Differences in inclusion criteria, OPCRIT rating procedure (online supplement DS1) and prevalence of symptoms (Table DS3) across the two studies, which we purposefully combined in order to achieve sufficient spread in the distribution of non-affective and affective psychotic symptoms, may have led to an artificial increase in variance of both manifest symptoms and latent variables. Even though difficult to disentangle in this study, we would argue that, given OPCRIT is a well-validated tool purposefully designed to allow flexibility in its use (online supplement DS1) as well as the underlying commonalities in phenomenology, aetiology and severity of schizophrenia spectrum and bipolar disorder, such an increase in variance was unlikely to be artificial and instead allowed us to cover a broad range of psychotic disorders. However, ultimately, further investigations that purposefully sample across diagnoses with the same diagnostic assessment methodology are warranted to more fully elucidate this question. Finally, the current study did not include patients with other relevant non-psychotic disorders, which would have helped to disentangle overlap with, or independence from, other important spectra of mental disorder. Multidimensional item-response modelling allowed us to advance on previous research investigating the dimensionality of psychosis by identifying latent dimensions as determinants of symptoms. This approach is now widely considered preferable (for example over principal component analysis), let alone, ignoring the dimensional structure and factorial validity of symptom measures altogether, as common causes and liabilities plausibly lead to symptoms, and not vice versa. It is also noteworthy that the bifactor model with one general and five specific factors consistently provided a better model fit even when compared with models requiring estimation of the same number of free parameters and, therefore, of identical parsimony.

Comparisons with previous research

Recent years have seen calls for research cutting across boundaries of diagnostic categories, in order to strengthen the evidence base for including dimensional approaches in updated versions of DSM. Our finding of a general psychosis dimension provides evidence, at the clinical symptom level, that cuts across boundaries of the Kraepelinian dichotomy and suggests that schizophrenia and bipolar disorder lie on a transdiagnostic psychosis spectrum with overlapping non-affective and affective symptoms. When directly compared with a model with two distinct factors for non-affective and affective psychosis (a model of identical parsimony), a superior fit was evident for the bifactor model including one general psychosis factor (and five specific symptom factors). This extends our previous finding of a general psychosis dimension in schizophrenia spectrum disorder to individuals with bipolar disorder. This dimension resembles, to a degree, the thought disorder factor reported by previous studies, however, the thought disorder factor also included other disorders such as schizotypal and schizoid personality disorders or obsessive–compulsive disorder. Consistent with numerous previous studies, there was also...
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Evidence that, in addition to this dimension, psychotic symptom ratings are best accounted for by five specific dimensions of positive symptoms, negative symptoms, disorganisation, mania and depression.

In recent years, some researchers have proposed combining dimensional and categorical approaches in the classification of mental disorders.4,20 Such as ICD-1115 and (updated versions of) the DSM-5.2 However, to date, there has only been very limited evidence on the diagnostic utility of dimensional representations of psychosis for classifying patients into categorical diagnoses. Overall, strong diagnostic utility of the general and specific psychosis dimensions for allocating patients to diagnoses was demonstrated with the OPCRIT system, a clinical symptom measure that can be used to implement scoring algorithms in both research and routine care.23,25 Symptom profiles showed that the general psychosis dimension enabled individuals to be placed on the mania (bipolar disorder/hypomania) v. schizophrenia (schizoaffective disorder/schizophrenia) end of the psychosis spectrum. For the specific psychosis dimensions, symptom profiles were consistent with operational definitions of current classification systems8,37 and remarkably similar to those hypothesised for typical patients.20 Based on these findings, specific scoring rules can be defined and implemented that allow more accurate classification of patients into these diagnoses. Our findings on symptom profiles may provide a basis for such an approach (online Fig. DS4): first, quantitative scores on the general psychosis dimension may be used to determine whether to place patients on the mania or schizophrenia end of the psychosis spectrum; in a second step, based on the profiles for specific symptom dimensions, patients may be classified into specific diagnoses.

Findings on differential associations between clinical variables and general and specific psychosis dimensions echoed previous reports.7,20,21,28 A later, more acute mode of onset and a better premorbid adjustment were associated with the non-affective end of the psychosis spectrum, whereas an earlier, more chronic mode of onset and a poorer premorbid adjustment related to the affective end of the psychosis spectrum (Fig. DS4). A similar pattern was also evident for the relationship between these variables and the specific symptom dimensions. There is growing evidence that genetic variation and environmental exposures are shared across diagnostic categories.11,12 Using the OPCRIT system to derive RDC diagnosis in a twin study, Cardno et al20 found evidence of both common and syndrome-specific genetic contributions to psychosis liability. Given also recent calls for identifying cross-cutting dimensions,3,4 it is intriguing to speculate whether the general schizophrenia–bipolar disorder psychosis dimension that we have identified here might be strongly linked to shared genetic and environmental risks,5,19–38 whereas the specific psychosis dimensions are associated with non-shared risks. Although a few studies have investigated intermediate and clinical phenotypes across several different psychotic disorders,13 to date, no study that we are aware of has identified and validly measured a transdiagnostic, clinical phenotype of general psychosis underlying affective and non-affective psychotic symptoms in schizophrenia and bipolar disorders. However, ultimately, such a measure, as provided here, is required if we are to move from intermediate to clinical phenotypes and study these in relation to course and outcome of psychosis.

Implications

Our findings suggest that schizophrenia spectrum and bipolar disorders lie on a transdiagnostic psychosis spectrum with overlapping affective and non-affective psychotic symptoms.

Coupled with strong evidence on diagnostic utility, this finding should inform inclusion of dimensional approaches into (updated versions of) the DSM and may substantially enhance classification accuracy of current diagnostic classification systems. Our findings also provide a directly measurable clinical phenotype for cross-disorder investigations into genetic and environmental factors of psychosis. These are now required to identify shared genetic and environmental contributions to this phenotype (as well as non-shared factors of specific psychosis dimensions) and to disentangle potential overlap with, or independence from, other important spectra of mental disorder.

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