## ARTICLE

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# Integrity of the uncinate fasciculus is associated with the onset of bipolar disorder: a 6-year followed-up study

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#### Abstract

Patients with Bipolar Disorder (BD) are associated with aberrant uncinate fasciculus (UF) that connects amygdalaventral prefrontal cortex (vPFC) system, but the casual relationship is still uncertain. The research aimed to investigate the integrity of UF among offspring of patients with BD and investigate its potential causal association with subsequent declaration of BD. The fractional anisotropy (FA) and mean diffusivity (MD) of UF were compared in asymptomatic offspring (AO, n = 46) and symptomatic offspring (SO, n = 45) with a parent with BD, and age-matched healthy controls (HCs, n = 35). Logistic regressions were performed to assess the predictive effect of UF integrity on the onset of BD. The three groups did not differ at baseline in terms of FA and MD of the UF. Nine out of 45 SO developed BD over a follow-up period of 6 years, and the right UF FA predicted the onset of BD (p = 0.038, OR =0.212, 95% CI = 0.049-0.917). The ROC curve revealed that the right UF FA predicted BD onset (area-under-curve = 0.859) with sensitivity of 88.9% and specificity of 77.3%. The complementary whole-brain tract-based spatial statistics (TBSS) showed that widespread increases of FA were found in the SO group compared with HCs, but were not associated with the onset of BD. Our data provide evidence supporting the causal relationship between the white matter structural integrity of the amygdala-vPFC system and the onset of BD in genetically at-risk offspring of BD patients.

#### Introduction

Bipolar disorder (BD) is a major disabling mental illness, afflicting approximately 1% of the general population and accounting for 0.4% of total DALYs in global burden<sup>1,2</sup>. BD is highly heritable, with heritability of  $60.4-85\%^{3,4}$ . Extant evidence suggests that there are disruptions in mood regulation networks formed by the prefrontal and subcortical regions<sup>5,6</sup>. Some aberrances were reported in offspring of BD patients, suggesting that they may serve as endophenotypes<sup>7-9</sup>.

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Clinical staging models consider the development of BD as comprising several identifiable contiguous stages<sup>10</sup>. Genetically at-risk individuals can be regarded as in the high-risk stage (HR), whereas those with combined genetic risk and subthreshold symptoms can be grouped into the ultra-high-risk stage (UHR)<sup>11,12</sup>, a stage most proximal to the formal full-blown episode. It is worth noting that these hypothetical models need to be tested with prospective longitudinal studies. Available research suggests that up to 25% of genetically at-risk individuals developed into disorders. On the other hand, a larger proportion of genetically high-risk individuals, particularly those without subthreshold symptoms, may have resilience or protective features that prevent them from the onset of disorders<sup>13</sup>. It is crucially important to identify biomarkers capable of predicting the onset of

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psychiatric disorders<sup>14</sup>. Nevertheless, there have been few longitudinal studies that investigated the objective predictors of BD for genetically at-risk individuals<sup>15–17</sup>.

Amygdala-ventral prefrontal cortex (vPFC) system plays a critical role in emotional processing and mood regulation<sup>18,19</sup>. Abnormal structural changes in the prefrontal cortex and amygdala as well as functional connectivity between the regions have been repeatedly found in patients with BD<sup>6,20</sup>. Moreover, diffusion tensor imaging (DTI) studies found that BD patients had alterations in the white matter (WM) in the amygdala-vPFC system<sup>5</sup>. Uncinate fasciculus (UF) is a main fiber tract that connects the vPFC with amygdala and plays a key role in the emotional regulation circuitry<sup>21</sup>. Patients with BD were found to have decreased fractional anisotropy (FA) of the UF<sup>7,8,22</sup>, a measure that reflects collinearity of longitudinally-aligned fibers and axonal integrity<sup>23</sup>. Furthermore, a recent longitudinal DTI study by Weathers<sup>24</sup> reported that adolescents/young adults with BD had lower time-related expansion of FA in the UF, suggesting that its abnormal development may be related to BD pathology. Decreased FA in the UF was found in the first-degree relatives besides BD patients<sup>8</sup>.

Given the above considerations, we hypothesized that the integrity of the WM of the UF may be altered in the genetically at-risk offspring of parents with BD and could serve as biomarkers capable of predicting the onset of mood disorders for the at-risk individuals. To this end, we first did cross-sectional comparisons in the integrity (i.e. FA and mean diffusivity (MD)) of the UF between symptomatic and asymptomatic offspring of parents with BD and health controls, respectively. We then investigated whether baseline integrity measures of the UF could predict the prognosis of a cohort of offspring of parents with BD over a follow-up period of 6 years. As a complementary analysis, we additionally conducted a wholebrain tract-based spatial statistics (TBSS) between the groups.

#### Method

#### Participants

The data were derived from the recognition and early intervention on prodromal bipolar disorder (REI-PBD) project<sup>25</sup> that was launched in 2013, in which we followed-up a cohort of offspring of parents with BD. The project was approved by the Institutional Review Board of Guangzhou Brain Hospital. All participants and their guardians (if aged under 18 years) provided written informed consent.

Participants were screened for lifetime Axis I disorders at baseline interview using The Schedule for Affective Disorders and Schizophrenia for School-aged Children– Present and Lifetime versions (K-SADS-PL) or the Structured Clinical Interview for DSM-IV-TR Axis I Disorders, Research Version, Patient Edition (SCID-I/P) (if participants aged beyond 18 years). Hamilton depression rating scale (HAMD), Hamilton anxiety rating scale (HAMA), and the young mania rating scale (YMRS) were applied for evaluation of depressive symptoms and hypomanic symptoms, respectively. The follow-up assessments were prospectively performed at 3 months and annually. Age-matched health controls (HCs) were recruited through self-referred, advertisement, or word-by-mouth in the same manner as the offspring of parents with bipolar disorder.

Based on whether they manifested subthreshold mood symptoms, offspring of parents of BD were further divided into groups of asymptomatic and symptomatic offspring (AO and SO, respectively. Subthreshold mood symptoms were defined as below: (i) two or more hypomania symptoms lasting at least 4 days, but not meeting the criteria of hypomania defined by DSM-IV; (ii) two or more major depressive symptoms lasting at least 1 week, but not meeting the criteria of major depressive episode defined by DSM-IV; (iii) one or more attenuated psychotic symptoms (i.e., ideas of reference, odd ideas, odd beliefs, unusual perceptual, experiences, bizarre thoughts or speech, grandiosity, suspicious ideas, paranoid ideas, odd mannerisms, hallucinations, disorganized/catatonic behaviors) lasting at least 10 min for each symptom, with 2-7 times per week for at least 3 months; or (iv) two or more DSM-IV defined hyperactivity and impulsivity symptoms/signs observed by teachers, peers, and/or parents<sup>26</sup>. Offspring (n = 91) of parents with BD and HCs (n = 35) completed at least one scheduled followed-up assessment. Among the 91 bipolar offspring, 46 were identified as AO at baseline and 45 SO. During this up-to-6-year longitudinal follow-up study, we applied the DSM-IV diagnostic criteria when confirming conversion cases. Most conversion cases were confirmed by face-to-face psychiatric interview, and a few cases were confirmed by medical records and telephone interview.

#### **MRI Acquisition and Preprocessing**

All data of participants at baseline were acquired on Philips 3.0 T MRI scanner equipped with a 8-channel SENSE head-coil. 32 non-collinear (b value = 1000 s/mm<sup>2</sup>)-direction diffusion images and a no-diffusion weighting (b0) were collected using echo-planar imaging sequence with the following parameters: field of view (FOV) =  $256 \times 256$ , TR/TE = 10086/91 ms, 2 mm slice thickness with no gap, matrix =  $128 \times 128$ , voxel size =  $2 \times 2 \times 2 \text{ mm}^3$ . All images were corrected for eddy current distortion and head movement by registering diffusionweighted images to b0 and adjusting rotations of b-matrix using FMRIB's diffusion toolbox (FDT), part of FMRIB Software Library (FSL). FA and MD were calculated by DTIfit (https://fsl.fmrib.ox.ac.uk/fsl/fslwiki/FDT).

	AO	SO	HCs	Statistic	P-value
	N = 46	N = 45	N = 35		
	M (SD) or Total	M (SD) or Total	M (SD) or Total		
Demographic information					
Age	17.00 (4.70)	17.62 (5.37)	15.09 (3.74)	F = 3.00	0.053
Sex (female)	27	27	22	$\chi^2 = 0.147$	0.929
Handedness (right)	45	44	35	$\chi^2 = 0.782$	0.676
Clinical measure					
HAMD	0.43 (0.91)	7.96 (9.05)	0.43 (1.09)	F = 27.33	<0.001
HAMA	0.48 (0.89)	5.89 (7.42)	0.60 (1.56)	F = 20.11	<0.001
YMRS	0.52 (1.44)	2.00 (3.04)	0.14 (0.85)	F = 9.49	<0.001

Table 1 Demographics and clinical characteristics among AO, SO, and I
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F = ANOVA test statistical value;  $\chi^2$  = chi-squared test statistical value; AO: asymptomatic offspring of patients with BD; SO: symptomatic offspring of patients with BD; HCs health controls; HAMD: Hamilton Depression Rating Scale; HAMA: Hamilton Anxiety Scale; YMRS Young Manic Rating Scale; M = mean; SD = standard deviation. Bold values indicate statistical significance.

## Region-of-interest analysis and Tract-based spatial statistics (TBSS)

Tract ROI (UF) was created from probabilistic tract map based on JHU ICBM-DTI-81 atlas using fsl maths command in FSL<sup>27-29</sup>. Mean FA and MD of bilateral UF were calculated for each participant. Tract-based spatial statistics (TBSS) analysis was carried out for voxel-wise statistical analysis of FA<sup>30</sup>. After aligning each participant's FA data into 1×1×1mm<sup>3</sup> standard Montreal Neurological Institute (MNI152) space using non-linear registration<sup>31,32</sup>, the mean FA was created and thinned to generate a mean FA skeleton which represented the centers of all the tracts derived from all participants. Then, each aligned FA was projected onto the skeleton. The above procedure was also applied for the calculation (https://fsl.fmrib.ox.ac.uk/fsl/fslwiki/TBSS/ of MD UserGuide). Non-parametric permutation for voxel-wise statistics inference provided by FSL's randomization procedure was conducted to detect the group difference. Taking age and gender as covariates, threshold-free cluster enhancement (TFCE) was applied for multiple comparisons, with 5000 permutations for each contrast. The anatomical location of significant clusters (P < 0.05) was identified by Johns Hopkins University (JHU) ICBM-DTI-81 white-matter labels atlas<sup>27</sup>.

#### Statistical analysis

Demographic and clinical characteristics were analyzed using ANOVA and non-parametric tests (Mann-Whitney or Kruskal-Wallis test). Primary ROI analyses were performed using general linear models (GLM) in SPSS that separately included FA or MD as the dependent variable, group (AO, SO, or HC) as a fixed factor, and age and gender as covariates. Logistic regression was used to examine whether bilateral UF diffusion values (FA and MD) contributed to the prediction of subsequent onset of BD over the follow-up period. Diffusion values were converted to standardized scores (z-scores). Significant variables identified by the logistic regression models were used to build a receiver operating characteristic (ROC) curve and its area under the curve (AUC). All analyses were two-tailed and *P-value* was set at 0.05. Statistical analyses were carried out using SPSS version 24.0.

#### Results

#### Demographic and clinical characteristics

As shown in Table 1, the three groups were matched on age, gender, and handedness. The SO group scored significantly higher in the HAMD, HAMA, and YMRS than the AO group and HCs (p < 0.05). No significant difference in the HAMD, HAMA, orYMRS was found between the AO and the HCs (p > 0.05). Over the 6-year follow-up, 9 SO developed BD, and none of the AO group or HCs developed BD.

#### FA and MD comparisons between groups

We compared the FA of the left and right UF among the three groups and did not find any statistical significance (F = 0.821, p = 0.443; F = 0.354, p = 0.703, respectively). No significant difference in the MD of the left and right UF was found among the three groups (F = 0.995, p = 0.373; F = 0.198, p = 0.820, respectively).

#### Predictors for onset of BD

As shown in Table 2, univariate logistic regression analyses showed that baseline severity of anxiety (measured by HAMA) and the integrity of the right UF (measured by FA) could predict the onset of BD (p = 0.047, OR = 1.114, 95% CI = 1.001–1.238; p = 0.021, OR = 0.179, 95% CI = 0.041–0.775, respectively).

 Table 2
 Baseline characteristics related to subsequent onset of BD.

Characteristics	Univariate			Multivariate		
	OR	95% CI	<i>P-</i> value	OR	95% CI	<i>P-</i> value
Age	1.032	0.899–10184	0.658	_	_	
Gender	0.8	0.168–3.799	0.779	—	_	
HAMD	1.055	0.973–1.144	0.199	—	_	
HAMA	1.114	1.001-1.238	0.047	1.088	0.968-1.224	0.157
YMRS	1.24	0.978–1.571	0.075	—	_	
Left UF FA	0.366	0.13-1.033	0.058		_	
Right UF FA	0.179	0.041-0.775	0.021	0.212	0.049-0.917	0.038
Left UF MD	0.797	0.337–1.885	0.605	—	_	
Right UF MD	1.241	0.564–2.726	0.592	_	_	

Left UF FA = Fractional anisotropy of left uncinate fasciculus; Right UF FA = Fractional anisotropy of right uncinate fasciculus; Left UF MD = Mean diffusivity of left uncinate fasciculus; Right UF MD = Mean diffusivity of right uncinate fasciculus; OR = odds ratio; SD = standard deviation; CI = confidence interval. Bold values indicate statistical significance.

The correlationanalysisshowed that the HAMA scores were significantly correlated with the right UFFA (r = 0.379, P = 0.036). After controlling for HAMA, the predictive capacity of the right UF FA for the onset of BD did not change, with the OR value slightly increased from 0.179 to 0.212 (p = 0.038, OR = 0.212, 95% CI = 0.049-0.917). The corresponding ROC curve for the right UF FA is showed in Fig. 1. The AUC was 0.859 (95% CI 0.723-0.994, P = 0.002), with 88.9% sensitivity and 77.3% specificity.

#### Complementary whole-brain TBSS analysis

Whole-brain TBSS analysis showed that the SO group displayed higher FA than HCs in a cluster including the genu and body of corpus callosum, bilateral anterior corona radiate, and bilateral superior corona radiata (Fig. 2, Table 3). No significant difference in FA was found in the AO group versus HCs (p > 0.05). To avoid alignment problem for younger participates between the SO and HCs, supplementary TBSS analyses were conducted by excluding a few participants younger than 10 years old, and the results did not change significantly.

#### Discussion

To our knowledge, this is the first longitudinal DTI study that investigated the associations between the diffusion measures of the UF and the long-term clinical outcomes in the offspring of parents with BD. We found that the right UF FA at baseline had 88.9% sensitivity and



77.3% specificity in predicting the onset of BD over a 6year follow-up period. This finding supports our whitematter predictive model over the prospective development of BD.

The amygdala-vPFC system, connected by the UF, was involved in voluntary subprocesses and operated by a feedback mechanism<sup>5,33</sup>. Lower UF FA which reflects axonal loss and demyelination of WM tract<sup>34</sup> may result in abnormal bidirectional fronto-subcortical connectivity and aberrant "feedback" connectivity that lead to insufficient prefrontal inhibitory control over subcortical structures<sup>33,35,36</sup>. Moreover, a recent DTI study showed that integrity of the UF (measured by FA) was linked to amygdale processing of fearful faces<sup>37</sup>. Furthermore, the right UF integrity was positively correlated with performance in encoding and decoding of facial emotional expressions which were related to social behavior and emotional functioning<sup>38</sup>. Taken together, we thus speculate that the abnormal development of the UF over time is associated with the onset of BD. On the other hand, we did not find significant changes in the UF FA in the SO group versus HCs at baseline, consistent with other familiar studies<sup>39,40</sup>. One possibility may be that the change of UF FA is subtle at baseline so that our sample size did not have the statistical power to detect the difference.

In the whole-brain TBSS exploratory analysis, increased FA was found in the SO group when compared to HCs in a cluster including the genu and body of corpus callosum,



symptomatic offspring of patients with BD (SO) compared with health controls (HCs) obtained from Tract-based Spatial Statistic (TBSS) analysis. Significant increased FA in UHR (P < 0.05, TFCE) was represented by red and yellow color in genu of corpus callosum, body of corpus callosum, left anterior corona radiata, right anterior corona radiata, left superior corona radiata, and right superior corona radiata. Mean FA skeleton of SO and HCs individuals (green color) was overlaid on MNI FA 1 mm skeleton template. The result was thickened with "tbss-fill" command provided by FSL. The image follows radiological convention.

Table 3	Anatomical	locations	of	significant	voxelwise
analysis.					

voxels	COG X	COG Y	COG Z	WMT
				Genu of corpus callosum
				Body of corpus callosum
				Anterior corona radiata R
				Anterior corona radiata L
				Superior corona radiata R
2215	86.5	149	91.7	Superior corona radiata L

COG = Centre Of Gravity; WMT = white matter tract; R = right; L = left

bilateral anterior corona radiate, and bilateral superior corona radiate. However, the changes were not related to the onset of BD (data not shown). An increased FA may indicate excessive myelination<sup>34</sup>, probably reflective of overdeveloped pathways to compensate for pathological

processes<sup>41,42</sup>. The anterior corpus callosum carried left and right ventral prefrontal cortex connections engaging in cognitive processing and emotional regulation<sup>43,44</sup>. Abnormalities in the corona radiata, which connects brainstem with prefrontal regions including the ventrolateral prefrontal cortex (VLPFC) and dorsolateral prefrontal cortex (DLPFC)<sup>45,46</sup>, are repeatedly reported in patients with BD<sup>47,48</sup>. This finding of increased FA in the WM might suggest signs of compensatory reactions to the subthreshold mood symptoms manifested in the bipolar offspring as we previously observed<sup>25,26</sup>.

There are some limitations that should be mentioned when interpreting the findings. First, the method of the whole-tract approach does not take into account the intratract characteristics as tissue characteristics may differ along a WM tract<sup>49</sup>. Existing conceptual framework has implicated the UF tract as being divided into three prefrontal stems in which the medial stem that extends from BA25 is more implicated in mood regulation<sup>50</sup>. Future studies should investigate the subregions of UF. Second, our sample size is small and the findings might be only generalizable to genetically at-risk bipolar offspring. Third, the scope of this study was limited to the integrity of UF at baseline in predicting the onset of BD. Future studies are warranted for illustrating the trajectory of change of UF to clarify the UF effect on the development of BD.

#### Conclusion

Bipolar disorder is highly heritable, yet the long-term clinical outcomes of genetically at-risk offspring are largely heterogeneous. In this 6-year longitudinal study, our data suggest that the integrity of the right UF can predict the onset of BD in a cohort of bipolar offspring. Future prediction models for bipolar disorder should attempt to replicate and extend our findings.

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#### Conflict of interest

The authors declare that they have no conflict of interest.

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