

SPECIAL ARTICLE

Adolescent depression and resting-state fMRI brain networks: a scoping review of longitudinal studies

Marcos Antônio Macêdo,¹ João Ricardo Sato,^{2,3} Rodrigo A. Bressan,^{1,4} Pedro Mario Pan^{1,4,5,6}

¹Laboratório Interdisciplinar de Neurociências Clínicas, Departamento de Psiquiatria, Universidade Federal de São Paulo (UNIFESP), São Paulo, SP, Brazil. ²Centro de Matemática, Computação e Cognição, Universidade Federal do ABC, Santo André, SP, Brazil. ³Department of Psychosis Studies, Institute of Psychiatry, Psychology and Neuroscience, King's College London, London, UK. ⁴Instituto Nacional de Psiquiatria do Desenvolvimento, São Paulo, SP, Brazil. ⁵Programa Jovens Lideranças Médicas, Academia Nacional de Medicina, Rio de Janeiro, RJ, Brazil. ⁶Departamento de Psiquiatria, UNIFESP, São Paulo, SP, Brazil.

The neurobiological factors associated with the emergence of major depressive disorder (MDD) in adolescence are still unclear. Previous cross-sectional studies have documented aberrant connectivity in resting-state functional magnetic resonance imaging (rs-fMRI) networks. However, whether these findings precede MDD onset has not been established. This scoping review mapped key methodological aspects and main findings of longitudinal rs-fMRI studies of MDD in adolescence. Three sets of neuroimaging methods to analyze rs-fMRI data were identified: seed-based analysis, independent component analysis, and network-based approaches. Main findings involved aberrant connectivity within and between the default mode network (DMN), the cognitive control network (CCN), and the salience network (SN). Accordingly, we utilized Menon's (2011) triple-network model for neuropsychiatric disorders to summarize key results. Adolescent MDD was associated with hyperconnectivity within the SN and between DMN and SN, as well as hypoconnectivity within the CCN. These findings suggested that dysfunctional connectivity among the three main large-scale brain networks preceded MDD onset. However, there was high heterogeneity in neuroimaging methods and sampling procedures, which may limit comparisons between studies. Future studies should consider some level of harmonization for clinical instruments and neuroimaging methods.

Keywords: Magnetic resonance imaging; major depressive disorder; longitudinal studies; functional neuroimaging; adolescent psychiatry

Introduction

According to the Global Burden of Disease (GBD) study, major depressive disorder (MDD) is a leading cause of years lived with disability (YLDs).¹ Its incidence starts to increase in early youth,^{2,3} and an adolescent-onset episode almost triples the risk of future episodes in adulthood,⁴ suggesting that neurodevelopmental factors affect the underlying pathophysiology of the disorder.⁵

In recent years, neuroimaging methods have enabled the exploration of neural mechanisms implicated in several psychiatric disorders.⁶ A particularly promising technique uses the functional magnetic resonance imaging (fMRI) signal called blood-oxygen-level-dependent (BOLD), which is a proxy for real-time brain activity in humans.⁷ At first, studies explored the fMRI BOLD signal while subjects performed tasks. Researchers then became interested in the baseline condition, before initiation of the task,⁸ known as resting-state fMRI (rs-fMRI). Since it

carries fewer risks than other imaging modalities and fewer technical constraints, rs-fMRI is important for understanding the development of brain networks during adolescence and its relationship with the emergence of common psychiatric disorders, such as MDD.⁹

Recent reviews of rs-fMRI studies supported the hypothesis that MDD can be conceptualized as a brain network disorder.^{10,11} However, there are conflicting results, with studies reporting hyperconnectivity, hypoconnectivity, or even both. This is in contrast, for instance, with reward-task-based fMRI studies in MDD, which have consistently found less activation of reward circuitry regions, such as the ventral striatum, particularly in adolescence.¹² In addition, the heterogeneity of methodological approaches to rs-fMRI data may impact direct comparisons between studies, limiting the ability to conduct adequate meta-analyses of neuroimaging.¹³⁻¹⁵ The neuroscience field, and neuroimaging studies in particular, has been struggling to perform well-powered

Correspondence: Pedro Mario Pan, Universidade Federal de São Paulo, Departamento de Psiquiatria, Laboratório Interdisciplinar de Neurociências Clínicas, Rua Pedro de Toledo, 669, Edifício de Pesquisas II, 3º andar, fundos, Vila Clementino, CEP 04039-032, São Paulo, SP, Brazil.

E-mail: pedro.pan@unifesp.br

Submitted May 25 2021, accepted Dec 02 2021, Epub Jul 15 2022.

How to cite this article: Macêdo MA, Sato JR, Bressan RA, Pan PM. Adolescent depression and resting-state fMRI brain networks: a scoping review of longitudinal studies. Braz J Psychiatry. 2022; 44:420-433. <http://doi.org/10.47626/1516-4446-2021-2032>

investigations, with significant samples and methodological homogeneity.¹⁴ These issues have increased concerns regarding the reliability of findings from such studies to date. A systematic review and meta-analysis on this particular topic found that edges studied in fMRI research had an overall poor intraclass correlation coefficient.¹⁵ Although we focused on rs-fMRI, it is important to acknowledge that reliability problems seem even more prominent in task-based fMRI research. Vetter et al.,¹⁶ for instance, found that cognitive task findings were reliable, whereas emotional attention and intertemporal choice tasks had considerably better outcomes. Adding another challenge to the interpretation of neuroimaging findings, specific regions of interest (ROIs) have presented higher reliability, while others lacked consistency and varied considerably.¹⁷

The majority of brain network research on MDD has been performed in cross-sectional samples,^{10,11,18} which do not allow inferences on the temporality of the brain-behavior associations (i.e., which came first). It is also uncertain whether adult findings apply to adolescence, when biological aspects of neurodevelopment are still taking place.¹⁹ In addition, relevant differences in clinical MDD profiles exist between adults and adolescents.²⁰ Methodological aspects may also differ significantly between these populations, such as diagnostic criteria, clinical interviews, and sampling criteria. Even though previous reviews investigated altered brain networks in MDD, they were not focused on adolescent MDD,^{10,11} longitudinal studies,¹⁸ or rs-fMRI.²¹

This scoping review maps the literature addressing the research question: what is the evidence from longitudinal studies linking altered rs-fMRI brain networks to adolescent MDD? Specifically, our aims were dual: first, to map key methodological elements of rs-fMRI research and how they were employed in adolescent MDD studies; second, to investigate if there is evidence from longitudinal studies suggesting that aberrant resting-state connectivity precedes MDD.

Methods

We followed systematic procedures suggested by the Preferred Reporting Items for Systematic reviews and Meta-Analyses extension for Scoping Reviews (PRISMA-ScR).²² As required by the PRISMA-ScR protocol, study and/or personal fundings for included studies/authors were collected and are listed in Table S1, available as online-only supplementary material. The review protocol was not registered. The eligibility criteria were studies reporting on: 1) adolescence (10-20 years of age); 2) depression (categorical MDD or dimensional measures); 3) rs-fMRI; iv) longitudinal designs. The exclusion criteria were: 1) interventional designs; and 2) task-based functional connectivity. We performed an online search using the PubMed/MEDLINE database in August 2020 using the keywords (Adolesc*) AND (Depress*) AND (rest*) AND (connect*). Titles and abstracts of the search results were independently screened by two authors (MM and PP) using the online platform Rayyan.²³ Data from included studies was charted by one author (MM) and

then independently revised by a second author (PP). Core variables for extraction were defined on the basis of previous reviews in the field.^{18,21} References from relevant reviews and commentaries were also screened.

To provide a critical appraisal of the evidence, we used a rationale to synthesize data according to the triple-network model.⁶ In a seminal paper, Menon⁶ critically reviewed the fMRI literature and proposed a triple-network model for neuropsychiatric disorders. According to this model, dysfunctional connectivity between or within the three most replicated brain networks was associated with emotional and behavioral symptoms. These networks are the default mode network (DMN), the cognitive control network (CCN) (also called the central executive network [CEN]), and the salience network (SN).^{6,24-28} Finally, we categorized our findings according to the specific network connectivity pattern: hyperconnectivity, hypoconnectivity, or mixed. We describe in detail, in the Results section, the assumptions or simplifications that were necessary to adequately classify main study findings according to this proposal, such as assigning a specific region to a network in a seed-based analysis study.

Results

Aim 1 – Key methodological elements of resting-state functional magnetic resonance imaging (rs-fMRI) research

The correlation of the BOLD signal time-series at rest exhibits consistent patterns of synchronous activity among different brain regions.²⁹ This pattern of co-activation or co-deactivation is called intrinsic functional connectivity (iFC).⁹

Since there is no task to perform in rs-fMRI, the researcher asks the patient to stare at a cross mark during the entire scan. However, studies showed that even across distinct resting-state conditions, such as sleep and anesthesia, these iFC patterns were highly consistent.²⁹

The duration of the scan protocol varies from a few minutes to half an hour, and several methods now allow researchers to remove undesirable artifacts of the BOLD signal, such as the effect of minimal head movements during the scan.^{8,30,31}

There are three main sets of methods to analyze brain networks using rs-fMRI:

- 1) Seed-based analysis: investigates whether the BOLD signal time-series of a predetermined ROI (i.e., the seed) is correlated to any other brain region (seed-to-whole-brain) or to another predetermined ROI (seed-to-seed). Seeds can be defined using data from previous studies or by applying hypothesis-driven theoretical assumptions.³²
- 2) Independent component analysis (ICA): a hypothesis-free methodology in which the correlations of the BOLD signal time-series (i.e., connectivity) are explored for the whole brain.³³ Therefore, there is no need for a predetermined ROI selection. Researchers then interpret inter-regional correlation patterns captured by ICA to ascertain for existing brain networks.

3) Network-based approach: this branch encompasses various methods derived from graph theory analysis, the mathematical study of networks.³⁴ It investigates which nodes (predetermined ROIs) and edges (ROI-ROI BOLD time-series correlations) are relevant in the context of a specific network. Several measures of network features (i.e., integration or segregation) and performance (i.e., nodes centrality, local, and global efficiency) can be explored.

ICA-based rs-fMRI studies revealed that the spontaneous activity of the brain can be organized in distinct networks.³⁵ Several networks have been reported, such as auditory, basal ganglia, primary and secondary visual cortices, language, and sensorimotor networks. Specific connectivity patterns can be interpreted as a functional specialization. However, according to the triple-network model, the most significant networks for neuropsychiatric disorders are the DMN, the CCN, and the SN.⁶

Default mode network (DMN)

This network consists of brain regions that are synchronously activated during periods without any specific task assigned.^{25,36} The DMN is divided into anterior and posterior sub-networks. The main node of the anterior DMN is the medial prefrontal cortex (mPFC). This node plays a particular role in emotional regulation and self-referential processes, showing important connections with subcortical regions, such as the amygdala.^{37,38} The posterior DMN encompasses the posterior cingulate cortex (PCC) and the precuneus cortex. These nodes are involved in consciousness and memory processing, displaying relevant connections with the hippocampal formation.³⁹⁻⁴¹ Other brain regions are also part of the DMN, such as the inferior parietal cortex, the lateral temporal cortex, and the subgenual anterior cingulate cortex (sgACC).^{40,42,43}

Cognitive control network (CCN)

The CCN is also known as the CEN or the “task-positive network”. In contrast to the DMN, the CCN is highly activated during cognitive tasks,⁴⁴ although the presence of the CCN in rs-fMRI data is a highly replicable finding.³² The CCN and the DMN are commonly referred to as “opposite networks”.^{45,46} The CCN consists mainly of frontoparietal regions such as the dorsolateral prefrontal cortex (dlPFC), the posterior parietal cortex, and the dorsal anterior cingulate cortex (dACC). It has been implicated in regulatory top-down control and in specific cognitive functions, such as decision-making and working memory.^{47,48}

Salience network (SN)

The main regions of the SN are the fronto-insular cortex, the amygdala, and the ventrolateral PFC (vlPFC). Altogether, these regions have been implicated in tasks involving emotionally relevant stimuli.²⁶ SN is also relevant to the detection of environmental cues by mediating

the constant alternation between the DMN and CCN activation.^{26,49,50}

Resting-state fMRI and neurodevelopment

rs-fMRI is particularly useful for studying neurodevelopment in children and adolescents.³¹ Understanding complex task instructions, for instance, may be difficult in childhood. Consequently, numerous studies used this method to leverage knowledge on typical neurodevelopment, showing segregation and specialization of large-scale networks across development.^{31,51,52} The centrality of the subcortical and cerebellar nodes among a whole-brain network, for instance, decreases from late childhood to early adolescence.⁵³ In contrast, the relevance of cortical nodes progressively increases in the same developmental window. These findings are in line with structural changes in cortical regions across development,⁵⁴ supporting the hypothesis of late maturation for cortical regions – particularly the PFC.^{55,56} In sum, important neurodevelopmental changes occur in the adolescent brain,^{27,56,57} which may impact rs-fMRI findings as they relate to MDD.

Aim 2 – Evidence suggesting that aberrant brain connectivity precedes adolescent-MDD onset

Our literature search retrieved 307 research articles. Eighteen studies met inclusion criteria and were retrieved for full-text analysis. Five studies were subsequently excluded due to interventional design (n=3, cognitive-behavioral therapy; n=1, transcranial magnetic stimulation; n=1, antidepressant). The 13 remaining articles were included in this review. Table 1 summarizes the main findings of these studies. Figure 1 depicts the developmental periods explored in each study and whether findings point to hyperconnectivity, hypoconnectivity, or to a mixed pattern.

The first rs-fMRI longitudinal study in adolescent MDD was published in 2011.⁶² Low- and middle-income countries (LMIC) were underrepresented, with only one study from Brazil⁶⁰ as compared to eight from the United States^{58,62,63,65,66-69,71} and four from Australia.^{61,64,67,70} Sample sizes ranged from 41 to 637 subjects.^{60,65} Smaller samples reported on well-characterized clinical MDD,^{63-65,69} whereas larger studies were frequently drawn from community-based samples in which categorical MDD assessment was not commonly performed.^{58,61,62,66-68,70,71} Some of these community-based studies only reported dimensional measures of depressive symptoms from specific (Child Depression Inventory, Center for Epidemiological Studies Depression scale) or non-specific (Youth Self-Report and Adult Self-Report, Child and Adolescent PsychProfiler) instruments.

Several high-risk strategies were adopted to select participants. These can be categorized into: 1) family history of MDD or other non-specific family psychiatric morbidity,^{60,65,68} 2) previous individual history of MDD,^{58,63,69} and 3) individual high risk due to phenotypic or temperamental traits.^{61,70} One study used a mixture of

Table 1 Longitudinal studies on resting-state fMRI and adolescent depression

Author, location	Study sample	Follow-up (mo) [†]	Total (n/MDD)	Baseline age range (years) (mean [SD])	Female (%)	Follow-up age range (years) (mean [SD])	Population	Method	fMRI scans
Lopez, ⁵⁹ St. Louis, United States	Preschool Depression Study (Luby et al. ⁶⁵)	18	143/58	7-12 (9.74-1.23)	66.00	10-16 (12.52-1.11)	Community-based, high-risk, 58 MDD-hx, and 85 controls	Seed to whole brain	2 [‡]
Pan, ⁶⁰ São Paulo and Porto Alegre, Brazil	BHRCS	36	637/56	6-12	45.6	9-15 (10.6-1.9)	Community-based, high-risk	Graph theory analyses	1
Davey, ⁶¹ Melbourne, Australia	ADS	24	56/8	(16.5-0.5)	44.60	19 (18.8-0.5)	Community-based, high-risk, eight new-onset MDD at follow-up	Seed to seed	2
Luking, ⁶² St. Louis, United States	Early Emotional Development Program at Washington University School of Medicine in St. Louis	48-60	51/26	3-6	52.90	7-11	Clinical sample; four subgroups: MDD-hx, familial high-risk, both combined, healthy controls	Seed to seed	2 [‡]
Langenecker, ⁶³ Ann Arbor and Chicago, United States	Convenience sample from University of Illinois	13-18	109/60 (21 recurrent MDD)	18-23 (21.00-1.38 for recurrence groups)	54.10	19-25	Community-based convenience, high-risk, 60 with MDD-hx, 21 MDD recurrence at follow-up	Seed to whole brain	1
Callaghan, ⁶⁴ Melbourne, Australia	ADS	36	101/14	16 (16.5-0.53)	46.50	19 (18.8-0.5)	Community-based, 14 developed MDD prior to fMRI scan (excluded from analyses) and 14 after	Seed to whole brain	1
Hirshfeld-Becker, ⁶⁵ Boston, United States	Convenience sample from Massachusetts General Hospital	38.7-60.2 (47.8, 4.5)	41/10	8-14 (11.0-1.72)	46.30	12-18 (15.3-1.7)	Community-based, family high-risk MDD, 10 at risk developed MDD	Seed to whole brain	1
Jin, ⁶⁶ New York, United States	ADEPT	18	173/none	13-15.5 (15.29-0.65)	100.00	14.5-17	Community-based, convenience	Graph theory analyses	1
Strikwerda-Brown, ⁶⁷ Melbourne, Australia	ADS	24	72/11	(16.47-0.59)	45.80	(18.75-0.48)	Community-based, 72 adolescents, 11 MDD on sets between follow-ups 2 and 6 with high scores at each time point	Seed to whole brain	2
Shapiro, ⁶⁸ Boston, United States	Convenience sample from Massachusetts General Hospital of Illinois	47.4 (38.1-54.7, 4.68)	44/12 between scans; two at follow-up	8-14 (11.0-1.72)	45.00	11-19 (14.3-1.9)	Community-based, genetic high-risk MDD, 11/28 high-risk and 1/16 low-risk developed MDD	Seed to whole brain	1
Connolly, ⁶⁹ San Diego, United States	Convenience sample recruited from adolescent psychiatric and primary care clinics	3.3 (0.60)	101/48 MDD (24 at follow-up)	13-18 (16.1-1.3)	61.30	Only 3 months of follow-up	Clinical sample, 48 drug naive MDD adolescents, 24 completed follow-up	Seed to whole brain	1
Mathi, ⁷⁰ Sydney, Australia	Convenience sample recruited from the same school	24	88/27 symptomatic	14-16 (15.35-0.52)	100.00	16-18	Community-based from a single school, follow-up n=71 (27 with emotional symptoms and 44 controls)	Independent component analyses	1 (dynamic fMRI)
Jablitzkowski, ⁷¹ Pittsburgh, United States	Accelerated cohort longitudinal design study Replication used the Philadelphia Neurodevelopmental Cohort	15-45	246/none (anxiety and depressive symptoms)	10-22 longitudinal sub-sample; 20-25 cross-sectional subsample	49.10	Not reported	Community-based, participants and their first-degree relatives without psychiatric disorder. Follow-up data for two (n=117) or three (n=90) visits.	Seed to seed	1-3

Continued on next page

Table 1 Continued.

Author, location	MRI model/scan duration	Depression assessment	Main analyses	Secondary analyses	Findings	Specificity analyses	Network model interpretation	Limitation
Lopez, ⁵⁸ St. Louis, United States	3-T Tim Trio/6.8 min	Child and Adolescent Psychiatric Assessment (categorical); CDI and Child Sadness Management Scores (dimensional)	dIPFC and amygdala	vIPFC, insula, vmPFC, dorsal anterior cingulate cortex	Amygdala, striatum and PFC network (within-circuit) linked to concurrent and future MDD	Other diagnoses, anxiety, disruptive	Hyperconnectivity, CCN-SN	No categorical MDD analysis; no significant finding after adjusting for concurrent depressive symptoms
Pan, ⁶⁰ São Paulo and Porto Alegre, Brazil	1.5-T GE Signa HDX/6 min	Developmental and Well-Being Assessment	Node strength (i.e., degree centrality) of striatal nodes within a 11-node reward network	Node strength (i.e., degree centrality) of other nodes: thalamus, insula, pre-SMA, ventral tegmental area, anterior cingulate cortex, PCC, vmPFC	Increased left ventral striatum connectivity within reward network predicted a 50% increase in MDD risk at follow-up	Attention-deficit/hyperactivity disorder, Anxiety, any substance use	Hyperconnectivity, within reward network	Investigated only IFC within one brain network, no cross-network analyses
Davey, ⁶¹ Melbourne, Australia	3-T Siemens MAGNETOM Trio/not reported	CES-D	Amygdala to sgACC associations with negative affectivity	Longitudinal associations with MDD onset	Concurrent increase in amygdala -sgACC connectivity among new-onset MDD participants; amygdala -sgACC connectivity changes associated with negative affectivity changes	Attention-deficit/hyperactivity disorder, anxiety, any substance use	Hyperconnectivity, SN-DMN	MDD was a secondary analysis
Luking, ⁶² St Louis, United States	3-T Tim Trio Scanner/6.8 min	Preschool Age Psychiatric Assessment (categorical); CDI, dimensional (current)	Amygdala to bilateral: superior temporal gyrus, hippocampus; right: putamen and para hippocampal gyrus; left: inferior temporal gyrus; middle frontal gyrus, superior middle gyrus, IPL, precuneus, superior frontal gyrus	Associations with CDI and MDD severity	Reduced connectivity between amygdala and the dlPFC, dmPFC, cingulate cortex, hippocampus, and hippocampal gyrus in MDD/family risk	Other diagnoses (not specified) included in control group and used as covariates	Hyperconnectivity, SN-DMN, SN-CCN	MDD episode occurred several years before the fMRI
Langenecker, ⁶³ Ann Arbor and Chicago, United States	3-T, GE Scanner/8 min	Diagnostic Interview for Genetic Studies	sgACC and middle frontal gyrus	rs-fMRI analyses are part of a larger task-based study	Increased connectivity between sgACC, middle frontal gyrus, and other CCN regions, and decreased connectivity between the middle frontal gyrus and parietal regions in MDD-Hx who presented an MDD recurrence at follow-up	Test-retest intraclass correlation coefficient analyses with fMRI scans after 4-12 weeks	Hyperconnectivity, DMN-CCN; hypoconnectivity within CCN	Previous history of MDD defined retrospectively
Callaghan, ⁶⁴ Melbourne, Australia	3-T Siemens MAGNETOM Trio/not reported	K-SADS-E	Amygdala to whole brain. Associations between previous maternal aggression and current amygdala iFC.	VS and Nac with whole brain	Increased amygdala-temporal cortex and amygdala-insula iFC in MDD group. Findings mediated the maternal aggression-MDD association.	VS and Nac iFC was not associated with maternal behavior	Hyperconnectivity, within SN	Relatively small sample size for MDD group

Continued on next page

Table 1. (continued)

Author, location	MRI model/scan duration	Depression assessment	Main analyses	Secondary analyses	Findings	Specificity analyses	Network model interpretation	Limitation
Hirshfeld-Becker, ⁶⁵ Boston, United States	3-T TrioTim Siemens Scanner/6.2 min	K-SADS-E and CDI	mPFC, PCC, sgACC, dlPFC and amygdala	Exploratory seed-to-seed amygdala-dlPFC	Incident MDD group exhibited weaker connection between sgACC and IPL and between left and right dlPFC. Non-converters (resilient to the genetic risk) showed higher sgACC-IPL iFC connectivity.	Support vector machine classifier using iFC	Hypoconnectivity, within DMN and between DMN-CCN	Relatively high attrition rate (28%) and few cases of incident MDD
Jin, ⁶⁶ New York, United States	3-T TrioTim Siemens Scanner/5-6 min	IDAS-II	A within-circuit graph including PFC, amygdala and striatum and the iFC between this circuit with the whole brain (extended-circuit)	A whole-brain graph using 217 nodes previously defined in a rs-fMRI atlas	Amygdala, striatum, and PFC network (within-circuit) linked to concurrent and future MDD	Extended-circuit model did not increase sensibility in predicting MDD symptoms	Hyperconnectivity within SN and between SN-DMN ¹	Included only female participants
Strikwerda-Brown, ⁶⁷ Melbourne, Australia	3-T Siemens MAGNETOM Trio/12 min	CES-D	Longitudinal analyses of sgACC iFC	Cross-sectional analyses of sgACC iFC	Decreased iFC between sgACC and dmPFC, PCC, right angular gyrus, and left middle temporal gyrus associated with higher depressive symptoms at follow-up	Models adjusted for anxiety symptoms	Hypoconnectivity within DMN	Longitudinal findings did not survive to head movement adjustment for both time points
Shapiro, ⁶⁸ Boston, United States	3T TrioTim Siemens Scanner/6.2 min	K-SADS-E both times; CDI and Child Behavior Checklist at follow-up	DMN seeds (mPFC, PCC), CCN seeds (bilateral dlPFC) and amygdala		Increased functional connectivity between DMN and supramarginal gyrus and decreased connectivity within the CCN (between left and right dlPFC) predicted onset of MDD	Self- ad parent-reported dimensional symptomatic change	Hyperconnectivity DMN-CCN; hypoconnectivity within CCN	Canonical correlation analyses to reduce rs-fMRI variables due to low sample size
Comolly, ⁶⁹ San Diego, United States	3T GE MR750/8.32 min	Children's Depression Rating Scale-Revised	Amygdala to whole brain		Increased connectivity from R Amygdala to orbital middle frontal gyrus was associated with greater symptoms at follow-up. Increased connectivity from R Amygdala to bilateral insulae was associated with a reduction in follow-up depressive symptoms.		Hypoconnectivity and hyperconnectivity within SN	High follow-up attrition rate; treatment type was not controlled
Mulhi, ⁷⁰ Sydney, Australia	3-T Siemens MAGNETOM Trio Scanner/not reported	Child and Adolescent PsychProfiler, CDI	28 components/networks comprising DMN (n=7), CCN (n=7), and attentional networks (n=14)	Longitudinal changes in CDI and state anxiety	Left iFC showed weaker connection with posterior and anterior midline PFC (DMN) and greater connection with right iFC (CCN) in symptomatic girls	Increased left LPFN-right LPFN iFC contributed to longitudinal CDI changes	Hypoconnectivity CCN-DMN, hyperconnectivity within CCN	Sample with low representativeness; only girls assessed; no formal MDD diagnosis

Continued on next page

Table 1. (continued)

Author, location	MRI model/scan duration	Depression assessment	Main analyses	Secondary analyses	Findings	Specificity analyses	Network model interpretation	Limitation
Jalbrzikowski, ⁷¹ Pittsburgh, United States	3-T Tim Trio/5 min	Youth Self-Report, 10-17 years-old/ Adult Self-Report, ages 18-25 years-old	Amygdala (BL and CM subregions) and vmPFC (anterior and posterior OFC, rACC, ventral anterior cingulate cortex, sgACC subregions)	-	Increased centromedial amygdala-rACC connectivity was associated with anxiety and depression symptoms in early adulthood	Time-varying effect models evaluated differential effects of age, sex, and emotional symptoms	Hyperconnectivity SN-DMN	No formal MDD diagnosis

ADS = Orygen Adolescent Development Study; BHRCS = Brazilian High-Risk Cohort Study; CCN = cognitive control network; CDI = Child Depression Inventory; CES-D = Center for Epidemiological Studies Depression Scale; dlPFC = dorsolateral prefrontal cortex; DMN = default mode network; dmPFC = dorsomedial prefrontal cortex; fMRI = functional magnetic resonance imaging; IFC = intrinsic functional connectivity; IPL = inferior parietal lobule; ITG = inferior temporal gyrus; K-SABS-E = Kiddie Schedule for Affective Disorders and Schizophrenia for School-Aged Children - Present and Lifetime Version; iPFC = lateral prefrontal cortex; MDD = major depressive disorder; MDD-hx = major depressive disorder history; mPFC = medial prefrontal cortex; Nac = nucleus accumbens; PCC = posterior cingulate cortex; PFC = prefrontal cortex; rACC = rostral anterior cingulate cortex; rs-fMRI = resting-state functional magnet resonance image; SD = standard deviation; sgACC = subgenual anterior cingulate cortex; SN = Salience Network; vmPFC = ventromedial prefrontal cortex; VS = ventral striatum.

¹ Original values in weeks. Calculated in months by the author for standardization.

² Both scans performed at same time point.

³ See main text for limitations of this interpretation.

⁴ Mean (standard deviation).

these strategies.⁶² Individual psychiatric comorbidity was allowed in some studies for both case (MDD) and control groups.^{58,60} The amygdala was the most studied ROI,^{58,61,62,64,65,68,69,71} while the most frequent methodological approach was seed-based analysis.^{58,61-65,67-69,71} Only three studies employed repeated fMRI scan assessments.^{61,67,71}

The following sections summarize main findings from each study according to the analytical rs-fMRI approach and the directionality of the brain-behavior association, vis-à-vis Menon's triple-network model.⁶ Overall, four studies reported on mixed findings of hyperconnectivity and hypoconnectivity, six studies reported only hyperconnectivity, and three reported only hypoconnectivity among the three networks (DMN, CCN, and SN).

Hyperconnectivity findings for seed-based analysis studies

Using a seed-to-seed approach, a study found that higher negative affectivity was associated with increased connectivity between the amygdala and the sgACC over 24 months of follow-up.⁶¹ Davey et al.⁶¹ measured negative affectivity (NA), a temperamental trait previously associated with increased risk for future MDD, with the revised Early Adolescent Temperament Questionnaire. They defined high-risk participants based on increased levels of NA. Interestingly, among the 56 high-risk adolescents, new-onset MDD was associated with follow-up concurrent increased amygdala-sgACC connectivity. These results suggest a pattern of hyperconnectivity between the SN and the DMN.

Another study from the same group linked exposure to observed maternal aggressive behavior in early adolescence (at 12 years old), abnormal amygdala iFC in mid-adolescence, and MDD at 19 years old.⁶⁴ Callaghan et al.⁶⁴ followed 101 children for over 7 years (3 years between fMRI scan and MDD assessment) and found increased connectivity from the amygdala to temporal cortices and bilateral insula in MDD. It is noteworthy that this finding mediated the association between maternal aggressive behavior and MDD. In a specificity analysis, striatal seeds did not show the same pattern of association, indicating a specific role for the amygdala in the relationship between early trauma and adolescent-onset depression. We categorized these findings as evidence of SN within-network hyperconnectivity.

Using a high-risk design based on previous depressive symptoms, the study from Lopez et al.⁵⁸ included 58 adolescents with a history of MDD (MDD-hx) and 85 adolescents without previous MDD episodes (no-MDD group). Data were drawn from a large 12-year longitudinal study, the Preschool Depression Study. Although baseline recruitment study assessed familial risk (for more details, see Luby et al.⁵⁹), Lopez et al.⁵⁸ considered personal history of MDD as the only high-risk criteria. Importantly, the no-MDD group could also include subjects with other previous or ongoing psychiatry disorders such as attention-deficit/hyperactivity disorder, anxiety, and conduct disorder. Results suggested that

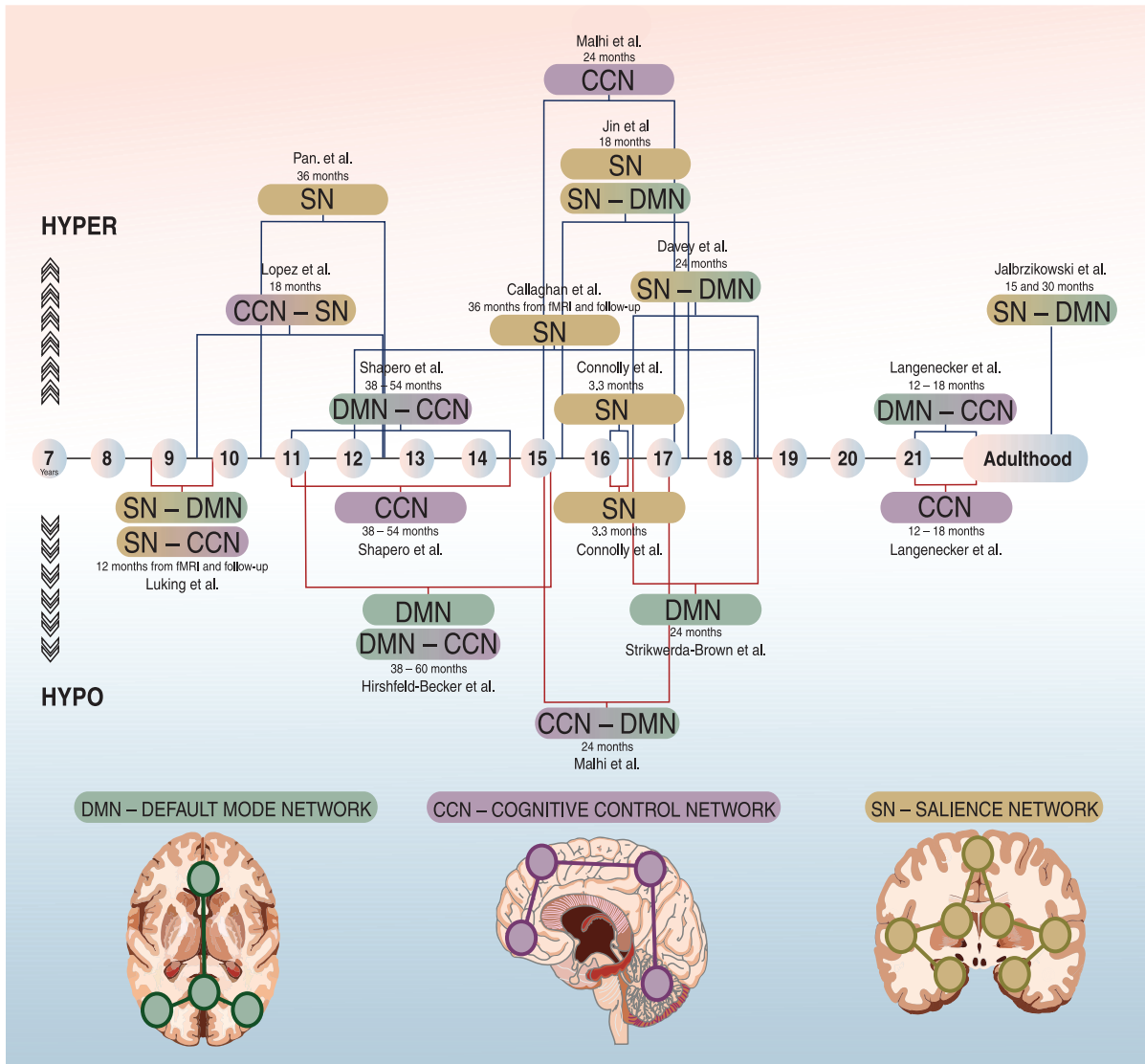


Figure 1 Connectivity findings, mean age and follow-up period of included rs-fMRI longitudinal studies of adolescent depression.

hyperconnectivity between the dIPFC and the dorsal ACC in preadolescence (9-14 years old) predicted higher levels of depressive symptoms in adolescence (10-16 years old). These results were not statistically significant when models included baseline depressive symptoms concurrent to the brain scan. Additionally, there were no categorical MDD assessments at follow-up. Keeping in line with Menon's triple-network model, these findings suggest a putative increased connectivity between the CCN and the SN, which comprises dIPFC and dACC regions, respectively.

Jalbrzikowski et al.⁷¹ was the only study that included up to three rs-fMRI scans from the same subject. They assessed connectivity between the amygdala and the ventromedial prefrontal cortex (vmPFC) using a seed-to-seed approach in a large sample of adolescents and young adults. The focus of the study was to establish normative patterns of functional and structural (white-matter tract) connectivity between the amygdala and the

vmPFC across youth. A normative pattern of decreasing amygdala-vmPFC connectivity between the ages of 10-25 years was established and then replicated in an independent sample. Increased amygdala-ACC connectivity was linked to higher levels of internalizing psychopathology – a mixture of depression and anxiety symptoms – in late adolescence and early adulthood. We categorized these findings according to the seed regions as putative evidence of SN-DMN hyperconnectivity.

Hypoconnectivity findings for seed-based analysis studies

Luking et al.⁶² used a seed-to-seed approach to investigate amygdala connectivity in a high-risk sample. They employed a mixture of individual and family high-risk factors to compose four non-overlapping groups: MDD-hx, familial high-risk, both combined, and none of these conditions (healthy controls). Repeated standardized clinical assessments were used to ascertain for previous

MDD episodes.⁶² This strategy resulted in a low number of participants for each group. Nevertheless, they were able to follow participants for up to 5 years. MDD-hx and familial high-risk groups exhibited decreased connectivity between the amygdala and several brain regions, including the dlPFC, the dmPFC, and the hippocampus. Intriguingly, the same pattern of aberrant connectivity was not found in the combined MDD-hx plus genetic risk group. Since this study investigated MDD several years before the rs-fMRI scan, it was not possible to disentangle whether connectivity alterations represent high-risk patterns or adaptations to previous MDD episodes. We categorized these results as between-network hypoconnectivity from the SN to the DMN and the CCN.

Hirshfeld-Becker et al.⁶⁵ selected a high-risk sample based on family history of MDD, assessed at baseline with semi-structured diagnostic instruments.⁶⁵ Parental past or current episodes of mood disorders (MDD, bipolar disorder, or dysthymia) were considered a high-risk factor for probands. Results indicated decreased connectivity between left and right dlPFC among adolescents who developed MDD at follow-up. This group exhibited weaker connectivity between the sgACC and the inferior parietal lobule (IPL), whereas “non-converters” (i.e., those resilient to the genetic risk) showed increased sgACC-IPL connectivity. Therefore, we found evidence of within-network hypoconnectivity for CCN and DMN-CCN between-network hypoconnectivity.

Using sgACC seeds and a seed-to-whole-brain approach, Strikwerda-Brown et al.⁶⁷ found an association between decreased sgACC-dmPFC connectivity and incident depressive symptoms. Concurrent and longitudinal associations with depressive symptoms were also observed with other posterior DMN nodes, such as the PCC, suggesting a pattern of hypoconnectivity within the DMN. Longitudinal associations, however, did not survive when head motion was included as covariate for both time points. Few subjects developed full-blown MDD episodes at follow-up, which may have limited the statistical power to perform categorical MDD analysis.

Mixed findings for seed-based analysis studies

A longitudinal study evaluated a relatively large sample of drug-naïve MDD adolescents.⁶⁹ The sample initially included 48 depressed adolescents and 53 healthy controls, but the attrition rate at the 3-month follow-up was up to 50% within the MDD group. Using seed-to-whole-brain analyses and bilateral amygdala seeds, increased connectivity from the right amygdala to the orbital cortex and to the middle frontal gyrus was predictive of higher levels of depressive symptoms at follow-up. Conversely, decreased right amygdala to bilateral insula connectivity was significantly associated with symptoms at follow-up. Since these regions have been described as important elements of the SN circuitry, we considered these findings as evidence for both hyperconnectivity and hypoconnectivity within the SN.

In a 4-year follow-up study, Shapero et al.⁶⁸ evaluated the conversion to MDD among youth with high familial risk

for MDD (defined as having a parent with any lifetime history of MDD) and healthy controls. Conversion to MDD was substantially higher among the high familial risk group: 11 out of 28 high-risk subjects converted to MDD, whereas only one adolescent out of the 16 healthy controls fulfilled criteria for depression. Increased connectivity between DMN seeds and the supramarginal gyrus, a CCN region of the inferior parietal cortex, predicted new-onset MDD. Decreased connectivity between right and left dlPFC was also associated to MDD onset. Therefore, these findings suggest a pattern of DMN-CCN hyperconnectivity and hypoconnectivity within the CCN.

Langenecker et al.⁶³ investigated factors related to the recurrence of MDD in youth who reported previous depressive episodes. This was the only study that performed fMRI test-retest analyses, with re-scans occurring 4-12 weeks after the baseline assessment. Recurrence occurred in 21 of 60 participants with previous MDD episodes. A seed-to-whole-brain approach investigated the sgACC and the middle frontal gyrus as primary seeds. Connectivity of these seeds with multiple brain regions were associated with MDD recurrence. Main findings indicated a predominance of increased connectivity between the sgACC, the middle frontal gyrus, and several other CCN regions among the MDD recurrence group. Decreased connectivity between middle frontal gyrus seeds and parietal regions were also reported, even though these associations were less prominent. We considered these results as hyperconnectivity between the DMN and the CCN, and hypoconnectivity within the CCN.

Graph theory analysis and independent component analysis (ICA)

Jin et al.⁶⁶ evaluated depressive symptoms in 173 adolescent girls for up to 18 months. They investigated a hypothesis-based network formed by 40 nodes comprising the amygdala, the striatum, and the prefrontal cortex. Within-network connectivity was associated with concurrent and future depressive symptoms. Then, in a specificity analysis, 217 nodes from a fMRI atlas were included to form a “quasi”-whole-brain network. Including these nodes did not increase the ability of the model to predict depressive symptoms. Since the main analysis involved a network including several regions from the SN, we categorized this finding as SN within-network hyperconnectivity. However, as the most predictive set of nodes were localized in the ACC, it was also suggestive of SN-DMN hyperconnectivity.

A study of a putative resting-state reward network analyzed data from the larger sample among all included studies from our literature search.⁶⁰ This community-based study, the Brazilian High Risk Cohort Study, was also the only LMIC sample. Pan et al.⁶⁰ used rs-fMRI to compute a network measure called node strength, which examines the relevance of a given node for the entire network³⁴ (in this case, the centrality of the ventral striatum node within the reward network). Increased striatal node strength in 9-year-old participants was associated with future MDD in early adolescence, even

after adjusting for baseline depression. Specifically, increased left ventral striatum connectivity with other nodes of the reward network predicted a 50% increase in the likelihood of a MDD episode 3 years later.

ICA analysis was utilized in one study, which was also the only study using a novel approach called dynamic fMRI. Malhi et al.⁷⁰ reported on an Australian school-based, female-only sample with subclinical depressive symptoms. Twenty-eight ICA components were analyzed, comprising regions from the DMN (n=7), the CCN (n=7), and attentional networks (n=14). Some of these attentional networks are considered subnetworks of the SN.¹⁰ Increased connectivity between the left and right lateral PFC was associated with depressive and anxiety symptoms after 2 years of follow-up. The group with emotional symptoms showed decreased dlPFC connectivity with both anterior and posterior DMN nodes in comparison to controls. Of note, anxiety and depression symptoms were examined using dimensional scales, and categorical MDD assessment was not performed. We considered these results evidence for CCN-DMN hypoconnectivity and CCN within-network hyperconnectivity.

Discussion

In this scoping review, we charted the evidence from longitudinal rs-fMRI studies of adolescent-onset MDD. Our first aim was to map key methodological elements of rs-fMRI research and how they might contribute to the investigation of adolescent MDD pathophysiology. Three main sets of methods to analyze brain networks were identified: seed-based analysis, ICA, and network-based approaches. These methods reported on hyperconnectivity or hypoconnectivity between regions and networks. A theoretical model encompassing three robust resting-state brain networks – DMN, CN, and SN – was considered adequate to summarize major findings from the research field. Our second aim was to identify longitudinal studies examining aberrant brain connectivity in adolescent MDD. Among the 13 studies retrieved from the literature, we found preliminary evidence that aberrant network connectivity precedes adolescent MDD. However, there was significant heterogeneity in methodological approaches and study designs.

Previous reviews including adult and adolescent MDD rs-fMRI studies have identified reliable patterns of aberrant network connectivity. Among the most replicated findings, we highlight: 1) hyperconnectivity within the DMN; 2) hypoconnectivity within the CCN; and 3) dysfunctional connectivity between the anterior DMN and the SN.^{10,11,18,21} These findings showed altered within- and between-network connectivity among DMN, CCN, and SN, which supports the utilization of the triple-network model as an adequate system to make sense of adolescent MDD rs-fMRI data.⁶⁸ One hypothesis is that the insula, a key SN node, fails to regulate DMN-CCN communication, which possibly leads to inadequate switching from internal states to external stimuli.^{49,50} This dysfunctional connectivity pattern could explain why MDD patients have prominent internally directed thoughts in the context of altered emotional regulation.^{24,72-74}

Importantly, Menon's triple-network model was not described exclusively for MDD. Aberrant connectivity among these involved networks may also be associated with other common neuropsychiatric disorders, such as schizophrenia and obsessive-compulsive disorder. These network derangements may also represent an unspecific, general marker of psychopathology, as suggested for overarching psychopathology models like the p-factor.^{75,76}

The main findings from longitudinal studies included in this review are partially in line with commonly found patterns of aberrant resting-state MDD research. The well-replicated hyperconnectivity within the DMN was not a prevalent finding in longitudinal studies of adolescent MDD. In fact, one included study using sgACC seeds reported hypoconnectivity with DMN regions, a finding which contradicts the extant literature, as acknowledged by the authors.^{61,64,67} Still, hyperconnectivity between the DMN and the SN and within the SN were prevalent findings in our review.^{66,68,71} One possible explanation for these – to some extent – conflicting findings may arise from the classification of the ACC within the triple-network model. While this region is not a classical DMN node, hyperconnectivity between ACC and other anterior brain regions may reflect further evidence for the dysfunctional anterior DMN connectivity in MDD. Anterior DMN nodes impact a variety of self-referential mental processes,⁷⁷ which are arguably intertwined with emotional processing attributed to the SN, such as affective decision-making and autobiographical memories. Therefore, increased connectivity within the anterior DMN and between DMN and SN may reflect similar underlying processes associated with difficulties shifting from an internal to an external focus and the tendency to ruminate negative thoughts.

Hypoconnectivity within the CCN, a common finding in adult MDD studies,¹⁰ was also found in two studies retrieved by our literature search.^{65,68} We classified the findings of Malhi et al.⁷⁰ as hyperconnectivity within the CCN, which contrasts with these previous adult findings.⁷⁰ However, an ICA approach was employed in this study, plausibly limiting direct comparisons. Moreover, some adult studies found decreased connectivity among several reward circuitry nodes.^{78,79} One included study reported hyperconnectivity within the reward network in adolescent MDD.⁶⁰ This finding is in line with increased corticostriatal connectivity found in a seminal cross-sectional study of adolescent MDD.⁸⁰ A normative increase in striatal sensitivity to reward stimuli has been shown in healthy youth,⁸¹ which is possibly related to typical adolescent behaviors such as impulsivity. In addition, distinct activation of reward circuitry as a function of MDD age-at-onset and chronicity has been reported.⁸² These results suggest that corticostriatal and reward circuitry alterations in MDD may depend on specific neurodevelopmental windows.

In our review, we identified studies suggesting that aberrant network connectivity precedes adolescent MDD. Decreased connectivity within the dlPFC was a predictor of adolescent-onset MDD in high-risk samples.^{65,68} One longitudinal study found that increased connectivity

within the reward network in late childhood and early adolescence was associated with later MDD.⁶⁰ Altered resting-state connectivity was also associated with the emergence of depressive and internalizing symptoms.^{58,66,67,69,71} An important methodological aspect of these findings relates to the adjustment for baseline depressive symptoms in statistical models. Some longitudinal findings from Lopez et al.,⁵⁸ for instance, lost significance after adjusting for depressive symptoms at the time of the brain scan. Therefore, the presence of depressive psychopathology itself may have driven their significant findings, rather than an alteration that precedes the onset of depressive symptoms. Therefore, it is plausible that there may be reciprocal (“cross-lagged”) effects between hypo/hyperconnectivity components of the triple-network model and depression (i.e., both depression predating functional changes and functional changes leading to depression).⁸³ Future studies should investigate the depression-brain network link using statistical approaches that assess causal relationships in observational designs, such as cross-lagged panel models and, more recently, the random intercept cross-lagged panel model (RI-CLPM). Hamaker et al.,⁸⁴ in an interesting article with a very pertinent example, showed that findings derived from CLPM (parental responsiveness resulting in reduction of depressive symptoms) are always reliable, as the same analyses using RI-CLPM demonstrated no cross-lagged effect. Also, it has been noted that a minimum of three waves of measures would be required to correctly address such relationships.⁸³

We identified important limitations among the included studies. First, 14 different MDD questionnaires and interviews were used among the 13 included studies. This is an important limitation for future reviews aiming to conduct meta-analyses of neuroimaging techniques. Second, most studies included in this review failed to provide detailed information about treatment modality or medication status for their samples. Only three studies clearly stated treatment interventions: one explicitly included only medication-naïve patients, and two reported type of pharmacological treatment. The exclusion of subjects with recent medication use was also implemented in two studies, one for 30 days prior to the rs-fMRI scan⁶⁰ and the other for the last 3 months.⁶³ Future longitudinal studies must clearly describe the therapeutics used and any procedure implemented to adjust for these potential confounders. Third, a pivotal adult study linked distinct patterns of altered rs-fMRI connectivity with specific symptomatic domains and subtypes using canonical correlations.⁸⁵ Even though replication of these early findings is still undefined,⁸⁶ we were not able to identify studies testing this approach in adolescent samples.

Some limitations of this review itself must also be noted. First, this is not a systematic review of the literature and, therefore, relevant studies may have been excluded from our search. However, our aim was to conduct a scoping review, mapping the research field to identify key concepts and relevant findings from previous studies. In addition, we used up-to-date methodology following a

structured guideline procedure.²² Second, deciphering specific regional positive or negative connectivity patterns using graph theory approaches and ICA may not be as straightforward as in seed-based analysis. Some network measures, for instance, add the absolute value of both positive and negative correlation values (i.e., connections, edges).³² Furthermore, we categorized findings according to the triple-network model, which considered various brain regions as part of the DMN, CCN, or SN. This classification is arbitrary and may have limited interpretations regarding other brain networks and specific ROIs. Third, the present review excluded findings from interventional MDD studies. However, our literature search retrieved some interesting examples on how brain connectivity is associated with treatment response to antidepressants and psychotherapy.⁸⁷⁻⁸⁹ Understanding neural changes that can be normalized with treatment may boost information from observational studies (for review, see Chahal et al.⁹⁰). Lastly, LMIC were underrepresented among the included studies. In a recent review, Battel et al.⁹¹ found that less than one-fifth of studies on the topic were from LMIC. Interestingly, these countries are home to the vast majority (around 90%) of the world’s adolescent population.⁹¹ Collaboration among research centers, especially in these countries, and even across broader regions (for instance, Latin America), could surpass funding difficulties experienced by these centers and increase substantially our understanding of functional connectivity in adolescent depression, providing very valuable data.

In this scoping review, we charted key concepts and research findings from adolescent MDD rs-fMRI studies. We found that three main sets of methods were used in the rs-fMRI MDD literature: seed-based analysis, ICA, and network approaches. In addition, Menon’s triple-network model for neuropsychiatric disorders⁶ was considered acceptable to categorize longitudinal findings from studies in adolescent MDD. The evidence so far suggests that dysfunctional connectivity within and between the DMN, the CCN, and the SN precedes adolescent-onset MDD. The heterogeneity of methodological approaches may have limited direct comparisons between studies. Future studies should address previous weaknesses, such as the limited number of repeated fMRI scans during follow-up, as well as medication use. Finally, the research field should consider some level of harmonization for clinical instruments and neuroimaging methods, as proposed by initiatives such as Enhancing Neuro Imaging Genetics Through Meta Analysis (ENIGMA).^{92,93}

Acknowledgements

This study was partially supported by Instituto Nacional de Psiquiatria do Desenvolvimento (INPD) with grants from the Brazilian government agencies Fundação de Amparo à Pesquisa do Estado de São Paulo (FAPESP) (#Fapesp 2014/50917-0) and Conselho Nacional de Desenvolvimento Científico e Tecnológico (CNPq) (#CNPq 465550/2014-2). JRS is supported by FAPESP (grants #2018/21934-5 and #2018/04654-9).

Disclosure

RAB has received research grants from Janssen Cilag, Novartis, and Roche; has been a forum consultant for Janssen, Novartis, and Roche; and has participated in speaker bureaus for Ache, Janssen, Lundbeck, and Novartis. PMP has received payment or honoraria for lectures and presentations in educational events for Sandoz, Daiichi Sankyo, Eurofarma, Abbott, Libbs, Instituto Israelita de Pesquisa e Ensino Albert Einstein, and Instituto D'Or de Pesquisa e Ensino. The other authors report no conflicts of interest.

References

- Ferrari AJ, Charlson FJ, Norman RE, Patten SB, Freedman G, Murray CJ, et al. Burden of depressive disorders by country, sex, age, and year: findings from the global burden of disease study 2010. *PLoS Med.* 2013;10:e1001547.
- Avenevoli S, Swendsen J, He JP, Burstein M, Merikangas KR. Major depression in the national comorbidity survey-adolescent supplement: prevalence, correlates, and treatment. *J Am Acad Child Adolesc Psychiatry.* 2015;54:37-44.e2.
- Beesdo K, Hofler M, Leibenluft E, Lieb R, Bauer M, Pfennig A. Mood episodes and mood disorders: patterns of incidence and conversion in the first three decades of life. *Bipolar Disord.* 2009;11:637-49.
- Johnson D, Dupuis G, Piche J, Clayborne Z, Colman I. Adult mental health outcomes of adolescent depression: a systematic review. *Depress Anxiety.* 2018;35:700-16.
- Marin O. Developmental timing and critical windows for the treatment of psychiatric disorders. *Nat Med.* 2016;22:1229-38.
- Menon V. Large-scale brain networks and psychopathology: a unifying triple network model. *Trends Cogn Sci.* 2011;15:483-506.
- Biswal B, Yetkin FZ, Haughton VM, Hyde JS. Functional connectivity in the motor cortex of resting human brain using echo-planar MRI. *Magn Reson Med.* 1995;34:537-41.
- Snyder AZ, Raichle ME. A brief history of the resting state: the Washington University perspective. *Neuroimage.* 2012;62:902-10.
- Van Dijk KR, Hedden T, Venkataraman A, Evans KC, Lazar SW, Buckner RL. Intrinsic functional connectivity as a tool for human connectomics: theory, properties, and optimization. *J Neurophysiol.* 2010;103:297-321.
- Kaiser RH, Andrews-Hanna JR, Wager TD, Pizzagalli DA. Large-scale network dysfunction in major depressive disorder: a meta-analysis of resting-state functional connectivity. *JAMA Psychiatry.* 2015;72:603-11.
- Mulders PC, van Eijndhoven PF, Schene AH, Beckmann CF, Tendolkar I. Resting-state functional connectivity in major depressive disorder: a review. *Neurosci Biobehav Rev.* 2015;56:330-44.
- Keren H, O'Callaghan G, Vidal-Ribas P, Buzzell GA, Brotman MA, Leibenluft E, et al. Reward processing in depression: a conceptual and meta-analytic review across fMRI and EEG studies. *Am J Psychiatry.* 2018;175:1111-20.
- Muller VI, Cieslik EC, Laird AR, Fox PT, Radua J, Mataix-Cols D, et al. Ten simple rules for neuroimaging meta-analysis. *Neurosci Biobehav Rev.* 2018;84:151-61.
- Button KS, Ioannidis JP, Mokrysz C, Nosek BA, Flint J, Robinson ES, et al. Power failure: why small sample size undermines the reliability of neuroscience. *Nat Rev Neurosci.* 2013;14:365-76.
- Noble S, Scheinost D, Constable RT. A decade of test-retest reliability of functional connectivity: a systematic review and meta-analysis. *Neuroimage.* 2019;203:116157.
- Vetter NC, Steding J, Jurk S, Ripke S, Mennigen E, Smolka MN. Reliability in adolescent fMRI within two years – a comparison of three tasks. *Sci Rep.* 2017;7:2287.
- Berboth S, Windschberger C, Kohn N, Morawetz C. Test-retest reliability of emotion regulation networks using fMRI at ultra-high magnetic field. *Neuroimage.* 2021;232:117917.
- Kerestes R, Davey CG, Stephanou K, Whittle S, Harrison BJ. Functional brain imaging studies of youth depression: a systematic review. *Neuroimage Clin.* 2014;4:209-31.
- Kaufman J, Martin A, King RA, Charney D. Are child-, adolescent-, and adult-onset depression one and the same disorder? *Biol Psychiatry.* 2001;49:980-1001.
- Rice F, Riglin L, Lomax T, Souter E, Potter R, Smith DJ, et al. Adolescent and adult differences in major depression symptom profiles. *J Affect Disord.* 2019;243:175-81.
- Toenders YJ, van Velzen LS, Heideman IZ, Harrison BJ, Davey CG, Schmaal L. Neuroimaging predictors of onset and course of depression in childhood and adolescence: a systematic review of longitudinal studies. *Dev Cogn Neurosci.* 2019;39:100700.
- Tricco AC, Lillie E, Zarin W, O'Brien KK, Colquhoun H, Levac D, et al. PRISMA Extension for Scoping Reviews (PRISMA-ScR): checklist and explanation. *Ann Intern Med.* 2018;169:467-73.
- Ouzzani M, Hammady H, Fedorowicz Z, Elmagarmid A. Rayyan-a web and mobile app for systematic reviews. *Syst Rev.* 2016;5:210.
- Hamilton JP, Chen MC, Gotlib IH. Neural systems approaches to understanding major depressive disorder: an intrinsic functional organization perspective. *Neurobiol Dis.* 2013;52:4-11.
- Raichle ME, MacLeod AM, Snyder AZ, Powers WJ, Gusnard DA, Shulman GL. A default mode of brain function. *Proc Natl Acad Sci U S A.* 2001;98:676-82.
- Seeley WW, Menon V, Schatzberg AF, Keller J, Glover GH, Kenna H, et al. Dissociable intrinsic connectivity networks for salience processing and executive control. *J Neurosci.* 2007;27:2349-56.
- Ernst M, Pine DS, Hardin M. Triadic model of the neurobiology of motivated behavior in adolescence. *Psychol Med.* 2006;36:299-312.
- Cole MW, Schneider W. The cognitive control network: integrated cortical regions with dissociable functions. *Neuroimage.* 2007;37:343-60.
- Fox MD, Raichle ME. Spontaneous fluctuations in brain activity observed with functional magnetic resonance imaging. *Nat Rev Neurosci.* 2007;8:700-11.
- Power JD, Schlaggar BL, Petersen SE. Recent progress and outstanding issues in motion correction in resting state fMRI. *Neuroimage.* 2015;105:536-51.
- Fair DA, Cohen AL, Dosenbach NU, Church JA, Miezin FM, Barch DM, et al. The maturing architecture of the brain's default network. *Proc Natl Acad Sci U S A.* 2008;105:4028-32.
- Fox MD, Snyder AZ, Vincent JL, Corbetta M, Van Essen DC, Raichle ME. The human brain is intrinsically organized into dynamic, anticorrelated functional networks. *Proc Natl Acad Sci U S A.* 2005;102:9673-8.
- Calhoun VD, Adali T, Pearlson GD, Pekar JJ. A method for making group inferences from functional MRI data using independent component analysis. *Hum Brain Mapp.* 2001;14:140-51.
- Rubinov M, Sporns O. Complex network measures of brain connectivity: uses and interpretations. *Neuroimage.* 2010;52:1059-69.
- Damoiseaux JS, Rombouts SA, Barkhof F, Scheltens P, Stam CJ, Smith SM, et al. Consistent resting-state networks across healthy subjects. *Proc Natl Acad Sci U S A.* 2006;103:13848-53.
- Greicius MD, Krasnow B, Reiss AL, Menon V. Functional connectivity in the resting brain: a network analysis of the default mode hypothesis. *Proc Natl Acad Sci U S A.* 2003;100:253-8.
- Andrews-Hanna JR, Reidler JS, Sepulcre J, Poulin R, Buckner RL. Functional-anatomic fractionation of the brain's default network. *Neuron.* 2010;65:550-62.
- Andrews-Hanna JR, Smallwood J, Spreng RN. The default network and self-generated thought: component processes, dynamic control, and clinical relevance. *Ann N Y Acad Sci.* 2014;1316:29-52.
- Cavanna AE, Trimble MR. The precuneus: a review of its functional anatomy and behavioural correlates. *Brain.* 2006;129:564-83.
- Buckner RL, Andrews-Hanna JR, Schacter DL. The brain's default network: anatomy, function, and relevance to disease. *Ann N Y Acad Sci.* 2008;1124:1-38.
- Leech R, Sharp DJ. The role of the posterior cingulate cortex in cognition and disease. *Brain.* 2014;137:12-32.
- Greicius MD, Krasnow B, Reiss AL, Menon V. Functional connectivity in the resting brain: a network analysis of the default mode hypothesis. *Proc Natl Acad Sci U S A.* 2003;100:253-8.
- Zhou Y, Yu C, Zheng H, Liu Y, Song M, Qin W, et al. Increased neural resources recruitment in the intrinsic organization in major depression. *J Affect Disord.* 2010;121:220-30.
- Dosenbach NU, Fair DA, Miezin FM, Cohen AL, Wenger KK, Dosenbach RA, et al. Distinct brain networks for adaptive and

- stable task control in humans. *Proc Natl Acad Sci U S A*. 2007;104:11073-8.
- 45 Hamilton JP, Furman DJ, Chang C, Thomason ME, Dennis E, Gotlib IH. Default-mode and task-positive network activity in major depressive disorder: implications for adaptive and maladaptive rumination. *Biol Psychiatry*. 2011;70:327-33.
 - 46 Sheline YI, Barch DM, Price JL, Rundle MM, Vaishnavi SN, Snyder AZ, et al. The default mode network and self-referential processes in depression. *Proc Natl Acad Sci U S A*. 2009;106:1942-7.
 - 47 Corbetta M, Shulman GL. Control of goal-directed and stimulus-driven attention in the brain. *Nat Rev Neurosci*. 2002;3:201-15.
 - 48 Rogers MA, Kasai K, Koji M, Fukuda R, Iwanami A, Nakagome K, et al. Executive and prefrontal dysfunction in unipolar depression: a review of neuropsychological and imaging evidence. *Neurosci Res*. 2004;50:1-11.
 - 49 Sridharan D, Levitin DJ, Menon V. A critical role for the right fronto-insular cortex in switching between central-executive and default-mode networks. *Proc Natl Acad Sci U S A*. 2008;105:12569-74.
 - 50 Goulden N, Khusnulina A, Davis NJ, Bracewell RM, Bokde AL, McNulty JP, et al. The salience network is responsible for switching between the default mode network and the central executive network: replication from DCM. *Neuroimage*. 2014;99:180-90.
 - 51 van Duijvenvoorde AC, Achterberg M, Braams BR, Peters S, Crone EA. Testing a dual-systems model of adolescent brain development using resting-state connectivity analyses. *Neuroimage*. 2016;124:409-20.
 - 52 Sato JR, Salum GA, Gadelha A, Picon FA, Pan PM, Vieira G, et al. Age effects on the default mode and control networks in typically developing children. *J Psychiatr Res*. 2014;58:89-95.
 - 53 Sato JR, Salum GA, Gadelha A, Vieira G, Zugman A, Picon FA, et al. Decreased centrality of subcortical regions during the transition to adolescence: a functional connectivity study. *Neuroimage*. 2015;104:44-51.
 - 54 Parker N, Patel Y, Jackowski AP, Pan PM, Salum GA, Pausova Z, et al. Assessment of neurobiological mechanisms of cortical thinning during childhood and adolescence and their implications for psychiatric disorders. *JAMA Psychiatry*. 2020;77:1127-36.
 - 55 Fair DA, Dosenbach NU, Church JA, Cohen AL, Brahmbhatt S, Miezin FM, et al. Development of distinct control networks through segregation and integration. *Proc Natl Acad Sci U S A*. 2007;104:13507-12.
 - 56 Casey BJ, Getz S, Galvan A. The adolescent brain. *Dev Rev*. 2008;28:62-77.
 - 57 Davey CG, Yucel M, Allen NB. The emergence of depression in adolescence: development of the prefrontal cortex and the representation of reward. *Neurosci Biobehav Rev*. 2008;32:1-19.
 - 58 Lopez KC, Luby JL, Belden AC, Barch DM. Emotion dysregulation and functional connectivity in children with and without a history of major depressive disorder. *Cogn Affect Behav Neurosci*. 2018;18:232-48.
 - 59 Luby JL, Si X, Belden AC, Tandon M, Spitznagel E. Preschool depression: homotypic continuity and course over 24 months. *Arch Gen Psychiatry*. 2009;66:897-905.
 - 60 Pan PM, Sato JR, Salum GA, Rohde LA, Gadelha A, Zugman A, et al. Ventral striatum functional connectivity as a predictor of adolescent depressive disorder in a longitudinal community-based sample. *Am J Psychiatry*. 2017;174:1112-9.
 - 61 Davey CG, Whittle S, Harrison BJ, Simmons JG, Byrne ML, Schwartz OS, et al. Functional brain-imaging correlates of negative affectivity and the onset of first-episode depression. *Psychol Med*. 2015;45:1001-9.
 - 62 Luking KR, Repovs G, Belden AC, Gaffrey MS, Botteron KN, Luby JL, et al. Functional connectivity of the amygdala in early-childhood-onset depression. *J Am Acad Child Adolesc Psychiatry*. 2011;50:1027-41.e3.
 - 63 Langenecker SA, Jenkins LM, Stange JP, Chang YS, DeDonno SR, Bessette KL, et al. Cognitive control neuroimaging measures differentiate between those with and without future recurrence of depression. *Neuroimage Clin*. 2018;20:1001-9.
 - 64 Callaghan BL, Dandash O, Simmons JG, Schwartz O, Byrne ML, Sheeber L, et al. Amygdala resting connectivity mediates association between maternal aggression and adolescent major depression: a 7-year longitudinal study. *J Am Acad Child Adolesc Psychiatry*. 2017;56:983-91.e3.
 - 65 Hirshfeld-Becker DR, Gabrieli JD, Shapero BG, Biederman J, Whitfield-Gabrieli S, Chai XJ. Intrinsic functional brain connectivity predicts onset of major depression disorder in adolescence: a pilot study. *Brain Connect*. 2019;9:388-98.
 - 66 Jin J, Van Snellenberg JX, Perlman G, DeLorenzo C, Klein DN, Kotov R, et al. Intrinsic neural circuitry of depression in adolescent females. *J Child Psychol Psychiatry*. 2020;61:480-91.
 - 67 Strikwerda-Brown C, Davey CG, Whittle S, Allen NB, Byrne ML, Schwartz OS, et al. Mapping the relationship between subgenual cingulate cortex functional connectivity and depressive symptoms across adolescence. *Soc Cogn Affect Neurosci*. 2015;10:961-8.
 - 68 Shapero BG, Chai XJ, Vangel M, Biederman J, Hoover CS, Whitfield-Gabrieli S, et al. Neural markers of depression risk predict the onset of depression. *Psychiatry Res Neuroimaging*. 2019;285:31-9.
 - 69 Connolly CG, Ho TC, Blom EH, LeWinn KZ, Sacchet MD, Tymofiyeva O, et al. Resting-state functional connectivity of the amygdala and longitudinal changes in depression severity in adolescent depression. *J Affect Disord*. 2017;207:86-94.
 - 70 Malhi GS, Das P, Outhred T, Bryant RA, Calhoun V. Resting-state neural network disturbances that underpin the emergence of emotional symptoms in adolescent girls: resting-state fMRI study. *Br J Psychiatry*. 2019;215:545-51.
 - 71 Jalbrzikowski M, Larsen B, Hallquist MN, Foran W, Calabro F, Luna B. Development of white matter microstructure and intrinsic functional connectivity between the amygdala and ventromedial prefrontal cortex: associations with anxiety and depression. *Biol Psychiatry*. 2017;82:511-21.
 - 72 Li B, Liu L, Friston KJ, Shen H, Wang L, Zeng LL, et al. A treatment-resistant default mode subnetwork in major depression. *Biol Psychiatry*. 2013;74:48-54.
 - 73 Veer IM, Beckmann CF, van Tol MJ, Ferrarini L, Milles J, Veltman DJ, et al. Whole brain resting-state analysis reveals decreased functional connectivity in major depression. *Front Syst Neurosci*. 2010;4:41.
 - 74 Manoliu A, Meng C, Brandl F, Doll A, Tahmasian M, Scherr M, et al. Insular dysfunction within the salience network is associated with severity of symptoms and aberrant inter-network connectivity in major depressive disorder. *Front Hum Neurosci*. 2013;7:930.
 - 75 Caspi A, Houts RM, Belsky DW, Goldman-Mellor SJ, Harrington H, Israel S, et al. The p factor: one general psychopathology factor in the structure of psychiatric disorders?. *Clin Psychol Sci*. 2014;2:118-37.
 - 76 Martel MM, Pan PM, Hoffmann MS, Gadelha A, do Rosario MC, Mari JJ, et al. A general psychopathology factor (P factor) in children: structural model analysis and external validation through familial risk and child global executive function. *J Abnorm Psychol*. 2017;126:137-48.
 - 77 Spreng RN, Grady CL. Patterns of brain activity supporting autobiographical memory, prospection, and theory of mind, and their relationship to the default mode network. *J Cogn Neurosci*. 2010;22:1112-23.
 - 78 Bai T, Zu M, Chen Y, Xie W, Cai C, Wei Q, et al. Decreased connection between reward systems and paralimbic cortex in depressive patients. *Front Neurosci*. 2018;12:462.
 - 79 Gong L, Yin Y, He C, Ye Q, Bai F, Yuan Y, et al. Disrupted reward circuits is associated with cognitive deficits and depression severity in major depressive disorder. *J Psychiatr Res*. 2017;84:9-17.
 - 80 Gabbay V, Ely BA, Li Q, Bangaru SD, Panzer AM, Alonso CM, et al. Striatum-based circuitry of adolescent depression and anhedonia. *J Am Acad Child Adolesc Psychiatry*. 2013;52:628-41.e13.
 - 81 Braams BR, van Duijvenvoorde AC, Peper JS, Crone EA. Longitudinal changes in adolescent risk-taking: a comprehensive study of neural responses to rewards, pubertal development, and risk-taking behavior. *J Neurosci*. 2015;35:7226-38.
 - 82 Rappaport BI, Kandala S, Luby JL, Barch DM. Brain reward system dysfunction in adolescence: current, cumulative, and developmental periods of depression. *Am J Psychiatry*. 2020;177:754-63.
 - 83 Posner J, Cha J, Wang Z, Talati A, Warner V, Gerber A, et al. Increased default mode network connectivity in individuals at high familial risk for depression. *Neuropsychopharmacology*. 2016;41:1759-67.
 - 84 Muetzel RL, Blanken LM, van der Ende J, El Marroun H, Shaw P, Sudre G, et al. Tracking brain development and dimensional psychiatric symptoms in children: a longitudinal population-based neuroimaging study. *Am J Psychiatry*. 2018;175:54-62.

- 85 Drysdale AT, Grosenick L, Downar J, Dunlop K, Mansouri F, Meng Y, et al. Resting-state connectivity biomarkers define neurophysiological subtypes of depression. *Nat Med*. 2017;23:28-38.
- 86 Dinga R, Schmaal L, Penninx BW, van Tol MJ, Veltman DJ, van Velzen L, et al. Evaluating the evidence for biotypes of depression: methodological replication and extension of. *Neuroimage Clin*. 2019;22:101796.
- 87 Cullen KR, Klimes-Dougan B, Vu DP, Westlund Schreiner M, Mueller BA, Eberly LE, et al. Neural correlates of antidepressant treatment response in adolescents with major depressive disorder. *J Child Adolesc Psychopharmacol*. 2016;26:705-12.
- 88 Straub J, Metzger CD, Plener PL, Koelch MG, Groen G, Ablner B. Successful group psychotherapy of depression in adolescents alters fronto-limbic resting-state connectivity. *J Affect Disord*. 2017;209:135-9.
- 89 Chattopadhyay S, Tait R, Simas T, van Nieuwenhuizen A, Hagan CC, Holt RJ, et al. Cognitive behavioral therapy lowers elevated functional connectivity in depressed adolescents. *EBioMedicine*. 2017;17:216-22.
- 90 Chahal R, Gotlib IH, Guyer AE. Research review: brain network connectivity and the heterogeneity of depression in adolescence – a precision mental health perspective. *J Child Psychol Psychiatry*. 2020;61:1282-98.
- 91 Battel L, Cunegatto F, Viduani A, Fisher HL, Kohrt BA, Mondelli V, et al. Mind the brain gap: the worldwide distribution of neuroimaging research on adolescent depression. *Neuroimage*. 2021;231:117865.
- 92 Schmaal L, Pozzi E, Ho TC, van Velzen LS, Veer IM, Opel N, et al. ENIGMA MDD: seven years of global neuroimaging studies of major depression through worldwide data sharing. *Transl Psychiatry*. 2020;10:172.
- 93 Zugman A, Harrewijn A, Cardinale EM, Zwiebel H, Freitag GF, Werwath KE, et al. Mega-analysis methods in ENIGMA: the experience of the generalized anxiety disorder working group. *Hum Brain Mapp*. 2022;43:255-77.