## Supplemental Methods and Results for

## Mapping neural circuit biotypes to symptoms and behavioral dimensions of depression and anxiety

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Table S4A. Regions implicated in dysfunction, and which defined quantified regional and composite circuit clinical scores for task-free circuits: region labels, coordinate definitions and metrics, computational steps and formulas used to generate global scores

		Default Mode Circuit	
Circuit Type	Condition	Task Contrast	Neurosynth Search criteria
Intrinsic	Task-free		Terms = "default mode"; "resting state" Number of studies = 516; 825 Search Date = 6.4.17
Region label	Region anatomy	Z Value	Template coordinates and definitions
D1	amPFC	22.0	-2, 50, -6
D2	AG L	26.1	-46, -70, 32
D3	AG R	20.6	50, -62, 26
D4	PCC	29.8	0, -50, 28
Computed inputs	Anatomical combinations	Input metric	Global Circuit Clinical Score Formula
$C_{D1,D2}$	amPFC with AG L	Intrinsic FC	
$C_{D1,D3}$	amPFC with AG R	Intrinsic FC	
$C_{D1,D4}$	amPFC with PCC	Intrinsic FC	$(C_{D1,D2} + C_{D1,D3} + C_{D1,D4} + C_{D2,D4} + C_{D3,D4})/5$
$C_{D2,D4}$	AG L with PCC	Intrinsic FC	(201,02 * 201,03 * 201,04 * 202,04 * 203,04).
$C_{D3,D4}$	AG R with PCC	Intrinsic FC	
		Salience Circuit	
Circuit Type	Condition	Task Contrast	Neurosynth Search criteria
Intrinsic	Task-free		Terms = "salience network"; "salience" Number of studies = 60; 269 Search Date = 6.4.17
Region label	Region anatomy	Z Value	Template coordinates and definitions
S1	aI L	11.9	-38, 14, -6
S2	aI R	14.8	38, 18, 2
S3	Amygdala L	6.9	AAL
S4	Amygdala R	14.7	AAL
Computed inputs	Anatomical combinations	Input Metric	Global Circuit Clinical Formula
$C_{S1,S3}$	aI L with Amygdala L	Intrinsic FC	
$C_{S2,S4}$	aI R with Amygdala R	Intrinsic FC	$(-C_{S1,S3} - C_{S2,S4} - C_{S1,S2})/3$
$C_{S1,S2}$	aI L with aI R	Intrinsic FC	
		Attention Circuit	
Circuit Type	Condition	Task Contrast	Neurosynth Search criteria
Intrinsic	Task-free		Terms = "frontoparietal network"; "attention" Number of studies = 1447; 79 Search Date = 6.4.17
Region label	Region anatomy	Z Value	Template coordinates and definitions
A1	msPFC	10.4	-2, 14, 52
A2	LPFC L	13.9	-44, 6, 32
A3	LPFC R	11.3	50, 10, 28
A4	aIPL L	10.4	-30, -54, 40
A5	aIPL R	10.4	38, -56, 48
A6	Precuneus L	13.0	-14, -66, 52
A7	Precuneus R	11.3	18, -68, 52
Computed inputs	Anatomical combinations	Input metric	Global Circuit Clinical Formula
$C_{A1,A4}$	msPFC with aIPL L	Intrinsic FC	
$C_{A1,A5}$	msPFC with aIPL R	Intrinsic FC	
$C_{A2,A4}$	LPFC L with aIPL L	Intrinsic FC	(- Cala4 - Cala5 - Ca244 - Ca345 - Ca446 - Ca547)/6
$C_{A3,A5}$	LPFC R with aIPL R	Intrinsic FC	( CA1,A4 CA1,A5 CA2,A4 - CA3,A5 - CA4,A6 - CA5,A7)/0
$C_{A4,A6}$	aIPL L with precuneus L	Intrinsic FC	
$C_{A5,A7}$	aIPL R with precuneus R	Intrinsic FC	

*Notes:* Z-scores and coordinates refer to peaks of meta-analytic Z values. Coordinates are in MNI atlas space and subcortical regions are defined by overlap with the AAL or FSL atlas. For the computation of circuit score formulas some inputs have been inverted according to the theoretical direction of dysfunction. Designs, stimuli and conditions underlying the task contrasts are outlined in more detail in the main text.

Anatomical Abbreviations: AAL = Automated Anatomical Labeling; AG = Angular Gyrus; aI = anterior Insula; aIPL = anterior Inferior Parietal Lobule; amPFC = anterior medial Prefrontal Cortex; FC = Frontal Cortex; FSL = FMRIB Software Library; L= Left; LPFC = Lateral Prefrontal Cortex; msPFC = medial superior Prefrontal Cortex; PCC = Posterior Cingulate Cortex; R= Right.

Table S4B. Regions implicated in dysfunction, and which defined quantified regional and composite circuit clinical scores for task-evoked circuits: region labels, coordinate definitions and metrics, computational steps and formulas used to generate global scores

	- Ne	gative Affect Circuit: Sad	
Circuit Type	Condition	Task Contrast	Neurosynth Search Criteria
	Conscious Facial Emotion	Sad vs Neutral based on	Term = "threat"
Task-evoked	Viewing	standardized facial emotion	Number of studies $= 170$
	Viewing	stimuli	Search Date $= 6.4.17$
Region label	Region anatomy	Z Value	Template coordinates and definitions
N1	pgACC*	6.3	6, 42, 4
N2	aI L	17.4	-36, 20, -4
N3	aI R	16.1	38, 22, -4
N4	Amygdala L	28.4	AAL
	Amygdaia L	20.4	AAL
N5	Amygdala R	25.2	AAL
Computed inputs	Anatomical combinations	Input Metric	Global Circuit Clinical Formula
$\mathbf{A}_{\mathrm{N1}}$	pgACC*	BOLD activation	
$\mathbf{A}_{ ext{N2}}$	aI L	BOLD activation	
$A_{N3}$	aI R	BOLD activation	
$A_{ m N4}$	Amygdala L	BOLD activation	
$A_{N5}$	Amygdala R	BOLD activation	
	[pgACC to aI L + aI L to		
$C_{N1,N2}$ *	pgACC]/2	PPI	$(A_{N1} + A_{N2} + A_{N3} + A_{N4} + A_{N5} - C_{N1,N2} - C_{N1,N3} + C_{N1,N3})$
	[pgACC to al R + al R to		C <sub>N1,N5</sub> )/9
$C_{N1,N3}*$	pgACC]/2	PPI	
	[pgACC to Amygdala L +		
$C_{N1,N4}*$		PPI	
	Amygdala L to pgACC]/2		
$C_{N1,N5}*$	[pgACC to Amygdala R +	PPI	
	Amygdala R to pgACC]/2	Affect Circuit: Threat Conscious	
Circuit Type	Condition	Task Contrast	Neurosynth Search Criteria
encur Type		Fear/Anger vs Neutral based	Term = "threat"
Task-evoked	Conscious Facial Emotion	on standardized facial emotion	Number of studies = 170
1 dsk-evoked	Viewing	stimuli	Search Date $= 6.4.17$
Region label	Region anatomy	Z Value	Template coordinates and definitions
T1	dACC	8.2	*
T2		28.4	6, 22, 32
T3	Amygdala L		AAL
	Amygdala R	25.2	AAL
Computed inputs	Anatomical combinations	Input Metric	Global Circuit Clinical Formula
$A_{T1}$	dACC	BOLD activation	
$A_{T2}$	Amygdala L	BOLD activation	
$A_{T3}$	Amygdala R	BOLD activation	
$C_{T1,T2}$	[dACC to Amygdala L+	PPI	$(-A_{T1} + A_{T2} + A_{T3} - C_{T1,T2} - C_{T1,T3})/5$
C11,12	Amygdala L to dACC]/2	111	
$C_{T1,T3}$	[dACC to Amygdala R +	PPI	
C11,13	Amygdala R to dACC]/2		
Ct. tum		ffect Circuit: Threat Nonconsciou	
Circuit Type	Condition	Task Contrast	Neurosynth Search Criteria
	Nonconscious Facial Emotion	Fear/Anger vs Neutral based	Term = "threat"
		on standardized facial emotion	Number of studies $= 170$
Task-evoked	Viewing	44	
	<u> </u>	stimuli	Search Date = $6.4.17$
Region label	Region anatomy	Z Value	Search Date = 6.4.17 Template coordinates and definitions
	<u> </u>		Search Date = $6.4.17$
Region label	Region anatomy ${ m sgACC}^\dagger$	Z Value	Search Date = 6.4.17 Template coordinates and definitions
Region label	Region anatomy	Z Value 5.6	Search Date = 6.4.17 <b>Template coordinates and definitions</b> 4, 26, -10
Region label T1 T2 T3	<b>Region anatomy</b> sgACC <sup>†</sup> Amygdala L	<b>Z Value</b> 5.6 28.4 25.2	Search Date = 6.4.17  Template coordinates and definitions 4, 26, -10  AAL  AAL
Region label T1 T2 T3 Computed inputs	Region anatomy sgACC <sup>†</sup> Amygdala L Amygdala R Anatomical combinations	<b>Z</b> Value 5.6 28.4 25.2 <b>Input Metric</b>	Search Date = 6.4.17  Template coordinates and definitions 4, 26, -10  AAL
Region label T1 T2 T3 Computed inputs A <sub>T1</sub>	Region anatomy sgACC <sup>†</sup> Amygdala L Amygdala R Anatomical combinations sgACC <sup>†</sup>	Z Value 5.6 28.4 25.2 Input Metric BOLD activation	Search Date = 6.4.17  Template coordinates and definitions 4, 26, -10  AAL  AAL
Region label T1 T2 T3 Computed inputs A <sub>T1</sub> A <sub>T2</sub>	Region anatomy  sgACC <sup>†</sup> Amygdala L  Amygdala R  Anatomical combinations  sgACC <sup>†</sup> Amygdala L	Z Value 5.6 28.4 25.2 Input Metric BOLD activation BOLD activation	Search Date = 6.4.17  Template coordinates and definitions 4, 26, -10  AAL  AAL
Region label T1 T2 T3 Computed inputs A <sub>T1</sub>	Region anatomy  sgACC <sup>†</sup> Amygdala L  Amygdala R  Anatomical combinations  sgACC <sup>†</sup> Amygdala L  Amygdala R	Z Value 5.6 28.4 25.2 Input Metric BOLD activation	Search Date = 6.4.17  Template coordinates and definitions 4, 26, -10  AAL  AAL  Global Circuit Clinical Formula
Region label T1 T2 T3 Computed inputs A <sub>T1</sub> A <sub>T2</sub> A <sub>T3</sub>	Region anatomy sgACC <sup>†</sup> Amygdala L Amygdala R Anatomical combinations sgACC <sup>†</sup> Amygdala L Amygdala L Smygdala R [sgACC to Amygdala L +	Z Value 5.6 28.4 25.2 Input Metric BOLD activation BOLD activation	Search Date = 6.4.17  Template coordinates and definitions 4, 26, -10  AAL  AAL
Region label T1 T2 T3 Computed inputs A <sub>T1</sub> A <sub>T2</sub>	Region anatomy sgACC <sup>†</sup> Amygdala L Amygdala R Anatomical combinations sgACC <sup>†</sup> Amygdala L Amygdala L Amygdala R [sgACC to Amygdala L + Amygdala L to sgACC]/2	Z Value 5.6 28.4 25.2 Input Metric BOLD activation BOLD activation BOLD activation	Search Date = 6.4.17  Template coordinates and definitions 4, 26, -10  AAL  AAL  Global Circuit Clinical Formula
$\begin{tabular}{ll} \textbf{Region label} \\ T1 \\ T2 \\ T3 \\ \begin{tabular}{ll} \hline \textbf{Computed inputs} \\ A_{T1} \\ A_{T2} \\ A_{T3} \\ C_{T1,T2} \\ \begin{tabular}{ll} ta$	Region anatomy sgACC <sup>†</sup> Amygdala L Amygdala R Anatomical combinations sgACC <sup>†</sup> Amygdala L Amygdala R [sgACC to Amygdala L + Amygdala L to sgACC]/2 [sgACC to Amygdala R +	Z Value 5.6 28.4 25.2 Input Metric BOLD activation BOLD activation BOLD activation	Search Date = 6.4.17  Template coordinates and definitions 4, 26, -10  AAL  AAL  Global Circuit Clinical Formula
Region label T1 T2 T3 Computed inputs A <sub>T1</sub> A <sub>T2</sub> A <sub>T3</sub>	Region anatomy  sgACC <sup>†</sup> Amygdala L  Amygdala R  Anatomical combinations  sgACC <sup>†</sup> Amygdala L  Amygdala R  [sgACC to Amygdala L +  Amygdala L to sgACC]/2  [sgACC to Amygdala R +  Amygdala R to sgACC]/2	Z Value 5.6 28.4 25.2 Input Metric BOLD activation BOLD activation BOLD activation PPI PPI	Search Date = 6.4.17  Template coordinates and definitions 4, 26, -10  AAL  AAL  Global Circuit Clinical Formula
Region label $T1$ $T2$ $T3$ Computed inputs $A_{T1}$ $A_{T2}$ $A_{T3}$ $C_{T1,T2}^{\dagger}$ $C_{T1,T3}^{\dagger}$	Region anatomy sgACC <sup>†</sup> Amygdala L Amygdala R Anatomical combinations sgACC <sup>†</sup> Amygdala L Amygdala L Amygdala L Amygdala R [sgACC to Amygdala L + Amygdala L to sgACC]/2 [sgACC to Amygdala R + Amygdala R to sgACC]/2 Pos	Z Value 5.6 28.4 25.2 Input Metric BOLD activation BOLD activation BOLD activation PPI PPI PPI	$Search \ Date = 6.4.17$ $Template \ coordinates \ and \ definitions$ $4, 26, -10$ $AAL$ $AAL$ $Global \ Circuit \ Clinical \ Formula$ $(-A_{T1} + A_{T2} + A_{T3} - C_{T1,T2} - C_{T1,T3})/5$
$\begin{tabular}{lll} \textbf{Region label} \\ T1 \\ T2 \\ T3 \\ \hline \textbf{Computed inputs} \\ A_{T1} \\ A_{T2} \\ A_{T3} \\ \hline \textbf{C}_{T1,T2}^{\dagger} \\ \end{tabular}$	Region anatomy  sgACC <sup>†</sup> Amygdala L  Amygdala R  Anatomical combinations  sgACC <sup>†</sup> Amygdala L  Amygdala R  [sgACC to Amygdala L +  Amygdala L to sgACC]/2  [sgACC to Amygdala R +  Amygdala R to sgACC]/2	Z Value 5.6 28.4 25.2 Input Metric BOLD activation BOLD activation BOLD activation PPI PPI PPI itive Affect Circuit: Happy Task Contrast	Search Date = $6.4.17$ Template coordinates and definitions $4, 26, -10$ AAL AAL Global Circuit Clinical Formula $(-A_{T1} + A_{T2} + A_{T3} - C_{T1,T2} - C_{T1,T3})/5$ Neurosynth Search Criteria
Region label $T1$ $T2$ $T3$ Computed inputs $A_{T1}$ $A_{T2}$ $A_{T3}$ $C_{T1,T2}^{\dagger}$ $C_{T1,T3}^{\dagger}$ Circuit Type	Region anatomy sgACC <sup>†</sup> Amygdala L Amygdala R Anatomical combinations sgACC <sup>†</sup> Amygdala L Amygdala L Amygdala L Amygdala R [sgACC to Amygdala L + Amygdala L to sgACC]/2 [sgACC to Amygdala R + Amygdala R to sgACC]/2 Pos	Z Value 5.6 28.4 25.2 Input Metric BOLD activation BOLD activation BOLD activation PPI PPI PPI itive Affect Circuit: Happy Task Contrast Happy vs Neutral based on	Search Date = $6.4.17$ Template coordinates and definitions $4, 26, -10$ AAL AAL Global Circuit Clinical Formula $(-A_{T1} + A_{T2} + A_{T3} - C_{T1,T2} - C_{T1,T3})/5$ Neurosynth Search Criteria Terms = "monetary reward"; "reward"
$\begin{tabular}{ll} \textbf{Region label} \\ T1 \\ T2 \\ T3 \\ \textbf{Computed inputs} \\ A_{T1} \\ A_{T2} \\ A_{T3} \\ C_{T1,T2} \\ \dagger \\ C_{T1,T3} \\ \dagger \\ \end{tabular}$	Region anatomy sgACC <sup>†</sup> Amygdala L Amygdala R Anatomical combinations sgACC <sup>†</sup> Amygdala L Amygdala L Amygdala L Amygdala R [sgACC to Amygdala L + Amygdala L to sgACC]/2 [sgACC to Amygdala R + Amygdala R to sgACC]/2 Pos Condition	Z Value 5.6 28.4 25.2 Input Metric BOLD activation BOLD activation BOLD activation PPI PPI PPI itive Affect Circuit: Happy Task Contrast Happy vs Neutral based on standardized facial emotion	Search Date = $6.4.17$ Template coordinates and definitions $4, 26, -10$ AAL AAL Global Circuit Clinical Formula $(-A_{T1} + A_{T2} + A_{T3} - C_{T1,T2} - C_{T1,T3})/5$ Neurosynth Search Criteria Terms = "monetary reward"; "reward" Number of studies = $84$ ; $671$
Region label $T1$ $T2$ $T3$ Computed inputs $A_{T1}$ $A_{T2}$ $A_{T3}$ $C_{T1,T2}^{\dagger}$ $C_{T1,T3}^{\dagger}$ Circuit Type	Region anatomy sgACC <sup>†</sup> Amygdala L Amygdala R Anatomical combinations sgACC <sup>†</sup> Amygdala L Amygdala L Amygdala R [sgACC to Amygdala L + Amygdala L to sgACC]/2 [sgACC to Amygdala R + Amygdala R to sgACC]/2 Pos Condition Conscious Facial Emotion	Z Value 5.6 28.4 25.2 Input Metric BOLD activation BOLD activation BOLD activation PPI PPI PPI itive Affect Circuit: Happy Task Contrast Happy vs Neutral based on	Search Date = $6.4.17$ Template coordinates and definitions $4, 26, -10$ AAL AAL Global Circuit Clinical Formula $(-A_{T1} + A_{T2} + A_{T3} - C_{T1,T2} - C_{T1,T3})/5$ Neurosynth Search Criteria Terms = "monetary reward"; "reward"

	P2	Striatum L	14.0	FSL				
	P3	Striatum R	7.9	FSL				
	Computed inputs	Anatomical combinations	Input Metric	Global Circuit Clinical Formula				
	$A_{P1}$	vMPFC	BOLD activation					
	$A_{P2}$	Striatum L	BOLD activation	$(-A_{P1} - A_{P2} - A_{P3})/3$				
	$A_{P3}$	Striatum R	BOLD activation					
Cognitive Control Circuit								
	Circuit Type	Condition	Task Contrast	Neurosynth Search Criteria				
				Terms = "cognitive control"				
	Task-evoked	Go-NoGo task	No-Go vs. Go	Number of studies $= 428$				
				Search Date $= 6.4.17$				
	Region label	Region anatomy	Z Value	Template coordinates and definitions				
	C1	dACC	20.0	0, 18, 46				
	C2	DLPFC L	20.4	-44, 6, 32				
	C3	DLPFC R	12.4	44, 34, 22				
	Computed inputs	Anatomical combinations	Input Metric	Global Circuit Clinical Formula				
	$A_{C1}$	dACC	BOLD activation					
	$A_{C2}$	DLPFC L	BOLD activation					
	$\mathbf{A}_{\mathrm{C3}}$	DLPFC R	BOLD activation					
$C_{C1,C2}$	C	[dACC to DLPFC L + DLPFC L	PPI	(-A <sub>C1</sub> - A <sub>C2</sub> - A <sub>C3</sub> - C <sub>C1,C2</sub> - C <sub>C1,C3</sub> )/5				
	CC1,C2	to dACC]/2						
C <sub>C1,C3</sub>	C	[dACC to DLPFC R + DLPFC R	PPI					
	CC1,C3	to dACC]/2						

*Notes:* Z-scores and coordinates refer to peaks of meta-analytic Z values. Note that PPI values were computed using each region in the pair as a seed region and results averaged. Coordinates are in MNI atlas space and subcortical regions are defined by overlap with the AAL or FSL atlas. For the computation of circuit score formulas, some inputs have been inverted according to the theoretical direction of dysfunction. Designs, stimuli and conditions underlying the task contrasts are outlined in more detail in the main text.

Abbreviations: AAL = Automatic Anatomical Labeling; C = Connectivity; BOLD = Blood Oxygenated Level Dependent; FSL = FMRIB Software Library; MNI = Montreal Neurological Institute; PPI = Psychophysiological Interaction.

Anatomical Abbreviations: AAL = Automated Anatomical Labeling atlas; aI = anterior Insula; aIPL = anterior Inferior Parietal Lobule; dACC = dorsal Anterior Cingulate Cortex; DLPFC = Dorsolateral Prefrontal Cortex; L= Left; LPFC = Lateral Prefrontal Cortex; vMPFC = ventromedial Prefrontal Cortex; pgACC = pregenual Anterior Cingulate Cortex; PCC = Posterior Cingulate Cortex; sgACC = subgenual Anterior Cingulate Cortex; SPL = Superior Parietal Lobule; R= Right.

<sup>\*</sup>The pgACC peaks were defined by decreasing the minimum cluster distance in the 3dCluster algorithm.

<sup>†</sup>Although the sgACC did not meet our quality control metrics for temporal signal-to-noise ratio, given both the difficulty of imaging this region and its importance of this region to defining the negative affect circuit elicited by implicit threat stimuli and to prior imaging findings in depression, we report supplementary analyses including this region.