Supplemental Material

Supplementary Methods

The three groups were defined using the DAWBA self-report. An additional criteria for healthy controls was a score lower than 4 on the Adolescent Depression Rating Scale (ADRS) at both follow-ups. To be diagnosed with MDD, participants had to endorse a total of at least 5 depressive symptoms on the DAWBA at one of the follow-up assessments (e.g. 5 of more of the following symptoms: sad mood, loss of interest, fatigue, changed appetite, weight loss/gain, insomnia, hypersomnia, psychomotor agitation, feelings of worthlessness or guilt, concentration problems, thoughts of death), with at least 1 of these symptoms including one of the two core depression criteria (sad mood and loss of interest) over a period of at least 2 weeks (1). In addition, they also had to score 50% or higher on the DAWBA computer prediction of depression (http://www.dawba.info). Subthreshold MDD was defined as experiencing at least 1 of the two core symptoms and at least 2 other depressive symptoms on the DAWBA at one of the follow-up assessments, without any restrictions on the duration or functional impact of these symptoms. Participants with comorbid bipolar disorder or psychosis at any timepoint were excluded from the MDD groups, however comorbid anxiety disorders were no exclusion criteria. There were no differences between age and sex distributions of participants in the included and excluded samples, however depressive symptoms were higher in the excluded participants since those with depression at baseline were removed from the sample

Demographic predictors

Sex was included as predictor variable. Age was not included since all participants were within the same age range (~14 years old at baseline).

Clinical predictors

Scores on five subscales of the strengths and difficulties questionnaire (SDQ) were included to measure psychopathology (2). A binary predictor was created indicating if the participants had a first degree relative with a history of psychiatric disorder (schizophrenia, bipolar disorder, depression, anxiety disorder, obsessive compulsive disorder or substance use disorder) or suicide attempt, based on the genetic screening and family history of psychiatric disorders interview filled out by participants'

parent or caregiver. A baseline depression score, ranging from 0 to 14, was created based on self-reported depressive symptoms assessed using the Development and Well-Being Assessment (DAWBA).

Cognitive predictors

Scores on eight subscales of the Wechsler Intelligence Scale for Children, fourth edition, (WISC-IV) were included, capturing verbal comprehension, visual spatial processing, inductive and quantitative reasoning and working memory (3). From the Cambridge Neuropsychological Test Automated Battery (CANTAB), the pattern recognition memory task, spatial working memory task and rapid visual information processing task were included (4). In addition, 12 predictors from the emotional dot probe task were used. In the emotional dot probe task, the participants are simultaneously shown two (emotional) faces, next a probe appears on the location of one of the faces. The participant has to indicate on which side the probe was displayed. The following 12 variables were used as predictors; reaction time and number of correct responses for the six different task conditions (angry, fearful and happy versus neutral; congruent and incongruent) (5).

Personality trait predictors

Scores on five subscales of the NEO Five-Factor Inventory (NEO-FFI) were included (6). Four subscales from the substance use risk profile scale (SURPS) were included (7).

Psychosocial predictors

To measure life events, the subscales for lifetime frequency and mean valence of life events in eight categories from the life-events questionnaire were included (8). In addition, six items of the Olweus Bully/Victim questionnaire were included that focused on situations where the participant were the victim (9).

Substance use predictors

Variables encapsulating substance use were based on four self-report questionnaires, including alcohol use in the past year based on the first question in the Alcohol Use Disorder Identification Test (AUDIT) (10), lifetime frequency of cannabis use and lifetime frequency smoking cigarettes on a scale

of 0 (never) to 6 (>40 times) (European School Survey Project on Alcohol and Drugs; ESPAD) (11) and total score on the Fagerström test for nicotine dependence (12).

Developmental predictors

The total score on the pubertal development scale was included to assess the stage of physical pubertal development at baseline (13).

Neuroimaging predictors

T1 weighted images were acquired on 3T scanners (Siemens, Munich, Germany; Philips, Best, The Netherlands; General Electrics, Chalfont St Giles, UK; Bruker, Ettlingen, Germany). Variance between sites was minimized and tested by scanning The American College of Radiology phantom and healthy volunteers at each site (14). For the current study we focused on the magnetization prepared gradient echo sequence (MPRAGE), which was based on the ADNI protocol (http://adni.loni.usc.edu/methods/mri-tool/mri-analysis/). The acquisition parameters were: repetition time (TR): 2300 ms, echo time (TE): 2.8 ms, flip angle: 8-9°, voxel size: 1.1x1.1x1.1 mm, pixel matrix: 256x256x170 mm.

FreeSurfer (version 5.3) was used to extract measures of cortical and subcortical brain structure (15), using the Desikan-Killiany atlas for cortical parcellations. The ENIGMA protocols were used to check the quality of the cortical parcellations and subcortical segmentations (http://enigma.ini.usc.edu/protocols/imaging-protocols) (16, 17). Cortical surface area (34 regions), cortical thickness (34 regions) and subcortical volumes (8 regions) was calculated per region and averaged across left and right hemisphere. In total 78 structural MRI measures were included as predictors. To correct for the effect of head size, intercranial volume (ICV) was regressed out of the cortical surface area and subcortical volume variables. This was not done for cortical thickness, because cortical thickness does not scale with head size (18). Participants missing more than 10% of neuroimaging data were excluded.

Prediction of depression excluding comorbid anxiety

To assess if depression could be predicted when subjects who developed comorbid anxiety where excluded, the analysis was repeated in a smaller sample (N = 393 in training set). However, excluding participants who developed a comorbid anxiety disorder at follow-up (in addition to depression) results in a non-representative sample, therefore we decided to keep these participants in the main analysis.

Supplementary Results

Prediction of MDD

When those with subthreshold depression were excluded, MDD onset could be predicted with an AUROC ranging between 0.86 and 0.88 across different levels of α (Supplementary Table S1). When subjects who developed subthreshold depression were included as healthy controls, the AUROC ranged between 0.54 and 0.59 (Supplementary Table S2).

Prediction of depression excluding comorbid anxiety

The performance measures of prediction of depression onset when those who developed comorbid anxiety were excluded were similar to the performance measures of the main analysis (AUROC: 0.69-0.70) (Supplementary Table S3).

Supplementary Figures and Tables

S1 Supplementary Table S1. Performance measures in penalized logistic regression for four different α (Ridge towards Lasso penalty) to predict MDD onset.

α	ÀUROC	SD AUROC	Sensitivity	Specificity	Accuracy
0.25	0.86	0.16	0.92	0.49	0.70
0.5	0.88	0.15	0.94	0.46	0.70
0.75	0.88	0.16	0.96	0.45	0.70
1	0.88	0.19	0.94	0.47	0.71

SD: standard deviation across folds

S2 Supplementary Table S2. Performance measures in penalized logistic regression for four different α (Ridge towards Lasso penalty) to predict MDD onset with subthreshold depression included as healthy controls.

α	AUROĆ	SD AUROC	Sensitivity	Specificity	Accuracy
0.25	0.59	0.10	0.70	0.43	0.57
0.5	0.55	0.09	0.74	0.34	0.54
0.75	0.56	0.10	0.75	0.32	0.54
1	0.54	0.09	0.76	0.29	0.53

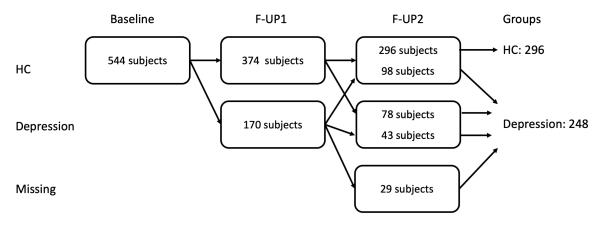
SD: standard deviation across folds

S3 Supplementary Table S3. Performance measures in penalized logistic regression for four different α (Ridge towards Lasso penalty) to predict depression (comorbid anxiety was excluded).

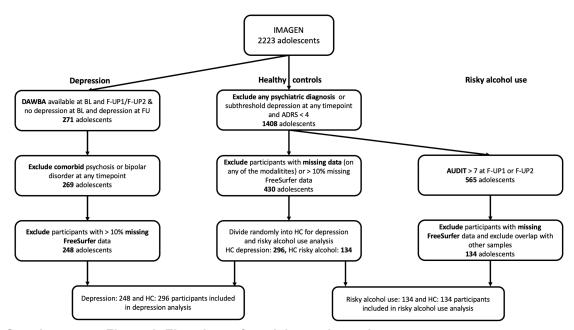
α	AUROC	SD AUROC	Sensitivity	Specificity	Accuracy	
0.25	0.70	0.08	0.66	0.64	0.65	

0.5	0.69	0.09	0.63	0.65	0.64	
0.75	0.69	0.09	0.63	0.66	0.64	
1	0.70	0.10	0.66	0.66	0.66	

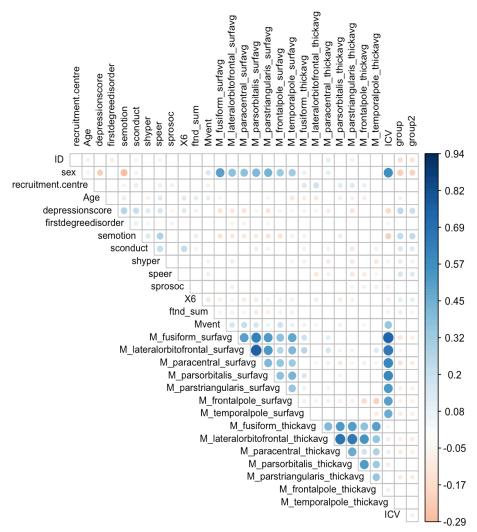
SD: standard deviation across folds



Supplementary Figure 1. Flowchart of participants across groups



Supplementary Figure 2. Flowchart of participants in study



Supplementary Figure 3. Strongest correlations between the features used to predict depression onset.

S2 Supplemental Table S2. Features used to predict depression onset

Category	Feature	Explanation	Based on (measure)
Demographical	Sex	Male or Female	
	Recruitment center	5 recruitment sites	
Clinical	Depression score	Total score	DAWBA
	Emotional symptoms	Subscale	SDQ
	Conduct problems	Subscale	SDQ
	Hyperactivity	Subscale	SDQ
	Peer problems	Subscale	SDQ
	Prosocial behavior	Subscale	SDQ
	First degree relative with history		GEN
	of psychiatric disorder		
Cognition	Block design	Spatial visualization	WISC IV
	Digit span backward	Memory span	WISC IV
	Digit span forward	Memory span	WISC IV
	Digit span longest backward	Memory span	WISC IV
	Digit span longest forward	Memory span	WISC IV
	Matrix reasoning	Perceptual reasoning	WISC IV

	Similarities	Verbal comprehension	WISC IV
	Vocabulary	Verbal comprehension	WISC IV
	Pattern recognition memory	Visual recognition memory, % correct	CANTAB
	Rapid visual information processing	Sustained attention	CANTAB
	Spatial working memory errors	Visual memory and manipulation	CANTAB
	Spatial working memory strategy	Visual memory and manipulation	CANTAB
	Angry – neutral congruent	Reaction time	EDPT
	Angry – neutral incongruent	Reaction time	EDPT
	Fear – neutral congruent	Reaction time	EDPT
	Fear – neutral incongruent	Reaction time	EDPT
	Happy – neutral congruent	Reaction time	EDPT
	Happy – neutral incongruent	Reaction time	EDPT
	Angry – neutral congruent	Number correct responses	EDPT
	Angry – neutral incongruent	Number correct responses	EDPT
	Fear – neutral incongruent	Number correct responses	EDPT
	Fear – neutral incongruent	Number correct responses	EDPT
	G	Number correct responses	EDPT
	Happy – neutral congruent Happy – neutral incongruent	Number correct responses	EDPT
Environmental	Bullied at school	Number correct responses	Bully
Liiviioiiiieiitai	Called mean names/made fun of		Bully
	Left out or ignored		Bully
	Physically bullied		Bully
	Bullied by teacher		•
	•		Bully
	Bullied by family member	Subscale total score of	Bully LEQ
	Family lifetime		LEQ
		lifetime occurrence of	
		(yes(1)/no(0) for each event):	
		Parents: divorce, remarried,	
		alcohol abuse, money	
	English days	problems, argues/fought	150
	Family valence	How did that make you feel?	LEQ
	Accident/illness lifetime	Subscale total score of lifetime occurrence of	LEQ
		(yes(1)/no(0) for each event):: Family	
		accident/illness, given	
		medication, death in family,	
		serious accident/illness	
	Accident/illness valence		LEQ
	Sexuality lifetime	Subscale total score of	LEQ
	•	lifetime occurrence of	
		(yes(1)/no(0) for each	
		event):: Fell in love,	
		got/made pregnant, got/gave	
		STD, started going out with	
		girl/boyfriend, broke up with	
		boy/girlfriend, had a gay	
		experience, lost virginity	
		experience, lest virginity	

	Sexuality valence Autonomy lifetime	Subscale total score of lifetime occurrence of (yes(1)/no(0) for each event):: Found new friends, began time-consuming hobby, decided about college/university, joined club or group, got own TV/computer, went on holiday without parents, started driving a motor vehicle, started making own	LEQ LEQ
	Autonomy valence	money	LEQ
	Deviance lifetime	Subscale total score of lifetime occurrence of (yes(1)/no(0) for each event):: Got in trouble with the law, stole something valuable, got in trouble at school	LEQ
	Deviance valence		LEQ
	Relocation lifetime	Subscale total score frequency lifetime: Parents changed jobs, changed schools, family moved	LEQ
	Relocation valence Distress lifetime	Subscale total score of lifetime occurrence of (yes(1)/no(0) for each event):: Face broke out with pimples, started seeing therapist, thought about suicide, ran away from home, got poor grades in school, gained a lot of weight	LEQ LEQ
	Distress valence	scribble, gained a lot of weight	LEQ
	Other lifetime	Subscale total score of lifetime occurrence of (yes(1)/no(0) for each event):: Brother/sister moved out, met a teacher I liked a lot, found religion	LEQ
	Other valence		LEQ
Developmental	Pubertal development scale	Total score	PDS
Personality	Neuroticism Extraversion Openness Agreeableness Conscientiousness Anxiety sensitivity	Subscale total score	NEO-FFI NEO-FFI NEO-FFI NEO-FFI SURPS

			OLIDDO.
	Negative thinking	Subscale total score	SURPS
	Impulsivity	Subscale total score	SURPS
-	Sensation seeking	Subscale total score	SURPS
Substance use	Smoking	Number of occasions	ESPAD
		smoking (lifetime)	
	Smoking score	Total score	FTND
	Cannabis use	Number of occasions	ESPAD
		marijuana (lifetime)	
	Alcohol use	Frequency alcohol use –	AUDIT
		question 1	
Structural MRI	Hippocampus	Volume	FreeSurfer
Subcortical	Amygdala	Volume	FreeSurfer
	Thalamus	Volume	FreeSurfer
	Nucleus accumbens	Volume	FreeSurfer
	Pallidum	Volume	FreeSurfer
	Putamen	Volume	FreeSurfer
	Caudate	Volume	FreeSurfer
	Ventricles	Volume	FreeSurfer
Cortical	Bank of superior sulcus of	Surface area & thickness	FreeSurfer
	temporal lobe		
	Caudal anterior cingulate cortex	Surface area & thickness	FreeSurfer
	Caudal middle frontal cortex	Surface area & thickness	FreeSurfer
	Cuneus	Surface area & thickness	FreeSurfer
	Entorhinal cortex	Surface area & thickness	FreeSurfer
	Fusiform gyrus	Surface area & thickness	FreeSurfer
	Inferior parietal cortex	Surface area & thickness	FreeSurfer
	Inferior temporal cortex	Surface area & thickness	FreeSurfer
	Isthmuscingulate cortex	Surface area & thickness	FreeSurfer
	Lateral occipital cortex	Surface area & thickness	FreeSurfer
	Lateral orbitofrontal cortex	Surface area & thickness	FreeSurfer
	Lingual cortex	Surface area & thickness	FreeSurfer
	Medial orbitofrontal cortex	Surface area & thickness	FreeSurfer
	Middle temporal cortex	Surface area & thickness	FreeSurfer
	Parahippocampal cortex	Surface area & thickness	FreeSurfer
	Paracentral cortex	Surface area & thickness	FreeSurfer
	Pars opercularis	Surface area & thickness	FreeSurfer
	Pars triangularis	Surface area & thickness	FreeSurfer
	Pars orbitalis	Surface area & thickness	FreeSurfer
	Pericalcarine	Surface area & thickness	FreeSurfer
	Postcentral gyrus	Surface area & thickness	FreeSurfer
	Precentral gyrus	Surface area & thickness	FreeSurfer
	Posterior cingulate cortex	Surface area & thickness	FreeSurfer
	Precuneus	Surface area & thickness	FreeSurfer
	Rostral anterior cingulate cortex	Surface area & thickness	FreeSurfer
	Rostral middle frontal cortex	Surface area & thickness	FreeSurfer
	Superior frontal gyrus	Surface area & thickness	FreeSurfer
	Superior parietal lobule	Surface area & thickness	FreeSurfer
	Superior temporal cortex	Surface area & thickness	FreeSurfer
	Supramarginal	Surface area & thickness	FreeSurfer
	Frontal pole	Surface area & thickness	FreeSurfer
	Temporal pole	Surface area & thickness	FreeSurfer
	Transversetemporal	Surface area & thickness	FreeSurfer
	Tanovorocomporar	Carrace area & triteritess	riccourie

AUDIT: alcohol use disorders identification test, CANTAB: Cambridge neuropsychological test automated battery, DAWBA: development and well-being assessment, EDPT: emotional dot probe task, ESPAD: European school survey project on alcohol and other drugs, FTND: Fagerstrom test for nicotine dependence, GEN: genetic screening and family history of psychiatric disorders interview, LEQ: life events questionnaire, NEO-FFI: neuroticism-extraversion-openness five-factor inventory, PDS: pubertal development scale, SDQ: strengths and difficulties questionnaire, SURPS: substance use risk profile scale, WISC-IV: Wechsler intelligence scale for children – fourth edition.

S3 Supplemental Table S3. Demographic, clinical, cognitive, personality, environmental, substance use, developmental and neurobiological variables in three groups (healthy control, MDD, subthreshold MDD)

	Training depression (n=180)	Training control (n=227)	Test depression (n=68)	Test control (n=69)
Age				
Mean (SD)	14.5 (0.54)	14.4 (0.44)	14.4 (0.59)	14.4 (0.61)
Sex				
Female	121 (67.2%)	104 (45.8%)	46 (67.6%)	29 (42.0%)
Male	59 (32.8%)	123 (54.2%)	22 (32.4%)	40 (58.0%)
Site				
Berlin	34 (18.9%)	17 (7.5%)	NA	NA
Dresden	17 (9.4%)	62 (27.3%)	NA	NA
Hamburg	35 (19.4%)	45 (19.8%)	NA	NA
London	47 (26.1%)	53 (23.3%)	NA	NA
Nottingham	47 (26.1%)	50 (22.0%)	NA	NA
Dublin	NA	NA	21 (30.9%)	11 (15.9%)
Mannheim	NA	NA	20 (29.4%)	27 (39.1%)
Paris	NA	NA	27 (39.7%)	31 (44.9%)
Depression score at BL (DAWBA)				
Mean (SD)	1.07 (1.23)	0.59 (0.80)	0.82 (0.88)	0.36 (0.57)
SDQ				
Emotion (mean (SD))	3.02 (2.01)	2.32 (1.77)	3.22 (2.23)	1.59 (1.65)
Conduct problems (mean (SD))	2.20 (1.57)	1.76 (1.32)	2.18 (1.44)	1.81 (1.39)
Hyperactivity (mean (SD))	4.31 (2.12)	3.88 (2.03)	4.24 (2.12)	3.16 (2.30)
Peer (mean (SD))	2.07 (1.63)	1.76 (1.62)	1.93 (1.66)	1.03 (1.11)
Prosocial (mean (SD))	7.87 (1.73)	7.71 (1.59)	7.99 (1.46)	7.86 (1.56)
Familial psychiatric history				
No	156 (87%)	197 (87%)	59 (87%)	62 (90%)
Yes	24 (13%)	30 (13%)	9 (13%)	7 (10%)
WISC-IV				

	Training depression (n=180)	Training control (n=227)	Test depression (n=68)	Test control (n=69)
Block design (mean (SD))	50.7 (9.67)	52.6 (7.87)	49.8 (9.24)	54.2 (8.22)
Digit span backward (mean (SD))	8.78 (1.93)	9.01 (2.20)	8.18 (1.93)	8.70 (1.97)
Digit span forward (mean (SD))	9.69 (1.92)	9.59 (2.15)	9.66 (1.99)	9.94 (2.06)
Digit span longest back (mean (SD))	5.04 (1.27)	5.18 (1.36)	4.72 (1.03)	4.97 (1.26)
Digit span longest forward (mean (SD))	6.35 (1.28)	6.42 (1.27)	6.28 (1.13)	6.67 (1.21)
Matrix Reasoning (mean (SD))	26.6 (3.74)	27.5 (3.35)	26.3 (3.94)	27.1 (4.21)
Similarities (mean (SD))	30.2 (5.84)	31.5 (4.90)	30.5 (4.45)	31.6 (5.06)
Vocabulary (mean (SD))	51.0 (8.41)	52.0 (8.07)	47.4 (6.56)	50.4 (6.70)
Executive functioning				
Pattern recognition memory (mean (SD))	95.3 (6.25)	95.4 (7.36)	95.5 (7.04)	94.4 (9.44)
Rapid visual information processing (mean (SD))	0.88 (0.05)	0.89 (0.05)	0.87 (0.05)	0.88 (0.05)
Spatial working memory errors (mean (SD))	18.8 (13.2)	17.8 (13.3)	21.9 (15.0)	17.6 (13.3)
Spatial working memory strategy (mean (SD))	31.0 (5.46)	30.4 (5.76)	31.8 (5.33)	31.1 (4.88)
Emotional Dot Probe Task				
Reaction time congruent angry neutral (mean (SD))	469 (218)	458 (116)	458 (79.4)	451 (97.1)
Reaction time incongruent angry neutral (mean (SD))	450 (87.6)	469 (149)	475 (116)	447 (77.9)
Reaction time congruent fear neutral (mean (SD))	455 (87.8)	466 (126)	482 (148)	457 (111)
Reaction time incongruent fear neutral (mean (SD))	452 (76.4)	470 (192)	480 (168)	448 (85.0)
Reaction time congruent happy neutral (mean (SD))	454 (94.7)	466 (127)	463 (93.7)	451 (95.9)
Reaction time incongruent happy neutral (mean (SD))	456 (89.9)	469 (170)	483 (182)	455 (93.9)
Score congruent angry neutral (mean (SD))	19.5 (1.55)	19.5 (1.11)	19.7 (0.58)	19.6 (0.73)
Score incongruent angry neutral (mean (SD))	19.4 (1.35)	19.5 (1.30)	19.4 (0.74)	19.7 (0.70)
Score congruent fear neutral (mean (SD))	19.4 (1.54)	19.5 (1.22)	19.5 (0.80)	19.7 (0.68)
Score incongruent fear neutral (mean (SD))	19.5 (1.20)	19.5 (1.00)	19.7 (0.59)	19.6 (0.69)
Score congruent happy neutral (mean (SD))	19.4 (1.54)	19.5 (1.09)	19.6 (0.61)	19.7 (0.61)

	Training depression (n=180)	Training control (n=227)	Test depression (n=68)	Test control (n=69)
Score incongruent happy neutral (mean (SD))	19.4 (1.73)	19.6 (1.10)	19.7 (0.62)	19.6 (0.65)
I was bullied in school				
None	95 (52.8%)	155 (68.3%)	33 (48.5%)	49 (71.0%)
Only once or twice	59 (32.8%)	46 (20.3%)	26 (38.2%)	16 (23.2%)
2 or 3 times a month	11 (6.1%)	12 (5.3%)	3 (4.4%)	1 (1.4%)
About once a week	9 (5.0%)	7 (3.1%)	3 (4.4%)	2 (2.9%)
Several times a week	6 (3.3%)	7 (3.1%)	2 (2.9%)	1 (1.4%)
Missing	0 (0%)	0 (0%)	1 (1.5%)	0 (0%)
I was called mean names by a peer				
None	107 (59.4%)	162 (71.4%)	37 (54.4%)	48 (69.6%)
Only once or twice	50 (27.8%)	43 (18.9%)	19 (27.9%)	18 (26.1%)
2 or 3 times a month	5 (2.8%)	11 (4.8%)	7 (10.3%)	0 (0%)
About once a week	7 (3.9%)	6 (2.6%)	2 (2.9%)	3 (4.3%)
Several times a week	11 (6.1%)	5 (2.2%)	2 (2.9%)	0 (0%)
Missing	0 (0%)	0 (0%)	1 (1.5%)	0 (0%)
A peer left me out of things				
None	116 (64.4%)	170 (74.9%)	50 (73.5%)	63 (91.3%)
Only once or twice	50 (27.8%)	44 (19.4%)	14 (20.6%)	6 (8.7%)
2 or 3 times a month	3 (1.7%)	7 (3.1%)	1 (1.5%)	0 (0%)
About once a week	4 (2.2%)	3 (1.3%)	2 (2.9%)	0 (0%)
Several times a week	7 (3.9%)	3 (1.3%)	0 (0%)	0 (0%)
Missing	0 (0%)	0 (0%)	1 (1.5%)	0 (0%)
I was hit by a peer				
None	152 (84.4%)	194 (85.5%)	55 (80.9%)	64 (92.8%)
Only once or twice	24 (13.3%)	27 (11.9%)	7 (10.3%)	5 (7.2%)
2 or 3 times a month	1 (0.6%)	2 (0.9%)	2 (2.9%)	0 (0%)
About once a week	2 (1.1%)	2 (0.9%)	2 (2.9%)	0 (0%)
Several times a week	1 (0.6%)	2 (0.9%)	1 (1.5%)	0 (0%)
Missing	0 (0%)	0 (0%)	1 (1.5%)	0 (0%)
I have been bullied by a teacher				
None	140 (77.8%)	201 (88.5%)	59 (86.8%)	65 (94.2%)
Only once or twice	34 (18.9%)	19 (8.4%)	7 (10.3%)	4 (5.8%)

	Training depression (n=180)	Training control (n=227)	Test depression (n=68)	Test control (n=69)
2 or 3 times a month	2 (1.1%)	5 (2.2%)	0 (0%)	0 (0%)
About once a week	2 (1.1%)	1 (0.4%)	0 (0%)	0 (0%)
Several times a week	2 (1.1%)	1 (0.4%)	1 (1.5%)	0 (0%)
Missing	0 (0%)	0 (0%)	1 (1.5%)	0 (0%)
I have been bullied by a family member				
None	145 (80.6%)	202 (89.0%)	57 (83.8%)	65 (94.2%)
Only once or twice	25 (13.9%)	16 (7.0%)	7 (10.3%)	1 (1.4%)
2 or 3 times a month	5 (2.8%)	4 (1.8%)	1 (1.5%)	2 (2.9%)
About once a week	2 (1.1%)	2 (0.9%)	0 (0%)	1 (1.4%)
Several times a week	3 (1.7%)	3 (1.3%)	2 (2.9%)	0 (0%)
Missing	0 (0%)	0 (0%)	1 (1.5%)	0 (0%)
Life events				
Family lifetime (mean (SD))	1.69 (1.17)	1.11 (1.03)	1.12 (1.18)	0.65 (0.78)
Family valence (mean (SD))	-1.15 (0.44)	-1.14 (0.41)	-1.10 (0.46)	-1.07 (0.34)
Accident lifetime (mean (SD))	2.24 (1.03)	2.09 (0.97)	1.84 (1.11)	1.77 (1.10)
Accident valence (mean (SD))	-1.28 (0.32)	-1.21 (0.32)	-1.22 (0.29)	-1.19 (0.29)
Sexuality lifetime (mean (SD))	2.17 (1.20)	1.76 (1.26)	1.93 (1.30)	1.99 (1.16)
Sexuality valence (mean (SD))	-0.03 (0.39)	-0.02 (0.37)	-0.13 (0.38)	0.02 (0.34)
Autonomy lifetime (mean (SD))	4.31 (1.33)	4.37 (1.35)	4.22 (1.35)	4.16 (1.35)
Autonomy valence (mean (SD))	0.97 (0.34)	0.97 (0.35)	0.99 (0.37)	0.99 (0.33)
Deviance lifetime (mean (SD))	0.90 (0.64)	0.72 (0.62)	0.68 (0.68)	0.57 (0.65)
Deviance valence (mean (SD))	-1.09 (0.50)	-0.99 (0.51)	-0.95 (0.56)	-0.97 (0.44)
Relocation lifetime (mean (SD))	1.45 (1.06)	1.48 (0.95)	1.15 (1.11)	1.10 (0.96)
Relocation valence (mean (SD))	-0.44 (0.60)	-0.37 (0.50)	-0.40 (0.53)	-0.43 (0.50)
Distress lifetime (mean (SD))	1.90 (1.13)	1.41 (1.12)	1.94 (1.17)	1.30 (0.96)
Distress valence (mean (SD))	0.108 (0.44)	0.15 (0.44)	0.23 (0.45)	0.19 (0.34)
Other lifetime (mean (SD))	1.06 (0.77)	0.99 (0.82)	0.94 (0.91)	0.84 (0.78)
Other valence (mean (SD))	-1.13 (0.40)	-1.12 (0.34)	-1.05 (0.37)	-1.03 (0.30)
Pubertal Development Scale				
Mean (SD)	2.69 (0.44)	2.59 (0.44)	2.71 (0.42)	2.61 (0.45)
NEO-FFI				
Neuroticism (mean (SD))	24.6 (6.71)	21.9 (6.78)	23.9 (8.27)	20.5 (7.00)
Extraversion (mean (SD))	30.0 (5.67)	30.5 (4.97)	30.8 (5.79)	31.0 (5.56)
Openness (mean (SD))	27.3 (5.54)	26.3 (5.69)	26.9 (5.59)	24.6 (5.71)

	Training depression (n=180)	Training control	Test depression (n=68)	Test control (n=69)
Agreeableness (mean (SD))	28.6 (5.78)	(n=227) 30.1 (4.80)	29.2 (5.16)	30.2 (4.44)
Conscientiousness (mean	, ,	, ,	,	, ,
(SD))	27.3 (6.55)	28.3 (5.95)	27.1 (7.51)	29.1 (6.20)
SURPS				
Anxiety sensitivity (mean (SD))	2.28 (0.44)	2.24 (0.44)	2.39 (0.49)	2.10 (0.46)
Negative thinking (mean (SD))	1.85 (0.39)	1.79 (0.33)	1.89 (0.37)	1.74 (0.34)
Impulsivity (mean (SD))	2.42 (0.43)	2.34 (0.38)	2.59 (0.42)	2.32 (0.43)
Sensation seeking (mean (SD))	2.75 (0.55)	2.76 (0.52)	2.81 (0.57)	2.79 (0.51)
Smoking (lifetime)				
0	125 (69.4%)	185 (81.5%)	43 (63.2%)	44 (63.8%)
1-2	24 (13.3%)	19 (8.4%)	6 (8.8%)	11 (15.9%)
3-5	12 (6.7%)	9 (4.0%)	4 (5.9%)	5 (7.2%)
6-9	3 (1.7%)	3 (1.3%)	3 (4.4%)	0 (0%)
10-19	4 (2.2%)	2 (0.9%)	4 (5.9%)	4 (5.8%)
20-39	3 (1.7%)	4 (1.8%)	1 (1.5%)	2 (2.9%)
40+	9 (5.0%)	5 (2.2%)	7 (10.3%)	3 (4.3%)
FTND total				
Mean (SD)	0.03 (0.25)	0.01 (0.13)	0.12 (0.56)	0.00 (0.00)
Cannabis (lifetime)				
0	165 (91.7%)	215 (94.7%)	62 (91.2%)	64 (92.8%)
1-2	7 (3.9%)	10 (4.4%)	1 (1.5%)	3 (4.3%)
3-5	3 (1.7%)	1 (0.4%)	3 (4.4%)	2 (2.9%)
6-9	0 (0%)	1 (0.4%)	0 (0%)	0 (0%)
10-19	5 (2.8%)	0 (0%)	0 (0%)	0 (0%)
20-39	0 (0%)	0 (0%)	0 (0%)	0 (0%)
40+	0 (0%)	0 (0%)	1 (1.5%)	0 (0%)
Missing	0 (0%)	0 (0%)	1 (1.5%)	0 (0%)
AUDIT question 1				
Never	67 (37.2%)	102 (44.9%)	30 (44.1%)	34 (49.3%)
Monthly or less	85 (47.2%)	91 (40.1%)	28 (41.2%)	30 (43.5%)
Two to four times a month	24 (13.3%)	32 (14.1%)	8 (11.8%)	5 (7.2%)
Two to three times a week	3 (1.7%)	2 (0.9%)	1 (1.5%)	0 (0%)
Four or more times a week	1 (0.6%)	0 (0%)	0 (0%)	0 (0%)
Missing	0 (0%)	0 (0%)	1 (1.5%)	0 (0%)
Brain structure (mean (SD))				

	Training depression (n=180)	Training control (n=227)	Test depression (n=68)	Test control (n=69)
ICV	1510000 (151000)	1540000 (137000)	1520000 (155000)	1560000 (122000)
Hippocampus	4330 (377)	4370 (386)	4400 (445)	4420 (383)
Amygdala	1760 (220)	1790 (229)	1770 (249)	1760 (207)
Thalamus	7410 (708)	7540 (695)	7690 (736)	7600 (637)
Nucleus accumbens	778 (107)	795 (102)	810 (119)	798 (108)
Pallidum	1690 (225)	1690 (205)	1690 (229)	1670 (193)
Putamen	6570 (709)	6600 (593)	6440 (647)	6560 (705)
Caudate	4080 (506)	4130 (455)	4160 (514)	4120 (413)
Ventricles	4930 (2180)	5130 (2630)	4870 (2080)	4950 (2390)
Banks of the superior temporal sulcus surface area	1030 (144)	1070 (141)	1040 (147)	1060 (138)
Caudal anterior cingulate surface area	729 (132)	742 (123)	726 (133)	741 (98.9)
Caudal middle frontal surface area	2280 (361)	2380 (360)	2290 (357)	2430 (314)
Cuneus surface area	1530 (202)	1550 (184)	1510 (195)	1530 (178)
Entorhinal surface area	354 (67.9)	370 (76.0)	359 (63.1)	362 (60.5)
Fusiform surface area	3330 (416)	3410 (377)	3260 (427)	3390 (377)
Inferior parietal surface area	5160 (663)	5370 (619)	5250 (737)	5380 (589)
Inferior temporal surface area	3300 (481)	3340 (426)	3220 (538)	3310 (372)
Isthmuscingulate surface area	976 (147)	1010 (172)	1020 (172)	1010 (151)
Lateral occipital surface area	4810 (569)	4940 (591)	4760 (684)	4850 (559)
Lateral orbitofrontal surface area	2590 (310)	2620 (320)	2570 (334)	2630 (289)
Lingual surface area	3140 (358)	3230 (380)	3150 (439)	3170 (353)
Medial orbitofrontal surface area	1790 (228)	1810 (206)	1790 (223)	1840 (199)
Middle temporal surface area	3360 (409)	3420 (406)	3280 (466)	3370 (383)
Parahippocampal surface area	704 (91.5)	731 (91.3)	711 (83.3)	721 (83.7)
Paracentral surface area	1460 (175)	1510 (179)	1480 (173)	1510 (196)
Pars opercularis surface area	1610 (218)	1640 (219)	1600 (215)	1630 (224)
Pars orbitalis surface area	730 (90.1)	736 (87.5)	717 (96.8)	719 (83.1)
Pars triangularis surface area	1460 (212)	1490 (211)	1430 (194)	1490 (190)
Pericalcarine surface area	1450 (213)	1440 (234)	1420 (260)	1440 (211)
Postcentral surface area	4170 (458)	4320 (474)	4280 (530)	4310 (414)
Posterior cingulate surface area	1210 (169)	1240 (162)	1220 (169)	1230 (130)
Precentral surface area	4850 (530)	4960 (510)	4870 (481)	5020 (537)

	Training depression (n=180)	Training control (n=227)	Test depression (n=68)	Test control (n=69)
Precuneus surface area	3970 (495)	4110 (491)	4060 (541)	4140 (446)
Rostral anterior cingulate surface area	742 (136)	771 (128)	754 (138)	781 (111)
Rostral middle frontal surface area	5920 (852)	6130 (825)	5750 (829)	6070 (801)
Superior frontal surface area	7220 (845)	7470 (801)	7310 (862)	7500 (866)
Superior parietal surface area	5570 (631)	5710 (591)	5680 (709)	5670 (576)
Superior temporal surface area	3800 (426)	3890 (452)	3720 (404)	3840 (376)
Supramarginal surface area	3900 (520)	4090 (537)	4010 (600)	4040 (512)
Frontal pole surface area	264 (33.5)	271 (35.0)	267 (31.8)	268 (37.7)
Temporal pole surface area	450 (52.2)	459 (53.6)	440 (67.5)	452 (48.6)
Transversetemporal surface area	409 (59.1)	421 (64.4)	408 (61.7)	412 (58.0)
Insula surface area	2060 (230)	2090 (220)	2050 (216)	2090 (177)
Bank of the superior temporal sulcus thickness	2.72 (0.18)	2.74 (0.17)	2.77 (0.19)	2.80 (0.18)
Caudal anterior cingulate thickness	2.89 (0.24)	2.87 (0.25)	2.95 (0.25)	2.92 (0.22)
Caudal middle frontal thickness	2.64 (0.18)	2.64 (0.18)	2.64 (0.18)	2.68 (0.13)
Cuneus thickness	2.04 (0.14)	2.04 (0.15)	2.06 (0.16)	2.04 (0.11)
Entorhinal thickness	3.50 (0.37)	3.44 (0.36)	3.42 (0.39)	3.46 (0.37)
Fusiform thickness	2.90 (0.15)	2.90 (0.16)	2.85 (0.17)	2.87 (0.18)
Inferior parietal thickness	2.62 (0.15)	2.65 (0.14)	2.66 (0.14)	2.70 (0.14)
Inferior temporal thickness	2.94 (0.23)	2.92 (0.21)	2.82 (0.23)	2.86 (0.24)
Isthmuscingulate thickness	2.79 (0.19)	2.80 (0.19)	2.80 (0.22)	2.81 (0.20)
Lateral occipital thickness	2.34 (0.12)	2.36 (0.13)	2.37 (0.13)	2.37 (0.12)
Lateral orbitofrontal thickness	2.85 (0.17)	2.87 (0.19)	2.80 (0.22)	2.85 (0.18)
Lingual thickness	2.25 (0.12)	2.27 (0.12)	2.27 (0.11)	2.27 (0.12)
Medial orbitofrontal thickness	2.67 (0.19)	2.68 (0.19)	2.64 (0.20)	2.64 (0.16)
Middle temporal thickness	3.04 (0.20)	3.03 (0.20)	2.97 (0.21)	3.01 (0.21)
Parahippocampal thickness	2.99 (0.29)	2.94 (0.27)	2.96 (0.28)	2.93 (0.29)
Paracentral thickness	2.53 (0.17)	2.57 (0.16)	2.60 (0.18)	2.64 (0.16)
Pars opercularis thickness	2.75 (0.16)	2.78 (0.17)	2.79 (0.15)	2.82 (0.14)
Pars orbitalis thickness	2.97 (0.24)	2.94 (0.23)	2.87 (0.24)	2.86 (0.22)
Pars triangularis thickness	2.62 (0.18)	2.65 (0.16)	2.63 (0.18)	2.66 (0.14)
Pericalcarine thickness	1.70 (0.13)	1.71 (0.15)	1.74 (0.15)	1.72 (0.11)
Postcentral thickness	2.13 (0.14)	2.17 (0.13)	2.18 (0.13)	2.22 (0.13)
Posterior cingulate thickness	2.79 (0.17)	2.80 (0.15)	2.85 (0.18)	2.84 (0.14)
Precentral thickness	2.62 (0.15)	2.63 (0.15)	2.63 (0.16)	2.68 (0.14)

	Training depression (n=180)	Training control (n=227)	Test depression (n=68)	Test control (n=69)
Precuneus thickness	2.56 (0.14)	2.60 (0.14)	2.61 (0.15)	2.66 (0.14)
Rostral anterior cingulate thickness	3.10 (0.21)	3.10 (0.24)	3.10 (0.23)	3.12 (0.21)
Rostral middle frontal thickness	2.49 (0.16)	2.49 (0.16)	2.45 (0.16)	2.47 (0.13)
Superior frontal thickness	2.92 (0.16)	2.92 (0.17)	2.90 (0.15)	2.95 (0.14)
Superior parietal thickness	2.26 (0.15)	2.30 (0.15)	2.31 (0.15)	2.35 (0.14)
Superior temporal thickness	3.00 (0.19)	3.01 (0.17)	3.00 (0.21)	3.03 (0.18)
Supramarginal thickness	2.73 (0.15)	2.74 (0.16)	2.77 (0.16)	2.82 (0.14)
Frontal pole thickness	3.09 (0.31)	3.08 (0.31)	2.97 (0.33)	3.01 (0.27)
Temporal pole thickness	3.62 (0.35)	3.58 (0.35)	3.55 (0.42)	3.67 (0.33)
Transversetemporal thickness	2.66 (0.24)	2.65 (0.20)	2.63 (0.19)	2.67 (0.21)
Insula thickness	3.29 (0.13)	3.30 (0.152)	3.29 (0.13)	3.33 (0.15)

AUDIT: alcohol use disorders identification test, DAWBA: development and well-being assessment, FTND: Fagerstrom test for nicotine dependence, ICV: intracranial volume, MDD: major depressive disorder, N: sample size, NEO-FFI: neuroticism-extraversion-openness five-factor inventory, SD: standard deviation, SDQ: strengths and difficulties questionnaire, SURPS: substance use risk profile scale, WISC-IV: Wechsler intelligence scale for children – fourth edition.

S4 Supplemental Table S4. Demographics risky alcohol use

	Healthy control (N=134)	Risky alcohol use (N=134)
Age		
Mean (SD)	14.4 (0.40)	14.4 (0.34)
Sex		
Female	66 (49.3%)	55 (41.0%)
Male	68 (50.7%)	79 (59.0%)
Site		
Berlin	8 (6.0%)	12 (9.0%)
Dresden	31 (23.1%)	7 (5.2%)
Dublin	8 (6.0%)	21 (15.7%)
Hamburg	27 (20.1%)	19 (14.2%)
London	18 (13.4%)	16 (11.9%)
Mannheim	15 (11.2%)	11 (8.2%)
Nottingham	12 (9.0%)	37 (27.6%)
Paris	15 (11.2%)	11 (8.2%)
Depression score at BL (DAWBA)		
Mean (SD)	0.455 (0.66)	1.82 (2.91)

References

- 1. American Psychiatric Association (2013): *Diagnostic and statistical manual of mental disorders (5th ed.).*, 5th ed. Washington, DC: Author.
- 2. Goodman R (2001): Psychometric properties of the strengths and difficulties questionnaire. *J Am Acad Child Adolesc Psychiatry*. 40: 1337–1345.
- 3. Kaufman AS, Flanagan DP, Alfonso VC, Mascolo JT (2006): Test Review: Wechsler Intelligence Scale for Children, Fourth Edition (WISC-IV). *J Psychoeduc Assess*. 24: 278–295.
- 4. Sahakian BJ, Owen AM (1992): Computerized assessment in neuropsychiatry using CANTAB: Discussion paper. *J R Soc Med.* 85: 399–402.
- 5. MacLeod C, Mathews A, Tata P (1986): Attentional Bias in Emotional Disorders. *J Abnorm Psychol.* 95: 15–20.
- 6. Costa Jr P, McCrae R (1992): Revised NEO Personality Inventory (NEO-PI-R) and NEO Five-Factor Inventory (NEO-FFI) Professional Manual. Odessa: FI: PAR.
- Woicik PA, Stewart SH, Pihl RO, Conrod PJ (2009): The substance use risk profile scale: A scale
 measuring traits linked to reinforcement-specific substance use profiles. *Addict Behav*. 34:
 1042–1055.
- 8. Newcomb MD, Huba GJ, Bentler PM (1981): A multidimensional assessment of stressful life events among adolescents: derivation and correlates. *J Health Soc Behav*. 22: 400–415.
- 9. Olweus D (1996): Revised Olweus Bully/Victim Questionnaire. Br J Educ Psychol. .
- Saunders JB, Aasland OG, Babor TF, De La Fuente JR, Grant M (1993): Development of the Alcohol Use Disorders Identification Test (AUDIT): WHO Collaborative Project on Early Detection of Persons with Harmful Alcohol Consumption-II. *Addiction*. 88: 791–804.
- 11. Hibell B, Andersson B, Bjarnason T, Kokkevi A, Morgan M, Narusk A, Ahlström S (1997): The 1995 ESPAD report. Alcohol and other drug use among students in 26 European countries.
- 12. Heatherton, TF, Kozlowski LT FK (1991): The Fagerstrom test for nicotine dependece. *Br J Addict*.
- 13. Petersen AC, Crockett L, Richards M, Boxer A (1988): A self-report measure of pubertal status: Reliability, validity, and initial norms. *J Youth Adolesc.* 17: 117–133.
- 14. Schumann G, Loth E, Banaschewski T, Barbot A, Barker G, Büchel C, *et al.* (2010): The IMAGEN study: reinforcement-related behaviour in normal brain function and psychopathology. *Mol Psychiatry*. 15: 1128–1139.
- 15. Dale AM, Fischl B, Sereno MI (1999): Cortical surface-based analysis. I. Segmentation and surface reconstruction. *Neuroimage*. 9: 179–194.
- Desikan RS, Ségonne F, Fischl B, Quinn BT, Dickerson BC, Blacker D, et al. (2006): An automated labeling system for subdividing the human cerebral cortex on MRI scans into gyral based regions of interest. *Neuroimage*. 31: 968–980.
- 17. Fischl B, Salat DH, Busa E, Albert M, Dieterich M, Haselgrove C, *et al.* (2002): Whole brain segmentation: Automated labeling of neuroanatomical structures in the human brain. *Neuron.* 33: 341–355.
- 18. Barnes J, Ridgway GR, Bartlett J, Henley SMD, Lehmann M, Hobbs N, *et al.* (2010): Head size, age and gender adjustment in MRI studies: A necessary nuisance? *Neuroimage*. 53: 1244–1255.