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## TWIN-10: Protocol for a 10-year longitudinal twin study of the neuroscience of mental wellbeing and resilience

Journal:	<i>BMJ Open</i>
Manuscript ID	bmjopen-2021-058918
Article Type:	Protocol
Date Submitted by the Author:	02-Nov-2021
Complete List of Authors:	Park, Haeme; Neuroscience Research Australia, Williams, Leanne ; Stanford University, Turner, Robin ; University of Otago Dunedin School of Medicine, Biostatistics Gatt, Justine; Neuroscience Research Australia,
Keywords:	MENTAL HEALTH, Adult psychiatry < PSYCHIATRY, Magnetic resonance imaging < RADIOLOGY & IMAGING

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Manuscripts

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3 **TWIN-10: Protocol for a 10-year longitudinal twin study of the neuroscience of mental**  
4 **wellbeing and resilience**  
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27 Abstract word count: 300  
28

29 Manuscript word count: 4627/4000  
30

31 Figures: 2  
32

33 Tables: 4  
34

35 Supplementary Material Files: 1  
36

37 References: 70  
38  
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## Abstract

**Introduction.** Mental wellbeing is a core component of mental health, and resilience is a key process of positive adaptive recovery following adversity. However, we lack an understanding of the neural mechanisms that contribute to individual variation in the trajectories of wellbeing and resilience relative to risk. Genetic and/or environmental factors may also modulate these mechanisms. The aim of the TWIN-10 study is to characterise the trajectories of wellbeing and resilience over 12 years across 4 time-points (baseline, 1-year, 10-years, 12-years) in 1669 Australian adult twins. To this end, we integrate data across genetics, environment, psychological self-report, neurocognitive performance and brain function measures of wellbeing and resilience.

**Methods and analysis.** Twins who took part in the baseline TWIN-E study will be invited back to participate in the TWIN-10 study, at 10- and 12-years follow-up timepoints. Participants will complete an online battery of psychological self-reports, computerised behavioural assessments of neurocognitive functions, and magnetic resonance imaging testing of brain structure and function during resting and task-evoked scans. These measures will be used as predictors of the risk versus resilience trajectory groups defined by their changing levels of wellbeing and illness symptoms over time as a function of trauma exposure. Structural equation models will be used to examine the association between the predictors and trajectory groups of resilience and risk over time. Univariate and multivariate twin modelling will be used to determine heritability of the measures, as well as the shared versus unique genetic and environmental contributions.

**Ethics and dissemination.** This study was approved by the University of New South Wales Human Research Ethics Committee (HC180403) and the Scientific Management Panel of Neuroscience Research Australia Imaging (CX2019-05). Results will be disseminated to the public via social, print, and broadcast media, as well as through publications and presentations to the public and the academic community.

### Strengths and Limitations of this study

- The TWIN-10 longitudinal twin study will identify resilience versus risk trajectories of mental health and illness over four time-points in adults.
- The outcomes will identify predictive biomarkers of resilience and wellbeing that span psychological, cognitive and neuroimaging measures over time.
- By using a twin design, we will test for the explicit impact of genetics and environmental factors within and between measures.
- An important consideration of the study is participant retention, which may prove challenging over the entire project duration.
- As the sample population includes only European ancestry Australians to minimise genetic stratification effects, generalisations of the study outcomes may be specific to Caucasian adults.

## Introduction

While it is now widely accepted that mental health is more than the mere absence of mental illness, there is still a large gap in understanding the neural and behavioural mechanisms that contribute to optimal mental wellbeing. Wellbeing consists of two subcomponents: subjective wellbeing, which relates to happiness and life satisfaction (Diener et al., 1999); and psychological wellbeing, which relates to having a purpose in life and setting goals (Ryff & Singer, 2008). It has been shown that both components uniquely contribute to total (or composite) wellbeing, and achieving a flourishing state of wellbeing requires high levels of both (Gatt et al., 2014; Henderson & Knight, 2012). Previous studies have shown associations between high wellbeing and improved quality of life and happiness (Bartels, 2015), healthy aging and increased lifespan (Steptoe et al., 2015), as well as decreased risk for illness and death (Keyes, 2007), indicating the importance of identifying the underlying factors that promote mental wellbeing. Yet, mental health research has mostly targeted identifying factors and biomarkers that contribute to risk for psychopathology, such as anxiety and depression, rather than those that contribute to optimal psychological functioning, highlighting the need for further studies that focus on maximising wellbeing and developing resilience in the face of adversity.

Resilience is defined as a dynamic process encompassing both a swift recovery from adversity and trauma and the ability to maintain optimal levels of wellbeing after exposure (Alexander & Gatt, 2019). In light of recent events, such as the global pandemic, fostering resiliency to adverse events has become particularly pertinent. However, there is still a significant gap in knowledge regarding the possible psychological and neurobiological mechanisms that underlie mental wellbeing and resilience. In terms of wellbeing, functional magnetic resonance imaging (fMRI) studies have started to identify regions of interest including increased functional activity in the amygdala, striatum, ventral anterior cingulate cortex, dorsolateral prefrontal cortex, and parieto-temporal regions in response to emotionally salient information (Cunningham & Kirkland, 2013; Heller et al., 2013; Ren et al., 2019; Van Reekum et al., 2007), as well as between wellbeing measures and resting-state fMRI metrics such as regional homogeneity (Kong et al., 2015, 2016) and functional connectivity (Luo et al., 2016; Shi et al., 2018). In terms of resilience, previous neuroimaging studies have reported structural changes in the amygdala, anterior cingulate cortex, prefrontal cortex, and the hippocampus

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3 as possible markers (e.g., van der Werff et al., 2013), while fMRI outcomes implicate activation  
4 differences in regions such as the ventral prefrontal cortex, insula, and the anterior cingulate cortex  
5 that are involved in emotion regulation and attentional control (Rodman et al., 2019; Waugh et al.,  
6 2008), and dynamic connectivity changes within the default mode network during a cognitive oddball  
7 task as a function of trait resilience (Miyagi et al., 2020). Interestingly, neural circuits that underlie  
8 emotion functioning show some overlap between mental illness (e.g., anxiety and depression) and  
9 wellbeing. For example, fMRI studies in clinical patients show decreased prefrontal cortex (PFC)  
10 activation during emotion regulation, as well as increased activation in the amygdala in response to  
11 fearful stimuli (e.g., Picó-Pérez et al., 2017), while in resilient individuals, the opposite pattern has  
12 been reported (i.e., increased PFC during regulation and decreased/inhibited amygdala in response to  
13 aversive stimuli; Chen et al., 2018; New et al., 2009). However, despite a wealth of clinical studies  
14 examining underlying circuits subserving other cognitive processes such as executive function and  
15 reward processing in patients, similar research lines in resilient individuals is only starting to develop.

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31 There is also a lack of synthesis thus far on the neural signatures of wellbeing and resilience  
32 in existing studies, largely driven by the substantial heterogeneity in defining the two constructs.  
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34 Studies examining wellbeing often focus on *either* subjective *or* psychological wellbeing, despite  
35 theoretical frameworks suggesting that *both* contribute to overall mental health, and a composite  
36 measure is a better indicator of optimal psychological functioning (Henderson & Knight, 2012).  
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38 Research on resilience operationalise the construct usually in one of three ways: 1) as the absence of  
39 psychopathology following trauma or adversity; 2) as a personality trait (e.g., self-esteem and positive  
40 affect); or 3) as a dynamic process by which an individual positively adapts to an environment in the  
41 face of adversity (Fletcher & Sarkar, 2013). The variation in studies using disparate definitions has  
42 hampered the integration of findings across populations, experimental paradigms (e.g., task vs. resting  
43 state), and research modalities (e.g., behavioural vs. neuroimaging). In particular, resilience studies  
44 often utilise targeted populations, such as military cohorts and firefighters, and/or those who do not  
45 develop post-traumatic stress disorder after trauma (e.g., Elliott et al., 2015; Reynaud et al., 2013;  
46 Sekiguchi et al., 2015; Snijders et al., 2018), which especially limit the generalisability of their  
47 findings.

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3 Within the context of neural correlates, changes in the brain that are related to wellbeing and  
4 resilience are unlikely to happen in isolation. In other words, the association between neural networks,  
5 mental wellbeing and resilience is likely to impact the dynamic interactions between genetic and  
6 environmental influences, whereby heritable factors affecting brain structure and function are likely to  
7 form the bases on which environmental effects unfold over time to determine the level of resilience.  
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9 By utilising a twin design, we are able to establish the genetic features from those that result from  
10 exposure to life events (environment). As monozygotic (MZ) twins share 100% of their genes  
11 compared to dizygotic (DZ) twins with 50% shared genetics, we can deduce increased similarity in  
12 MZ twins to have a heritable basis, while increased similarity in DZ twins may be attributed to shared  
13 *environment* (e.g., parenting style, education). Using a multivariate modelling approach, we can  
14 deduce the variations in these gene-environment effects on risk versus resilience, and how they  
15 modulate neural structure and function. Previous studies have shown that genetics and environment  
16 play a role in wellbeing and resilience with heritability estimates ranging from 36% - 48% for  
17 wellbeing (Bartels, 2015; Gatt et al., 2014) and from 35% - 64% for resilience (Hansson et al., 2008).  
18 This suggests that environmental factors also play a large role in determining one's level of wellbeing  
19 and resilience, spanning adverse effects (e.g., a stress response from trauma) to protective buffers  
20 (e.g., secure and caring parenting, enriching environment) (Alexander & Gatt, 2019). However, the  
21 potential moderating effects of such factors have not yet been examined in the context of risk versus  
22 resilience, and how they determine individual differences.  
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43 Understanding the processes by which individuals develop resilience during their lifespan  
44 requires longitudinal data that allow tracking of one's mental health trajectory over a time period.  
45 Most of the current literature focuses on cross-sectional results of resilience, due to time and budget  
46 constraints associated with longitudinal data collection. Although such studies provide valuable  
47 insight into the associations between variables of interest, there is an inherent inability to derive  
48 resilient profiles as this requires ongoing observations of response to adversity over time as well as  
49 the directional impact on neural mechanisms, which can be addressed by adopting a longitudinal  
50 design. By observing risk and resilient profile trajectories over time in a sample of participants who  
51 were all healthy at baseline, and with no history of psychiatric illness, we can identify the unique  
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3 neural and behavioural markers that correspond to these trajectories, and build a novel  
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5 multidimensional profile of risk and resilience.  
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7         The purpose of the current TWIN-10 study is to identify the resilience versus risk neural  
8 profiles of mental health and illness in an adult twin sample over a 10-year and 12-year period (Time  
9 3 and 4). This is a cohort study, following up 1669 healthy twins previously tested between 2009 and  
10 2012 at baseline (Time 1) and then again at 1-year follow-up (Time 2) between 2010 and 2013 (the  
11 TWIN-E sample; Gatt et al., 2012). From the TWIN-E study, we were able to create the COMPAS-W  
12 Wellbeing Scale (Gatt et al., 2014). This 26-item scale measures composite (i.e., both subjective and  
13 psychological) wellbeing as well as six subcomponents that include Composure, Own-worth,  
14 Mastery, Positivity, Achievement, and Satisfaction. This scale has shown strong internal reliability,  
15 test-retest reliability over 12 months, and construct validity with other health-related indicators in  
16 adults aged 18 to 61 years (Gatt et al., 2014). It has also been validated for use in adolescents aged 12  
17 to 16 years, and across four countries including Australia, Canada, China and New Zealand (Gatt et  
18 al., 2020). Using this scale, we have established several unique biomarkers that correlate with  
19 wellbeing at baseline. For instance, in terms of psychological and physical health indicators, we have  
20 shown that higher wellbeing is associated with low depression and anxiety scores (Routledge et al.,  
21 2016), as well as higher levels of sleep and exercise, increased intake of fruit/vegetables, and better  
22 work performance (Gatt et al., 2014), and more approach-focused forms of coping strategies (Cheng  
23 et al., 2021). In terms of cognitive functioning, we found associations between higher wellbeing and  
24 superior cognitive functioning related to sustained attention, inhibition, cognitive flexibility, and  
25 working memory, while depression and anxiety symptoms were negatively associated with cognitive  
26 functioning (Routledge et al., 2017). We also observed faster behavioural response times to happy  
27 faces in individuals with high wellbeing, while those with higher depression and anxiety symptoms  
28 displayed slower reaction times (Routledge et al., 2018). On a neural level, we reported associations  
29 between higher wellbeing and an electroencephalography resting-state profile of high alpha and delta  
30 and low beta (ABD) power (Chilver et al., 2020), a reduced pons grey matter volume localised to the  
31 locus coeruleus (Gatt et al., 2018), increased fMRI functional activity in the right inferior frontal  
32 gyrus in response to happy faces during an emotional faces task (Park et al., 2021), and decreased  
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3 insula activation during a sustained attention continuous performance task (Montalto et al., under  
4 review). Finally, in terms of genetics, we confirmed a polygenic score of wellbeing to be predictive of  
5 COMPAS-W scores, and derived nine sub-threshold candidate genes from a genome-wide association  
6 study (GWAS) analysis of the COMPAS-W scores (Jamshidi et al., 2020).  
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11 As our sample consisted of twin participants, we utilised twin modelling methods to  
12 determine heritability estimates of: 1) total COMPAS-W wellbeing (48%, with  $h^2$  ranging from 24% -  
13 43% for the six subscales; Gatt et al., 2014); 2) cognitive and emotional functioning (ranging from  
14 19% - 55% for cognitive processes and 23% - 37% for emotion processes; Routledge et al., 2017,  
15 2018); 3) EEG frequency bands (ranging from 54% - 91% for the alpha, beta, theta, and delta bands,  
16 and 37% for the ABD interaction; Chilver et al., 2020); 4) pons structural volume (at 20%; Gatt et al.,  
17 2018); and 5) functional MRI activation (20% in the inferior frontal gyrus in response to happy  
18 emotional faces, and 15% - 18% in bilateral insula during sustained attention; Montalto et al., under  
19 review; Park et al., 2021). Finally, using multivariate twin modelling we have been able to confirm  
20 the role of shared genetics and environmental factors in each of the phenotypic associations. For  
21 instance, we found evidence to suggest that the links between wellbeing and variables including EEG  
22 resting state (ABD interaction; Chilver et al., 2020), depression and anxiety symptoms (Routledge et  
23 al., 2016) and cognitive inhibition (Routledge et al., 2017) were mostly genetically driven, whereas  
24 the links between wellbeing and variables including emotion-related neural activity (Park et al., 2021)  
25 and pons volume (Gatt et al., 2018) were mostly environmentally driven. Together, these results  
26 identify for the first time how genetics versus life experience can modulate the links between neural  
27 markers and wellbeing. However, as all of these associations were determined at baseline, the relative  
28 direction of influence cannot be ascertained. With longitudinal data, we will be able to more clearly  
29 delineate how changes in biomarkers at one time point influence wellbeing at later time points (and  
30 vice versa), and how our genetics and environmental exposures including stress, trauma and positive  
31 life experiences may modulate these pathways over time.  
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55 The TWIN-10 longitudinal study of mental wellbeing and resilience is a continuation of  
56 TWIN-E, and aims to evaluate long-term changes in neurocognitive, neuroimaging, and psychosocial  
57 factors, and their impact on wellbeing and resilience over the 10 to 12-year period. The aims of the  
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3 current study are three-fold: (1) to categorise individuals showing risk vs resilient profiles in terms of  
4 non-linear changes in mental health outcomes in response to adversity over time; (2) to track the  
5 longitudinal changes in neurocognitive performance, and the structural and functional changes in the  
6 brain using MRI that correspond to these trajectory profiles; and (3) to unravel the relative  
7 contribution of genetics and environmental factors in modulating these shared neurocognitive and  
8 neural networks supporting risk versus resilience using twin design models (MZ versus DZ).  
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## 18 **Methods and analysis**

### 19 *Participants*

20 Participant recruitment was conducted by Twins Research Australia (TRA), which is an Australian  
21 national register of twin volunteers interested in participating in research studies. TRA was  
22 responsible for recruiting the initial TWIN-E sample of twins, which resulted in 1669 twins  
23 completing at least one component of the original study. Inclusion criteria for the original TWIN-E  
24 study in 2009 included being a twin (either monozygotic or dizygotic), aged between 18-65 years,  
25 having English as primary language, and being of European ancestry (in order to avoid population  
26 stratification effects in genetic analyses). Exclusion criteria consisted of either currently having or  
27 having a history of psychiatric/neurological/genetic disorders, brain injury, other medical conditions  
28 (e.g., cancer, heart disease, hepatitis), substance abuse (e.g., drug, alcohol), and sensory impairments  
29 (e.g., hearing, hand movement, vision).  
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43 For the current TWIN-10 study, TRA approached the initial 1669 participants who completed  
44 Time 1 measurements for TWIN-E. From this approach, we received contact details for 920  
45 participants who agreed to participate in TWIN-10. This included 173 participants who were eligible  
46 for the MRI component. Online data collection for Time 3 (June 2019 – December 2020) resulted in  
47 517 participants completing all three sections of the component (Qualtrics, WebNeuro, and  
48 CANTAB) and a further 86 participants who completed at least one of the sections. Out of the 173  
49 participants invited for the MRI component, 121 agreed to participate, which began in March 2020  
50 and is still ongoing with delays due to COVID-19. Time 4 of TWIN-10 started in August of 2021,  
51 which is a two-year follow-up of Time 3, and consists of inviting Time 3 participants to again return  
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3 to complete an online testing component consisting of questionnaires and WebNeuro. Only those who  
4 completed at least one section of the Time 3 online component are invited back for Time 4 (target n =  
5 603).  
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### 11 *Study design*

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13 TWIN-10 is a longitudinal follow-up study of the TWIN-E cohort, which began ten years prior in  
14 2009 as a multisite study of 1669 healthy same-sex 18-65-year-old monozygotic (MZ) and dizygotic  
15 (DZ) Australian twins. TWIN-E included two time-points, baseline (Time 1) and a one-year follow-up  
16 (Time 2) (see Gatt et al., 2012). Briefly, Time 1 consisted of three separate components conducted  
17 between 2009 and 2012: (a) an online assessment of psychological measures and neurocognitive tasks  
18 delivered via WebQ and WebNeuro completed remotely and across Australia as well as collection of  
19 saliva samples for DNA genotyping (n=1669); (b) an electroencephalography (EEG) session in  
20 Sydney and Adelaide labs, which included EEG measurements during resting state tasks, followed by  
21 event-related potential (ERP) recordings during six emotion and cognitive tasks (n=441); and (c) a  
22 magnetic resonance imaging (MRI) session in the Sydney Westmead lab, which consisted of four  
23 tasks, a structural scan, and a diffusion-weighted scan (n=270). Time 2 was the longitudinal  
24 component of TWIN-E, and consisted of repeating the WebQ and WebNeuro online measures 12  
25 months after their initial completion. This took place between 2010 and 2013. Of the 1669  
26 participants who completed baseline, 1347 participants completed the time 2 measures (i.e., 81%  
27 retention). Time 2 also consisted of a separate optional randomised-control trial of cognitive brain  
28 training for a subset of participants (n = 352) who had completed both Time 1 and 2 measurements,  
29 which took place between 2010 and 2013 (Routledge et al., 2021).  
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49 Recruitment and data collection for TWIN-10 began in 2019. It consists of two further time-  
50 points of data collection which includes online psychological and neurocognitive tasks, and MRI-  
51 subset components (Time 3), and a two-year online-only follow-up (Time 4). Time 3 includes two  
52 separate components: (a) an online testing component, including psychological measures presented  
53 via Qualtrics and two sets of neurocognitive tasks using WebNeuro and CANTAB test batteries; and  
54 (b) an MRI component, consisting of five functional tasks, a resting state scan, and a diffusion-  
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3 weighted scan. Recruitment by TRA began in June 2019, targeting the 1669 participants who  
4 completed at least the Time 1 online component (TWIN-E). A subsample of 270 participants who  
5 completed the MRI at Time 1 were further invited to participate in the MRI session for TWIN-10.  
6  
7 Data collection for the online component took place between June 2019 and December 2020. MRI  
8 testing began in March 2020 and remains to be completed in late 2021, accounting for multiple pauses  
9 in testing due to COVID-19. For Time 4, those who have completed at least the online component at  
10 Time 3 will be invited back for another online component follow-up, which will consist of  
11 questionnaires via Qualtrics, and neurocognitive tasks via WebNeuro only. This is due to begin in the  
12 second half of 2021 and will extend into 2022 for completion. In total, this will result in the collection  
13 of psychometric measures and neurocognitive task data for four timepoints (Times 1 and 2 during  
14 TWIN-E, and Times 3 and 4 during TWIN-10; see Fig. 1).  
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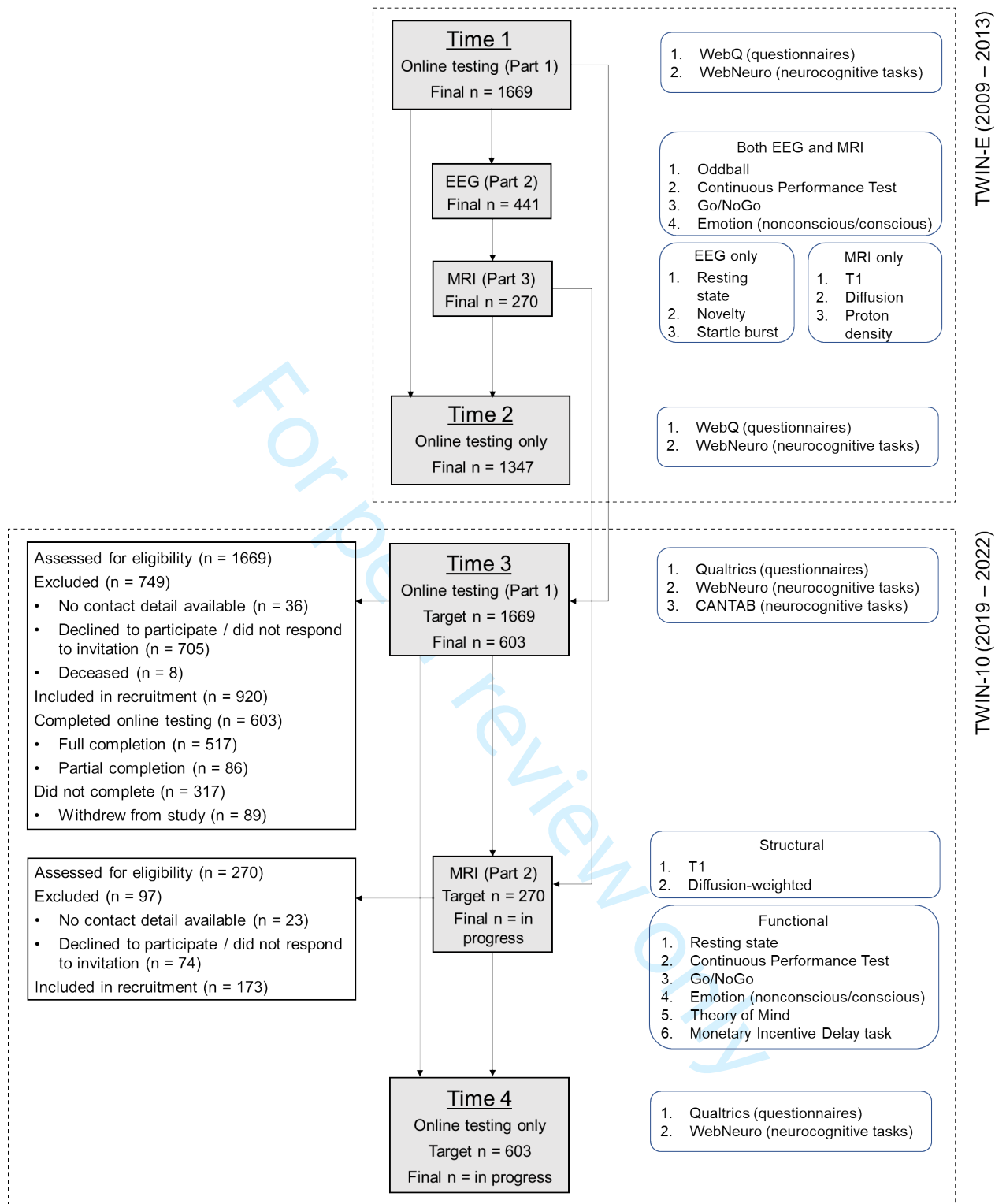


Figure 1. The TWIN project flowchart consisting of the baseline TWIN-E study (completed) and the current TWIN-10 study (ongoing).

**Measurements and procedures**

*Questionnaire and neurocognitive assessments (Times 3 and 4)*

For the online testing component of Time 3, participants were required to complete a set of self-report questionnaires on Qualtrics, as well as two sets of neurocognitive tasks (WebNeuro and CANTAB) on their own personal computers. Personalised links to access all three parts were sent to each participant individually to ensure that the data saved from each link was for that particular participant. In total, this component took around 1.5 to 2.5 hours to complete, with instructions to take short breaks between each part. Online assessments will be repeated at Time 4, which will include a subset of questionnaires used at Time 3 (see Table 1) as well as the WebNeuro neurocognitive tasks (see Table 2).

*Qualtrics.* Self-report questionnaires were administered online via Qualtrics, and included a battery of measures assessing five domains (general health, emotional healthy, emotion, personality, and environmental factors; see Table 1).

Table 1

*List of questionnaires included in the online testing component (TWIN-E: Times 1 and 2; TWIN-10: Times 3 and 4).*

Domain	Questionnaire	Measured at Time 1	Measured at Time 2	Measured at Time 3	Measured at Time 4
General health, lifestyle and work performance	Demographics questionnaire	x	x	x	x
	Lifestyle, nutrition, social activities, and sleep (Gatt et al., 2012)	x	x	x	x
	Medical history (Gatt et al., 2012)	x	x	x	x
	Health and Work Performance Questionnaire (HPQ; Kessler et al., 2003)	x	x	x	x
Mental health and wellbeing	The Somatic and Psychological Health Report (SPHERE; Couvy-Duchesne et al., 2017)	x	x	x	-
	Alcohol Use Disorders Identification Test (AUDIT; (Saunders et al., 1993)	-	-	x	- <sup>a</sup>

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4		COMPAS-W Wellbeing Scale	x	x	x
5		(Gatt et al., 2014)			x
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7		Abbreviated World Health	x	x	x
8		Organization Quality of Life			x
9		(WHOQOL-Bref; Harper et			
10		al., 1998)			
11					
12		Satisfaction With Life Scale	x	x	x
13		(SWLF; Diener et al., 1985)			x
14					
15		Depression Anxiety and Stress	x	x	x
16		Scale (DASS-42; (Lovibond &			x
17		Lovibond, 1995)			
18					
19		PTSD checklist for DSM-5	-	-	x
20		(PCL-5; Blevins et al., 2015)			x
21					
22	Resilience	Resilience Research Centre	-	-	x
23		Adult Resilience Measure			x
24		(RRC-ARM; (Liebenberg &			
25		Moore, 2018))			
26					
27		Ego-Resilience Scale (ER89;	-	x	-
28		Block & Kremen, 1996)			-
29					
30	Emotion regulation	Self-Compassion Scale –	-	-	x
31		Short Form (SCS-SF; (Raes et			-
32		al., 2011)			
33		Emotion Regulation	x	x	x
34		Questionnaire (ERQ; Gross &			x
35		John, 2003)			
36					
37		Toronto Alexithymia Scale	-	-	x
38		(TAS-20; Leising et al., 2009)			-
39					
40	Mood and coping	Internal Control Index (ICI;	x	x	-
41		Duttweiler, 1984)			-
42					
43		Brain Resource Inventory of	x	x	-
44		Social Cognitions (BRISC;			-
45		Gordon et al., 2008)			
46					
47		Modified Differential	-	x	x
48		Emotions Scale (mDES;			x
49		Fredrickson et al., 2003)			
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	Abbreviated Coping Orientation to Problems Experienced Inventory (Brief-COPE; Carver, 1997)	-	-	x	x
Personality	NEO Five-Factor Inventory (NEO-FFI; McCrae & Costa, 2004)	x	x	x	x
	Short Oxford-Liverpool Inventory of Life and Experiences (sO-LIFE; Mason et al., 2005)	-	-	x	-
	Temperament and Character Inventory (TCI; Cloninger et al., 1994)	-	-	x	-
	Highly Sensitive Person scale (HSP; Aron & Aron, 1997)	-	-	x	-
	Vividness of Visual Imagery Questionnaire (VVIQ; Marks, 1989)	-	-	x	-
	Mindful Attention Awareness Scale (MAAS; Brown & Ryan, 2003)	-	-	-	x
Environmental Factors	Daily life events questionnaire, including COVID-19 specific items (Gatt et al., 2012; See Table S1 for a list of items)	-	x	x	x
	Early Life Stress Questionnaire (ELSQ; Mcfarlane et al., 2005)	x	-	-	-
	Measure of Parental Style (MOPS; Parker et al., 1997)	x	-	-	-

*Note.* <sup>a</sup> Alcohol usage related questions were incorporated into the Lifestyle, nutrition, social activities, and sleep measure at Time 4.

*WebNeuro.* Participants were tested on their emotional and cognitive processes via WebNeuro, which is an online testing platform that provides a standardised battery of neurocognitive tasks that can be completed remotely on a personal computer at the participant's pace (see Table 2). Reliability and

construct validity metrics have been established (Silverstein et al., 2007), and the norms are provided by WebNeuro. This task was repeated across all time-points.

Table 2

*List of WebNeuro emotion and cognitive processing tasks included in TWIN-10 (Times 1 - 4).*

Domain	Sub-domain	Task	Dependent measure
Emotion	Emotion identification	Explicit emotion identification	Reaction time for each emotion <sup>a</sup> Accuracy for each emotion <sup>a</sup>
	Emotion recognition	Implicit emotion recognition	Reaction time for each emotion <sup>a</sup> Accuracy for recognition of previously seen face
Thinking	Response speed	Motor tapping	Number of taps Variability of pause between taps
		Choice reaction time	Average response time Variability of response times
	Impulsivity	Go-NoGo	Reaction time False negative/positive errors Accuracy
	Sustained attention and concentration	Continuous performance test	Reaction time False negative/positive errors Accuracy
		Switching of attention	Completion time Errors
	Information processing efficiency	Verbal interference (Stroop task)	Total number of correct 'colour' responses Total number of incorrect 'word' responses
		Memory	Digit span
Memory recognition	Number of words remembered Number of intrusions (incorrect words selected) Learning rate		
Executive function	Maze	Total errors Overrun errors Completion time Total trials	

*Note.* <sup>a</sup> Emotion stimuli include facial expressions of anger, happiness, fear, sadness, disgust and neutral.

*CANTAB*. The Cambridge Neuropsychological Test Automated Battery (*CANTAB*) also provides measures of neuropsychological functioning via an online testing platform, and shows good reliability and validity (Barnett et al., 2010; Matos Gonçalves et al., 2018). Norms are provided by *CANTAB*. This is a new addition to the longitudinal study at Time 3, and contains eight tasks that test information processing, memory, and social cognition domains (see Table 3).

Table 3

*List of CANTAB emotion and cognitive processing tasks included in TWIN-10 (Time 3 only).*

Domain	Sub-domain	Task	Dependent measure
Emotion	Social cognition	Emotion bias tasks:	Response count for each emotion <sup>a</sup>
		1. Happy – Angry	Mean reaction time for each emotion <sup>a</sup>
		2. Happy – Sad	Bias point (proportion of trials where ‘Happy’ is chosen over ‘Angry’ or ‘Sad’)
Information processing	Decision making, risk taking	Cambridge gambling task	Reaction time Decision making quality Delay aversion Sensitivity to risk
	Executive function	One touch stockings of Cambridge	Number of choices Total latency Errors
	Attention	Intra-extra dimensional set shift	Total trials completed Total latency Errors
Memory	Visual memory	Paired associates learning	First attempt memory score Errors
	Retention and manipulation of visual information	Spatial working memory	Number of strategies used Errors
	Attention and recognition	Delayed matching to sample	Accuracy Probability of error given

*Note.* <sup>a</sup> Emotion stimuli included facial expressions of happiness and anger for the Happy – Angry condition, or happiness and sadness for the Happy – Sad condition.

### *Magnetic Resonance Imaging measures (Time 3)*

MRI images were acquired using a 3T Philips Ingenia CX scanner (Philips Healthcare, Best, the Netherlands) with a 32-channel head coil at the NeuRA Imaging centre at Neuroscience Research Australia, Randwick Australia. The MRI session included the acquisition of a T1-weighted structural scan using a 3D Turbo Field Echo (TFE) sequence, a twice-refocused diffusion-weighted scan, and six sets of T2\*-weighted echo-planar images (EPI) for a resting-state scan and five functional tasks (see Table 4), which took around 75 minutes in the scanner. Blip up and blip down scans were also collected to correct for any magnetic field inhomogeneities for the diffusion and functional scans. Prior to the scanning session, each participant completed a practice session outside the scanner, which included detailed instructions regarding the structural and functional components of the session, and a practice run for two of the five functional tasks (Monetary Incentive Delay and Continuous Performance Test) on a laptop. Each participant was reimbursed \$100 for their travel costs to NeuRA. Duty of Care reports will be prepared and checked by the MRI radiographer and a radiologist in case of significant incidental findings.

Table 4

*List of structural and functional MRI tasks included in TWIN-E (Time 1) and TWIN-10 (Time 3) sessions).*

Domain	Type	Scan protocol <sup>a</sup>	Description/Task	Time 1	Time 3
Structural	T1	TR = 7.2 ms; TE = 3.4 ms; FOV = 240 mm; flip angle = 8 degrees; 190 sagittal slices; voxel size = 1 × 1 × 1 mm; scanning time = 3 min 7 secs	Grey/white matter volume, cortical thickness, cortical surface area.	x	x
	Diffusion	TR = 8300 ms; TE = 78 ms; multiband acceleration factor = 2; SENSE = 2.5; FOV = 240 mm; flip angle = 90 degrees; 58 transverse slices; voxel size = 2.5 × 2.5 × 2.5 mm; 61 directions with <i>b</i> values of 0 and 2400; scanning time = 8 min 53 secs	White matter diffusivity measures (e.g., fibre density, cross-section, density and cross-section).	x	x

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4	Functional	Resting state	TR = 1000 ms; TE = 30 ms; multiband acceleration factor = 4; SENSE = 2; FOV = 230 mm; flip angle = 62 degrees; 68 transverse slices; voxel size = 2.4 × 2.4 × 2.4 mm; 330 volumes; scanning time = 5 min 35 secs	Functional connectivity measures (e.g., seed-to-voxel, voxel-to-voxel, independent components analysis).	- x
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14		Continuous	TR = 2000 ms; TE = 30 ms; multiband acceleration factor = 2; SENSE = 3; FOV = 230 mm; flip angle = 75 degrees; 68 transverse slices; voxel size = 2.4 × 2.4 × 2.4 mm; 157 volumes; scanning time = 5 min 22 secs	120 stimuli are presented (letters: B, C, D, or G) for 200 ms each (ISI = 2300 ms). 80 of the letters are in yellow, with 60 to be held in working memory (no consecutive repetition) while 20 are 1-back sustained attention stimuli (same yellow letter is repeated consecutively). 40 of the letters are in white, providing a perceptual baseline.	x x
15		Performance Test (CPT)			
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31		Go-NoGo	See CPT protocol.	180 Go stimuli (word 'PRESS' in green) and NoGo stimuli (word 'PRESS' in red) are presented for 500 ms each (ISI = 750 ms).	x x
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39		Monetary	See CPT protocol; 307 volumes; scanning time = 10 min 22 secs	60 trials consisting of a cue-target structure are presented. Cue options include 'win money', 'win nothing', 'lose money', and 'lose nothing', and are presented for 2000 ms (ISI = 4000 ms – target duration). Target duration was variable and was determined by a staircase procedure.	- x
40		Incentive Delay task			
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52		Theory of Mind	See CPT protocol; 196 volumes; scanning time = 6 min 40 secs	Ten video clips showing shapes either mentally interacting with each other or randomly moving are presented for 20 secs (IBI = 15 secs).	- x
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Emotion (masked 'nonconscious', then unmasked 'conscious')	See CPT protocol.	240 images of emotional face expressions (happy, angry, sad, disgust, fear, neutral) are presented in a block-design (5 blocks per emotion with each block containing 8 images of the same emotion) for: 'nonconscious' = 16 ms each replaced by a neutral face for 150 ms (ISI = 1084 ms); 'conscious' = 500 ms each (ISI = 750 ms).	x	x
Oddball	Time 1 only; see Gatt et al., 2012 for protocol.	20 target (1000 Hz) and 100 nontarget (50 Hz) tones presented consecutively for 50 ms at 75 db (ISI = 2.4 secs).	x	-

*Note.* <sup>a</sup> Scan protocol listed here is for TWIN-10 (Time 3) only; please see Gatt et al., 2012 for the TWIN-E (Time 1) scanning protocol. ISI = inter-stimulus interval; IBI = inter-block interval.

### Data analysis

Questionnaire data from Qualtrics will be exported as .csv files for data preprocessing in *R*. This will include checking for missing or dummy responses, correct coding of responses, and data imputation for missing data. All questionnaires will be collated into one master database that will include measurements collected earlier at Times 1 and 2, matched by participant ID number. For MRI data, DICOM files from the scanner will be exported and converted into NIfTI files and uploaded onto a secure server hosted by NeuRA.

The primary outcome measures will be the COMPAS-W Wellbeing Scale and measures of illness symptoms (e.g., DASS). In order to map resilience vs risk trajectories, we will consider the presence of previous trauma exposure in participants to delineate those who may be more resilient (i.e., high levels of wellbeing despite trauma exposure) from those who are less resilient (i.e., low levels of wellbeing), as compared to 'control' participants who report no trauma exposure, while controlling for illness symptoms using the DASS. A parallel analysis will be conducted using DASS score change as the outcome variable, controlling for wellbeing. This will enable a dual-outcome approach and help consolidate understanding of risk vs resilience profiles using both illness symptoms

and wellbeing outcomes. The risk vs resilience trajectories over time will be identified using structural equation modelling, per the hypothesised trajectories displayed in Figure 2. These hypothesised trajectories of wellbeing change were adapted from prototypical patterns of disrupted functioning normally observed in individuals following trauma, as discussed by Bonanno (2004, see Figure 1). Using these profiles, predictors of response will then be examined using linear mixed models and structural equation modelling of the different predictors over time. The predictors may include, for example, measures of emotion regulation, personality, and neuropsychological performance (WebNeuro and CANTAB). Potential moderators will include factors such as resiliency resources and coping strategies. We will covary for twin-pair correlation, as well as other relevant covariates such as age, sex, and zygosity. Software packages for these analyses will include linear mixed models in *R* or SPSS, and structural equation modelling using the *lavaan* package in *R*, the PROCESS macro in SPSS, or the AMOS package in SPSS.

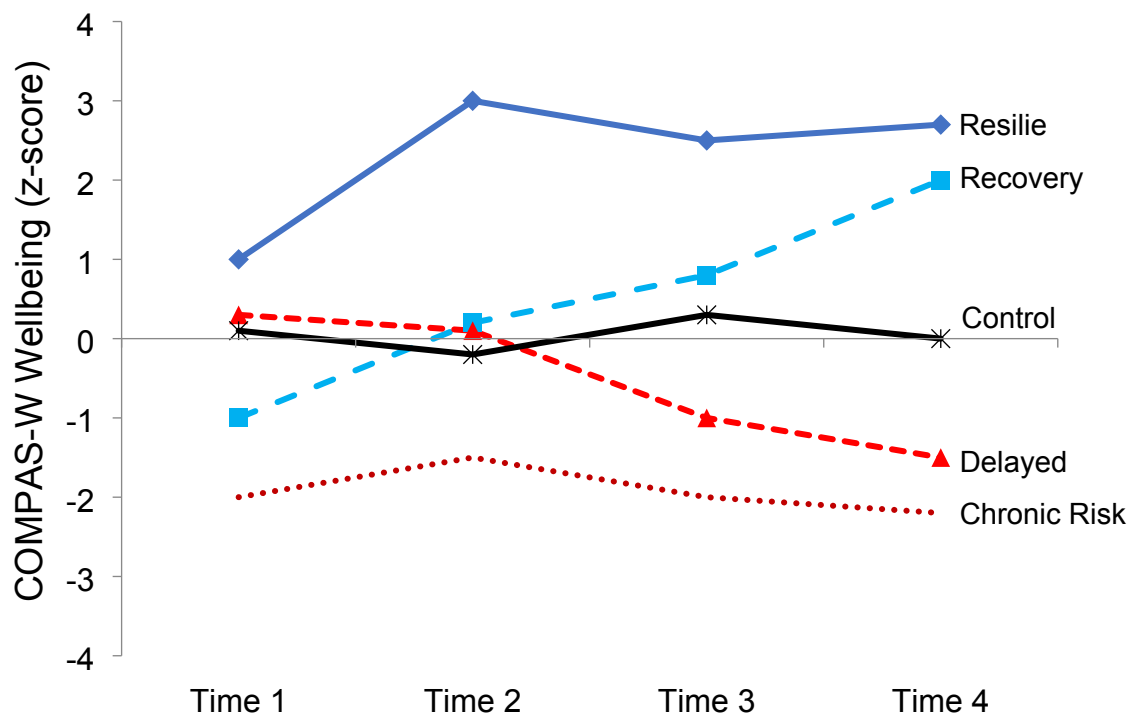


Figure 2. Predicted trajectories of risk vs resilience across the four time-point measurements. In participants with previous trauma exposure, increasing levels of wellbeing (indexed by COMPAS-W) will indicate resilience or recovery (and differentiated by baseline wellbeing levels), while decreasing wellbeing over time may lead to delayed or chronic risk for mental illness. Control participants

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3 (without any trauma exposure) are expected to maintain their wellbeing levels over time. Figure  
4 adapted from Bonanno, 2004.  
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9 MRI analyses investigating corresponding changes in brain over time will be run using SPM12 for  
10 structural and functional MRI data, MRTrix3 for diffusion-weighted data, and R/SPSS for statistical  
11 analyses. For cross-sectional functional MRI analyses, we will use both whole-brain and regions-of-  
12 interest approaches to link task-related brain activity to neuropsychological data using a mass  
13 univariate approach, and also utilise multivariate independent component analysis (ICA) and  
14 functional connectivity methods for task and resting-state data. Similarly, both univariate (voxel-  
15 based morphometry) and multivariate (source-based morphometry) approaches will be used for  
16 structural data, in order to uncover anatomical correlates of neural functioning. For diffusion data, we  
17 will use the MRTrix3 toolbox for white matter analysis including fibre tractography, fixel-based  
18 analysis, and structural connectivity analysis. For longitudinal analyses, we will utilise the Sandwich  
19 Estimator Toolbox (SwE) implemented in Matlab and SPM12, which takes into account within-  
20 subject correlation observed in longitudinal data and allows for a more accurate estimation of the  
21 parameters of interest (Guillaume et al., 2014). We will also combine extracted structural and  
22 functional measures (e.g., beta estimates, brain volume, loading coefficients) with neurocognitive  
23 measures to build a more comprehensive SEM path model, and examine the relationships between  
24 brain and behaviour that ultimately give rise to risk vs resilience and variation in wellbeing scores.  
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43 Finally, heritability of measures-of-interest (both neural and neurocognitive) will be assessed  
44 using univariate ACE twin modelling (A: additive genetic variance; C: common environment; E:  
45 nonshared environment) of monozygotic and dizygotic twin pairs, while multivariate twin models  
46 (e.g., correlated factors models) will be used to look at the shared vs unique genetic and  
47 environmental correlations between measures. These twin models will be implemented using the  
48 *OpenMx* package in R. Statistical significance will be set at  $p < .05$  for all analyses, and will be  
49 corrected for multiple comparisons using Bonferroni correction for statistical data and family-wise  
50 error (FWE) for MRI data.  
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## Patient and public involvement

Participants and the general public were not involved in the design or conduct of this study as it is a longitudinal study involving repeated measurements from the 2009 baseline study.

## Discussion

The primary objective of the TWIN-10 longitudinal twin study is to identify trajectories of risk versus resilience over time, and the corresponding biomarkers that predict these trajectories. Despite the fact that over 75% of the Australian population will experience at least one major trauma in their lifetime, we do not yet fully understand the neural and behavioural factors that underlie resilience and mental wellbeing, nor the pathways in which genetic and environmental variables modulate neural circuitry to determine individual differences. Identification of such factors will be crucial in delineating the factors that ultimately lead to positive or negative mental health outcomes.

There are several strengths to the current study. By following life trajectories of a twin cohort over 10 years using structural equation modelling, we can provide robust directional evidence of neurocognitive and neuroimaging changes over time, and derive objective and observable biomarkers that may be used to calculate 'risk' for developing mental illness in individuals with previous trauma exposure in the absence of overt clinical symptoms. Additionally, by using a twin design, we can examine the extent to which neural and behavioural markers may be influenced by a person's genetic background or by environmental factors during development. The results will ultimately contribute to the development of tailored interventions that are personalised to the individual and targeting specific markers that are strongly predictive of wellbeing and resilience change.

Limitations of the current study include participant retention which is particularly difficult over such a long period of time. In order to mitigate this, the TRA keep regular records of contact details of their participating twins and so with their support, we hope to maximise our retention rates over time. Furthermore, our sampling population is limited to Australian twins with European ancestry in order to minimise the effects of genetic stratification and who are active in volunteering for research studies, which may preclude some of the findings from being generalisable across other ethnic populations, and/or singleton (i.e., non-twin) groups. Despite these limitations, the benefits of

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3 using a twin sample certainly supersede these drawbacks by providing a rich dataset to evaluate the  
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5 specificities of genetic versus environmental contributions.  
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### 9 **Ethics and dissemination**

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11 TWIN-10 was approved by the University of New South Wales Human Research Ethics Committee  
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13 (HC180403) in July 2018. Informed consent is obtained from all participants who are provided with a  
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15 detailed Participant Information Sheet containing relevant information regarding each stage of the  
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17 project. Each participant is provided with a unique participant identification code that is used for data  
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19 collection and analyses. Further ethical approval was sought and received for the MRI component of  
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21 the project by the Scientific Management Panel of Neuroscience Research Australia Imaging  
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23 (CX2019-05) in July 2019.  
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27 Results of the project will be communicated to the public through various types of media,  
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29 including social (e.g., Facebook, Twitter), print (e.g., online websites, newspapers), and broadcast  
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31 (e.g., television and radio) channels, as well as advertised on institutional websites (e.g., NeuRA,  
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33 UNSW, TRA). Findings will be published in peer-reviewed publications and presentations (including  
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35 seminars, lectures and webinars) to both the public and the academic community. All major findings  
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37 will also be summarised and made available by Twins Research Australia (e.g., via their website,  
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39 newsletter and/or email subscriptions) and emailed to participants.  
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### **Authors' contributions**

HRPP is the postdoctoral fellow on the project, and set up the online testing and MRI components of the study, drafted the first copy of the manuscript, and is currently responsible for participant recruitment and MRI data processing of the TWIN-10 project. JMG conceptualised and designed the TWIN-10 study, obtained funding from the NHMRC (1122816) as Lead Investigator, and edited the first draft of the manuscript. JMG is leading the project, and has contributed to all parts of the TWIN-10 project. LMW and RT contributed to the study design and are Co-Investigators on the NHMRC grant. All authors have read, edited, and approved the manuscript for submission.

### **Funding**

This project is supported by a National Health and Medical Research Council (NHMRC) Project Grant (1122816). JMG and HRPP are supported by the same grant. This research is facilitated through access to Twins Research Australia, a national resource supported by NHMRC Centre of Research Excellence Grant (1079102).

### **Conflict of interests**

JMG is a stockholder in MAP Biotech Pty Ltd. LMW has received advisory board fees from One Mind Psyberguide and the Laureate Institute for Brain Research unrelated to this study. HRPP and RMT declare that they have no conflicts of interest.

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# BMJ Open

## TWIN-10: Protocol for a 10-year longitudinal twin study of the neuroscience of mental wellbeing and resilience

Journal:	<i>BMJ Open</i>
Manuscript ID	bmjopen-2021-058918.R1
Article Type:	Protocol
Date Submitted by the Author:	26-May-2022
Complete List of Authors:	Park, Haeme; Neuroscience Research Australia, Williams, Leanne ; Stanford University, Turner, Robin ; University of Otago Dunedin School of Medicine, Biostatistics Gatt, Justine; Neuroscience Research Australia,
<b>Primary Subject Heading</b>:	Mental health
Secondary Subject Heading:	Mental health
Keywords:	MENTAL HEALTH, Adult psychiatry < PSYCHIATRY, Magnetic resonance imaging < RADIOLOGY & IMAGING

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Manuscripts

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3 **TWIN-10: Protocol for a 10-year longitudinal twin study of the neuroscience of mental**  
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27 Abstract word count: 297  
28

29 Manuscript word count: 4839  
30

31 Figures: 2  
32

33 Tables: 4  
34

35 References: 70  
36  
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## Abstract

**Introduction.** Mental wellbeing is a core component of mental health, and resilience is a key process of positive adaptive recovery following adversity. However, we lack an understanding of the neural mechanisms that contribute to individual variation in the trajectories of wellbeing and resilience relative to risk. Genetic and/or environmental factors may also modulate these mechanisms. The aim of the TWIN-10 study is to characterise the trajectories of wellbeing and resilience over 12 years across 4 time-points (baseline, 1-year, 10-years, 12-years) in 1669 Australian adult twins of European ancestry (to account for genetic stratification effects). To this end, we integrate data across genetics, environment, psychological self-report, neurocognitive performance and brain function measures of wellbeing and resilience.

**Methods and analysis.** Twins who took part in the baseline TWIN-E study will be invited back to participate in the TWIN-10 study, at 10- and 12-years follow-up timepoints. Participants will complete an online battery of psychological self-reports, computerised behavioural assessments of neurocognitive functions, and magnetic resonance imaging testing of brain structure and function during resting and task-evoked scans. These measures will be used as predictors of the risk versus resilience trajectory groups defined by their changing levels of wellbeing and illness symptoms over time as a function of trauma exposure. Structural equation models will be used to examine the association between the predictors and trajectory groups of resilience and risk over time. Univariate and multivariate twin modelling will be used to determine heritability of the measures, as well as the shared versus unique genetic and environmental contributions.

**Ethics and dissemination.** This study was approved by the University of New South Wales Human Research Ethics Committee (HC180403) and the Scientific Management Panel of Neuroscience Research Australia Imaging (CX2019-05). Results will be disseminated through publications and presentations to the public and the academic community.

### Strengths and Limitations of this study

- The TWIN-10 longitudinal twin study will identify resilience versus risk trajectories of mental health and mental illness over 12 years, with multi-modal assessments undertaken at four time points.
- Resilience trajectories will map individuals who increase or maintain mental wellbeing despite exposure to psychological trauma whereas risk trajectories will map individuals who have reduced levels of wellbeing following trauma exposure, each relative to individuals who report no trauma exposure.
- Our twin design provides the opportunity to explicitly disentangle the contributions of genetic and environmental factors on risk and resilience trajectories characterised by psychological scales, general and cognitive emotional function, and neuroimaging data of brain function.
- A key challenge will be the retention of participants across each time point over the life of the study.
- Because the study focuses on a national twin sample of European ancestry to minimise genetic stratification effects, generalisations of the study outcomes may be specific to Caucasian adults.



## Introduction

While it is now widely accepted that mental health is more than the mere absence of mental illness, there is still a large gap in understanding the neural and behavioural mechanisms that contribute to optimal mental wellbeing. Wellbeing consists of two subcomponents: subjective wellbeing, which relates to happiness and life satisfaction (1); and psychological wellbeing, which relates to having a purpose in life and setting goals (2). It has been shown that both components uniquely contribute to total (or composite) wellbeing, and achieving a flourishing state of wellbeing requires high levels of both (3,4). Previous studies have shown associations between high wellbeing and improved quality of life and happiness (5), healthy aging and increased lifespan (6), as well as decreased risk for illness and death (7), indicating the importance of identifying the underlying factors that promote mental wellbeing. Yet, mental health research has mostly targeted identifying factors and biomarkers that contribute to risk for psychopathology, such as anxiety and depression, rather than those that contribute to optimal psychological functioning, highlighting the need for further studies that focus on maximising wellbeing and developing resilience in the face of adversity.

Resilience is defined as a dynamic process encompassing both a swift recovery from adversity and trauma and the ability to maintain optimal levels of wellbeing after exposure (8). In light of recent events, such as the global pandemic, fostering resiliency to adverse events has become particularly pertinent. However, there is still a significant gap in knowledge regarding the possible psychological and neurobiological mechanisms that underlie mental wellbeing and resilience. In terms of wellbeing, functional magnetic resonance imaging (fMRI) studies have started to identify regions of interest including increased functional activity in the amygdala, striatum, ventral anterior cingulate cortex, dorsolateral prefrontal cortex, and parieto-temporal regions in response to emotionally salient information (9–12), as well as between wellbeing measures and resting-state fMRI metrics such as regional homogeneity (13,14) and functional connectivity (15,16). In terms of resilience, previous neuroimaging studies have reported structural changes in the amygdala, anterior cingulate cortex, prefrontal cortex, and the hippocampus as possible markers (17), while fMRI outcomes implicate activation differences in regions such as the ventral prefrontal cortex, insula, and the anterior cingulate cortex that are involved in emotion regulation and attentional control (18,19), and dynamic

connectivity changes within the default mode network during a cognitive oddball task as a function of trait resilience (20). Interestingly, neural circuits that underlie emotion functioning show some overlap between mental illness (e.g., anxiety and depression) and wellbeing. For example, fMRI studies in clinical patients show decreased prefrontal cortex (PFC) activation during emotion regulation, as well as increased activation in the amygdala in response to fearful stimuli (21), while in resilient individuals, the opposite pattern has been reported (i.e., increased PFC during regulation and decreased/inhibited amygdala in response to aversive stimuli (22,23)). However, despite a wealth of clinical studies examining underlying circuits subserving other cognitive processes such as executive function and reward processing in patients, similar research lines in resilient individuals is only starting to develop.

There is also a lack of synthesis thus far on the neural signatures of wellbeing and resilience in existing studies, largely driven by the substantial heterogeneity in defining the two constructs. Studies examining wellbeing often focus on *either* subjective *or* psychological wellbeing, despite theoretical frameworks suggesting that *both* contribute to overall mental health, and a composite measure is a better indicator of optimal psychological functioning (4). Research on resilience operationalise the construct usually in one of three ways: 1) as the absence of psychopathology following trauma or adversity; 2) as a personality trait (e.g., self-esteem and positive affect); or 3) as a dynamic process by which an individual positively adapts to an environment in the face of adversity (24). The variation in studies using disparate definitions has hampered the integration of findings across populations, experimental paradigms (e.g., task vs. resting state), and research modalities (e.g., behavioural vs. neuroimaging). In particular, resilience studies often utilise targeted populations, such as military cohorts and firefighters, and/or those who do not develop post-traumatic stress disorder after trauma (25–28), which especially limit the generalisability of their findings.

Within the context of neural correlates, changes in the brain that are related to wellbeing and resilience are unlikely to happen in isolation. In other words, the association between neural networks, mental wellbeing and resilience is likely to impact the dynamic interactions between genetic and environmental influences, whereby heritable factors affecting brain structure and function are likely to form the bases on which environmental effects unfold over time to determine the level of resilience.

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3 By utilising a twin design, we are able to establish the genetic features from those that result from  
4 exposure to life events (environment). As monozygotic (MZ) twins share 100% of their genes  
5 compared to dizygotic (DZ) twins with 50% shared genetics, we can deduce increased similarity in  
6 MZ twins to have a heritable basis, while increased similarity in DZ twins may be attributed to shared  
7 *environment* (e.g., parenting style, education). Using a multivariate modelling approach, we can  
8 deduce the variations in these gene-environment effects on risk versus resilience, and how they  
9 modulate neural structure and function. Previous studies have shown that genetics and environment  
10 play a role in wellbeing and resilience with heritability estimates ranging from 36% - 48% for  
11 wellbeing (3,5) and from 35% - 64% for resilience (29). This suggests that environmental factors also  
12 play a large role in determining one's level of wellbeing and resilience, spanning adverse effects (e.g.,  
13 a stress response from trauma) to protective buffers (e.g., secure and caring parenting, enriching  
14 environment) (8). However, the potential moderating effects of such factors have not yet been  
15 examined in the context of risk versus resilience, and how they determine individual differences.

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31 Understanding the processes by which individuals develop resilience during their lifespan  
32 requires longitudinal data that allow tracking of one's mental health trajectory over a time period.  
33 Most of the current literature focuses on cross-sectional results of resilience, due to time and budget  
34 constraints associated with longitudinal data collection. Although such studies provide valuable  
35 insight into the associations between variables of interest, there is an inherent inability to derive  
36 resilient profiles as this requires ongoing observations of response to adversity over time as well as  
37 the directional impact on neural mechanisms, which can be addressed by adopting a longitudinal  
38 design. By observing risk and resilient profile trajectories over time in a sample of participants who  
39 were all healthy at baseline, and with no history of psychiatric illness, we can identify the unique  
40 neural and behavioural markers that correspond to these trajectories, and build a novel  
41 multidimensional profile of risk and resilience.

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54 The purpose of the current TWIN-10 study is to identify the resilience versus risk neural  
55 profiles of mental health and illness in an adult twin sample over a 10-year and 12-year period (Time  
56 3 and 4). This is a cohort study, following up 1669 healthy twins previously tested between 2009 and  
57 2012 at baseline (Time 1) and then again at 1-year follow-up (Time 2) between 2010 and 2013 (the  
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3 TWIN-E sample (30)). From the TWIN-E study, we were able to create the COMPAS-W Wellbeing  
4 Scale (3). This 26-item scale measures composite (i.e., both subjective and psychological) wellbeing  
5 as well as six subcomponents that include Composure, Own-worth, Mastery, Positivity, Achievement,  
6 and Satisfaction. This scale has shown strong internal reliability, test-retest reliability over 12 months,  
7 and construct validity with other health-related indicators in adults aged 18 to 61 years (3). It has also  
8 been validated for use in adolescents aged 12 to 16 years, and across four countries including  
9 Australia, Canada, China and New Zealand (31). Using this scale, we have established several unique  
10 biomarkers that correlate with wellbeing at baseline. For instance, in terms of psychological and  
11 physical health indicators, we have shown that higher wellbeing is associated with low depression and  
12 anxiety scores (32), as well as higher levels of sleep and exercise, increased intake of fruit/vegetables,  
13 and better work performance (3), and more approach-focused forms of coping strategies (33). In terms  
14 of cognitive functioning, we found associations between higher wellbeing and superior cognitive  
15 functioning related to sustained attention, inhibition, cognitive flexibility, and working memory, while  
16 depression and anxiety symptoms were negatively associated with cognitive functioning (34). We also  
17 observed faster behavioural response times to happy faces in individuals with high wellbeing, while  
18 those with higher depression and anxiety symptoms displayed slower reaction times (35). On a neural  
19 level, we reported associations between higher wellbeing and an electroencephalography resting-state  
20 profile of high alpha and delta and low beta (ABD) power (36), a reduced pons grey matter volume  
21 localised to the locus coeruleus (37), increased fMRI functional activity in the right inferior frontal  
22 gyrus in response to happy faces during an emotional faces task (38), and decreased insula activation  
23 during a sustained attention continuous performance task (39). Finally, in terms of genetics, we  
24 confirmed a polygenic score of wellbeing to be predictive of COMPAS-W scores, and derived nine  
25 sub-threshold candidate genes from a genome-wide association study (GWAS) analysis of the  
26 COMPAS-W scores (40).

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54 As our sample consisted of twin participants, we utilised twin modelling methods to  
55 determine heritability estimates of: 1) total COMPAS-W wellbeing (48%, with  $h^2$  ranging from 24% -  
56 43% for the six subscales; (3)); 2) cognitive and emotional functioning (ranging from 19% - 55% for  
57 cognitive processes and 23% - 37% for emotion processes; (34,35)); 3) EEG frequency bands  
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(ranging from 54% - 91% for the alpha, beta, theta, and delta bands, and 37% for the ABD interaction; (36)); 4) pons structural volume (at 20%; (37)); and 5) functional MRI activation (20% in the inferior frontal gyrus in response to happy emotional faces, and 15% - 18% in bilateral insula during sustained attention; (38,39)). Finally, using multivariate twin modelling we have been able to confirm the role of shared genetics and environmental factors in each of the phenotypic associations. For instance, we found evidence to suggest that the links between wellbeing and variables including EEG resting state (ABD interaction; (36)) depression and anxiety symptoms (32) and cognitive inhibition (34) were mostly genetically driven, whereas the links between wellbeing and variables including emotion-related neural activity (38) and pons volume (37) were mostly environmentally driven. Together, these results identify for the first time how genetics versus life experience can modulate the links between neural markers and wellbeing. However, as all of these associations were determined at baseline, the relative direction of influence cannot be ascertained. With longitudinal data, we will be able to more clearly delineate how changes in biomarkers at one time point influence wellbeing at later time points (and vice versa), and how our genetics and environmental exposures including stress, trauma and positive life experiences may modulate these pathways over time.

The TWIN-10 longitudinal study of mental wellbeing and resilience is a continuation of TWIN-E, and aims to evaluate long-term changes in neurocognitive, neuroimaging, and psychosocial factors, and their impact on wellbeing and resilience over the 10 to 12-year period. The aims of the current study are three-fold: (1) to categorise individuals showing risk vs resilient profiles in terms of non-linear changes in mental health outcomes in response to adversity over time; (2) to track the longitudinal changes in neurocognitive performance, and the structural and functional changes in the brain using MRI that correspond to these trajectory profiles; and (3) to unravel the relative contribution of genetics and environmental factors in modulating these shared neurocognitive and neural networks supporting risk versus resilience using twin design models (MZ versus DZ).

## **Methods and analysis**

### *Participants*

Participant recruitment was conducted by Twins Research Australia (TRA), which is an Australian national register of twin volunteers interested in participating in research studies. TRA was responsible for recruiting the initial TWIN-E sample of twins, which resulted in 1669 twins completing at least one component of the original study. Inclusion criteria for the original TWIN-E study in 2009 included being a twin (either monozygotic or dizygotic), aged between 18-65 years, having English as primary language, and being of European ancestry (in order to avoid population stratification effects in genetic analyses). Exclusion criteria consisted of either currently having or having a history of psychiatric/neurological/genetic disorders, brain injury, other medical conditions (e.g., cancer, heart disease, hepatitis), substance abuse (e.g., drug, alcohol), and sensory impairments (e.g., hearing, hand movement, vision).

For the current TWIN-10 study, the start and planned end dates are June 2019 – December 2023. TRA approached the initial 1669 participants who completed Time 1 measurements for TWIN-E. From this approach, we received contact details for 920 participants who agreed to participate in TWIN-10. This included 173 participants who were eligible for the MRI component. Online data collection for Time 3 (June 2019 – December 2020) resulted in 517 participants completing all three sections of the component (Qualtrics, WebNeuro, and CANTAB) and a further 86 participants who completed at least one of the sections. Out of the 173 participants invited for the MRI component, 121 agreed to participate, which began in March 2020 and is still ongoing with delays due to COVID-19. Time 4 of TWIN-10 started in August of 2021, which is a two-year follow-up of Time 3, and consists of inviting Time 3 participants to again return to complete an online testing component consisting of questionnaires and WebNeuro. Only those who completed at least one section of the Time 3 online component are invited back for Time 4 (target n=603).

### *Study design*

TWIN-10 is a longitudinal follow-up study of the TWIN-E cohort, which began ten years prior in 2009 as a multisite study of 1669 healthy same-sex 18-65-year-old monozygotic (MZ) and dizygotic (DZ) Australian twins. TWIN-E included two time-points, baseline (Time 1) and a one-year follow-up (Time 2) (see (30)). Briefly, Time 1 consisted of three separate components conducted between 2009

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3 and 2012: (a) an online assessment of psychological measures and neurocognitive tasks delivered via  
4 WebQ and WebNeuro completed remotely and across Australia as well as collection of saliva samples  
5 for DNA genotyping (n=1669); (b) an electroencephalography (EEG) session in Sydney and Adelaide  
6 labs, which included EEG measurements during resting state tasks, followed by event-related  
7 potential (ERP) recordings during six emotion and cognitive tasks (n=441); and (c) a magnetic  
8 resonance imaging (MRI) session in the Sydney Westmead lab, which consisted of four tasks, a  
9 structural scan, and a diffusion-weighted scan (n=270). Time 2 was the longitudinal component of  
10 TWIN-E, and consisted of repeating the WebQ and WebNeuro online measures 12 months after their  
11 initial completion. This took place between 2010 and 2013. Of the 1669 participants who completed  
12 baseline, 1347 participants completed the time 2 measures (i.e., 81% retention). Time 2 also consisted  
13 of a separate optional randomised-control trial of cognitive brain training for a subset of participants  
14 (n = 352) who had completed both Time 1 and 2 measurements, which took place between 2010 and  
15 2013 (41).

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31 Recruitment and data collection for TWIN-10 began in 2019. It consists of two further time-  
32 points of data collection which includes online psychological and neurocognitive tasks, and MRI-  
33 subset components (Time 3), and a two-year online-only follow-up (Time 4). Time 3 includes two  
34 separate components: (a) an online testing component, including psychological measures presented  
35 via Qualtrics and two sets of neurocognitive tasks using WebNeuro and CANTAB test batteries; and  
36 (b) an MRI component, consisting of five functional tasks, a resting state scan, and a diffusion-  
37 weighted scan. Recruitment by TRA began in June 2019, targeting the 1669 participants who  
38 completed at least the Time 1 online component (TWIN-E). A subsample of 270 participants who  
39 completed the MRI at Time 1 were further invited to participate in the MRI session for TWIN-10.  
40 Data collection for the online component took place between June 2019 and December 2020. MRI  
41 testing began in March 2020 and remains to be completed in late 2021, accounting for multiple pauses  
42 in testing due to COVID-19. For Time 4, those who have completed at least the online component at  
43 Time 3 will be invited back for another online component follow-up, which will consist of  
44 questionnaires via Qualtrics, and neurocognitive tasks via WebNeuro only. This is due to begin in the  
45 second half of 2021 and will extend into the end of 2023 for completion. In total, this will result in the  
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3 collection of psychometric measures and neurocognitive task data for four timepoints (Times 1 and 2  
4 during TWIN-E, and Times 3 and 4 during TWIN-10; see Figure 1).  
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9 [Insert Fig 1 about here]  
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### 13 **Measurements and procedures**

#### 14 *Questionnaire and neurocognitive assessments (Times 3 and 4)*

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16 For the online testing component of Time 3, participants were required to complete a set of self-report  
17 questionnaires on Qualtrics, as well as two sets of neurocognitive tasks (WebNeuro and CANTAB) on  
18 their own personal computers. Personalised links to access all three parts were sent to each participant  
19 individually to ensure that the data saved from each link was for that particular participant. In total,  
20 this component took around 1.5 to 2.5 hours to complete, with instructions to take short breaks  
21 between each part. Online assessments will be repeated at Time 4, which will include a subset of  
22 questionnaires used at Time 3 (see Table 1) as well as the WebNeuro neurocognitive tasks (see Table  
23 2). Overall, being a longitudinal study, some of the questionnaires and neurocognitive assessments  
24 were repeated across all sessions as they were critical to wellbeing and resilience measurement, others  
25 were only collected at Time 1 as they did not require repeating (e.g., childhood trauma and parenting  
26 style MOPS), and some new measures were added to Times 3 and 4 in order to explore new potential  
27 correlates of wellbeing that were not considered at earlier time-points (e.g., resiliency resources, self-  
28 compassion, personality, CANTAB tasks).  
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51 *Qualtrics.* Self-report questionnaires were administered online via Qualtrics, and included a battery of  
52 measures assessing five domains (general health, emotional healthy, emotion, personality, and  
53 environmental factors; see Table 1).  
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3 *WebNeuro*. Participants were tested on their emotional and cognitive processes via WebNeuro, which  
4 is an online testing platform that provides a standardised battery of neurocognitive tasks that can be  
5 completed remotely on a personal computer at the participant's pace (see Table 2). Reliability and  
6 construct validity metrics have been established (42), and the norms are provided by WebNeuro. This  
7 task was repeated across all time-points.  
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16 [Insert Table 2 about here]  
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20 *CANTAB*. The Cambridge Neuropsychological Test Automated Battery (CANTAB) also provides  
21 measures of neuropsychological functioning via an online testing platform, and shows good reliability  
22 and validity (43,44). Norms are provided by CANTAB. This is a new addition to the longitudinal  
23 study at Time 3, and contains eight tasks that test information processing, memory, and social  
24 cognition domains (see Table 3).  
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32 [Insert Table 3 about here]  
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### 37 *Magnetic Resonance Imaging measures (Time 3)*

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39 MRI images were acquired using a 3T Philips Ingenia CX scanner (Philips Healthcare, Best, the  
40 Netherlands) with a 32-channel head coil at the NeuRA Imaging centre at Neuroscience Research  
41 Australia, Randwick Australia. The MRI session included the acquisition of a T1-weighted structural  
42 scan using a 3D Turbo Field Echo (TFE) sequence, a twice-refocused diffusion-weighted scan, and  
43 six sets of T2\*-weighted echo-planar images (EPI) for a resting-state scan and five functional tasks  
44 (see Table 4), which took around 75 minutes in the scanner. Blip up and blip down scans were also  
45 collected to correct for any magnetic field inhomogeneities for the diffusion and functional scans.  
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Prior to the scanning session, each participant completed a practice session outside the scanner, which  
included detailed instructions regarding the structural and functional components of the session, and a  
practice run for two of the five functional tasks (Monetary Incentive Delay and Continuous  
Performance Test) on a laptop. Each participant was reimbursed \$100 for their travel costs to NeuRA.

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3 Duty of Care reports will be prepared and checked by the MRI radiographer and a radiologist in case  
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5 of significant incidental findings.  
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9 [Insert Table 4 about here]  
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## 11 **Data analysis**

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13 Questionnaire data from Qualtrics will be exported as .csv files for data preprocessing in *R*. This will  
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15 include checking for missing or dummy responses, correct coding of responses, and data imputation  
16  
17 for missing data. All questionnaires will be collated into one master database that will include  
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19 measurements collected earlier at Times 1 and 2, matched by participant ID number. For MRI data,  
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21 DICOM files from the scanner will be exported and converted into NIfTI files and uploaded onto a  
22  
23 secure server hosted by NeuRA.  
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27 The primary outcome measures will be the COMPAS-W Wellbeing Scale and measures of  
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29 illness symptoms (e.g., DASS). In order to map resilience vs risk trajectories, we will consider the  
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31 presence of previous trauma exposure in participants to delineate those who may be more resilient  
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33 (i.e., showing increased or maintenance of satisfactory levels of wellbeing despite trauma exposure)  
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35 from those who are less resilient (i.e., showing reduced levels of wellbeing), as compared to ‘control’  
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37 participants who report no trauma exposure, while controlling for illness symptoms using the DASS.  
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39 In this case, we are therefore suggesting that resilience may include either an increase in wellbeing  
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41 scores or a maintenance (or non-decrease) in wellbeing scores when their baseline wellbeing score is  
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43 within satisfactory levels (i.e., moderate or flourishing ranges). However, maintenance of a  
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45 languishing wellbeing score would not be considered resilient, but rather ‘chronic risk’ (see Figure 2).  
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47 In parallel, should someone have a languishing wellbeing score at baseline but demonstrate an  
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49 increase in wellbeing over time, this would be indicative of a ‘recovery’ profile. A parallel analysis  
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51 will be conducted using DASS score change as the outcome variable, controlling for wellbeing. This  
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53 will enable a dual-outcome approach and help consolidate understanding of risk vs resilience profiles  
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55 using both illness symptoms and wellbeing outcomes. The risk vs resilience trajectories over time will  
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57 be identified using structural equation modelling, per the hypothesised trajectories displayed in Figure  
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59 2. These hypothesised trajectories of wellbeing change were adapted from prototypical patterns of  
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3 disrupted functioning normally observed in individuals following trauma, as discussed by Bonanno  
4 ((45), see Figure 2). The trajectories of trauma response will be considered for both childhood trauma  
5 (prior to Time 1) and adult trauma (10 years prior to Time 3). Using these profiles, predictors of  
6 response will then be examined using linear mixed models and structural equation modelling of the  
7 different predictors over time. The predictors may include, for example, measures of emotion  
8 regulation, personality, and neuropsychological performance (WebNeuro and CANTAB). Potential  
9 moderators will include factors such as resiliency resources and coping strategies. We will covary for  
10 twin-pair correlation, as well as other relevant covariates such as age, sex, and zygosity. Software  
11 packages for these analyses will include linear mixed models in *R* or SPSS, and structural equation  
12 modelling using the *lavaan* package in *R*, the PROCESS macro in SPSS, or the AMOS package in  
13 SPSS.  
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[Insert Fig 2 about here]

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33 MRI analyses investigating corresponding changes in brain over time will be run using SPM12 for  
34 structural and functional MRI data, MRTrix3 for diffusion-weighted data, and *R*/SPSS for statistical  
35 analyses. For cross-sectional functional MRI analyses, we will use both whole-brain and regions-of-  
36 interest approaches to link task-related brain activity to neuropsychological data using a mass  
37 univariate approach, and also utilise multivariate independent component analysis (ICA) and  
38 functional connectivity methods for task and resting-state data. Similarly, both univariate (voxel-  
39 based morphometry) and multivariate (source-based morphometry) approaches will be used for  
40 structural data, in order to uncover anatomical correlates of neural functioning. For diffusion data, we  
41 will use the MRTrix3 toolbox for white matter analysis including fibre tractography, fixel-based  
42 analysis, and structural connectivity analysis. For longitudinal analyses, we will utilise the Sandwich  
43 Estimator Toolbox (SwE) implemented in Matlab and SPM12, which takes into account within-  
44 subject correlation observed in longitudinal data and allows for a more accurate estimation of the  
45 parameters of interest (46). We will also combine extracted structural and functional measures (e.g.,  
46 beta estimates, brain volume, loading coefficients) with neurocognitive measures to build a more  
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3 comprehensive SEM path model, and examine the relationships between brain and behaviour that  
4 ultimately give rise to risk vs resilience and variation in wellbeing scores.  
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7 Finally, heritability of measures-of-interest (both neural and neurocognitive) will be assessed  
8 using univariate ACE twin modelling (A: additive genetic variance; C: common environment; E:  
9 nonshared environment) of monozygotic and dizygotic twin pairs, while multivariate twin models  
10 (e.g., correlated factors models) will be used to look at the shared vs unique genetic and  
11 environmental correlations between measures. These twin models will be implemented using the  
12 *OpenMx* package in *R*. Statistical significance will be set at  $p < .05$  for all analyses, and will be  
13 corrected for multiple comparisons using Bonferroni correction for statistical data and family-wise  
14 error (FWE) for MRI data.  
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### 26 **Patient and public involvement**

27 Participants and the general public were not involved in the design or conduct of this study as it is a  
28 longitudinal study involving repeated measurements from the 2009 baseline study.  
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### 35 **Discussion**

36 The primary objective of the TWIN-10 longitudinal twin study is to identify trajectories of risk versus  
37 resilience over time, and the corresponding biomarkers that predict these trajectories. Despite the fact  
38 that over 75% of the Australian population will experience at least one major trauma in their lifetime,  
39 we do not yet fully understand the neural and behavioural factors that underlie resilience and mental  
40 wellbeing, nor the pathways in which genetic and environmental variables modulate neural circuitry  
41 to determine individual differences. Identification of such factors will be crucial in delineating the  
42 factors that ultimately lead to positive or negative mental health outcomes.  
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51 There are several strengths to the current study. By following life trajectories of a twin cohort  
52 over 10 years using structural equation modelling, we can provide robust directional evidence of  
53 neurocognitive and neuroimaging changes over time, and derive objective and observable biomarkers  
54 that may be used to calculate 'risk' for developing mental illness in individuals with previous trauma  
55 exposure in the absence of overt clinical symptoms. Additionally, by using a twin design, we can  
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3 examine the extent to which neural and behavioural markers may be influenced by a person's genetic  
4 background or by environmental factors during development. The results will ultimately contribute to  
5 the development of tailored interventions that are personalised to the individual and targeting specific  
6 markers that are strongly predictive of wellbeing and resilience change.  
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11 Limitations of the current study include participant retention which is particularly difficult  
12 over such a long period of time. In order to mitigate this, the TRA keep regular records of contact  
13 details of their participating twins and so with their support, we hope to maximise our retention rates  
14 over time. Furthermore, our sampling population is limited to Australian twins with European  
15 ancestry in order to minimise the effects of genetic stratification and who are active in volunteering  
16 for research studies, which may preclude some of the findings from being generalisable across other  
17 ethnic populations, and/or singleton (i.e., non-twin) groups. Despite these limitations, the benefits of  
18 using a twin sample certainly supersede these drawbacks by providing a rich dataset to evaluate the  
19 specificities of genetic versus environmental contributions.  
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### 33 **Ethics and dissemination**

34 TWIN-10 was approved by the University of New South Wales Human Research Ethics Committee  
35 (HC180403) in July 2018. Informed consent is obtained from all participants who are provided with a  
36 detailed Participant Information Sheet containing relevant information regarding each stage of the  
37 project. Each participant is provided with a unique participant identification code that is used for data  
38 collection and analyses. Further ethical approval was sought and received for the MRI component of  
39 the project by the Scientific Management Panel of Neuroscience Research Australia Imaging  
40 (CX2019-05) in July 2019.  
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50 Results of the project will be communicated to the public through various types of media,  
51 including social (e.g., Facebook, Twitter), print (e.g., online websites, newspapers), and broadcast  
52 (e.g., television and radio) channels, as well as advertised on institutional websites (e.g., NeuRA,  
53 UNSW, TRA). Findings will be published in peer-reviewed publications and presentations (including  
54 seminars, lectures and webinars) to both the public and the academic community. All major findings  
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3 will also be summarised and made available by Twins Research Australia (e.g., via their website,  
4 newsletter and/or email subscriptions) and emailed to participants.  
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For peer review only

### **Authors' contributions**

HRPP is the postdoctoral fellow on the project, and set up the online testing and MRI components of the study, drafted the first copy of the manuscript, and is currently responsible for participant recruitment and MRI data processing of the TWIN-10 project. JMG conceptualised and designed the TWIN-10 study, obtained funding from the NHMRC (1122816) as Lead Investigator, and edited the first draft of the manuscript. JMG is leading the project, and has contributed to all parts of the TWIN-10 project. LMW and RT contributed to the study design and are Co-Investigators on the NHMRC grant. All authors have read, edited, and approved the manuscript for submission.

### **Funding**

This project is supported by a National Health and Medical Research Council (NHMRC) Project Grant (1122816). JMG and HRPP are supported by the same grant. This research is facilitated through access to Twins Research Australia, a national resource supported by NHMRC Centre of Research Excellence Grant (1079102).

### **Conflict of interests**

JMG is a stockholder in MAP Biotech Pty Ltd. LMW has received advisory board fees from One Mind Psyberguide and the Laureate Institute for Brain Research unrelated to this study. HRPP and RMT declare that they have no conflicts of interest.

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## Figure legends

*Figure 1.* The TWIN project flowchart consisting of the baseline TWIN-E study (completed) and the current TWIN-10 study (ongoing).

*Figure 2.* Predicted trajectories of risk vs resilience across the four time-point measurements. In participants with trauma exposure, increasing or maintaining levels of wellbeing (indexed by COMPAS-W) will indicate resilience or recovery (differentiated by baseline wellbeing levels), while decreasing wellbeing over time may lead to delayed or chronic risk for mental illness. Control participants (without any trauma exposure) are expected to maintain their wellbeing levels over time. Both childhood trauma (prior to Time 1) and adult trauma (over 10 years prior to Time 3) will be considered. Figure adapted from Bonanno, 2004.

Table 1

List of questionnaires included in the online testing component (TWIN-E: Times 1 and 2; TWIN-10: Times 3 and 4).

Domain	Questionnaire	Measured at Time 1	Measured at Time 2	Measured at Time 3	Measured at Time 4
General health, lifestyle and work performance	Demographics questionnaire	x	x	x	x
	Lifestyle, nutrition, social activities, and sleep (30)	x	x	x	x
	Medical history (30)	x	x	x	x
	Health and Work Performance Questionnaire (HPQ (47))	x	x	x	x
Mental health and wellbeing	The Somatic and Psychological Health Report (SPHERE (48))	x	x	x	-
	Alcohol Use Disorders Identification Test (AUDIT (49))	-	-	x	- <sup>a</sup>
	COMPAS-W Wellbeing Scale (3)	x	x	x	x
	Abbreviated World Health Organization Quality of Life (WHOQOL-Bref (50))	x	x	x	x
	Satisfaction With Life Scale (SWLF (51))	x	x	x	x
	Depression Anxiety and Stress Scale (DASS-42 (52))	x	x	x	x
	PTSD checklist for DSM-5 (PCL-5 (53))	-	-	x	x
Resilience	Resilience Research Centre Adult Resilience Measure (RRC-ARM (54))	-	-	x	x
	Ego-Resilience Scale (ER89 (55))	-	x	-	-
Emotion regulation	Self-Compassion Scale – Short Form (SCS-SF (56))	-	-	x	-
	Emotion Regulation Questionnaire (ERQ (57))	x	x	x	x



		Toronto Alexithymia Scale (TAS-20 (58))	-	-	x	-
	Mood and coping	Internal Control Index (ICI (59))	x	x	-	-
		Brain Resource Inventory of Social Cognitions (BRISC (60))	x	x	-	-
		Modified Differential Emotions Scale (mDES (61))	-	x	x	x
		Abbreviated Coping Orientation to Problems Experienced Inventory (Brief-COPE (62))	-	-	x	x
	Personality	NEO Five-Factor Inventory (NEO-FFI (63))	x	x	x	x
		Short Oxford-Liverpool Inventory of Life and Experiences (sO-LIFE (64))	-	-	x	-
		Temperament and Character Inventory (TCI (65))	-	-	x	-
		Highly Sensitive Person scale (HSP (66))	-	-	x	-
		Vividness of Visual Imagery Questionnaire (VVIQ (67))	-	-	x	-
		Mindful Attention Awareness Scale (MAAS (68))	-	-	-	x
	Environmental Factors	Daily life events questionnaire, including COVID-19 specific items (30)	-	x	x	x
		Early Life Stress Questionnaire (ELSQ (69))	x	-	-	-
		Measure of Parental Style (MOPS (70))	x	-	-	-

*Note.* <sup>a</sup> Alcohol usage related questions were incorporated into the Lifestyle, nutrition, social activities, and sleep measure at Time 4.

Table 2

List of WebNeuro emotion and cognitive processing tasks included in TWIN-10 (Times 1 - 4).

Domain	Sub-domain	Task	Dependent measure
Emotion	Emotion identification	Explicit emotion identification	Reaction time for each emotion <sup>a</sup> Accuracy for each emotion <sup>a</sup>
	Emotion recognition	Implicit emotion recognition	Reaction time for each emotion <sup>a</sup> Accuracy for recognition of previously seen face
Thinking	Response speed	Motor tapping	Number of taps Variability of pause between taps
		Choice reaction time	Average response time Variability of response times
	Impulsivity	Go-NoGo	Reaction time False negative/positive errors Accuracy
	Sustained attention and concentration	Continuous performance test	Reaction time False negative/positive errors Accuracy
		Switching of attention	Completion time Errors
	Information processing efficiency	Verbal interference (Stroop task)	Total number of correct 'colour' responses Total number of incorrect 'word' responses
		Memory	Digit span
Memory recognition	Number of words remembered Number of intrusions (incorrect words selected) Learning rate		
Executive function	Maze	Total errors	
		Overrun errors	
		Completion time	
		Total trials	

*Note.* <sup>a</sup> Emotion stimuli include facial expressions of anger, happiness, fear, sadness, disgust and neutral.

Table 3

List of CANTAB emotion and cognitive processing tasks included in TWIN-10 (Time 3 only).

Domain	Sub-domain	Task	Dependent measure
Emotion	Social cognition	Emotion bias tasks: 1. Happy – Angry 2. Happy – Sad	Response count for each emotion <sup>a</sup> Mean reaction time for each emotion <sup>a</sup> Bias point (proportion of trials where ‘Happy’ is chosen over ‘Angry’ or ‘Sad’)
Information processing	Decision making, risk taking	Cambridge gambling task	Reaction time Decision making quality Delay aversion Sensitivity to risk
	Executive function	One touch stockings of Cambridge	Number of choices Total latency Errors
	Attention	Intra-extra dimensional set shift	Total trials completed Total latency Errors
Memory	Visual memory	Paired associates learning	First attempt memory score Errors
	Retention and manipulation of visual information	Spatial working memory	Number of strategies used Errors
	Attention and recognition	Delayed matching to sample	Accuracy Probability of error given

Note. <sup>a</sup> Emotion stimuli included facial expressions of happiness and anger for the Happy – Angry condition, or happiness and sadness for the Happy – Sad condition.

Table 4

List of structural and functional MRI tasks included in TWIN-E (Time 1) and TWIN-10 (Time 3) sessions).

Domain	Type	Scan protocol <sup>a</sup>	Description/Task	Time 1	Time 3
Structural	T1	TR = 7.2 ms; TE = 3.4 ms; FOV = 240 mm; flip angle = 8 degrees; 190 sagittal slices; voxel size = 1 × 1 × 1 mm; scanning time = 3 min 7 secs	Grey/white matter volume, cortical thickness, cortical surface area.	x	x
	Diffusion	TR = 8300 ms; TE = 78 ms; multiband acceleration factor = 2; SENSE = 2.5; FOV = 240 mm; flip angle = 90 degrees; 58 transverse slices; voxel size = 2.5 × 2.5 × 2.5 mm; 61 directions with <i>b</i> values of 0 and 2400; scanning time = 8 min 53 secs	White matter diffusivity measures (e.g., fibre density, cross-section, density and cross-section).	x	x
Functional	Resting state	TR = 1000 ms; TE = 30 ms; multiband acceleration factor = 4; SENSE = 2; FOV = 230 mm; flip angle = 62 degrees; 68 transverse slices; voxel size = 2.4 × 2.4 × 2.4 mm; 330 volumes; scanning time = 5 min 35 secs	Functional connectivity measures (e.g., seed-to-voxel, voxel-to-voxel, independent components analysis).	-	x
	Continuous Performance Test (CPT)	TR = 2000 ms; TE = 30 ms; multiband acceleration factor = 2; SENSE = 3; FOV = 230 mm; flip angle = 75 degrees; 68 transverse slices; voxel size = 2.4 × 2.4 × 2.4 mm; 157 volumes; scanning time = 5 min 22 secs	120 stimuli are presented (letters: B, C, D, or G) for 200 ms each (ISI = 2300 ms). 80 of the letters are in yellow, with 60 to be held in working memory (no consecutive repetition) while 20 are 1-back sustained attention stimuli (same yellow letter is repeated consecutively). 40 of the letters are in white, providing a perceptual baseline.	x	x
	Go-NoGo	See CPT protocol.	180 Go stimuli (word 'PRESS' in green) and NoGo stimuli (word 'PRESS' in red) are presented for 500 ms each (ISI = 750 ms).	x	x

1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21 22 23 24 25 26 27 28 29 30 31 32 33 34 35 36 37 38 39 40 41 42 43 44	Monetary Incentive Delay task	See CPT protocol; 307 volumes; scanning time = 10 min 22 secs	60 trials consisting of a cue-target structure are presented. Cue options include 'win money', 'win nothing', 'lose money', and 'lose nothing', and are presented for 2000 ms (ISI = 4000 ms – target duration). Target duration was variable and was determined by a staircase procedure.	-	x
16 17 18 19 20 21 22 23	Theory of Mind	See CPT protocol; 196 volumes; scanning time = 6 min 40 secs	Ten video clips showing shapes either mentally interacting with each other or randomly moving are presented for 20 secs (IBI = 15 secs).	-	x
24 25 26 27 28 29 30 31 32 33 34 35 36 37 38	Emotion (masked 'nonconscious', then unmasked 'conscious')	See CPT protocol.	240 images of emotional face expressions (happy, angry, sad, disgust, fear, neutral) are presented in a block-design (5 blocks per emotion with each block containing 8 images of the same emotion) for: 'nonconscious' = 16 ms each replaced by a neutral face for 150 ms (ISI = 1084 ms); 'conscious' = 500 ms each (ISI = 750 ms).	x	x
39 40 41 42 43 44	Oddball	Time 1 only; see Gatt et al., 2012 for protocol.	20 target (1000 Hz) and 100 nontarget (50 Hz) tones presented consecutively for 50 ms at 75 db (ISI = 2.4 secs).	x	-

*Note.* <sup>a</sup> Scan protocol listed here is for TWIN-10 (Time 3) only; please see Gatt et al., 2012 for the TWIN-E (Time 1) scanning protocol. ISI = inter-stimulus interval; IBI = inter-block interval.

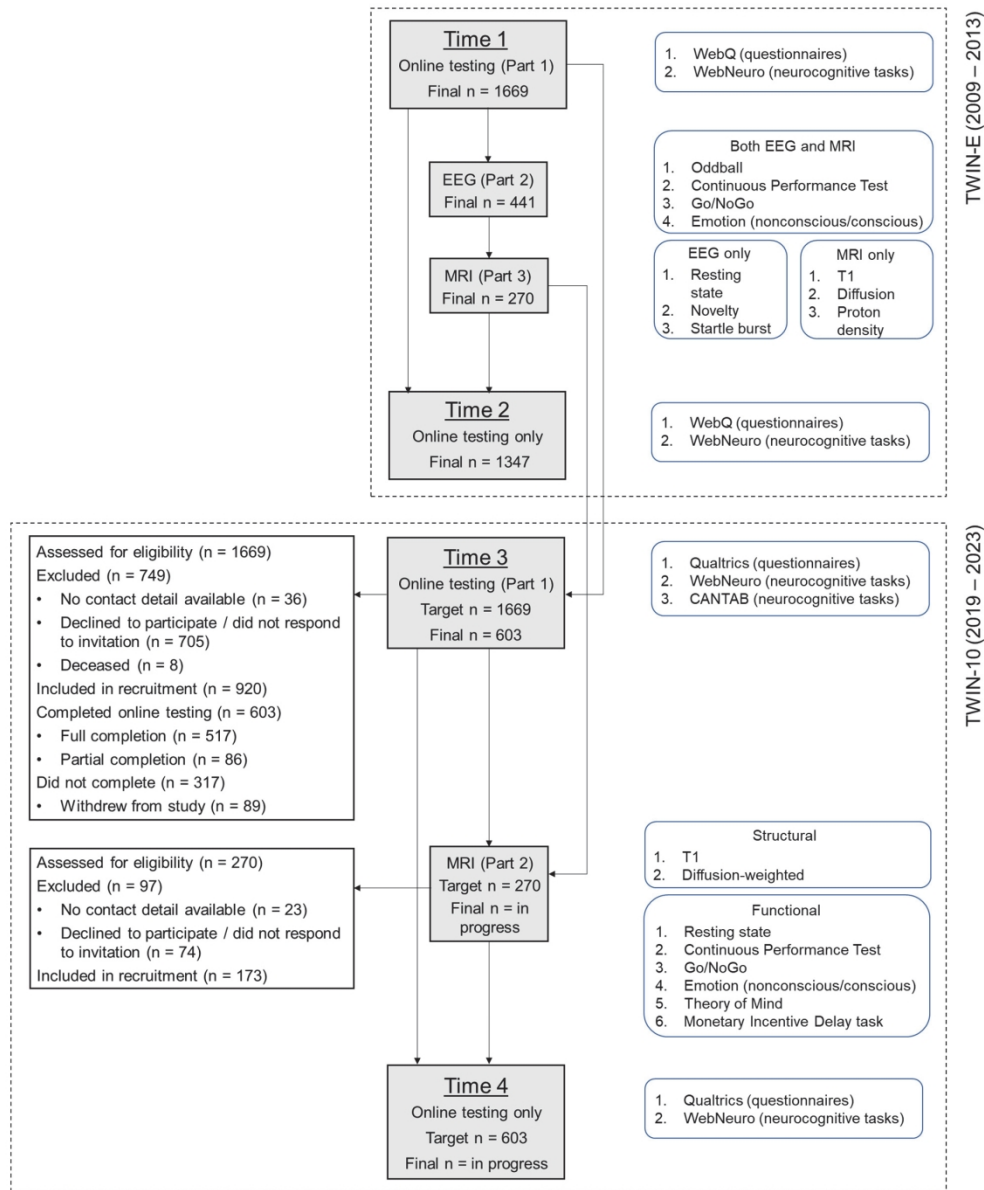


Figure 1. The TWIN project flowchart consisting of the baseline TWIN-E study (completed) and the current TWIN-10 study (ongoing).

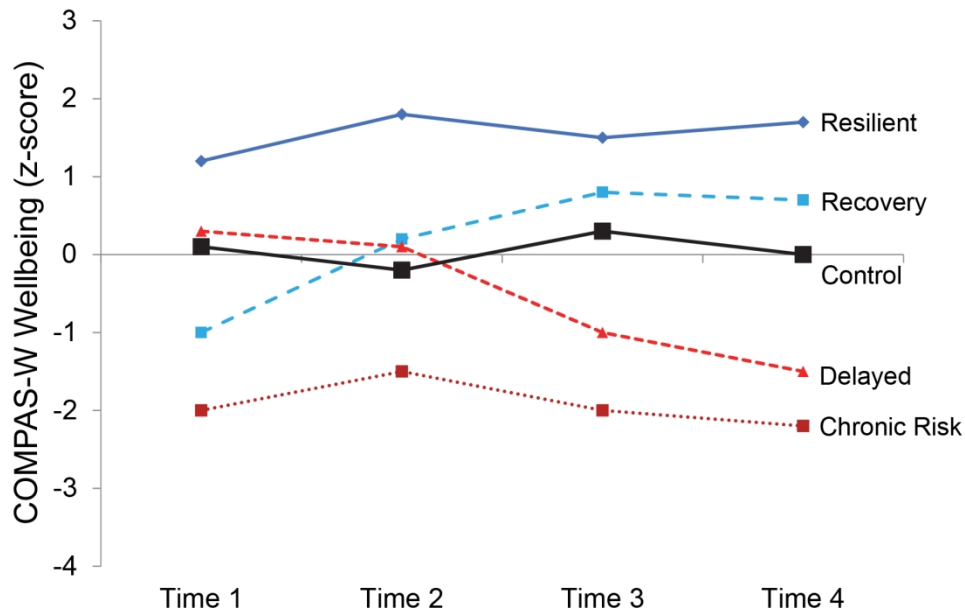


Figure 2. Predicted trajectories of risk vs resilience across the four time-point measurements. In participants with trauma exposure, increasing or maintaining levels of wellbeing (indexed by COMPAS-W) will indicate resilience or recovery (differentiated by baseline wellbeing levels), while decreasing wellbeing over time may lead to delayed or chronic risk for mental illness. Control participants (without any trauma exposure) are expected to maintain their wellbeing levels over time. Both childhood trauma (prior to Time 1) and adult trauma (over 10 years prior to Time 3) will be considered. Figure adapted from Bonanno, 2004.