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Evaluating the combined effects of mobile computerized CBT and post-learning oscillatory modulation on self-esteem: a randomized controlled trial

Limor Shtoots¹, Asher Nadler², Avi Gamoran³, Daniel A. Levy^{2,4} & Guy Doron²□

Self-esteem, crucial for psychological well-being, can be enhanced through targeted interventions like cognitive behavioral therapy (CBT). However, traditional CBT faces various accessibility barriers. Digital health interventions such as computerized CBT and mobile health (mHealth) applications offer potential solutions. Recent research suggests that brain oscillations, particularly theta rhythms, play a key role in memory consolidation. Combining computerized CBT with post-learning theta rhythm modulation may optimize and stabilize improvements in self-esteem and promote neuro-wellbeing. This six-month longitudinal study aimed to evaluate the synergistic effects of a computerized CBT intervention (GGSE) combined with post-training theta rhythm brain modulation on improving selfesteem in young adults with low self-esteem. Participants were randomly allocated to three groups: GGSE + theta audio-visual entrainment (AVE) with Cranio-Electro Stimulation (CES), GGSE + beta AVE + CES (active control), and GGSE only (control). The intervention lasted three weeks. Assessments of self-esteem, maladaptive beliefs, and mood were conducted at baseline, 21 days, 42 days, and six months post-baseline. Although post-treatment oscillatory entrainment did not enhance the long-term efficacy of the intervention, significant treatment effects persisted for six months across all groups. These results support the potential long-term efficacy of brief, game-like, digital CBT approaches for improving self-esteem.

Keywords Self-esteem, Computerized CBT, Brain oscillations, Longitudinal study, Neuro-wellness.

Self-esteem, the evaluation of one's own worth, talents, and competencies, has been implicated in various determinants of well-being¹. Low self-esteem has also been linked with various mental health issues including anxiety and depression^{2,3} and has been suggested to contribute to their development and maintenance³. Indeed, the Diagnostic and Statistical Manual of Mental Health Disorders 5⁴ has low self-esteem as a diagnostic, associative feature, risk factor or consequence in numerous disorders.

Although self-esteem is often considered a relatively stable trait, research findings suggest that it is malleable to treatment⁵. Cognitive Behavioral Therapy (CBT), a therapeutic approach rooted in learning principles, has been shown to be effective in treating low self-esteem^{6,7}, and CBT models suggest low self-esteem is maintained by maladaptive self-beliefs and schemas⁸. Fennell, for instance, expanded on Beck's work⁹ and proposed a model where individuals form a "bottom line" self-image schema (e.g., "I'm worthless") based on past experiences. This schema influences information processing, leading to the formation of rigid maladaptive beliefs (e.g., perfectionism; "I must do everything perfectly") intended to conceal this vulnerable schema. However, events challenging these beliefs activate the bottom line and trigger predictions of negative consequences (e.g., harsh judgment by others). CBT disrupts this cycle by reducing negative self-beliefs and increasing accessibility to more positive self-perceptions using strategies such as cognitive restructuring and behavioral adjustments. This enables individuals to become more self-compassionate, self-accepting and develop healthier self-perceptions.

¹The Dina Recanati School of Medicine, Reichman University, Herzliya 4610101, Israel. ²Baruch Ivcher School of Psychology, Reichman University, HaUniversita 8, Herzliya 4610101, Israel. ³Department of Psychology, Ben-Gurion University of the Negev, 653, Beer Sheva, Israel. ⁴Department of Psychology, Palo Alto University, Palo Alto, CA 94304, USA. [™]email: gdoron@runi.ac.il

Findings from a recent meta-analysis indicate that Fennell's CBT approach yields medium to large effects in boosting self-esteem in adults across diverse populations, including those who are healthy, depressed, or anxious, with benefits sustained for at least three months post-treatment¹⁰. Considering depression measures inherently capture aspects of self-esteem^{3,11,12}, studies have also consistently demonstrated superior long-term outcomes of CBT for depression and self-esteem compared to other therapeutic approaches, including pharmacological interventions^{13,14}. This efficacy is evident in both in-person and virtual administrations of CBT^{15,16}.

Despite its efficacy in clinical and non-clinical populations, however, there are significant barriers for receiving CBT treatment such as stigma, high costs, substantial time commitments, limited accessibility, and a shortage of trained professionals^{17,18}. Moreover, many individuals with low self-esteem may not seek treatment because they don't perceive their struggles as severe enough to warrant clinical intervention⁸ and are unaware of their increased vulnerability to psychopathology. There is a need for interventions for low self-esteem that are easily accessible and with widespread reach.

Computerized CBT and mobile health (mHealth) interventions have emerged as promising solutions, offering greater accessibility, flexibility, and significantly reduced costs compared to traditional CBT¹⁹. These digital platforms have the potential to deliver effective therapy to a broader population, overcoming the limitations of conventional face-to-face therapy. Although numerous CBT-based mHealth platforms exist, only a few are evidence based^{20,21}. An example of such an evidence-based mobile-computerized CBT application is the GGtude platform²²⁻²⁴. Seventeen published studies including 11 randomized controlled trials (RCTs)²⁵⁻³⁵ and real-world data analyses³⁶⁻³⁸ have consistently indicated that daily use of this platform for a period of 2–4 weeks (for an average of 3–4 min a day) is associated with significant mental health benefits.

Among these, four RCTs conducted in the USA, Spain, Italy and Israel have included self-esteem measures 25,26,30,31 . These studies suggest that using various modules of the GGtude platform is associated with increased self-esteem compared with a waitlist control group and that these gains remain at follow-up assessments. For examples, a large (n=315) fully remote RCT 30 , including people with serious mental illness, found large effect-size increases in self-esteem following 1-month training on the GGtude platform compared with a waitlist control group. These results were maintained at 1-month follow-up and replicated following crossover. Similar findings were found in another RCT with crossover design conducted in Spain 25 . In this RCT, students (n=97) training with the relationship obsessions module, GGRO, of the GGtude platform showed medium effect-size increases in self-esteem compared with a waitlist control group. Again, these findings were maintained at 15-day follow-up and replicated following crossover.

A third RCT²⁶ (n=90) conducted in Israel found that two weeks of daily use with the body image module, GGBI, of the GGtude platform were associated with improved self-esteem scores that were maintained at 1-month follow-up. The fourth RCT conducted in Italy³¹ also used the GGRO module. Findings from this study indicated that students (n=50) with subclinical symptoms of relationship OCD³⁹ showed medium effect-size improvement in self-esteem relative to a waitlist control group that remained at follow-up assessment. However, an analysis using the reliable scale index (RSI)⁴⁰ suggested reliable change in only 12% of these users. Consistent with findings from the above mentioned RCTs, are finding from a recent study using real world data analyses of the self-esteem module (GGSE)³⁷. In this study, data of users that downloaded the app from Google Play or App Store and completed at least two assessment points (n=1034) were analyzed. Results indicated large effect size improvements in self-esteem that were consistent with a dosage-response effect³⁷.

Overall, findings from previous RCTs consistently support the efficacy of the GGtude platform^{25,26,30,31} in increasing self-esteem relative to waitlist control groups and indicate that such improvements persist for a period up to 1-month. However, the long-term efficacy of training on the GGtude platform remains underexplored, with no studies extending follow-up to six months. Moreover, given that CBT is grounded on learning principles, enhancing memory effects following a CBT based intervention could increase its efficacy and extend its long-term benefits. Daily training with the GGtude platform followed by an intervention aimed at enhancing memory consolidation may, therefore, boost its immediate and long-term effects.

Memory consolidation refers to the dynamic process by which newly acquired information is transformed into stable, long-lasting memory representations. It involves molecular, synaptic, and system-level changes that reinforce neural circuits, protecting the memory from decay or interference. This process, occurring during the critical post-learning period, is crucial for the persistence of new memories. Over time, these changes contribute to the gradual integration of new information into pre-existing networks \$^{41,42}\$.

Recent evidence suggests that interventions during this time window of memory consolidation can significantly enhance the retention of learned material. Specifically, modulating brain oscillations—particularly theta rhythms—has been shown to optimize neural synchrony, thereby amplifying learning effects^{43–47}. Effective communication within brain networks is facilitated by increased synchrony in neuronal firing^{48,49}. These network oscillations influence the precise timing of neural activity both within and between brain regions, which is crucial for representing and encoding information^{45,50}. Consequently, post-learning replay of neural activity from the encoding phase, which supports consolidation, can be strengthened through the optimization of neural transmission by enhancing synchrony at specific frequencies. Given the evidence highlighting the importance of theta rhythms in successful encoding and retrieval^{43,44,46,47,51,52}, and considering that both retrieval and consolidation involve reinstatement or replay, modulating theta rhythms after learning potentially provides a means to promote consolidation^{53–58}.

Techniques such as EEG neurofeedback (NFB) and transcranial alternating current stimulation (tACS), have demonstrated the ability to strengthen memory consolidation by targeting theta activity. In previous research 55, we have used EEG NFB to enable participants to selectively increase theta power in their EEG spectra following episodic memory encoding. Free recall assessments immediately following the interventions, 24 h later, and 7 days later all indicated benefit to memory of theta NFB. Similar results were obtained by 3 Hz theta tACS in episodic

memory⁵³. These results complement our earlier findings that theta NFB similarly improves consolidation of procedural learning⁵⁶ and spatial memory⁵⁴, which were all tested up until one week post-intervention.

Alongside EEG NFB and tACS, another method of modulating oscillatory neural activity is audio-visual entrainment (AVE), which uses rhythmic auditory and visual stimuli to potentiate desired frequencies of brain electrical activity. Research on visual processing has demonstrated that entrainment can increase targeted oscillatory activity, influencing spiking responses and improving behavioral performance^{59,60}. Moreover, AVE upregulation of theta-frequency activity was reported for improving episodic memory retrieval⁶¹. Since memory consolidation involves stabilizing and integrating newly acquired information into long-lasting memory networks⁴², this is extremely relevant for interventions like CBT that rely on altering maladaptive beliefs and schemas, also due to the hippocampus-dependent nature of the cognitive components in CBT⁶². Our goal, therefore, was to explore whether post-learning theta entrainment could optimize and stabilize CBT outcomes, enhancing the long-term effects of self-esteem interventions delivered via mobile platforms.

In this study, we hypothesized that combining an accessible, mobile-delivered, personalized form of CBT (via the GGtude platform) with post-learning theta rhythm modulation could further improve self-esteem treatment response, optimize the intervention, and achieve longer-term effects. We expected that the synergistic effect of these two methods would lead to higher response rates, maximize the therapeutic impact, and stabilize its effects over a longer duration. To test this hypothesis, we assessed whether using theta entrainment techniques post-training with the GGtude platform could enhance and prolong the platform's efficacy on self-esteem, with a particular focus on outcomes over a 6-month period. Two control groups were included in this study: an active control Beta group, as in our previous studies^{53–55}, and a GGSE only control group in which participant used the GGtude platform with no brain entrainment method. As there are no established criteria for clinically significant improvement on the Rosenberg self-esteem scale (RSES), we used the RCI⁴⁰ to assess reliable and meaningful change of each participant on the RSES scale. We also examined the effects of the intervention on related psychological constructs, such as mood, social anxiety, maladaptive perfectionism, self-compassion, dysfunctional attitudes, and social comparison tendencies, all of which have been previously found to be associated with self-esteem⁶³⁻⁶⁸. This longitudinal study design allowed us to investigate not only the immediate benefits but also the durability of treatment effects, a critical factor in the broader implementation of scalable mHealth interventions for self-esteem.

Methods Participants

179 young adults, recruited in campus communities and nearby areas, completed the RSES⁶⁹ on the Qualtrics online platform. Of those, 85 young adults (52 females; mean age 23.3 years, SD 3.3 years, age range 18 to 37) who showed low self-esteem scores (RSES < 16) participated in this study.

Exclusion criteria were self-reported hearing problems, neurological/psychiatric problems, learning disabilities/ADD, regular drug use (prescription/recreational), pacemaker, epilepsy, regular use of alcohol, previous head injuries/head tumor/stroke, ear piercing, previous injury to the skin on the earlobe (peeling, redness, scarring, etc.). Participants were randomly assigned to one of the following groups: Theta group (20 F, 11 M, mean age 23.4 years, SD 3.8 years), Beta group (17 F, 12 M, mean age 23.3 years, SD 3.3 years), or GGSE only control group (15 F, 10 M, mean age 23.1 years, SD 2.8 years). Participants received monetary compensation of 400 NIS for their participation. The study protocol and publication were approved by Reichman University, Herzliya, Israel (No: 2020015_P). Informed consent was obtained from all subjects. All procedures were performed in accordance with relevant guidelines.

Experimental design

At T0, participants in the Theta and Beta groups were asked to arrive at the lab to collect the AVE+CES (Cranio-Electro Stimulation) device and to undergo a training session with an experimenter. From that point on, all participants conducted the experiment at home. They were asked to use GGSE five days per week (excluding Fridays and Saturdays) over a period of three weeks, for a total of 15 days, at the same time each day. Following the completion of each daily GGSE training (5 min/day), participants used the AVE+CES device (20 min/day), in a theta or beta session mode, depending on the group they were randomly assigned to. The GGSE-only control group participants went through the same experimental procedure, but without the use of the AVE+CES device. All participants were requested to complete web-based assessment, with questionnaires relating to self-esteem, maladaptive beliefs and mood at baseline (T0), 21 days following baseline—after the completion of the intervention (T1), 42 days following baseline (T2) and 6 months following baseline (T3). An experimenter conducted daily follow-ups with all participants via Zoom or phone call, for technical support and to verify the completion of the daily training. Participants did not use the app after the initial intervention period (first three weeks of the experiment).

CBT intervention

The GGtude platform was specifically designed to take advantage of mobile phone technology and use interactive, short, touch-screen based intervention to reduce psychological symptoms)e.g^{22,23,25}. The self-esteem module of the platform (GGSE) includes 46 training levels targeting 11 maladaptive beliefs/metacognitions related to low self-esteem. GGSE consists of game-like interactions facilitating accessibility to adaptive self-statements relating to the appraisals of thoughts, emotions, and events related to self-esteem.

At the onboarding stage, participants received a brief psychoeducation script about the impact of self-talk on mood. They then engage in short, game-like interactions aimed at promoting more adaptive self-talk. Each training session presents self-statements consistent with maladaptive beliefs (e.g., "I must be perfect to be accepted") or inconsistent with such beliefs (e.g., "Imperfection is part of being human"). Each daily session

targets a specific maladaptive belief (e.g., perfectionism, intolerance of uncertainty, self-efficacy, over-estimation of social threat, fear of abandonment) or metacognition (e.g., positive beliefs about comparisons and about self-criticism). Users are instructed to discard maladaptive statements by swiping them in an upward motion. They are instructed to "embrace" helpful statements by swiping them downwards towards themselves.

When introducing new levels that address a particular belief, the app presents a screen explaining the rationale for challenging this belief. For instance, before addressing self-criticism, users see: "Research shows that self-criticism is associated with depression, anxiety and low self-esteem. However, people with low self-esteem often believe self-criticism is useful. Let's try and challenge this belief!" After completing a level, users take a brief memory quiz, selecting one of three self-esteem-enhancing statements featured in the level. Upon completing three levels, the app advises: "You've reached the recommended amount of training for today. To get the best results, continue practicing tomorrow", encouraging users to conclude their session and resume training the following day. The duration of each daily session is approximately 5 min.

AVE + CES stimulation

After each GGtude daily session, participants in the stimulation conditions received 20 min of either theta entrainment at 5.5 Hz, or beta entrainment at 15 Hz, depending on their assigned group. Entrainment was generated by exposure to rhythmically flashing lights, pulsing pure tone sounds and mild electric currents oscillating at theta or beta frequency. A commercially available device (DAVID DELIGHT PRO by Mind Alive, Inc., Edmonton, Canada) was used to administer visual stimulation (via LED lights embedded on the inner edge of darkened eyeglasses), pulsed tones (via headphones) and CES (via earlobe electrodes, using a conductive gel). All subjects were instructed to attend to the lights and sounds and not to fall asleep. Participants could close their eyes or leave them slightly open during the entrainment period in accordance with their personal comfort preference, as the lights remained visible with eyes closed⁶¹.

Behavioral assessments

To thoroughly investigate the multilayered nature of self-esteem pre- and post- CBT intervention, we considered a range of psychological constructs that have been associated with low self-esteem (see detailed description of the measures below). For instance, we examined the effects of the intervention on the relentless pursuit of unattainable standards (i.e., perfectionism; as measured by the MPS)^{63,70}, the tendency for upward social comparisons (as measure by the INCOM)⁶⁴, the need of others' approval⁶⁸ (i.e., dysfunctional attitudes; as measured by the DAS) and fears of negative evaluation and social rejection (i.e., social anxiety; as measured by the SIAS)⁶⁶. Similarly, we assessed symptoms of depression, anxiety, and stress that have been closely linked to self-esteem (as measures by DASS), with lower self-esteem often found in individuals experiencing higher levels of these negative emotional states⁶⁵. We also measured self-compassion (measured by the SCS) that has shown to be positively associated with self-esteem levels and buffer against low self-esteem, seemingly by promoting a kinder, more forgiving self-view⁶⁷. Together, these tools provide a comprehensive framework for understanding the complex and interrelated factors that influence self-esteem, enabling us to assess intervention effects. Overall, the following questionnaires were provided for participants to complete at T0, T1, T2, and T3: The Rosenberg Self-Esteem Scale (RSES)⁷¹; the Multidimensional Perfectionism Scale (MPS)⁷⁰; the Iowa-Netherlands Comparison Orientation Measure (INCOM)⁶⁴; the Dysfunctional Attitude Scale (DAS)⁶⁸; the Social Interaction Anxiety Scale (SIAS)⁶⁶; the short version of the Depression Anxiety and Stress Scale (DASS)⁶⁵ and the short form of the Self-Compassion Scale (SCS)⁶⁷.

The Rosenberg Self-Esteem Scale (RSES)^{69,71} ranges from 0 to 40 (with higher scores indicating greater self-esteem) and consists of 10 statements that assess the individual's self-esteem, for example: "In total, I'm happy with myself." The items are rated on a four-point Likert scale, ranging from "Strongly agree" to "Strongly disagree". RSES internal consistency: Cronbach's α T0 = 0.85; T1 = 0.88; T2 = 0.87; T3 = 0.89.

The Multidimensional Perfectionism Scale (MPS) is a shortened version of the original 45-item MPS⁷⁰ which comprises three subscales (five-items per subscale) measuring self-oriented perfectionism, other-oriented perfectionism, and socially prescribed perfectionism, with higher scores indicating greater perfectionism tendencies. Participants were asked to rate each item on a seven-point scale from 1 ("strongly disagree") to 7 ("strongly agree"). Total scores were used in this study. MPS internal consistency: Cronbach's α T0=0.74; T1=0.77; T2=0.74; T3=0.73.

The short version of the depression anxiety and stress scale (DASS)⁶⁵ is a 21-item (DASS-21) self-report questionnaire listing negative emotional symptoms that is divided into three subscales measuring depression, anxiety and stress (seven items per subscale). The items are rated on our-point scales (0="Does not relate to me at all," 3= "Relates to me greatly, or most of the time"). The total score was used in this study, with higher scores indicating higher levels of general distress⁷². DASS internal consistency was very high: Cronbach's α T0=0.90; T1=0.93; T2=0.94; T3=0.92.

The short form of the self-compassion scale (SCS) consists of 12 items. The scale assesses the positive and negative aspects of the three main components of self-compassion: self-kindness versus self-judgment, common humanity versus isolation and mindfulness versus over-identification⁶⁷, with higher scores indicating greater self-compassion. The items are rated on a five-point scale ranging from "almost never" to "almost always". SCS internal consistency was: Cronbach's α T0 = 0.79; T1 = 0.84; T2 = 0.85; T3 = 0.88.

The Dysfunctional Attitude Scale (DAS) concise version is a self-report questionnaire, consisting of 17 items on a scale from 1 ("do not agree at all") to 7 ("completely agree"), with scores ranging from 17 to 119, designed to identify and measure cognitive distortions associated with depression 68. For example: "If I partly fail, it is as bad as being a complete failure". The higher the score, the more dysfunctional attitude an individual possesses. DAS internal consistency was very high: Cronbach's α T0 = 0.88; T1 = 0.91; T2 = 0.89; T3 = 0.91.

The Social Comparison Scale (INCOM) consists of 11 items and assesses the general tendency to compare oneself to others. People are given statements about their self-comparisons with others⁶⁴. The items are rated on a five-point scale ranging from "strongly disagree" to "strongly agree". INCOM internal consistency: Cronbach's α T0=0.81; T1=0.84; T2=0.83; T3=0.87.

The social interaction anxiety scale (SIAS) consists of 20 items, with scores ranging from 0 to 80. The items are rated on a five-point Likert scale, ranging from 0 to 4: "does not describe me at all" to "strongly describes me". All the items are self-statements describing reactions to social interactions. For example: "I get nervous if I have to speak with someone in authority (teacher, boss, etc.)" SIAS internal consistency was very high: Cronbach's α T0 = 0.92; T1 = 0.94; T2 = 0.94; T3 = 0.93.

Data analysis

All statistical analyses were performed using R version 4.4.0 (R Core Team, 2024). Analysis of Variance models were conducted with afex package and follow up analyses were conducted with the emmeans package. Imputation of missing values from the dataset was conducted using the mice package⁷³. Baseline comparisons across groups were conducted with one-way ANOVAs for continuous variables and Chi-square test for categorical variables. The primary outcome (self-esteem, RSES) and Secondary outcomes (DAS, MPS, SCS, INCOM, DASS, SIAS), were analyzed using a Group \times Time (T0, T1, T2, T3) RM-ANOVA. Partial eta-squared and Cohen's d were calculated.

Results

Comparison of study groups

Before examining the effects of app use and neuromodulation, differences in baseline scores (T0) on all the study scales, as well as differences in participants age and gender, were analyzed across groups. No significant difference between groups were found for participant's age (F(2,82) = 0.06, η^2 = 0.00, p = 0.944), gender (2(2) = 0.24, p = 0.887), or scores on baseline measures (Table 1).

Mean of all total scale scores, including SD, per group, at the four time points, are described in Table 2.

Primary outcome-improvement over time on self-esteem

The scores on the RSES scale were submitted to a Group (Theta/Beta/GGSE only control) X Time (T0, T1, T2, T3) ANOVA to assess Time X Group interactions as well as main effects of Time and Group. No significant effect was found for Group X Time interaction (F(5,214) = 0.89, η_p^2 = 0.02, p = 0.491) or Group (F(2,82) = 0.25, η_p^2 = 0.01, p = 0.778) (Fig. 1). However, a significant main effect was found for Time (F(3,214) = 25.18, η_p^2 = 0.23, p < 0.001).

Exploratory follow-up analyses of our primary outcome were performed to have a clearer view of the trajectory of each group on our primary outcome measure. Participants in all groups demonstrated significant improvements between baseline, and post-treatment assessments which were maintained at all consequent follow-up assessments (Table 3).

Reliable change evaluates whether the scores of an individual on a particular measurement changed significantly more than would be expected given measurement error (i.e., larger than that reasonably expected due to measurement error alone). The evaluation of such change provides an understanding of the extent to which change after treatment is reliable 40. We used the RCI 40 to assess reliable change of each participant on the RSES scale.

The calculation of the RCI requires estimates of a scale's internal consistency and standard deviation for a given population. The threshold for reliable change is calculated as 1.96 times the standard error of the difference between scores of a measure administered on two occasions. The standard error of measurement (S_E) was first calculated using:

$$S_E = S_1 \sqrt{1 - r_{xx}}$$

(where s_1 = standard deviation at pre-test and r_{xx} = the internal consistency of the measure) and the standard error of the difference score (S_{diff}) derived as:

$$S_{diff} = \sqrt{2 (S_E)^2}$$

Scale	f	df1	df2	Generalized eta-squared	p-value
DAS	0.70	2	82	0.02	0.499
DASS	0.30	2	82	0.01	0.745
MPS	0.08	2	82	0.00	0.922
RSES	0.36	2	82	0.01	0.698
SCS	0.51	2	82	0.01	0.605
SIAS	2.96	2	82	0.07	0.058
INCOM	0.32	2	82	0.01	0.73

Table 1. Comparison of baseline scores by group.

Scale	Time point	Theta group	Beta group	GGSE only group
DAS	T0	71.35 (17.35)	73.59 (16.09)	68.48 (13.22)
	T1	54.71 (17.03)	57.00 (20.24)	61.08 (17.24)
	T2	58.52 (13.23)	58.18 (16.73)	62.76 (17.60)
	Т3	57.14 (17.31)	60.38 (18.60)	60.96 (18.68)
	T0	43.77 (10.68)	42.17 (9.90)	44.28 (11.51)
DASS	T1	34.97 (11.41)	33.89 (11.87)	38.20 (10.66)
DASS	T2	34.62 (13.15)	33.43 (9.80)	38.76 (10.54)
	Т3	35.75 (11.96)	35.23 (9.88)	38.24 (10.41)
	T0	69.10 (11.00)	68.14 (14.65)	69.36 (9.27)
MPS	T1	59.87 (10.65)	58.85 (15.73)	63.76 (9.75)
MPS	T2	61.34 (10.15)	58.93 (12.59)	63.76 (10.35)
	T3	61.18 (10.25)	59.59 (18.27)	64.32 (10.14)
	T0	12.65 (4.14)	13.14 (5.17)	13.72 (4.80)
RSES	T1	16.57 (5.58)	17.52 (5.60)	16.72 (4.63)
RSES	T2	15.83 (5.20)	17.96 (5.87)	16.72 (5.06)
	Т3	16.89 (6.34)	17.00 (5.65)	16.88 (5.37)
	Т0	27.55 (7.35)	29.03 (6.48)	29.16 (6.54)
SCS	T1	35.13 (9.18)	35.89 (8.23)	33.24 (4.77)
SCS	T2	32.79 (8.43)	35.82 (8.95)	33.88 (5.94)
	Т3	35.82 (10.82)	34.92 (7.96)	33.40 (7.52)
	T0	39.26 (16.16)	47.34 (4.13)	38.72 (14.42)
SIAS	T1	29.45 (16.02)	39.70 (17.09)	37.08 (13.77)
	T2	29.52 (12.94)	37.57 (17.00)	36.84 (14.61)
	Т3	28.89 (11.81)	40.00 (16.27)	35.92 (15.48)
	T0	41.61 (7.94)	42.14 (5.16)	43.00 (5.90)
INCOM	T1	39.23 (7.27)	38.85 (7.54)	41.28 (4.91)
INCOM	T2	38.14 (5.69)	39.00 (7.94)	40.60 (5.35)
	Т3	36.39 (7.68)	37.88 (8.33)	41.48 (6.12)

Table 2. Mean and SD values of total scale scores by group.

Finally, RCI was calculated:

$$RCI = \frac{X_2 - X_1}{S_{diff}}$$

(where X_2 = individual post-test and X_1 = individual pre-test).

The RCI on the RSES scale was calculated for each participant in each of the groups from T0 (pre-training) to T3 (6-months follow up). The following percentages of improvement were obtained for each group: 22.6% for the Theta group (seven participants), 13.8% for the Beta group (four participants), and 24% for the GGSE only group (six participants). Overall, 20% (17 participants) of all participants achieved reliable clinical change. To determine whether there were significant differences among the three independent groups in the proportion of participants achieving clinically significant change, we performed a chi-squared test of independence. The results indicated no significant difference between the groups ($\chi^2 = 1.08$, d.f. = 2, p = 0.58). Results are shown in Table 4.

Secondary outcomes

The effects of Group and Time were examined for additional symptom and process scales (DAS, MPS, SCS, INCOM, DASS, SIAS). In all the scales, neither Group X Time interaction effects nor the main effect of Group (except the SIAS) were significant (see Table 5).

As in our primary variable, the only significant effects found were the main effect of Time (see Fig. 2).

Discussion

In the current longitudinal RCT, we examined the immediate and long-term effects of oscillatory neural modulation on the consolidation of a mHealth CBT-based intervention for self-esteem. We hypothesized that daily training with the self-esteem track of the GGtude platform (GGSE) followed by an intervention designed to enhance memory consolidation will result in a synergistic effect boosting the immediate and long-term effects of the intervention.

Our findings indicated medium to large effect sizes of the intervention evaluated immediately following and at the 6 months follow-up. However, contrary to our main hypothesis, our results did not support the synergistic

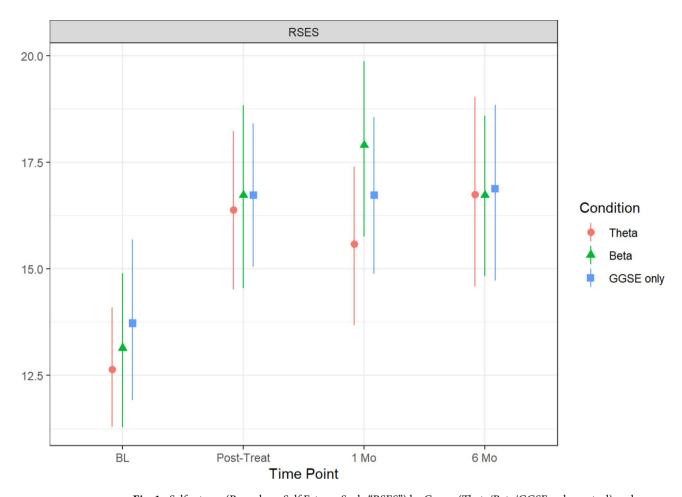


Fig. 1. Self esteem (Rosenberg Self Esteem Scale "RSES") by Group (Theta/Beta/GGSE only control) and assessment points: baseline (T0), post-treatment (T1), 1-month follow-up (T2), 6-month follow-up (T3). Error bars represent 95% confidence intervals.

Contrast	Group	Estimate	SE	df	t. ratio	Cohen's d	p-value
t1-t0	Theta	3.74	0.87	82	4.32	0.70	< 0.001***
t2-t0	Theta	2.94	0.78	82	3.77	0.55	< 0.001***
t3-t0	Theta	4.10	1.00	82	4.08	0.76	< 0.001***
t1-t0	Beta	3.59	0.90	82	4.00	0.67	< 0.001***
t2-t0	Beta	4.76	0.80	82	5.91	0.88	< 0.001***
t3-t0	Beta	3.59	1.04	82	3.45	0.67	< 0.001***
t1-t0	GGSE only	3.00	0.96	82	3.11	0.56	0.004**
t2-t0	GGSE only	3.00	0.87	82	3.46	0.56	0.003**
t3-t0	GGSE only	3.16	1.12	82	2.82	0.59	0.006**

Table 3. Follow up analyses for changes in RSES scores over assessment points.

effect of combining the intervention with theta oscillatory modulation. The theta and beta (active control) modulation groups exhibited similar benefits to the GGSE only non-modulation control group, as measured up to 6 months following the intervention.

Previous RCTs^{25,26,30,31} and one study using real world data³⁷ have consistently demonstrated the efficacy and effectiveness of training with various modules of the GGtude platform in improving self-esteem. This is the first RCT, however, to assess the GGSE module of the platform that specifically targets maladaptive cognitions implicated in the maintenance of low self-esteem. This is also the first published RCT comparing the effectiveness of the GGtude platform with active control groups. The findings from this study, therefore, lend further support to the efficacy of GGSE in improving self-esteem as well as related psychological constructs. Moreover, findings from this study indicate that improvement in self-esteem was maintained at all subsequent time points including at the 6-month follow-up, as well as a significant proportion of participants (20%) reaching clinically meaningful

	Theta group	Beta group	GGSE only group
1	3.2	2.03	0.75
2	1.37	2.71	0.25
3	2.97	1.19	2.26
4	1.6	1.35	1
5	3.89	2.03	1
6	0.23	-0.17	0.25
7	1.6	2.2	2.01
8	0.92	-0.68	2.26
9	-1.14	0.17	1
10	2.29	0.34	0
11	1.6	0.68	2.26
12	2.06	0.51	0.5
13	0.46	0.17	1
14	-0.23	0.85	0.75
15	0.92	0.51	1
16	1.14	1.35	0.75
17	1.37	1.02	-0.5
18	1.6	1.86	2.01
19	1.14	0	0.25
20	0	0.68	1
21	0	-0.51	0
22	2.06	0.85	2.76
23	0.23	0.17	-0.75
24	-0.46	-0.17	-1.75
25	0.46	-1.02	-0.25
26	-0.92	-0.17	NA
27	0.46	-2.03	NA
28	-1.37	1.52	NA
29	2.75	0.17	NA
30	-1.83	NA	NA
31	0.69	NA	NA

Table 4. Clinical change: RCI of the RSES.

improvement as indicated by the RCI of RSES. These results provide additional evidence to support the long-term maintenance of CBT for self-esteem.

The training exercises on the GGtude platform were designed to change the relative activation of adaptive and maladaptive cognitions such that the adaptive cognitions would be more easily retrieved than the maladaptive ones³⁶. GGSE targets maladaptive cognitions known to be implicated in the maintenance of low self-esteem such as self-criticism, perfectionism and the tendency to compare. Repeated exposure to self-statements challenging these beliefs may increase users' ability to generate and retrieve alternative self-statements promoting more positive self-view. The repeated pairing of self-referential pronouns with action words (verbs) with positive meaning during these exercises may also increase users' positive implicit self-esteem⁷⁴. Also, the brief psychoeducation scripts provided during these daily exercises may help motivate users and consolidate users' understanding of basic CBT principles⁷⁵.

Contrary to our main hypothesis, findings indicate no advantage for theta oscillatory modulation. Both theta and beta (active control) modulation groups exhibited similar benefits to the GGSE only (non-modulation) control group, as measured up to six months following the intervention. There are several possible reasons why the predicted benefit of post-training theta upregulation was similar to that of post-training beta upregulation and GGSE only groups.

One possible explanation for why our findings indicates no advantage for theta oscillatory modulation, is that bolstering memory consolidation via theta upregulation may be less effective in benefiting CBT-based improvement due to the mnemonic nature of the effects of the GGSE intervention. Although we have demonstrated that post-acquisition theta upregulation improves retention of various types of declarative memory and of the early stages of procedural motor skill learning ^{53–57}, the changes in attitude engendered by the intervention might be based on a different type of learning, leading to incremental practice-based modification of beliefs and behaviors. These might be more similar to the slow gradual changes in the extended phases of procedural learning, which are not dependent on the hippocampus ⁷⁶, and therefore not necessarily affected by theta upregulation.

Scale	Effect	f	df1	df2	Partial eta-squared	p-value
DAS	Group	0.30	2.00	82.00	0.01	0.738
DAS	Assessment point	24.62	2.59	212.76	0.23	< 0.001***
DAS	Group * assessment point	1.29	5.19	212.76	0.03	0.27
MPS	Group	0.79	2.00	82.00	0.02	0.457
MPS	Assessment point	19.66	2.69	220.64	0.19	< 0.001***
MPS	Group * assessment point	0.68	5.38	220.64	0.02	0.649
SCS	Group	0.37	2.00	82.00	0.01	0.69
SCS	Assessment point	30.04	2.70	221.72	0.27	< 0.001***
SCS	Group * assessment point	2.02	5.41	221.72	0.05	0.071
INCOM	Group	1.88	2.00	82.00	0.04	0.16
INCOM	Assessment point	11.96	2.92	239.64	0.13	< 0.001***
INCOM	Group * assessment point	1.21	5.84	239.64	0.03	0.303
DASS	Group	0.72	2.00	82.00	0.02	0.49
DASS	Assessment point	23.19	2.77	226.92	0.22	< 0.001***
DASS	Group * assessment point	0.51	5.53	226.92	0.01	0.788
SIAS	Group	3.25	2.00	82.00	0.07	0.044*
SIAS	Assessment Point	13.12	2.61	214.12	0.14	< 0.001***
SIAS	Group * assessment point	1.73	5.22	214.12	0.04	0.126

Table 5. Effects of group and assessment points on various symptom and process scales.

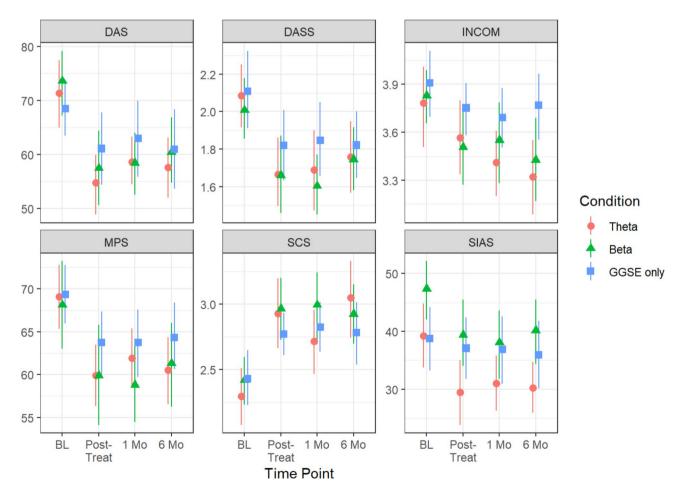


Fig. 2. Secondary outcome scales by group (Theta/Beta/GGSE only control) and assessment points: baseline (T0), post-treatment (T1), 1-month follow-up (T2), 6-month follow-up (T3). Error bars represent 95% confidence intervals.

In this study, due to the device settings, we employed theta entrainment at a frequency of 5.5 Hz. In our previous brain stimulation (via tACS) study⁵³ theta was set at 3 Hz. Prior studies found 3 Hz to be the theta band frequency most strongly implicated in memory consolidation⁷⁷. It is possible that a frequency of 3 Hz, or individually determined theta peak frequency entrainment, would be better for consolidating new therapeutic learning.

In addition, the distinct outcomes observed in the present study in which we used AVE with CES, as opposed to tACS⁵³, and NFB^{54,55} in our previous research, can be understood in light of their differing neurophysiological mechanisms. AVE+CES, which relies on rhythmic sensory stimulation and mild cranial electrical currents, exerts its effects through the broad modulation of neural networks. Specifically, AVE attempts to entrain brain oscillations by presenting external auditory and visual stimuli at frequencies aimed at synchronizing endogenous rhythms, while CES influences overall neural excitability by delivering mild electrical currents⁵⁹⁻⁶¹. This method inherently influences large-scale neural systems rather than modulating specific circuits or regions implicated in cognitive and emotional functions.

In contrast, tACS delivers alternating electrical currents directly to the scalp at frequencies designed to match and modulate endogenous brain rhythms. Since tACS (as opposed to NFB and AVE+CES) is focused on particular scalp locations, the selection of the most effective montage for stimulating brain areas involved in consolidation processes is important. This method exerts more precise control over neuronal oscillations, leading to phase alignment of neuronal firing in targeted regions. By influencing more localized cortical circuits, tACS can modulate functional connectivity between brain regions involved in cognitive processes, such as the hippocampal-cortical networks crucial for memory consolidation⁷⁸.

In addition, NFB represents an individualized and proactive approach, offering real-time feedback based on a participants' brain activity. This method allows for dynamic training of specific brain states, as participants are reinforced for achieving desired neural oscillatory patterns. The adaptability of NFB enables precise and individualized modulation of brain states, resulting in targeted interventions that can potentially optimize neurocognitive outcomes⁵⁸.

The mechanistic differences between these three methods help explain the results observed in this study. AVE+CES, with its broader, less focused modulation, likely lacks the specificity to effectively influence the neural circuits underpinning self-esteem and related cognitive functions for optimal therapeutic outcomes. Determining whether theta upregulation of the consolidation of new learning can benefit CBT-based changes if different stimulation methods are employed, or whether theta increases cannot in principle aid the strength of CBT-based interventions, seemingly requires further research.

The current study has several limitations. The sample size was relatively small, and our study included multiple measures. A larger sample size may have provided the statistical power to detect smaller effect-size interactions after correcting for multiple comparisons. Although several RCTs have shown the relative efficacy of training on the GGtude platform compared with waitlist control groups, inclusion of such an additional control group may have provided further insights into the differences between groups. Also, the age range of participants in our sample was relatively restricted (between 18 and 37 years) preventing generalization of the results to wider age groups. In addition, although participants were monitored for compliance, conducting the intervention at home may introduce variability in the environment and adherence to protocol, which could affect the outcomes.

Another potential limitation of our study is the possibility that regression to the mean may have influenced the results. Participants were selected based on low self-esteem and might naturally show some improvement over time independent of the intervention. However, several factors mitigate this concern. For instance, the groups were comparable at baseline, reducing the likelihood that extreme values in any particular group skewed the results and ensuring that any changes observed are less likely due to statistical artifacts. Also, we observed positive changes across multiple psychological measures, including self-esteem, processes measures (e.g. perfectionism, the tendency to compare) and symptoms (e.g., depression and anxiety). This suggests that the intervention produced genuine effects rather than being solely due to regression to the mean on one measure. Moreover, these improvements persisted across all follow-up assessments over six months. Importantly, regression to the mean typically does not account for sustained improvements over an extended period. Additionally, our findings align with those from four randomized controlled trials conducted in the USA, Spain, Italy, and Israel^{25,26,30,31} that included self-esteem measures. These studies found that using various modules of the GGtude platform led to increased self-esteem compared with a waitlist control group, with gains maintained at follow-up evaluations. Therefore, the replication of positive outcomes across diverse populations and settings strengthens the argument that the improvements are unlikely to be solely due to regression to the mean.

In conclusion, while the neuromodulatory manipulation did not achieve its hypothesized benefit, the finding that the intervention benefits persisted for 6 months after treatment is an important addition to our prior findings^{22,23,25,37}. We believe that this data further supports using this CBT-based intervention as an effective, long-lasting method of improving self-esteem and neuro-wellness.

Data availability

The datasets generated and analyzed during the current study are available in the figshare repository, https://doi.org/10.6084/m9.figshare.27022297.

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Author contributions

D.A.L., L.S., and G.D. designed the study, provided supervision and wrote the article. A.N. performed the research. A.G. analyzed the data. All authors read and approved the final paper.

Declarations

Competing interests

G.D. is the cofounder of GGtude Ltd and has a financial interest in the app described in this paper. Data analyses were conducted by members of the team unaffiliated with GGtude Ltd. All the remaining authors have no conflicts of interest to declare.

Additional information

Correspondence and requests for materials should be addressed to G.D.

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