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Evidence-based Umbrella Review of Cognitive Effects of Prefrontal

tDCS

Running title: Umbrella review on tDCS and cognition

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ABSTRACT

Transcranial direct current stimulation (tDCS) is a non-invasive brain stimulation approach which has been increasingly used as an investigational tool in neuroscience. In social and affective neuroscience research, the prefrontal cortex has been primarily targeted, since this brain region is critically involved in complex psychobiological processes subserving both "hot" and "cold" domains. Although several studies have suggested that prefrontal tDCS can enhance neuropsychological outcomes, metaanalyses have reported conflicting results. Therefore, we aimed to assess the available evidence by performing an umbrella review (UR). We evaluated the effects of prefrontal active vs. sham tDCS on different domains of cognition among healthy and neuropsychiatric individuals. AMSTAR-2 was employed to evaluate the quality of systematic reviews and meta-analyses and the GRADE system was employed to grade the quality of evidence. PubMed/MEDLINE, PsychINFO and the Cochrane Database of Systematic Reviews were searched, and 11 meta-analyses were included resulting in 55 comparisons. Only 16 comparisons reported significant effects favoring tDCS, but 13 of them had either a very low or low quality of evidence. Systematic reviews were rated as having critically low and low quality. Among several reasons to explain these findings, the lack of consensus and reproducibility in tDCS research is discussed.

Keywords

Umbrella review; non-invasive brain stimulation; cognition; psychology; psychiatry; reproducibility.

INTRODUCTION

Transcranial direct current stimulation (tDCS) is a non-invasive brain stimulation technique that consists on the application of weak, electric currents over the scalp (Brunoni *et al.*, 2012). Since the seminal study of Nitsche and Paulus (2000), which showed that tDCS promoted polarity-dependent changes in motor cortical excitability according to the parameters of stimulation, the technique has been investigated as a clinical and research tool in neuropsychology (Shin *et al.*, 2015) and neuropsychiatry (Moffa *et al.*, 2018; Brunoni *et al.*, 2019).

For these conditions, the prefrontal cortex (PFC) has been the preferential target of tDCS, since it is the brain region primarily involved in more complex psychological processes, including cognitive and emotional domains (Shin et al., 2015). In fact, several studies have investigated the effects of prefrontal tDCS on neuropsychological outcomes, such as working memory (Oliveira et al., 2013), cognitive control (Wolkenstein and Plewnia, 2013), vigilance to threat (Ironside et al., 2016), and rumination (Kuhn et al., 2012), mostly showing significant results. Nonetheless, nonsignificant results have also been found, with a recent meta-analysis suggesting that the net tDCS effects on cognition are null (Horvath et al., 2015). Several reasons could explain these heterogeneous findings, such as differences in tDCS montage, stimulation parameters and anatomical and functional individualities (Brunoni et al., 2012; Bikson et al., 2018; Chase et al., 2019). Issues in the design of tDCS studies also harm their internal validity, such as underpowered sample sizes (Medina and Cason, 2017) and methodological challenges in effective sham blinding (Fonteneau et al., 2019). To a broader extent, biases in cognitive sciences have been increasingly more common, with contradictory and non-replicable findings (Ioannidis et al., 2014). For instance, an attempt to reproduce the findings of 100 experimental and correlation studies in psychological science, using high-powered designs, was able to replicate approximately one-third of the them (Open Science Collaboration, 2015), which is suggestive of a "reproducibility crisis" on the field.

Recently, umbrella reviews (URs) have been introduced as a new metaanalytical modality in evidence-based synthesis (Fusar-Poli and Radua, 2018). They are reviews of previous systematic reviews and meta-analyses that use standardized methods to assess and compare the evidence of included studies. Examples of these methods include performing a systematic review of the literature, using common effect sizes, assessing heterogeneity, grading the quality of evidence and presenting new research avenues based on the assessed evidence (Fusar-Poli and Radua, 2018). In fact, they represent a higher level of evidence than meta-analyses that can also present biases and reach discrepant conclusions (Ioannidis, 2009). For these reasons, URs are becoming increasingly in the biomedical field (Fusar-Poli and Radua, 2018) as a method to synthesize highest-quality evidence. Considering the discrepant findings of meta-analyses examining the effects of tDCS on "hot" and "cold" cognition, an UR could be useful to critically assess the quality and availability of the evidence. Notwithstanding, no such study has been performed so far.

Therefore, our aim was to perform an UR of meta-analyses that examined the effects of prefrontal tDCS on cognition. Our study is important to provide critical, high-quality evidence of a commonly used tDCS application in neuropsychology, which can help better guiding and tailoring new studies according to our findings.

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METHODS

Search strategy and inclusion criteria for the UR

The protocol for this systematic review was pre-registered at PROSPERO (CRD42020140779). The electronic databases of PubMed, PsycINFO, and the Cochrane Database of Systematic Reviews (CDSR) were searched on April, 2019 for relevant references. Search strategies were tailored for each database and detailed descriptions can be found on the supplemental material. The search strategy was limited to meta-analyses in each one of the databases. The references section of review articles and meta-analyses were carefully read to look for additional references. No language restrictions were applied. No further efforts were made to search for unpublished research.

Titles and abstracts of references were screened by two independent reviewers (ARB, LCF) to identify those that were eligible for inclusion. Inclusion criteria were determined through the PICO (population, intervention, control and outcome) format; specifically, meta-analyses had to evaluate the comparative effects of prefrontal tDCS against sham tDCS on cognitive domains in healthy or neuropsychiatric individuals. No restrictions were made regarding age; diagnoses, i.e. any neuropsychiatric disorder was eligible for inclusion, e.g. depression, attention-deficit hyperactivity disorder, eating disorders, Parkinson's disease, etc.; polarity of tDCS, i.e. anodal tDCS (a-tDCS) and cathodal tDCS (c-tDCS) were eligible; number of treatment sessions; timing of outcome measurement, i.e. online and offline designs, when the study outcomes were measured during and after tDCS session, respectively, were eligible; cognitive domains, i.e. any cognitive domain reported in the eligible meta-analysis were included in the UR. Only

meta-analyses were eligible for our UR as we were interested on the effect sizes of tDCS interventions over the prefrontal cortex.

Data extraction, methodological quality assessment and appraisal of the evidence

Data were extracted by two independent reviewers (ARB, LCF); any disagreement was solved through discussing and obtaining more information from study investigators. For each comparison from eligible meta-analyses, the following data were extracted: first author, year of publication, cognitive domain, cognitive tasks, number of studies included, pooled effect sizes – either standardized mean difference (SMD) or Hedges' g – with their 95% confidence intervals (95% CIs) and I² values. If the Q-statistic was provided, I² was calculated as recommended by the Cochrane Handbook of Systematic Reviews of Interventions. Data were extracted in Summary of Finding (SoF) tables from the GRADEpro GDT (Grading of Recommendations, Assessment, Development and Evaluation Guideline Development Tool). The GRADEpro GDT can be accessed through the link www.gradepro.org and is the official GRADE working group software for the production of SoF tables. SoF tables are tabular presentations of key information about relevant outcomes of health care interventions. For this UR, separate SoF tables were created for healthy and neuropsychiatric populations, as well as for a-tDCS, c-tDCS and tDCS.

The GRADE approach was employed (The GRADE Working Group, 2013) to rate the quality of evidence of every comparison from each eligible meta-analysis. The GRADE approach is a system for rating the quality of evidence in systematic reviews and/or meta-analysis, providing four grades depending on the certainty that the true effect is close to the effect size estimate: high, moderate, low and very low. It considers five reasons to possibly rate down, and three to possibly rate up, the quality of evidence. Factors that rate down quality of evidence are (a) risk of bias (RoB); (b) inconsistency

of results (c) indirectness of evidence, (d) imprecision and (e) publication bias. Factors that rate up the quality of evidence are (a) large magnitude of effect, (b) dose-response gradient and (c) effect of plausible residual confounding. A GRADE checklist to aid in the consistency and reproducibility of the GRADE approach was also employed (Meader et al., 2014). Quality of evidence was evaluated at the comparison-level based on what was reported in each meta-analysis, and information from the trials included in each meta-analysis were not retrieved. A strict approach was employed to grade the quality of evidence to avoid validating results that were not of the highest possible quality. For instance, if statistical test for heterogeneity and/or I^2 values were not reported, the quality of evidence was downgraded due to serious inconsistency regardless of the distribution of effect sizes and 95% CI – those could only contribute to rate down further the quality of evidence due to very serious inconsistency. For RoB, a meta-analysis was considered to have not properly examined RoB if it did not perform a quality assessment of the included studies, i.e. if it did not check for methodological procedures that minimize biases, such as proper randomization, allocation concealment, blinding, attrition, and incomplete or selective reporting, as described in the Cochrane guidelines for Risk of Bias assessment (Higgins et al., 2011; Sterne et al., 2019); quality of evidence was systematically rated down due to serious RoB if RoB was not properly examined. For publication bias, if meta-analyses did not evaluate publication bias either through funnel plot asymmetry or statistical criteria, quality of evidence was rated down due to strong suggestion of publication bias. Additionally, adjusted effect sizes, e.g. through the trim-and-fill method, were not considered a solution to the identified publication bias as these are simulations with issues of their own (Guyatt et al., 2011) and quality of evidence was downgraded regardless of whether such imputation approaches were employed or not; similarly, considering recommendations from the

Cochrane Handbook of Systematic Reviews of Interventions, the fail-safe number was not considered an adequate assessment of publication bias when employed alone. For comparisons which included individuals with different neuropsychiatric disorders, quality of evidence was systematically rated down due to serious indirectness.

The methodological quality of each included meta-analysis was rated with the A MeaSurement Tool to Assess systematic Reviews 2 (AMSTAR-2) (Shea *et al.*, 2017), a 16-item tool employed to help in the evaluation of the reporting quality of systematic reviews. A detailed description of the AMSTAR 2 methodology can be found at the online-only supplemental material. The online AMSTAR-2 checklist available at https://amstar.ca/Amstar_Checklist.php was employed to apply the AMSTAR-2 methodology to each meta-analysis included in the UR.

RESULTS

Study selection and included meta-analysis

Figure 1 illustrates the PRISMA flowchart representing the selection of studies for this UR. Of the 40 references excluded through screening of titles and abstracts, 16 were excluded as prefrontal tDCS was not the intervention studied (Rodriguez-Martin *et al.*, 2002; Rodriguez-Martin *et al.*, 2003; Medical Advisory Secretariat, 2004; Phillips and McFerran, 2010; Poulet *et al.*, 2010; Hoekstra *et al.*, 2011; Meng *et al.*, 2011; Baldo *et al.*, 2012; Hobson *et al.*, 2012; Hilton *et al.*, 2013; Li *et al.*, 2014; Dougall *et al.*, 2015; Luvizutto *et al.*, 2015; Stevens *et al.*, 2016; Pievani *et al.*, 2017; Hsu *et al.*, 2018), 16 were excluded as the outcome evaluated was not a cognitive function (O'Connell *et al.*, 2010; Luedtke *et al.*, 2012; Tsoi *et al.*, 2013; Brunoni *et al.*, 2014; Vaseghi *et al.*, 2014; Brunoni *et al.*, 2015; Cruccu *et al.*, 2016; Elsner *et al.*, 2016; Hou *et al.*, 2016; McMillan *et al.*, 2016; Zhu *et al.*, 2017; Aleman *et al.*, 2018; Kennedy *et al.*, 2018; Machado *et al.*, 2018; Mutz *et al.*, 2018; Soares-Weiser *et al.*, 2018) and 8 studies were excluded as they were not meta-analyses (Micoulaud Franchi *et al.*, 2015; Martin *et al.*, 2016; Palm *et al.*, 2016; Hall *et al.*, 2017; Katz *et al.*, 2017; Bieck *et al.*, 2018; Lee *et al.*, 2018; Rubia, 2018; Boayue *et al.*, 2019). Of the nine references excluded through reading the full text, two reported results also presented in another paper which was already included in the UR (Dedoncker *et al.*, 2016a; Hall *et al.*, 2017), three did not report results from an independent comparison between active and sham prefrontal tDCS (Jansen *et al.*, 2013; Brunoni and Vanderhasselt, 2014; Song *et al.*, 2018) and four did not carry out meta-analyses (Khalighinejad *et al.*, 2016; Lupi *et al.*, 2017; Greenwood *et al.*, 2018; Schluter *et al.*, 2018).

Therefore, only 11 articles were included in this UR (Horvath *et al.*, 2015; Price *et al.*, 2015; Dedoncker *et al.*, 2016b; Hill *et al.*, 2016; Mancuso *et al.*, 2016; Lowe *et al.*, 2017; Nilsson *et al.*, 2017; Bell and DeWall, 2018; Imburgio and Orr, 2018; Mostafavi *et al.*, 2018; Salehinejad *et al.*, 2019). These 11 meta-analyses yielded 55 comparisons distributed across the 12 cognitive domains; specifically, working memory, [long-term] memory, set shifting, response inhibition, language, aggression, overeating/food cravings, emotional and implicit bias, honesty, rumination, impulsivity and risk-taking were the cognitive domains reported in these meta-analyses and were therefore included in our UR. The respective tasks for each one of these cognitive domains are depicted in Table 1. Of the 55 comparisons, 41 (~75%) were carried out among exclusively healthy individuals and another 7 (~13%) were carried out among a mixed population of healthy and neuropsychiatric individuals; therefore, only 7 comparisons (~13%) were carried out among exclusively neuropsychiatric individuals. Table 2 illustrates the methodological quality assessment of each meta-analysis while Table 3 describes the characteristics and quality of evidence assessment of each comparison among healthy (Table 3A), neuropsychiatric (Table 3B) and both healthy and neuropsychiatric (Table 3C) individuals.

Anodal tDCS

Working memory

Six meta-analyses (Horvath *et al.*, 2015, Hill *et al.*, 2016, Mancuso *et al.*, 2016, Nilsson *et al.*, 2017, Imburgio and Orr, 2018, Salenijehad *et al.* 2019) resulting in 13 comparisons, 10 among healthy and 3 among neuropsychiatric individuals, evaluated the effects of prefrontal a-tDCS on working memory performance. AMSTAR-2 quality assessment indicated that these reviews varied from critically low to low quality.

Among healthy individuals, all 10 comparisons targeted the DLPFC; in 7 comparisons, both offline and online designs were included; besides, in 8 comparisons, only single-session design studies were included whereas in the remaining 2 multiple sessions design with adjuvant working memory training studies were included.

The mean number of studies and individuals in the single-session design comparisons were 16.25 (range 8-32) and 457.5 (range 167-914), respectively. Of these 8 comparisons, 4 reported a significant effect favoring a-tDCS (ES = 0.56, 95% CI [0.19, 0.93], p < 0.01; ES = 0.17, 95% CI [0.03, 0.30], p = not reported; ES = 0.15, 95% CI [0.02, 0.28], p = 0.02; ES = -0.15, 95% CI [-0.29, -0.01], p = 0.003), but GRADE assessment of quality of evidence indicated moderate and low certainty that the true effect is close to these estimates as quality of evidence was rated down to "moderate" due to serious RoB (RoB was either not assessed or there was evidence of significant unclear RoB regarding randomization, allocation concealment and blinding) for all four comparisons and to "low" due to the serious imprecision (relatively small number of

trials [N = 10] and individuals [n = 354]) for one of these comparisons and due to the strong suggestion of publication bias (funnel plot asymmetry was identified) for another comparison. The remaining 4 comparisons yielded non-significant findings, and GRADE assessment of quality of evidence indicated very low certainty that the true effect is close to these estimates as quality of evidence was rated down to "moderate" due to serious RoB (RoB was not assessed), to "low" due to the strong suggestion of publication bias (publication bias was either not assessed or funnel plot asymmetry was identified) and to "very low" due to the serious imprecision (relatively small number of trials [N = 8] and individuals [n = 283/167]) for all five comparisons.

The mean number of studies and individuals in the 2 multiple-session design comparisons with adjuvant working memory training were 8.5 (range 7-10) and 275.5 (range 266 – 285), respectively. Only one comparison reported a small significant effect favoring a-tDCS (ES = 0.29, 95% CI [0.06, 0.52], p not reported), but GRADE assessment of quality of evidence indicated very low certainty that the true effect is close to this estimate as quality of evidence was rated down to "moderate" due to the strong suggestion of publication bias (funnel plot asymmetry was identified), to "low" due to serious RoB (RoB was not assessed) and to "very low" due to serious imprecision (relatively small number of trials [N = 10] and individuals [n = 285]). The remaining comparison yielded a non-significant effect, and GRADE assessment of quality of evidence was rated down to "moderate" due to this estimate; quality of evidence was rated down to "moderate" due to this estimate; quality of evidence was rated down to "moderate" due to serious RoB (RoB was not assessed) and to "low" due to serious RoB (RoB was not moderate") due to serious RoB (RoB was not assessed) and to "low" due to serious imprecision (relatively small number of trials [N = 10] and individuals [n = 285]). The remaining comparison yielded a non-significant effect, and GRADE assessment of quality of evidence was rated down to "moderate" due to serious RoB (RoB was not assessed) and to "low" due to serious imprecision (relatively small number of trials [N = 7] and individuals [n = 266] included).

Among neuropsychiatric individuals, all three comparisons targeted the DLPFC in a single-session design and included both an offline and online design. The mean number of studies and individuals included in these comparisons were 12 (range 8 - 16) and 491 (range 232 - 860), respectively. None of the three comparisons yielded significant effects, and GRADE assessment of quality of evidence indicated low and very low certainty that the true effect is close to these estimates. Quality of evidence was rated down to "moderate" due to serious RoB (there was evidence of significant unclear RoB regarding randomization, allocation concealment and/or blinding) for the three comparisons and to "low" due to serious indirectness (data included was from a sample with diverse neuropsychiatric individuals) for two comparisons and due to the strong suggestion of publication bias (publication bias was not evaluated) for the other comparison. Quality of evidence was rated down further to "very low" due to serious imprecision (relatively small number of trials [N = 8] and individuals [n = 232]) for one of these comparisons and due to serious inconsistency (effect size estimates from individual studies varied considerably with relatively little overlap of CIs) for another of these comparisons.

[Long-term] memory

One meta-analysis (Horvath *et al.*, 2015) resulting in one comparison among healthy individuals evaluated the effects of prefrontal a-tDCS on [long-term] memory. AMSTAR-2 quality assessment indicated that this review was of critically low quality. The comparison targeted the DLPFC and only included an online design. A small number of trials (N = 3) and individuals (n = 104) were included. No significant effects were reported, and GRADE assessment of quality of evidence indicated very low certainty that the true effect is close to this estimate as quality of evidence was rated down to "low" due to very serious imprecision (relatively small number of trials [N = 3] and individuals [n = 104]; extremely large 95% CI [-0.87, 2.94]) and to "very low" due to the strong suggestion of publication bias (publication bias was not evaluated).

Set shifting and response inhibition

Three meta-analyses (Horvath *et al.*, 2015, Imburgio and Orr, 2018, Salehinejad *et al.* 2019) resulting in 8 comparisons, 7 among healthy and 1 among neuropsychiatric individuals, evaluated the effects of prefrontal a-tDCS on set shifting and response inhibition. AMSTAR-2 quality assessment indicated that these reviews were of critically low quality. Among healthy individuals, 2 comparisons evaluated set shifting whereas the remaining 5 evaluated response inhibition; among neuropsychiatric individuals, only response inhibition was evaluated.

For set shifting, both comparisons among healthy individuals targeted the DLPFC; one included offline and online designs whereas the other only included offline designs. The mean number of studies and individuals in both comparisons were 8 (range 3 - 13) and 430 (range 212 - 648). None of the two comparisons yielded significant effects, and GRADE assessment of quality of evidence indicated very low certainty that the true effect is close to these estimates as quality of evidence was rated down to "moderate" due to serious RoB (RoB was not assessed) and to "low" due to serious inconsistency (either heterogeneity was not assessed statistically or was considerable [I² = 69.92%]) for both comparisons; quality of evidence was rated down further to "very low" due to the strong suggestion of publication bias (publication bias was not assessed) for one comparison and due to serious imprecision (effect size estimate with wide 95% CI [-0.68, 0.59]) for the other comparison. For response inhibition, of the 5 comparisons among healthy individuals, 3 targeted the DLPFC and 2 the IFG; 1 included offline and online designs, whereas 4 only included offline designs. The mean number of studies

and individuals in these five comparisons were 3.83 (range 2 - 13) and 141 (range 55 - 616). None of these five comparisons yielded significant effects and GRADE assessment of quality of evidence indicated low and very low certainty that the true effect is close to these estimates. Quality of evidence was rated down to "moderate" due to serious RoB (RoB was not assessed) and to "low" due to serious inconsistency (either heterogeneity was not assessed statistically or effect size estimates from individual studies varied considerably with relatively little overlap of CIs) for all five comparisons; quality of evidence was rated down further to "very low" due to strong suggestion of publication bias (publication bias was not assessed) for four comparisons.

For response inhibition, the comparison among neuropsychiatric individuals targeted the DLPFC and IFG and included offline and online designs. The number of trials and individuals included were 34 and 1404, respectively; only individuals with attention-deficit hyperactivity disorder were included. This comparison reported a small significant effect favoring a-tDCS (ES = 0.23, 95% CI [0.07 – 0.40], p = 0.0065), and GRADE assessment of quality of evidence indicated very low certainty that the true effect is close to this estimate as quality of evidence was rated down to "moderate" due to serious RoB (there was evidence of significant unclear RoB in blinding outcome assessment), to "low" due to serious inconsistency (effect size estimates from individual studies varied considerably) and to "very low" due to the strong suggestion of publication bias (publication bias was not assessed).

Memory/attention/executive functioning

One meta-analysis (Dedoncker *et al.*, 2016) resulting in 6 comparisons, 2 among healthy, 2 among neuropsychiatric and 2 among both healthy and neuropsychiatric individuals, evaluated the effects of prefrontal a-tDCS on memory/attention/executive

functioning. AMSTAR-2 quality assessment indicated that this review was of low quality.

Among healthy individuals, both comparisons targeted the DLPFC and included offline and online designs. The mean number of trials and individuals included were 116.5 (range 102 - 131) and 3942.5 (range 3470 - 4415), respectively. One of the two comparisons reported a small significant effect favoring a-tDCS (ES = -0.10, 95% CI [-0.16, -0.04], p < 0.01) and GRADE assessment of quality of evidence indicated moderate certainty that the true effect is close to this estimate as quality of evidence was rated down to "moderate" due to serious RoB (only 6/61 studies included in the Dedoncker *et al.*, 2016 meta-analysis had a low risk of allocation concealment bias). The remaining comparison reported a non-significant effect, and GRADE assessment of quality of evidence was rated down to "moderate down to moderate certainty that the true effect a non-significant effect, and GRADE assessment of quality of evidence also indicated moderate certainty that the true effect is close to this estimate as quality of evidence was rated down to "moderate" due to serious RoB (only 6/61 studies included in the Dedoncker *et al.*, 2016 meta-analysis had a low risk of allocation concealment bias).

Among neuropsychiatric individuals, both comparisons targeted the DLPFC and included offline and online designs. The mean number of trials and individuals included were 26 (range 22-30) and 802 (range 660 – 944), respectively. One of these comparisons reported a small significant effect favoring a-tDCS (ES = 0.22, 95% CI [0.04, 0.40], p < 0.05), but GRADE assessment of quality of evidence indicated very low certainty that the true effect is close to this estimate as quality of evidence was rated down to "moderate" due to serious RoB (only 6/61 studies included in the Dedoncker *et al.*, 2016 meta-analysis had a low risk of allocation concealment bias), to "low" due to serious indirectness (data included was from a sample with diverse neuropsychiatric individuals) and to "very low" due to serious inconsistency ($I^2 = 42.5\%$). The remaining

comparison reported a non-significant effect, and GRADE assessment of quality of evidence indicated low certainty that the true effect is close to its estimate as quality of evidence was rated down to "moderate" due to serious RoB (only 6/61 studies included in the Dedoncker *et al.*, 2016 meta-analysis had a low risk of allocation concealment bias) and to "low" due to serious indirectness (data included was from a sample with diverse neuropsychiatric individuals).

Among both healthy and neuropsychiatric individuals, both comparisons targeted the DLPFC and included both offline and online designs. The mean number of trials and individuals included were 144.5 (range 124 – 165) and 4,744.5 (range 4,130 – 5,359), respectively. The two comparisons reported small significant effects favoring a-tDCS (ES = 0.18, 95% CI [0.03, 0.18], p < 0.01; ES = -0.11, 95% CI [-0.17, -0.05], p < 0.01) and GRADE assessment of quality of evidence indicated very low and low certainty that the true effect is close to these estimates as quality of evidence was rated down to "moderate" due to serious RoB (only 6/61 studies included in the Dedoncker *et al.*, 2016 meta-analysis had a low risk of allocation concealment bias) and to "low" due to serious indirectness for both comparisons (data included was from a sample with diverse neuropsychiatric individuals); quality of evidence was rated down further to "very low" due to serious inconsistency (I² = 52.5%) for one comparison.

Language

Two meta-analyses (Horvath *et al.*, 2015 and Price *et al.*, 2015) resulting in five comparisons, all among healthy individuals, evaluated the effects of prefrontal a-tDCS on language. AMSTAR-2 quality assessment indicated that these reviews were of critically low quality. All 5 comparisons targeted the lPFC/DLPFC; 3 included only offline designs whereas the remaining 2 included only online designs.

For the 3 offline comparisons, the mean number of studies and individuals included were 4 (range 3-7) and 115.3 (range 58 - 208). Only one comparison yielded a small-to-moderate significant effect favoring a-tDCS (ES = 0.48, 95% CI [0.35, 0.92], p not reported), but GRADE assessment of quality of evidence indicated very low certainty that the true effect is close to this estimate as quality of evidence was rated down to "moderate" due to serious imprecision (small number of studies [N = 3] and individuals [n = 80] included), to "low" due to strong suggestion of publication bias (publication bias was not assessed) and to "very low" due to serious inconsistency indicated very low certainty that the true effects, and GRADE assessment of quality of evidence indicated very low certainty that the true effect is close to these estimates as quality of evidence indicated very low certainty that the true effect is close to these estimates as quality of evidence indicated very low certainty that the true effect is close to these estimates as quality of evidence indicated very low certainty that the true effect is close to these estimates as quality of evidence indicated very low certainty that the true effect is close to these estimates as quality of evidence indicated very low certainty that the true effect is close to these estimates as quality of evidence indicated lown due to serious imprecision (small number of studies [N = 2, 7] and individuals [n = 58, 208] included), to "low" due to strong suggestion of publication bias (publication bias was not assessed) and to "very low" due to serious inconsistency (heterogeneity was not assessed) and to "very low" due to serious inconsistency (heterogeneity was not assessed) and to "very low" due to serious inconsistency (heterogeneity was not assessed statistically) for both comparisons.

For the 2 online comparisons, the mean number of studies and individuals included were 3 (range 3 - 3) and 100 (range 100 - 100). None of the two comparisons yielded significant findings, and GRADE assessment of quality of evidence indicated very low certainty that the true effect is close to these estimates as quality of evidence was rated down due to significant imprecision (small number of studies and individuals included), to "low" due to strong suggestion of publication bias (publication bias was not assessed) and to "very low" due to significant inconsistency (heterogeneity was not assessed statistically).

Aggression

One meta-analysis (Bell and DeWall, 2018) resulting in one comparison among healthy individuals evaluated the effects of prefrontal a-tDCS on aggression. AMSTAR-2 quality assessment indicated that this review was of critically low quality. The comparison evaluated a-tDCS, targeted the DLPFC and included both an offline and an online design. The number of studies and individuals included were 6 and 339, respectively. The comparison yielded a non-significant finding, and GRADE assessment of quality of evidence indicated very low certainty that the true effect is close to this estimate as quality of evidence was rated down to "moderate" due to serious RoB (RoB was not assessed), to "low" due to serious imprecision (relatively small number of studies and individuals included) and to "very low" due to serious inconsistency (effect size estimates from individual studies varied considerably with relatively little overlap of CIs)

Overeating

One meta-analysis (Bell and DeWall, 2018) resulting in one comparison among healthy individuals evaluated the effects of prefrontal a-tDCS on overeating. AMSTAR-2 quality assessment indicated that this review was of critically low quality. The comparison targeted the DLPFC and included both offline and online designs. The number of trials and individuals included were 6 and 339, respectively. This comparison reported a small treatment effect favoring a-tDCS (ES = -0.25, 95% CI [-0.49, -0.01], p = 0.03), and GRADE assessment of quality of evidence indicated very low certainty that the true effect is close to this estimate, as quality of evidence was rated down to "moderate" due to serious RoB (RoB was not assessed), to "low" due to serious imprecision (relatively small number of trials and individuals included) and to "very low" due to strong suggestion of publication (funnel plot asymmetry was identified).

Emotional and implicit bias

Two meta-analyses (Horvath et al., 2015, Bell and DeWall, 2018) resulting in five comparisons among healthy individuals evaluated the effects of prefrontal a-tDCS on emotional and implicit bias; AMSTAR-2 quality assessment indicated that these reviews were of critically low quality. All comparisons targeted the DLPFC; four only included an online design and one included both an offline and an online design. Four of them only evaluated emotional bias whereas one of them included both emotional and implicit bias measures. The mean number of studies and individuals included were 3.2 (range 2 - 7) and 169 (range 88 - 447), respectively. One of the comparisons, the one which included mixed outcomes, reported a small significant effect favoring atDCS (ES = -0.25, 95% CI [-0.48, -0.03], p = 0.02). GRADE assessment of quality of evidence indicated low certainty that the true effect is close to this estimate; quality of evidence was rated down to "moderate" due to serious RoB (RoB was not assessed) and to "low" due to serious imprecision (relatively small number of trials [N = 7] and individuals [n = 447] included). The remaining four comparisons yielded nonsignificant findings, and GRADE assessment of quality of evidence indicated very low certainty that the true effect is close to these estimates as quality of evidence was rated down to "moderate" due to serious inconsistency (heterogeneity was not assessed statistically), to "low" due to serious RoB (RoB was not assessed) and to "very low" due to strong suggestion of publication bias (publication bias was not assessed).

Honesty

One meta-analysis (Bell and DeWall, 2018) resulting in one comparison among healthy individuals evaluated the effects of prefrontal a-tDCS on honesty. AMSTAR-2

quality assessment indicated that this review was of critically low quality. The comparison evaluated a-tDCS, targeted the DLPFC and included both an online and an offline design. The number of studies and individuals included were 4 and 322, respectively. The comparison yielded a non-significant finding, and GRADE assessment of quality of evidence indicated low certainty that the true effect is close to this estimate as quality of evidence was rated down to "moderate" due to serious imprecision (relatively small number of trials and individuals included) and to "low" due to serious RoB (RoB was not assessed).

Rumination

One meta-analysis (Horvath *et al.*, 2015) resulting in one comparison among healthy individuals evaluated the effects of prefrontal a-tDCS on rumination. AMSTAR-2 quality assessment indicated that this review was of critically low quality. The comparison targeted the DLPFC and included only online designs. The number of studies and individuals included were 2 and 126, respectively. The comparison yielded a non-significant finding, and GRADE assessment of quality of evidence indicated very low certainty that the true effect is close to this estimate as quality of evidence was rated down to "moderate" due to serious inconsistency (heterogeneity was not assessed statistically), to "low" due to serious RoB (RoB was not assessed) and to "very low" due to strong suggestion of publication bias (publication bias was not assessed).

Impulsivity

One meta-analysis (Bell and DeWall, 2018) resulting in one comparison among healthy individuals evaluated the effects of prefrontal a-tDCS on impulsivity. AMSTAR-2 quality assessment indicated that this review was of critically low quality. The comparison evaluated a-tDCS, targeted the DLPFC and included both an offline and an online design. The number of studies and individuals included were 9 and 676, respectively. The comparison yielded a non-significant finding and GRADE assessment of quality of evidence indicated low certainty that the true effect is close to this estimate as quality of evidence was rated down to "moderate" due to serious RoB (RoB was not assessed) and to "low" due to serious inconsistency (effect size estimates from individual studies varying considerable with relatively little overlap of CIs).

Risk-taking

Two meta-analyses (Horvath et al., 2015, Bell and DeWall, 2018) resulting in two comparisons, all among healthy individuals, evaluated the effects of prefrontal a-tDCS on risk-taking. AMSTAR-2 quality assessment indicated that these reviews were of critically low quality. Both comparisons targeted the DLPFC and while one only included online designs, the other one included both offline and online designs. The number of studies and individuals included were 8 (range 3-13) and 376 (range 76 -676), respectively. One of the comparisons yielded a small, significant effect in favor of a-tDCS (ES = -0.36, 95% CI [-0.65, -0.07], p = 0.01), but GRADE assessment of quality of evidence indicated very low certainty that the true effect is close to this estimate as quality of evidence was rated down to "moderate" due to due to strong suggestion of publication bias (funnel plot asymmetry was identified), to "low" due to serious RoB (RoB was not assessed) and to "very low" due to serious inconsistency (I² 65.5%). The remaining comparison yielded non-significant findings, and GRADE assessment of quality of evidence indicated very low certainty that the true effect is close to this estimate as quality of evidence was rated down to "moderate" due to serious inconsistency (heterogeneity was not assessed), to "low" due to serious RoB

(RoB was not assessed) and to "very low" due to strong suggestion of publication bias (publication bias was not assessed).

Cathodal tDCS

[Long-term] memory

One meta-analysis (Horvath *et al.*, 2015) resulting in one comparison among healthy individuals evaluated the effects of prefrontal c-tDCS on [long-term] memory. AMSTAR-2 quality assessment indicated that this review was of critically low quality. The comparison targeted the DLPFC and only included online designs. A small number of trials (N = 3) and individuals (n = 103) were included. No significant effects were reported, and GRADE assessment of quality of evidence indicated very low certainty that the true effect is close to this estimate as quality of evidence was rated down to "moderate" due to strong suggestion of publication bias (publication bias was not assessed), to "low" due to the serious heterogeneity (heterogeneity was not accessed statistically) and to "very low" due to serious RoB (RoB was not assessed).

Response inhibition

One meta-analysis (Salehinejad *et al.*, 2019) resulting in one comparison among neuropsychiatric individuals evaluated the effects of prefrontal c-tDCS on response inhibition. AMSTAR-2 quality assessment indicated that this review was of critically low quality. The comparison targeted the DLPFC and included both offline and online designs. A small number of trials (N = 13) and individuals (N = 468) were included. No significant effects were reported, and GRADE assessment of quality of evidence indicated very low certainty that the true effect is close to this estimate, as quality of evidence was rated down to "moderate" due to serious RoB (there was evidence of significant unclear RoB in blinding outcome assessment), to "low" due to serious inconsistency (effect size estimates from individual studies varied considerably with relatively little overlap of CIs) and to "very low" due to the strong suggestion of publication bias (publication bias was not assessed).

Memory/attention/executive functioning

One meta-analysis (Dedoncker *et al.*, 2016) resulting in two comparisons among both healthy and neuropsychiatric individuals evaluated the effects of prefrontal c-tDCS on memory/attention/executive functioning. AMSTAR-2 quality assessment indicated that this review was of low quality. The two comparisons included a mean number of studies and individuals of 32 (range 28 – 36) and 1,062 (range 942 – 1,182), respectively. None of them yielded significant effects and GRADE assessment of quality of evidence indicated very low certainty that the true effect is close to these estimates as quality of evidence was rated down to "moderate" due to serious RoB (only 6/61 studies included in the Dedoncker *et al.*, 2016 meta-analysis had a low risk of allocation concealment bias) and to "very low" due to very serious inconsistency ($I^2 =$ 82.5% or $I^2 = 33.8\%$ with effect size estimates from individual studies varying considerable with relatively little overlap of CIs) for both comparisons.

Emotional bias

One meta-analysis (Horvath *et al.*, 2015) resulting in two comparison among healthy individuals evaluated the effects of prefrontal c-tDCS on emotional bias. AMSTAR-2 quality assessment indicated that this review was of critically low quality. Both comparisons targeted the DLPFC and included online designs. The mean number of studies and individuals included were 2 (range 2 - 2) and 88 (range 88 - 88), respectively. None of the comparisons reported significant effects, and GRADE assessment of quality of evidence indicated very low certainty that the true effect is close to these estimates; quality of evidence was rated down to "moderate" due to serious inconsistency (heterogeneity was not assessed statistically), to "low" due to serious RoB (RoB was not assessed) and to "very low" due to strong suggestion of publication bias (publication bias was not assessed).

Risk taking

One meta-analysis (Horvath *et al.*, 2015) resulting in one comparison among healthy individuals evaluated the effects of prefrontal c-tDCS on risk taking. AMSTAR-2 quality assessment indicated that this review was of critically low quality. The comparison targeted the DLPFC and only included online designs. A small number of trials (N = 3) and individuals (n = 126) were included. No significant effects were reported, and GRADE assessment of quality of evidence indicated very low certainty that the true effect is close to this estimate as quality of evidence was rated down to "moderate" due to strong suggestion of publication bias (publication bias was not assessed), to "low" due to the serious heterogeneity (heterogeneity was not accessed statistically) and to "very low" due to serious RoB (RoB was not assessed).

tDCS

Three comparisons from two meta-analyses (Mostafavi *et al.*, 2018; Lowe *et al.*, 2017) did not report separate effect sizes for c-tDCS and a-tDCS, but rather analyzed results from both c-tDCS and a-tDCS together. All of these three comparisons evaluated the effects of prefrontal t-DCS on food cravings, targeted the DLPFC and included a

mixed population of healthy and neuropsychiatric individuals. The mean number of studies and individuals included were 7.66 (range 4 - 13) and 264 (range 145 - 416), respectively. Two comparisons yielded moderate-to-large significant effects (ES = -0.54, 95% CI [-0.85, -0.24], p < 0.001; ES = -0.78, 95% CI [-1.12, -0.44], p < 0.001), but GRADE assessment of quality of evidence indicated very low certainty that the true effect is close to these estimates as quality of evidence was rated down to "moderate" due to serious RoB (RoB was not assessed), to "low" due to serious indirectness (data included was from a sample with diverse neuropsychiatric individuals) and to "very low" due to serious imprecision (small number of studies [N = 4] and individuals [n = 4]145] included) for one comparison and due to serious inconsistency ($I^2 = 71.4\%$) for the other comparison. The remaining comparison yielded non-significant findings, and GRADE assessment of quality of evidence indicated very low certainty that the true effect is close to this estimate as quality of evidence was rated down to "moderate" due to strong suggestion of publication bias (funnel plot asymmetry was identified) and to " very low" due to the very serious imprecision (effect size estimates with wide 95% CI [-0.80, 0.29] and a small number of trials and individuals included).

DISCUSSION

This study provides a critical assessment of the available evidence regarding the effects of prefrontal tDCS on cognition. We identified previously published metaanalyses on the topic through a systematic literature search and rated the quality of meta-analyses included as well as of each included comparison evaluating the effects of either a-tDCS, c-tDCS or tDCS on several cognitive domains among either healthy or neuropsychiatric individuals. Our UR included 11 meta-analyses which were of either low (n = 2) or critically low (n = 9) quality. Our UR also included 55 comparisons, of which 41 (~75%) were exclusively among healthy individuals; therefore, only 25% of the included comparisons also involved individuals with different neuropsychiatric disorders, which were frequently collapsed together without abiding by diagnostic boundaries. Of the 55 available comparisons between active tDCS and sham tDCS, only 16 reported significant findings. Among healthy individuals, a significant effect favoring a-tDCS was reported for working memory (ES = 0.56, 0.29, 0.17, 0.15 [accuracy], -0.15 [reaction time]), memory/attention/executive functioning (ES = -0.10), language (ES = 0.48), overeating (ES = -0.25), emotional and implicit bias (ES = -0.25) and risk-taking (ES = -0.36). Among neuropsychiatric individuals, a significant effect favoring (ES was reported for response inhibition 0.26) a-tDCS and memory/attention/executive functioning (ES = 0.22). Among both healthy and neuropsychiatric individuals, a significant effect favoring tDCS was reported for memory/attention/executive functioning (ES = 0.18 [accuracy], -0.11 [reaction time]) and food cravings (ES = -0.54, -0.78). However, of these 16 significant effects, GRADE assessment of quality of evidence indicated that only 3 of them had moderate quality, while the remaining 13 had either low (n = 4) or very low (n = 9) quality. Of the 39 non-significant effects, GRADE assessment of quality of evidence indicated that only 1 of them had moderate quality, while the remaining 38 had either low (n = 7) or very low (n = 31) quality. When taken together, these findings highlight that, although several meta-analyses evaluating the effects of prefrontal tDCS on cognition have been carried out, they do not provide any definitive conclusion due to the low certainty of evidence.

In our UR, most of the included meta-analyses were rated as of low or critically low quality according to AMSTAR-2 methodology. Some of the identified weaknesses of the included meta-analyses were likely the result of continuing changes in the best practices for reporting meta-analysis. For instance, Preferred Reporting Items for Systematic reviews and Meta-analyses (PRISMA) (Moher et al., 2009) guidelines and the first international registry for systematic reviews (PROSPERO) (Page et al., 2018) were made available only in 2009 and 2011, respectively. It is reasonable to suppose that these innovations take some time to be implemented; in this context, the lack of *a priori* publication of a protocol might be, to some extent, understandable for the meta-analyses, especially the oldest ones. Editorial policies might also contribute to explain why lists of excluded studies were not frequently reported given most journals usually determine word-limits that might be considered relatively stringent for meta-analyses. Nevertheless, other weaknesses likely cannot be better explained by external factors. Among these, perhaps most importantly is the fact that few meta-analyses evaluated the RoB of the trials included in their analyses. RoB assessments are necessary to evaluate the internal validity of randomized trials, i.e. whether it answers the proposed research question 'correctly'. Without a proper assessment of RoB, meta-analyses have limited capability to draw accurate conclusions from their findings.

Additionally, although we have considered meta-analyses statistics as adequate for the 11 included studies, it should be noted that some meta-analyses frequently included, in the same model, data from two different experiments carried out with the same participants, which might be troubling as these data are likely not independent from one another (Peters and Mengersen, 2008). For instance, Hoy *et al.*, (2013) developed a cross-over trial to evaluate the effects of a-tDCS on working memory as measured by 10-minute blocks of n-back, 5 minutes each of 2-back and 3-back. In this trial, participants underwent 20-minute a-tDCS sessions, either 1mA, 2mA or sham, 1 week apart from one another to avoid carry-over effects. Participants also underwent the 10-minute blocks of n-back immediately, 20 minutes and 40 minutes after stimulation, totaling six trials of n-back, three 2-back and three 3back, per week of stimulation. Although it seems reasonable to consider data from this trial as non-independent, particularly data from the same stimulation strength, which were all collected within one hour after the a-tDCS session, the meta-analysis by Hill *et al.*, (2016) included data of each stimulation strength from Hoy *et al.*, (2016) as six independent trials. Similarly, Dedoncker *et al.*, (2016) included data of each stimulation strength from Hoy *et al.*, (2016) as three independent trials, although it did not consider differences in 2-back and 3back. Although the 1-week difference between active and sham tDCS might be enough to avoid carry-over effects, it likely is not an adequate time period to consider their data as independent.

Additionally, methodological issues with the trials included in the metaanalyses have also to be taken in consideration. For instance, some of the metaanalyses in our UR (Dedoncker *et al.*, 2016; Hill *et al.*, 2016) included mostly crossover single-session within-subject design trials in which active and sham tDCS were administered to the same individual separated by a period of time. This approach has several advantages, such as the relatively smaller cost and number of individuals required to complete the study. Yet, there are also important caveats to consider; importantly, the order of administration of active and sham tDCS can likely influence the outcomes of the study if an appropriate washout is not carefully respected. Although a large number of trials employed a large washout period, others have employed smaller periods (Boggio *et al.*, 2006; Gladwin *et al.*, 2012) which could have had carry-over effects.

Besides, many trials from meta-analyses in our UR frequently did not acknowledge how investigators involved with recruitment of subjects and treatment administration were blinded to the order of treatments of each subject. In fact, some trials even acknowledged employing a single-blind design, in which only the subjects who were receiving the treatment were unaware of the order of treatment administration. A recent report reinforced the need to improve blinding procedures in tDCS research, particularly when employing a single-session design (Bikson et al., 2018). Double-blinding in tDCS studies can be achieved by using specific tDCS research devices in which active/sham stimulation is delivered according to a 6-digit code inputted in a keypad, guaranteeing that neither subjects nor researchers are aware of the allocation group. This method was employed in recent tDCS trials (Brunoni et al., 2017; Sampaio-Junior et al., 2018). Although this would be the preferable method, in some scenarios specific research-tailored tDCS devices are not available. In such contexts, it is advisable that tDCS operators are instructed to not interact further with the subjects, and critically not when assessing study outcomes. Such approach has also been employed successfully in previous tDCS studies (Brunoni et al., 2013).

Additionally, sample sizes included in each individual trial were usually critically small, limiting the statistical power of comparison, and active and sham tDCS methodology varied considerably. Variation in the position and size of electrodes might influence how much current passes through different brain regions (Chase *et al.*, 2019); the use of different sham parameters for stimulation likely adds more variability and makes it increasingly difficult to compare results across different trials (Fonteneau *et al.*, 2019). Recently, several guidelines establishing adequate procedures for tDCS research have been published (Brunoni *et al.*, 2011; Woods *et al.*, 2016). The

understanding of the effects of prefrontal tDCS on cognition is likely going to improve when trials adopt these procedures.

Future trials designed to evaluate the cognitive effects of prefrontal tDCS could also benefit from including a bigger number of individuals with neuropsychiatric disorders besides only healthy volunteers. In this UR, most of the comparisons evaluated (~ 75%) were generated with data from trials which only included healthy volunteers; given healthy individuals are more likely to have normal cognitive functioning, studies which only included such participants might have been unable to detect a treatment effect in favor of tDCS due to the fact that there was a small room for improvement in cognitive functioning among healthy volunteers. Cognitive impairment is widely recognized in several neuropsychiatric disorders such as depression, bipolar disorder and schizophrenia (Millan et al., 2012; Bortolato et al., 2015; Bortolato et al., 2016), and it is likely that by giving preference to such populations future studies would be better equipped to detect treatment effects of tDCS regarding cognitive functioning, although it should be noted that effect sizes were mostly similar between comparisons performed among healthy and neuropsychiatric individuals, as well as among mixed samples.

Future meta-analysis evaluating the cognitive effects of prefrontal tDCS could also benefit from establishing separate comparison for individuals with different neuropsychiatric disorders. By collapsing individuals with different neuropsychiatric conditions in the same group, such approach includes subjects with distinct conditions which might limit the external validity of the findings identified in the meta-analysis. Although transdiagnostic approaches are useful under the Research Domain Criteria (RDoC) framework (Insel *et al.*, 2013) that

sustains that dysfunctions in cognitive domains occurring in psychiatric disorders should be investigated together in order to develop interventions specifically tailored for such dysfunctions, and not to the disorders per se, at the current moment it would likely be more clinically informative to have separate effect sizes for each neuropsychiatric disorder.

Our UR has several important strengths. A comprehensive search for eligible references was carried out. Considerable efforts were made to collect as much data as possible, and emails were sent to several authors asking for additional information. We were also able to include the vast majority – if not all – cognitive outcomes evaluated in prefrontal tDCS trials. Yet, this UR also has some limitations. We did not include reviews which did not report a separate comparison between active tDCS and sham tDCS, which might have limited – although to a little extent – the outcomes included. We did not carry out a quantitative analysis. We applied the GRADE criteria to metaanalyses without considering the information reported by individual trials; different results could have been obtained if we had done a careful examination of each trial included in each comparison from each meta-analysis, e.g. we could have assessed RoB instead of immediately downgrading for serious RoB if authors did not report RoB in their meta-analyses. However, we chose to apply the quality assessment criteria at the meta-analysis level as meta-analysis constitute one of the highest levels of evidence and frequently employed by researchers and clinicians as a guide to future are research/intervention; by highlighting the issues with available evidence from metaanalyses in this field, we clearly indicate there is actually an evidence of absence, and no definitive conclusions regarding whether a-tDCS, c-tDCS or tDCS are either effective or ineffective in improving cognitive functioning can be made. Additionally, we did not examine unpublished meta-analyses, which could have added new information to our findings. However, in contrast with pre-registration of clinical trials, pre-registration of systematic reviews and meta-analyses is still on its infancy and, in most journals, optional; therefore, there is no standard procedure for checking for unpublished meta-analyses yet. Lastly, since most meta-analyses did not perform sensitivity analyses on the range of parameters that possible influence the effects of tDCS such as single vs. multi-session, online vs. offline stimulation and others, we could not report separate findings in our UR, and future research should look further into this when data is available.

In conclusion, although a significant volume of trials and meta-analyses have been performed to provide an assessment of the effects of prefrontal tDCS on cognition, poor quality of trials and meta-analyses does not allow to take definitive conclusion as to whether tDCS is effective in improving cognitive function among healthy and neuropsychiatric individuals. At the moment, trials employing better methodology are warranted. Researchers aiming at developing future trials to evaluate the effects of tDCS on cognition should abide by the increasing recommendations from guidelines to enable the reproducibility of their experiments and the comparison of their findings with those from other researchers. Researchers aiming at synthetizing data of the cognitive effects of tDCS on cognition should also abide by the recommendations currently available in guiding formularies such as the PRISMA statement to ensure transparency and to provide more reliable estimates of effect.

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REFERENCES

Aleman, A., Enriquez-Geppert, S., Knegtering, H. & Dlabac-de Lange, J. J. (2018)

'Moderate effects of noninvasive brain stimulation of the frontal cortex for improving

negative symptoms in schizophrenia: Meta-analysis of controlled trials', Neurosci

Biobehav Rev, 89, pp. 111-118.

Baldo, P., Doree, C., Molin, P., McFerran, D. & Cecco, S. (2012) 'Antidepressants for patients with tinnitus', *Cochrane Database of Systematic Reviews* (9).

Bell, S. B. & DeWall, N. (2018) 'Does transcranial direct current stimulation to the prefrontal cortex affect social behavior? A meta-analysis' *Soc Cogn Affect Neurosci*, 13(9), pp. 899-906.

Bieck, S. M., Artemenko, C., Moeller, K. & Klein, E. (2018) 'Low to No Effect:
Application of tRNS During Two-Digit Addition', *Front Neurosci*, 12, p. 176.
Bikson, M., Brunoni, A. R., Charvet, L. E., Clark, V. P., Cohen, L. G., Deng, Z. D.,
Dmochowski, J., Edwards, D. J., Frohlich, F., Kappenman, E. S., Lim, K. O., Loo, C.,
Mantovani, A., McMullen, D. P., Parra, L. C., Pearson, M., Richardson, J. D., Rumsey,
J. M., Sehatpour, P., Sommers, D., Unal, G., Wassermann, E. M., Woods, A. J. &
Lisanby, S. H. (2018) 'Rigor and reproducibility in research with transcranial electrical
stimulation: An NIMH-sponsored workshop', *Brain Stimul*, 11(3), pp. 465-480.
Boayue, N. M., Csifcsak, G., Aslaksen, P., Turi, Z., Antal, A., Groot, J., Hawkins, G.
E., Forstmann, B., Opitz, A., Thielscher, A. & Mittner, M. (2019) 'Increasing propensity
to mind-wander by transcranial direct current stimulation? A registered report', *Eur J*

Bortolato, B., Miskowiak, K. W., Kohler, C. A., Maes, M., Fernandes, B. S., Berk, M. & Carvalho, A. F. (2016) 'Cognitive remission: a novel objective for the treatment of major depression?', BMC Med, **14**, p. 9.

Bortolato, B., Miskowiak, K. W., Kohler, C. A., Vieta, E. & Carvalho, A. F. (2015)

'Cognitive dysfunction in bipolar disorder and schizophrenia: a systematic review of

meta-analyses', Neuropsychiatr Dis Treat, 11, pp. 3111-3125.

Brunoni, A. R., Amadera, J., Berbel, B., Volz, M. S., Rizzerio, B. G. & Fregni, F.

(2011) 'A systematic review on reporting and assessment of adverse effects associated

with transcranial direct current stimulation', Int J Neuropsychopharmacol, 14(8), pp.

1133-1145.

Brunoni, A. R., Baeken, C., Machado-Vieira, R., Gattaz, W. F. & Vanderhasselt, M. A. (2015) 'BDNF blood levels after non-invasive brain stimulation interventions in major depressive disorder: a systematic review and meta-analysis', *World J Biol Psychiatry*, **16**(2), pp. 114-122.

Brunoni, A. R., Moffa, A. H., Sampaio-Junior, B., Borrione, L., Moreno, M. L.,

Fernandes, R. A., Veronezi, B. P., Nogueira, B. S., Aparicio, L. V. M., Razza, L. B.,

Chamorro, R., Tort, L. C., Fraguas, R., Lotufo, P. A., Gattaz, W. F., Fregni, F. &

Bensenor, I. M. (2017) 'Trial of Electrical Direct-Current Therapy versus Escitalopram for Depression', N Engl J Med, 376(26), pp. 2523-2533.

Brunoni, A. R., Nitsche, M. A., Bolognini, N., Bikson, M., Wagner, T., Merabet, L., Edwards, D. J., Valero-Cabre, A., Rotenberg, A., Pascual-Leone, A., Ferrucci, R., Priori, A., Boggio, P. S. & Fregni, F. (2012) 'Clinical research with transcranial direct current stimulation (tDCS): challenges and future directions', *Brain Stimul*, **5**(3), pp. 175-195.

Brunoni, A. R., Sampaio-Junior, B., Moffa, A. H., Aparicio, L. V., Gordon, P., Klein, I., Rios, R. M., Razza, L. B., Loo, C., Padberg, F. & Valiengo, L. (2019) 'Noninvasive brain stimulation in psychiatric disorders: a primer', *Braz J Psychiatry*, **41**(1), pp. 70-81. Brunoni, A. R., Shiozawa, P., Truong, D., Javitt, D. C., Elkis, H., Fregni, F. & Bikson,

M. (2014) 'Understanding tDCS effects in schizophrenia: a systematic review of clinical data and an integrated computation modeling analysis', *Expert Rev Med Devices*, **11**(4), pp. 383-394.

Brunoni, A. R., Valiengo, L., Baccaro, A., Zanao, T. A., de Oliveira, J. F., Goulart, A.,

Boggio, P. S., Lotufo, P. A., Bensenor, I. M. & Fregni, F. (2013) 'The sertraline vs. electrical current therapy for treating depression clinical study: results from a factorial, randomized, controlled trial', JAMA Psychiatry, 70(4), pp. 383-391.

Brunoni, A. R. & Vanderhasselt, M. A. (2014) 'Working memory improvement with non-invasive brain stimulation of the dorsolateral prefrontal cortex: a systematic review and meta-analysis', *Brain Cogn*, **86**, pp. 1-9.

Chase, H. W., Boudewyn, M. A., Carter, C. S. & Phillips, M. L. (2019) 'Transcranial direct current stimulation: a roadmap for research, from mechanism of action to clinical implementation', *Mol Psychiatry*.

Cruccu, G., Garcia-Larrea, L., Hansson, P., Keindl, M., Lefaucheur, J. P., Paulus, W., Taylor, R., Tronnier, V., Truini, A. & Attal, N. (2016) 'EAN guidelines on central neurostimulation therapy in chronic pain conditions', *Eur J Neurol*, **23**(10), pp. 1489-1499.

Dedoncker, J., Brunoni, A. R., Baeken, C. & erhasselt, M.-A. (2016a) 'The effect of the interval-between-sessions on prefrontal transcranial direct current stimulation (tDCS) on cognitive outcomes: A systematic review and meta-analysis', *Journal of Neural Transmission*, **123**(10), pp. 1159-1172.

Dedoncker, J., Brunoni, A. R., Baeken, C. & erhasselt, M.-A. (2016b) 'A systematic review and meta-analysis of the effects of transcranial direct current stimulation (tdcs) over the dorsolateral prefrontal cortex in healthy and neuropsychiatric samples:

Influence of stimulation parameters', Brain Stimulation, 9(4), pp. 501-517.

Dougall, N., Maayan, N., Soares-Weiser, K., McDermott, L. M. & McIntosh, A. (2015)

'Transcranial magnetic stimulation (TMS) for schizophrenia', Cochrane Database of

Systematic Reviews (8).

Elsner, B., Kugler, J., Pohl, M. & Mehrholz, J. (2016) 'Transcranial direct current

stimulation (tDCS) for improving activities of daily living, and physical and cognitive

functioning, in people after stroke', Cochrane Database of Systematic Reviews (3).

Fonteneau, C., Mondino, M., Arns, M., Baeken, C., Bikson, M., Brunoni, A. R., Burke,

M. J., Neuvonen, T., Padberg, F., Pascual-Leone, A., Poulet, E., Ruffini, G.,

Santarnecchi, E., Sauvaget, A., Schellhorn, K., Suaud-Chagny, M. F., Palm, U. &

Brunelin, J. (2019) 'Sham tDCS: A hidden source of variability? Reflections for further blinded, controlled trials', *Brain Stimul*, **12**(3), pp. 668-673.

Fusar-Poli, P. & Radua, J. (2018) 'Ten simple rules for conducting umbrella reviews', *Evid Based Ment Health*, **21**(3), pp. 95-100.

Greenwood, P. M., Blumberg, E. J. & Scheldrup, M. R. (2018) 'Hypothesis for cognitive effects of transcranial direct current stimulation: Externally- and internally-directed cognition', *Neurosci Biobehav Rev*, **86**, pp. 226-238.

Hall, P. A., Lowe, C., ra & Vincent, C. (2017) 'Brain stimulation effects on food cravings and consumption: An update on Lowe et al. (2017) and a response to Generoso et al. (2017)', *Psychosomatic Medicine*, **79**(7), pp. 839-842.

Higgins, J. P., Altman, D. G., Gotzsche, P. C., Juni, P., Moher, D., Oxman, A. D., Savovic, J., Schulz, K. F., Weeks, L. & Sterne, J. A. (2011) 'The Cochrane

Collaboration's tool for assessing risk of bias in randomised trials', Bmj, 343, p. d5928.

Hill, A. T., Fitzgerald, P. B. & Hoy, K. E. (2016) 'Effects of Anodal Transcranial Direct Current Stimulation on Working Memory: A Systematic Review and Meta-Analysis of Findings From Healthy and Neuropsychiatric Populations', *Brain Stimul*, **9**(2), pp. 197-208.

Hilton, M. P., Zimmermann, E. F. & Hunt, W. T. (2013) 'Ginkgo biloba for tinnitus', *Cochrane Database of Systematic Reviews* (3).

Hobson, J., Chisholm, E. & El Refaie, A. (2012) 'Sound therapy (masking) in the

management of tinnitus in adults', Cochrane Database of Systematic Reviews (11).

Hoekstra, C. E. L., Rynja, S. P., van Zanten, G. A. & Rovers, M. M. (2011)

'Anticonvulsants for tinnitus', Cochrane Database of Systematic Reviews (7).

Horvath, J. C., Forte, J. D. & Carter, O. (2015) 'Quantitative Review Finds No Evidence of Cognitive Effects in Healthy Populations From Single-session Transcranial Direct Current Stimulation (tDCS)', *Brain Stimul*, **8**(3), pp. 535-550.

Hou, W. H., Wang, T. Y. & Kang, J. H. (2016) 'The effects of add-on non-invasive brain stimulation in fibromyalgia: a meta-analysis and meta-regression of randomized controlled trials', *Rheumatology (Oxford)*, **55**(8), pp. 1507-1517.

Hsu, J. H., Daskalakis, Z. J. & Blumberger, D. M. (2018) 'An Update on Repetitive Transcranial Magnetic Stimulation for the Treatment of Co-morbid Pain and Depressive Symptoms', *Curr Pain Headache Rep*, **22**(7), p. 51.

Imburgio, M. J. & Orr, J. M. (2018) 'Effects of prefrontal tDCS on executive function: Methodological considerations revealed by meta-analysis', *Neuropsychologia*, **117**, pp. 156-166.

Insel, T., Cuthbert, B., Garvey, M., Heinssen, R., Pine, D.S., Quinn, K., Sanislow, C., Wang, P. (2010) 'Research Domain Criteria (RDoC): toward a new classification framework for research on mental disoders', *Am J Psychiatry*, **167**(7), pp 748-751.

Ioannidis, J. P. (2009) 'Integration of evidence from multiple meta-analyses: a primer on umbrella reviews, treatment networks and multiple treatments meta-analyses', *Cmaj*,

181(8), pp. 488-493.

Ioannidis, J. P., Munafo, M. R., Fusar-Poli, P., Nosek, B. A. & David, S. P. (2014)

'Publication and other reporting biases in cognitive sciences: detection, prevalence, and

prevention', *Trends Cogn Sci*, **18**(5), pp. 235-241.

Ironside, M., O'Shea, J., Cowen, P. J. & Harmer, C. J. (2016) 'Frontal Cortex

Stimulation Reduces Vigilance to Threat: Implications for the Treatment of Depression and Anxiety', *Biol Psychiatry*, **79**(10), pp. 823-830.

Jansen, J. M., Daams, J. G., Koeter, M. W. J., Veltman, D. J., van den Brink, W. & Goudriaan, A. E. (2013) 'Effects of non-invasive neurostimulation on craving: A metaanalysis', *Neuroscience and Biobehavioral Reviews*, **37**(10), pp. 2472-2480.

Katz, B., Au, J., Buschkuehl, M., Abagis, T., Zabel, C., Jaeggi, S. M. & Jonides, J.
(2017) 'Individual Differences and Long-term Consequences of tDCS-augmented
Cognitive Training', *J Cogn Neurosci*, **29**(9), pp. 1498-1508.

Kennedy, N. I., Lee, W. H. & Frangou, S. (2018) 'Efficacy of non-invasive brain stimulation on the symptom dimensions of schizophrenia: A meta-analysis of randomized controlled trials', *Eur Psychiatry*, **49**, pp. 69-77.

Khalighinejad, N., Di Costa, S. & Haggard, P. (2016) 'Endogenous Action Selection Processes in Dorsolateral Prefrontal Cortex Contribute to Sense of Agency: A Meta-Analysis of tDCS Studies of 'Intentional Binding'', *Brain Stimul*, **9**(3), pp. 372-379.

Kuhn, S., Vanderhasselt, M. A., De Raedt, R. & Gallinat, J. (2012) 'Why ruminators won't stop: the structural and resting state correlates of rumination and its relation to depression', *J Affect Disord*, **141**(2-3), pp. 352-360.

Lee, W. H., Kennedy, N. I., Bikson, M. & Frangou, S. (2018) 'A Computational Assessment of Target Engagement in the Treatment of Auditory Hallucinations with Transcranial Direct Current Stimulation', *Front Psychiatry*, **9**, p. 48.

Li, H., Wang, J., Li, C. & Xiao, Z. (2014) 'Repetitive transcranial magnetic stimulation

(rTMS) for panic disorder in adults', Cochrane Database of Systematic Reviews (9).

Lowe, C. J., Vincent, C. & Hall, P. A. (2017) 'Effects of Noninvasive Brain Stimulation on Food Cravings and Consumption: A Meta-Analytic Review', *Psychosom Med*, **79**(1), pp. 2-13.

Luedtke, K., Rushton, A., Wright, C., Geiss, B., Juergens, T. P. & May, A. (2012)
'Transcranial direct current stimulation for the reduction of clinical and experimentally
induced pain: a systematic review and meta-analysis', *Clin J Pain*, 28(5), pp. 452-461.
Lupi, M., Martinotti, G., Santacroce, R., Cinosi, E., Carlucci, M., Marini, S., Acciavatti,
T. & di Giannantonio, M. (2017) 'Transcranial Direct Current Stimulation in Substance
Use Disorders: A Systematic Review of Scientific Literature', *J ect*, 33(3), pp. 203-209.
Luvizutto, G. J., Bazan, R., Braga, G. P., Resende, L., Bazan, S. G. Z. & El Dib, R.
(2015) 'Pharmacological interventions for unilateral spatial neglect after stroke', *Cochrane Database of Systematic Reviews* (11).

Machado, D. G. d. S., Unal, G., Andrade, S. M., Moreira, A., re, Altimari, L., R., r., Brunoni, A. R., Perrey, S. p., Mauger, A. R., Bikson, M., Okano, A. & H., r. (2018) 'Effect of transcranial direct current stimulation on exercise performance: A systematic review and meta-analysis', *Brain Stimulation*, pp. No Pagination Specified-No

Pagination Specified.

Mancuso, L. E., Ilieva, I. P., Hamilton, R. H. & Farah, M. J. (2016) 'Does Transcranial Direct Current Stimulation Improve Healthy Working Memory? A Meta-analytic Review', *J Cogn Neurosci*, **28**(8), pp. 1063-1089.

Martin, D. M., Yeung, K. & Loo, C. K. (2016) 'Pre-treatment letter fluency performance predicts antidepressant response to transcranial direct current stimulation', Netherlands, Elsevier Science.

McMillan, R., Forssell, H., Buchanan, J. A. G., Glenny, A. M., Weldon, J. C. &

Zakrzewska, J. M. (2016) 'Interventions for treating burning mouth syndrome',

Cochrane Database of Systematic Reviews (11).

Meader, N., King, K., Llewellyn, A., Norman, G., Brown, J., Rodgers, M., Moe-Byrne

T., Higgins, J. P., Sowden, A. & Stewart, G. (2014) 'A checklist designed to aid

consistency and reproducibility of GRADE assessments: development and pilot validation', *Syst Rev*, **3**, p. 82.

Medical Advisory Secretariat (2004) 'Repetitive transcranial magnetic stimulation for the treatment of major depressive disorder: an evidence-based analysis', *Ont Health Technol Assess Ser*, **4**(7), pp. 1-98.

Medina, J. & Cason, S. (2017) 'No evidential value in samples of transcranial direct current stimulation (tDCS) studies of cognition and working memory in healthy populations', *Cortex*, **94**, pp. 131-141.

Meng, Z., Liu, S., Zheng, Y. & Phillips, J. S. (2011) 'Repetitive transcranial magnetic stimulation for tinnitus', *Cochrane Database of Systematic Reviews* (10).
Micoulaud Franchi, J. A., Quiles, C., Belzeaux, R., Adida, M. & Azorin, J. M. (2015) '[Negative symptoms of schizophrenia: from electrophysiology to electrotherapy]', *Encephale*, **41**(6 Suppl 1), pp. 6s50-56.

Millan, M. J., Agid, Y., Brune, M., Bullmore, E. T., Carter, C. S., Clayton, N. S.,
Connor, R., Davis, S., Deakin, B., DeRubeis, R. J., Dubois, B., Geyer, M. A., Goodwin,
G. M., Gorwood, P., Jay, T. M., Joels, M., Mansuy, I. M., Meyer-Lindenberg, A.,
Murphy, D., Rolls, E., Saletu, B., Spedding, M., Sweeney, J., Whittington, M. &

Young, L. J. (2012) 'Cognitive dysfunction in psychiatric disorders: characteristics,

causes and the quest for improved therapy', Nat Rev Drug Discov, 11(2), pp. 141-168.

Moffa, A. H., Brunoni, A. R., Nikolin, S. & Loo, C. K. (2018) 'Transcranial Direct

Current Stimulation in Psychiatric Disorders: A Comprehensive Review', Psychiatr Clin

North Am, **41**(3), pp. 447-463.

Moher, D., Liberati, A., Tetzlaff, J. & Altman, D. G. (2009) 'Preferred reporting items for systematic reviews and meta-analyses: the PRISMA statement', *PLoS Med*, **6**(7), p. e1000097.

Mostafavi, S. A., Khaleghi, A., Mohammadi, M. R. & Akhondzadeh, S. (2018) 'Is transcranial direct current stimulation an effective modality in reducing food craving? A systematic review and meta-analysis', *Nutr Neurosci*, pp. 1-13.

Mutz, J., Edgcumbe, D. R., Brunoni, A. R. & Fu, C. H. Y. (2018) 'Efficacy and acceptability of non-invasive brain stimulation for the treatment of adult unipolar and bipolar depression: A systematic review and meta-analysis of randomised sham-controlled trials', *Neurosci Biobehav Rev*, **92**, pp. 291-303.

Nilsson, J., Lebedev, A., V., e., Rydström, A. & Lövdén, M. (2017) 'Direct-current stimulation does little to improve the outcome of working memory training in older adults', *Psychological Science*, **28**(7), pp. 907-920.

Nitsche, M. A. & Paulus, W. (2000) 'Excitability changes induced in the human motor cortex by weak transcranial direct current stimulation', *J Physiol*, **527 Pt 3**, pp. 633-639. O'Connell, N. E., Wand, B. M., Marston, L., Spencer, S. & Desouza, L. H. (2010) 'Non-invasive brain stimulation techniques for chronic pain', *Cochrane Database Syst Rev* (9), p. Cd008208.

Oliveira, J. F., Zanao, T. A., Valiengo, L., Lotufo, P. A., Bensenor, I. M., Fregni, F. & Brunoni, A. R. (2013) 'Acute working memory improvement after tDCS in antidepressant-free patients with major depressive disorder', *Neurosci Lett*, **537**, pp. 60-64.

Open Science Collaboration (2015) 'PSYCHOLOGY. Estimating the reproducibility of psychological science', *Science*, **349**(6251), p. aac4716.

Page, M. J., Shamseer, L. & Tricco, A. C. (2018) 'Registration of systematic reviews in

PROSPERO: 30,000 records and counting', *Systematic reviews*, **7**(1), pp. 32-32.

Palm, U., Ayache, S. S., Padberg, F. & Lefaucheur, J. P. (2016) '[Transcranial direct

current stimulation (tDCS) for depression: Results of nearly a decade of clinical

research]', *Encephale*, **42**(1), pp. 39-47.

Peters, J. L. & Mengersen, K. L. (2008) 'Meta-analysis of repeated measures study designs', *J Eval Clin Pract*, **14**(5), pp. 941-950.

Phillips, J. S. & McFerran, D. (2010) 'Tinnitus Retraining Therapy (TRT) for tinnitus', Cochrane Database of Systematic Reviews (3).

Pievani, M., Pini, L., Ferrari, C., Pizzini, F. B., Boscolo Galazzo, I., Cobelli, C., Cotelli, M., Manenti, R. & Frisoni, G. B. (2017) 'Coordinate-Based Meta-Analysis of the
Default Mode and Salience Network for Target Identification in Non-Invasive Brain
Stimulation of Alzheimer's Disease and Behavioral Variant Frontotemporal Dementia
Networks', *J Alzheimers Dis*, **57**(3), pp. 825-843.

Poulet, E., Haesebaert, F., Saoud, M., Suaud-Chagny, M. F. & Brunelin, J. (2010)
'Treatment of shizophrenic patients and rTMS', *Psychiatr Danub*, **22 Suppl 1**, pp. S143-146.

Price, A. R., McAdams, H., Grossman, M. & Hamilton, R. H. (2015) 'A meta-analysis of transcranial direct current stimulation studies examining the reliability of effects on language measures', *Brain Stimulation*, **8**(6), pp. 1093-1100.

Rodriguez-Martin, J. L., Barbanoj, J. M., Pérez, V. & Sacristan, M. (2003) 'Transcranial magnetic stimulation for the treatment of obsessive-compulsive disorder', *Cochrane Database of Systematic Reviews* (2).

Rodriguez-Martin, J. L., Barbanoj, J. M., Schlaepfer, T. E., Clos, S. S. C., Pérez, V.,

Kulisevsky, J. & Gironell, A. (2002) 'Transcranial magnetic stimulation for treating depression', *Cochrane Database of Systematic Reviews* (2).

Rubia, K. (2018) 'Cognitive Neuroscience of Attention Deficit Hyperactivity Disorder

(ADHD) and Its Clinical Translation', *Front Hum Neurosci*, **12**, p. 100.

Salehinejad, M. A., Wischnewski, M., Nejati, V., Vicario, C. M. & Nitsche, M. A.

(2019) 'Transcranial direct current stimulation in attention-deficit hyperactivity

disorder: A meta-analysis of neuropsychological deficits', PLoS One, 14(4), p.

e0215095.

Sampaio-Junior, B., Tortella, G., Borrione, L., Moffa, A. H., Machado-Vieira, R.,

Cretaz, E., Fernandes da Silva, A., Fraguas, R., Aparicio, L. V., Klein, I., Lafer, B.,

Goerigk, S., Bensenor, I. M., Lotufo, P. A., Gattaz, W. F. & Brunoni, A. R. (2018)

'Efficacy and Safety of Transcranial Direct Current Stimulation as an Add-on Treatment for Bipolar Depression: A Randomized Clinical Trial', JAMA Psychiatry, 75(2), pp. 158-166.

Schluter, R. S., Daams, J. G., van Holst, R. J. & Goudriaan, A. E. (2018) 'Effects of Non-invasive Neuromodulation on Executive and Other Cognitive Functions in Addictive Disorders: A Systematic Review', *Front Neurosci*, **12**, p. 642.

Shea, B. J., Reeves, B. C., Wells, G., Thuku, M., Hamel, C., Moran, J., Moher, D., Tugwell, P., Welch, V., Kristjansson, E. & Henry, D. A. (2017) 'AMSTAR 2: a critical appraisal tool for systematic reviews that include randomised or non-randomised studies of healthcare interventions, or both', *Bmj*, **358**, p. j4008. Shin, Y. I., Foerster, A. & Nitsche, M. A. (2015) 'Transcranial direct current stimulation

(tDCS) - application in neuropsychology', Neuropsychologia, 69, pp. 154-175.

Soares-Weiser, K., Rathbone, J., Ogawa, Y., Shinohara, K. & Bergman, H. (2018)

'Miscellaneous treatments for antipsychotic-induced tardive dyskinesia', Cochrane

Database of Systematic Reviews(3).

Song, S., Zilverst, , A., Gui, W., Li, H.-j. & Zhou, X. (2018) 'Effects of single-session

versus multi-session non-invasive brain stimulation on craving and consumption in

individuals with drug addiction, eating disorders or obesity: A meta-analysis', Brain

Stimulation, pp. No Pagination Specified-No Pagination Specified.

Sterne, J. A. C., Savovic, J., Page, M. J., Elbers, R. G., Blencowe, N. S., Boutron, I.,

Cates, C. J., Cheng, H. Y., Corbett, M. S., Eldridge, S. M., Emberson, J. R., Hernan, M.

A., Hopewell, S., Hrobjartsson, A., Junqueira, D. R., Juni, P., Kirkham, J. J., Lasserson,

T., Li, T., McAleenan, A., Reeves, B. C., Shepperd, S., Shrier, I., Stewart, L. A.,

Tilling, K., White, I. R., Whiting, P. F. & Higgins, J. P. T. (2019) 'RoB 2: a revised tool for assessing risk of bias in randomised trials', Bmj, 366, p. 14898.

Stevens, B., Yamada, J., Ohlsson, A., Haliburton, S. & Shorkey, A. (2016) 'Sucrose for analgesia in newborn infants undergoing painful procedures', *Cochrane Database of Systematic Reviews*(7).

The GRADE Working Group (2013) GRADE handbook for grading quality of evidence and strength of recommendations.

Tsoi, D. T., Porwal, M. & Webster, A. C. (2013) 'Interventions for smoking cessation and reduction in individuals with schizophrenia', *Cochrane Database of Systematic Reviews*(2). Vaseghi, B., Zoghi, M. & Jaberzadeh, S. (2014) 'Does anodal transcranial direct current stimulation modulate sensory perception and pain? A meta-analysis study', *Clinical Neurophysiology*, **125**(9), pp. 1847-1858.

Wolkenstein, L. & Plewnia, C. (2013) 'Amelioration of cognitive control in depression

by transcranial direct current stimulation', *Biol Psychiatry*, **73**(7), pp. 646-651.

Woods, A. J., Antal, A., Bikson, M., Boggio, P. S., Brunoni, A. R., Celnik, P., Cohen,

L. G., Fregni, F., Herrmann, C. S., Kappenman, E. S., Knotkova, H., Liebetanz, D.,

Miniussi, C., Miranda, P. C., Paulus, W., Priori, A., Reato, D., Stagg, C., Wenderoth, N.

& Nitsche, M. A. (2016) 'A technical guide to tDCS, and related non-invasive brain

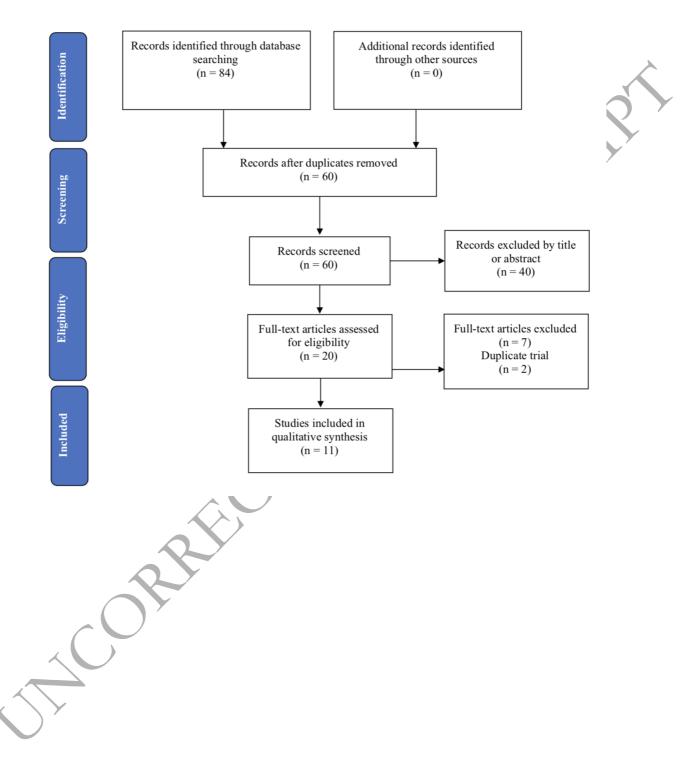
stimulation tools', Clin Neurophysiol, 127(2), pp. 1031-1048.

Ċ

Zhu, C. E., Yu, B., Zhang, W., Chen, W. H., Qi, Q. & Miao, Y. (2017) 'Efficitiveness and safety of transcranial direct current stimulation in fibromyalgia: A systematic review and meta-analysis', *J Rehabil Med*, **49**(1), pp. 2-9.

Figure legend:

Figure 1. PRISMA flowchart depicting study selection results.



cach cognitive aonnain		
Cognitive domain:	Outcomes and respective tasks:	Meta-analysis investigating each outcome:
Working memory	Accuracy, reaction time, d' values and working memory index in a multitude of working memory tasks such as 0- back, 1-back, 2-back, 3- back, n-back, Sternberg, Stroop, digit-span task, block tapping task, paced auditory serial addition test, operation word span, working memory scale,	Horvath et al., 2015, Dedoncker et al., 2016, Hill et al., 2016, Mancuso et al., 2016, Nilsson et al., 2017, Imburgio and Orr, 2018, Salenijehad et al. 2019
[Long-term] memory	Tower of London Accuracy in the recognition memory task and the long-term verbal memory task	Horvath et al., 2015, Dedoncker et al., 2016
Set shifting	Switch cost, resumption lag and errors in the task sequence learning, affective financial management, cognitive and motor set shifting task and the paced auditory serial addition test	Horvath et al., 2015, Dedoncker et al., 2016, Imburgio and Orr, 2018, Salehinejad et al. 2019
Response inhibition	Incongruent reaction time, flanker effect, accuracy and stop signal reaction time in the Stroop, Flanker, Stop Signal task, go/no-go task, Simon	Horvath et al., 2015, Dedoncker et al., 2016, Imburgio and Orr, 2018, Salehinejad et al. 2019
Language	Accuracy and number of words in verbal fluency tasks	Horvath et al., 2015 and Price et al., 2015
Aggression	Aggression score in the Taylor aggression paradigm and negative affect state after a frustrating task	Bell and DeWall, 2018
Overeating/food cravings	Subjective report of food	Bell and DeWall, 2018/

Table 1. Description of the outcomes and tasks included in the umbrella review for each cognitive domain

and sweet cravings, visual analog scale scores, food- craving questionnaire scores	Mancuso et al., 2016 and Lowe et al., 2017
Negativity rating after viewing both neutral and negative valence pictures, judgment score of a moral dilemma	Horvath et al., 2015, Bell and DeWall, 2018
Lying or reaction time in trust/truth games	Bell and DeWall, 2018
Rumination scores on the Rumination Response	Horvath et al., 2015
Error rate, errors in easy condition and errors on incorrect trials in the Stroop, sentence completion task, cognitive	Bell and DeWall, 2018
Number of pumps, high risk choices, riskiness in gains, number of low- probability/high-reward choices in the balloon analogue risk task, Columbia card task and gambling tasks (e.g. Iowa Gambling Task)	Horvath et al., 2015, Bell and DeWall, 2018
	analog scale scores, food- craving questionnaire scores Negativity rating after viewing both neutral and negative valence pictures, judgment score of a moral dilemma Lying or reaction time in trust/truth games Rumination scores on the Rumination Response Scale Error rate, errors in easy condition and errors on incorrect trials in the Stroop, sentence completion task, cognitive reflection test Number of pumps, high risk choices, riskiness in gains, number of low- probability/high-reward choices in the balloon analogue risk task, Columbia card task and gambling tasks (e.g. Iowa Gambling Task)

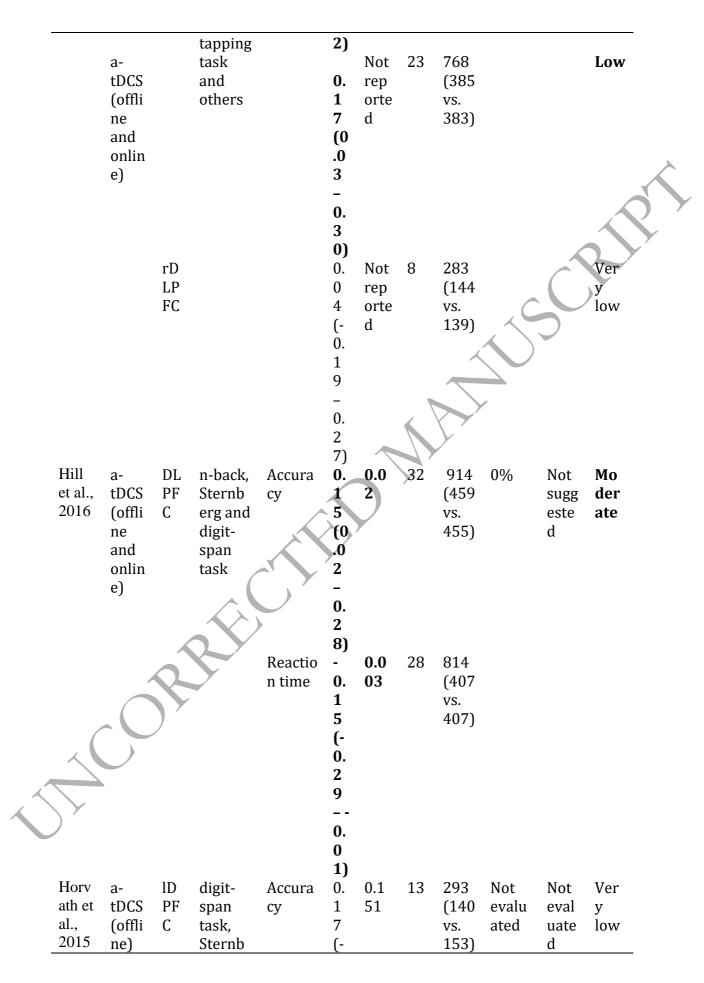
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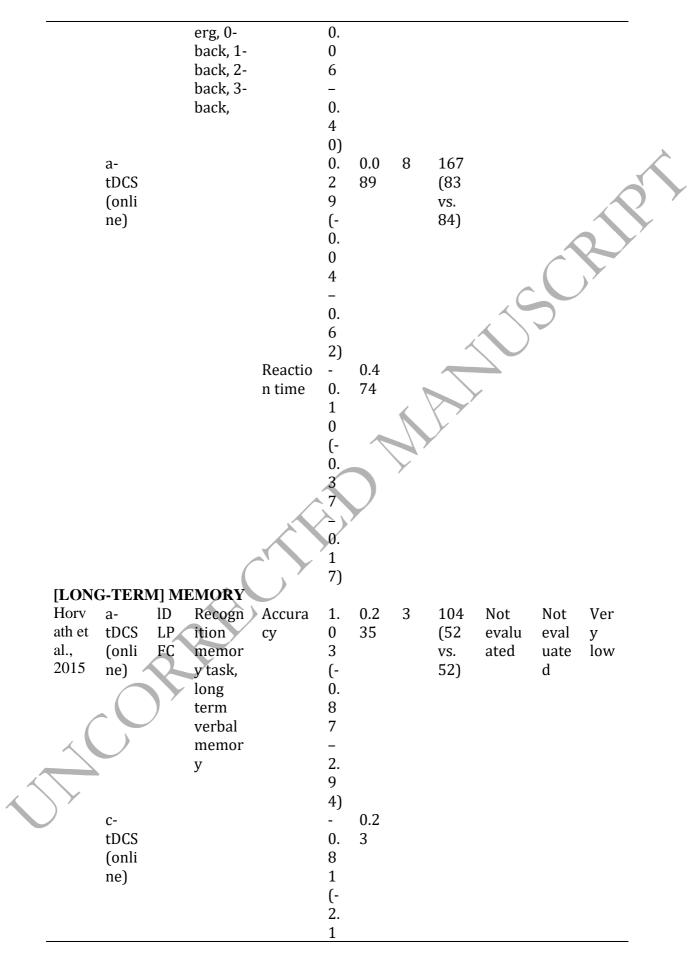
Table 2. Methodological quality assessment of the included systematic reviews using the AMSTAR 2 tool

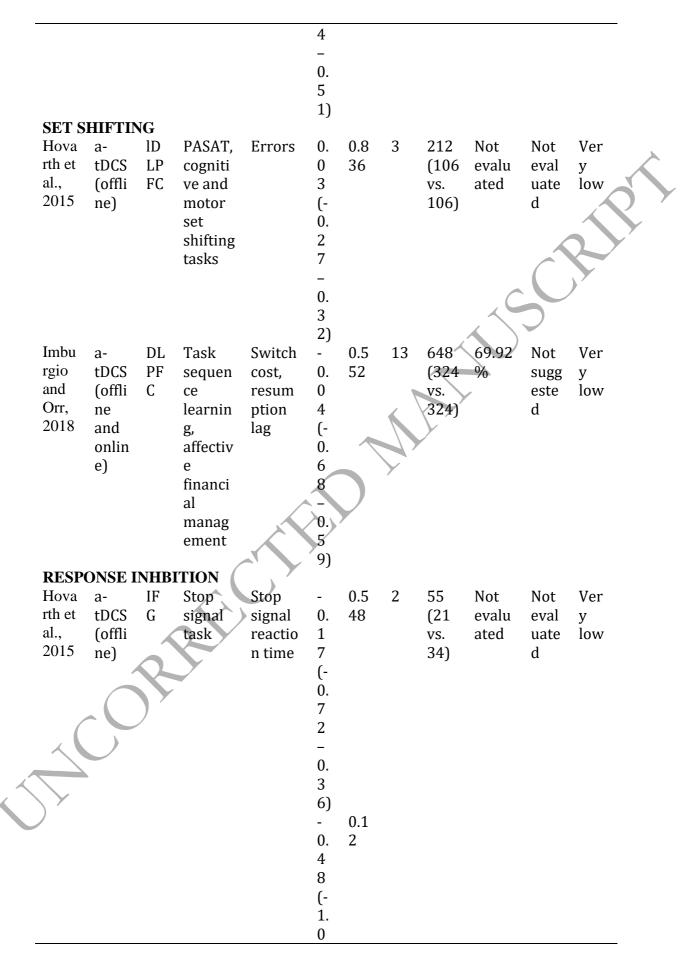
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10. Included studies' funding	No	No	No	No	No	No	No	No	No	No	No
sources 11. Meta- analysis statistics	Yes	Yes	Yes	Yes	Ye s	Yes	Yes	Ye s	Yes	Yes	Ye s
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15. Examine d publicati on bias?	No	Yes	Yes	Yes	Ye s	Yes	Yes	Ye s	Yes	No	No
16. Disclosu	Yes	Yes	Yes	Yes	Ye s	Yes	Yes	Ye s	No	No	No

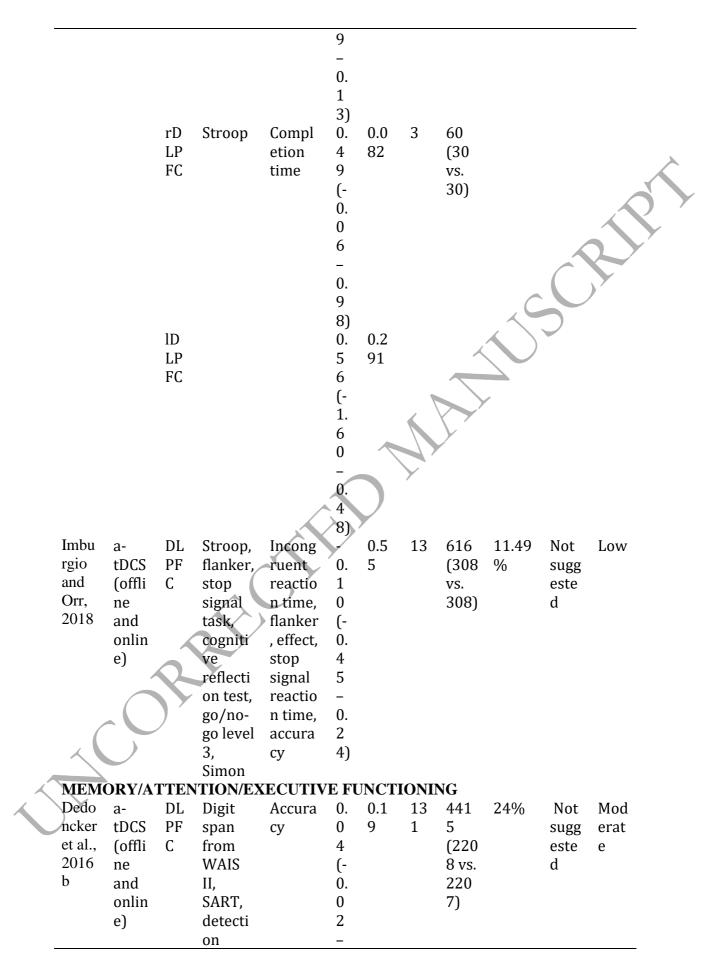
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Manc uso et al., 2016	a- tDCS + cogni tive	lD LP FC	and others n-back, PASAT, Sternb erg,OSP AN,	Accura cy and Reactio n time	0. 2 9 (0 .0	Not rep ort ed	10	285 (144 vs. 141)	0%	Fun nel plot asy mm	Ver y low
	train ing		digit- span task, block		6 - 0. 5					etry iden tifie d	

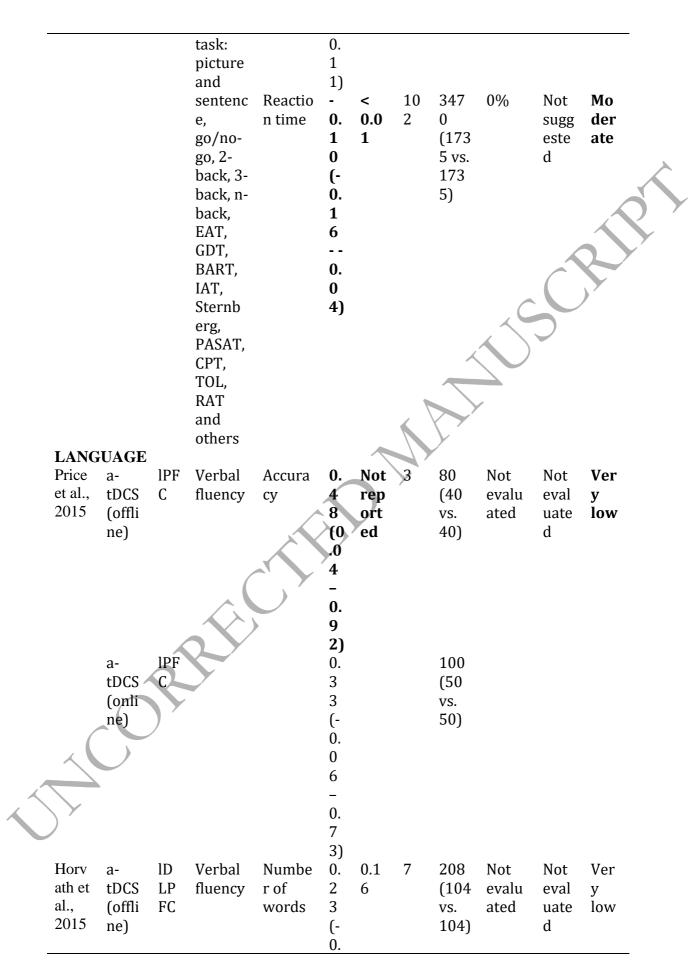
Table 3 Characteristics of included comparisons of the effects of tDCS over the prefrontal cortex on different domains of cognition among healthy individuals

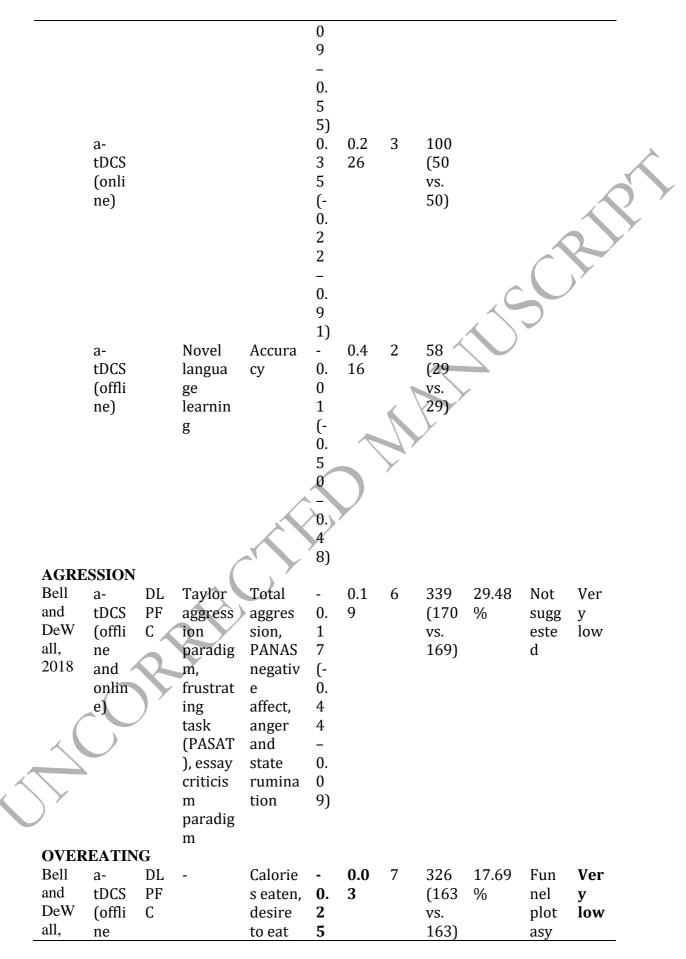




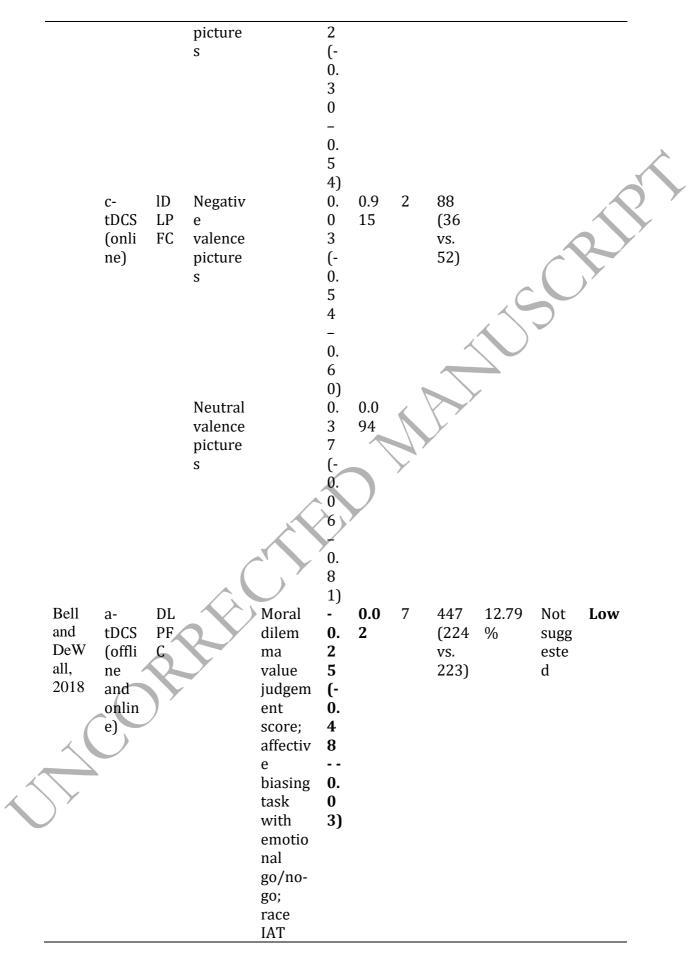




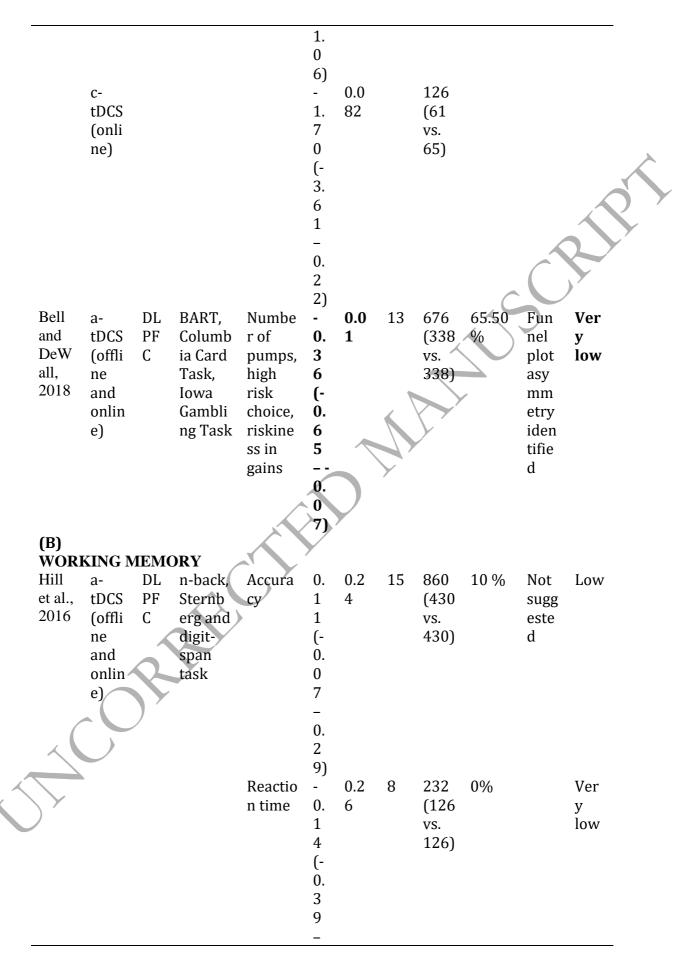


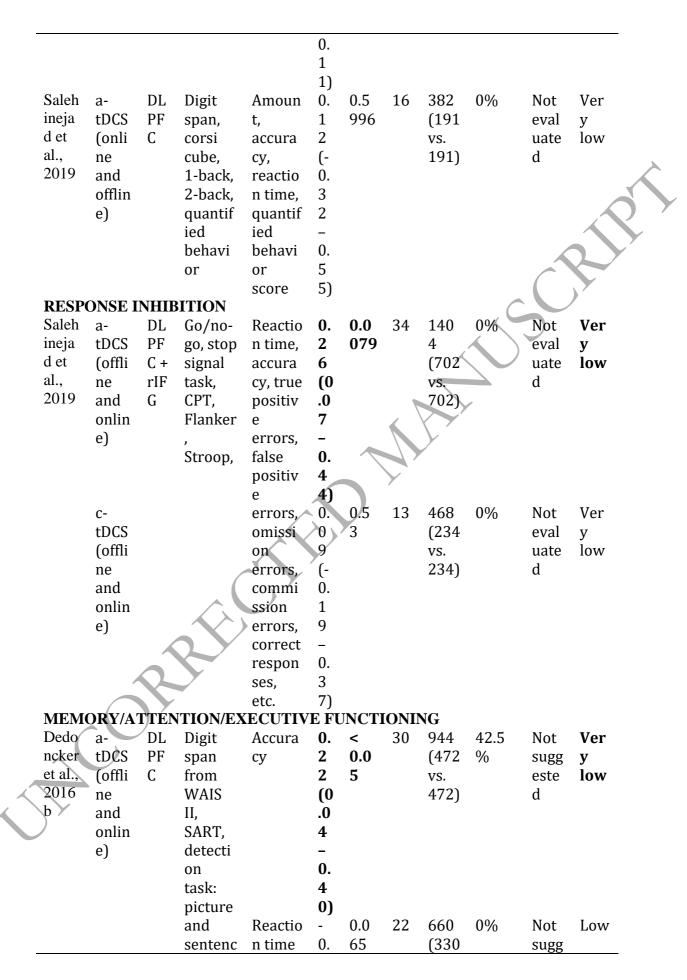


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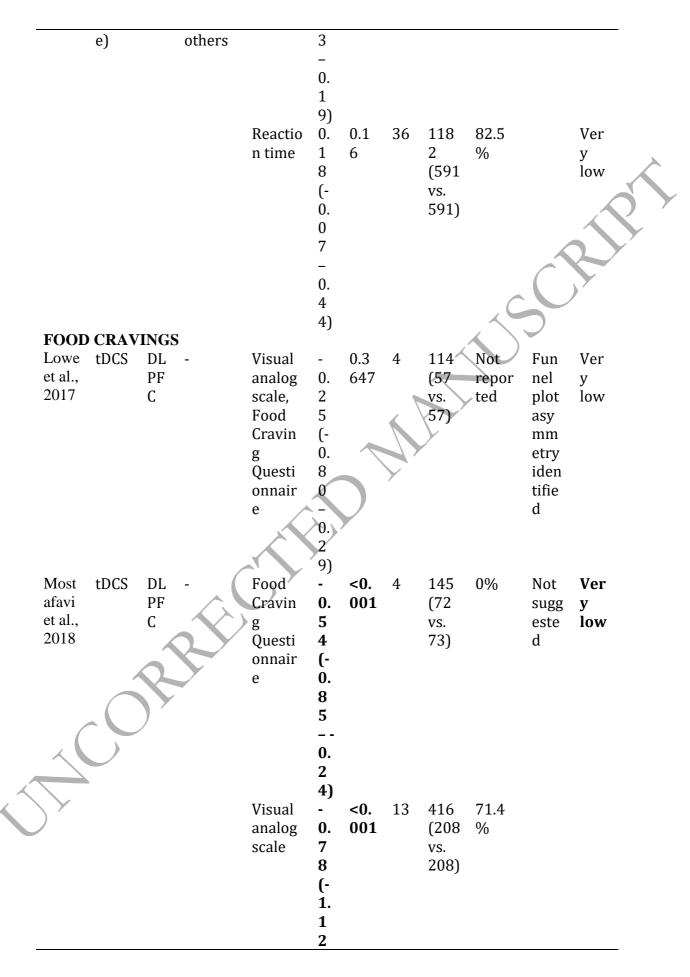
HONE Bell	a-	DL	Selecti	Reactio	0.	0.5	4	322	0%	Not	Low
and DeW all, 2018	tDCS (offli ne and onlin e)	PF C	on trials, trust game, truth respon se (perso nal inform ation)	n time, lying	0. 0 6 (- 0. 1 6 - 0. 2 8)	7	4	(162 vs. 160)	0.90	kot sugg este d	
	NATIC										
Horv ath et al., 2015	a- tDCS (offli ne)	DL PF C	-	Rumin ation Respon se Scale	- 0. 0 1 (- 0. 3 6 - 0.	0.9 5	2	126 (61 vs. 65)	Not evalu ated	Not eyal uate d	Ver y low
IMPU Bell and DeW all, 2018	a- tDCS (offli ne and onlin e)	TY DL PF C	e comple tion task, CRT proble m	conditi on, errors on incorre	4) - 0. 0 2 (- 0. 2 1 -	0.7 0	9	676 (338 vs. 338)	33.17 %	Not sugg este d	Low
)	solving task	ct trials	0. 1						
DICK	TAKIN	IC			6)						
Horv	a-	DL	BART,	Numbe	-	0.4	3	76	Not	Not	Ver
ath et al., 2015	tDCS (onli ne)	PF C	risk task, gambli ng task	r of low- probab ility/hi gh- reward choices	0. 6 7 (- 2. 3 9	51	5	(38 vs. 38)	evalu ated	eval uate d	y low





(C) MEM(DRV/A	TTEN	e, go/no- go, 2- back, 3- back, n- back, EAT, GDT, BART, IAT, Sternb erg, PASAT, CPT, TOL, RAT and others	ECUTIV	1 5 (- 0. 3 0 - 0. 0 1)	INCTI	[ONH	vs. 330)		este d	
Dedo ncker et al., 2016 b	a- tDCS (offli ne and onlin e)	DL PF C	Digit span from WAIS II, SART, detecti on task: picture	Accura cy	0. 1 8 (0 .0 3 - 0. 1	< 0.0 1	16 5	535 9 (268 0 vs. 267 9)	52.50 %	Not sugg este d	Ver y low
		S	and sentenc e, go/no- go, 2- back, 3- back, n- back, EAT, GDT, BART, IAT,	Reactio n time	8) - 0. 1 1 (- 0. 1 7 0. 0	< 0.0 1	12 4	413 0 (206 5 vs. 206 5)	0%		Low
	c- tDCS (offli ne and onlin		Sternb erg, PASAT, CPT, TOL, RAT and	Accura cy	5) 0. 0 3 (- 0. 1	0.7 0	28	942 (471 vs. 471)	33.8 %	Not sugg este d	Ver y low

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---0. 4 4)

a-tDCS: anodal tDCS, c-tDCS: cathodal tDCS, DLPFC: dorsolateral prefrontal cortex, rDLPFC: right dorsolateral prefrontal cortex, IDLPFC: lateral dorsolateral prefrontal cortex, IFG: inferior frontal gyrus, IPFC: left prefrontal cortex, PASAT: paced auditory serial addition test, OSPAN: operation span, WAIS-WM: Wechsler Adult Intelligence Scale Working Memory, SART: Sustained attention to respond task, TOL: Tower of London, RAT: Remote associates test, GDT: Game of dice task, BART: Balloon analog risk task, EAT: Error awareness task, IAT: Implicit association test, CRT: cognitive. reflection test, PANAS: Positive and negative affect schedule. Values in bold represent significant comparisons.

domain	$\mathbf{P}_{i}^{i} = \mathbf{f}_{i}^{i} + \mathbf{e}_{i}^{i} + \mathbf{e}$
Cognitive domain:	Findings from the umbrella review:
Working memory	5 comparisons among healthy
	individuals indicated significant
	benefit of a-tDCS for working
	memory, but there was at best
	moderate certainty that the true
	effect is close to the estimates from
	the meta-analyses.
	5 comparisons among healthy
	individuals indicated no benefit of a-
	tDCS for working memory.
	3 comparisons among neuropsychiatric
	individuals indicated no benefit of a-
	tDCS for working memory.
[Long-term] memory	2 comparisons among healthy
	individuals indicated no benefit of
	either a-tDCS or c-tDCS for [long-term]
	memory improvement.
Set shifting	2 comparisons among healthy
	individuals indicated no benefit of a-
	tDCS for set shifting.
Response inhibition	5 comparisons among healthy
-	individuals indicated no benefit of a-
	tDCS for response inhibition.
	1 comparison among
	neuropsychiatric individuals
	indicated a significant benefit of a-
	tDCS for response inhibition. but
	there was very low certainty that the
	true effect is close to the estimate
\mathbf{O}	from the meta-analysis.
	1 comparison among neuropsychiatric
	individuals indicated no benefit of c-
	tDCS for response inhibition.
Language	1 comparison among healthy
	individuals indicated a significant
	benefit of a-tDCS for language
	performance, but there was very low
	certainty that the true effect is close
$\mathbf{\mathbf{\mathbf{\mathbf{\mathbf{\mathbf{\mathbf{\mathbf{\mathbf{\mathbf{\mathbf{\mathbf{\mathbf{\mathbf{\mathbf{\mathbf{\mathbf{\mathbf{$	to the estimate from the meta-
	analysis.
	4 comparisons among healthy
	individuals indicated no benefit of a-
	tDCS for language performance.
Aggression	1 comparison among healthy
1981 00011	individuals indicated no benefit of a-
	tDCS for aggression.

Table 4. Description of the main findings in the umbrella review for each cognitive domain

Overeating/Food cravings	1 comparison among healthy
	individuals indicated significant
	benefit of a-tDCS for overeating, but
	there was very low certainty that the
	true effect is close to the estimate
	from the meta-analysis.
	2 comparisons among mixed samples
	of healthy and neuropsychiatric
	individuals indicated a significant
	benefit of tDCS for food cravings, but
	there was very low certainty that the
	true effect is close to the estimates
	from meta-analyses.
	1 comparison among mixed samples of
	healthy and neuropsychiatric
	individuals indicated no benefit of tDCS
	for food cravings.
Emotional and implicit bias	1 comparison among healthy
	individuals indicated a significant
	benefit of a-tDCS for emotional bias
	and implicit bias, but there was low
	certainty that the true effect is close
	to the estimate from the meta-
	analysis.
	6 comparisons among healthy individuals indicated no benefit of a-
	tDCS or c-tDCS for emotional bias.
Honesty	1 comparison among healthy
lionesty	individuals indicated no benefit of a-
	tDCS for honesty.
Rumination	1 comparison among healthy
	individuals indicated no benefit of a-
\sim	tDCS for rumination.
Impulsivity	1 comparison among healthy
	individuals indicated no benefit of a-
	tDCS for impulsivity.
Risk-taking	1 comparison among healthy
	individuals indicated significant
	benefit of a-tDCS for risk-taking, but
	there was very low certainty that the
	there was very low certainty that the true effect is close to the estimate
	true effect is close to the estimate
	true effect is close to the estimate from the meta-analysis.
	true effect is close to the estimate