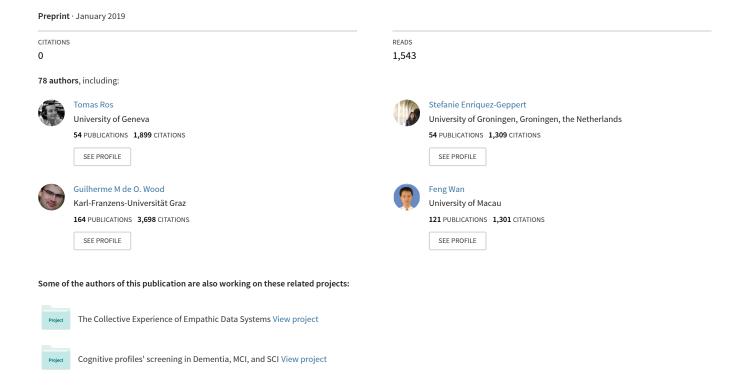
Consensus on the reporting and experimental design of clinical and cognitive-behavioural neurofeedback studies (CRED-nf checklist)



Consensus on the reporting and experimental design of clinical and cognitive-behavioural neurofeedback studies (CRED-nf checklist)

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After a protracted history, neurofeedback has begun to attract the attention and scrutiny of the scientific and medical mainstream (Kamiya, 2011; Linden, 2014; Sitaram et al., 2017). A debate now centres on the extent to which neurofeedback alters brain function and behaviour, and the mechanisms through which neurofeedback operates (e.g., neurofeedback-specific versus nonspecific). A series of correspondences in *Lancet Psychiatry* (Micoulaud-Franchi & Fovet, 2016; Pigott et al., 2017; Schönenberg et al., 2017b, 2017a, Thibault & Raz, 2016a, 2016b) and *Brain* (Fovet et al., 2017; Schabus, 2017, 2018; Schabus et al., 2017; Thibault, Lifshitz, & Raz, 2017a, 2017b; Witte, Kober, & Wood, 2018) discusses the theoretical arguments and empirical data backing the involvement of these two mechanisms.

The apparent controversy that the correspondence letters present stems from a well-known phenomenon in neuropsychology: that multiple components can drive the benefits of a treatment (Campbell & Stanley, 1983; Enriquez-Geppert, Huster, & Herrmann, 2013). We depict this hypothesized multi-component model for the context of neurofeedback in Figure 1. We divide the mechanisms driving experimental outcomes into five bins: neurofeedback-specific (related to training a target neurophysiological variable), neurofeedback-nonspecific (dependent on the

neurofeedback context, but independent from the act of controlling a particular brain signal), general nonspecific (including the common benefits of cognitive training as well as psychosocial influences, such as placebo responding), repetition related (e.g., test re-test improvement), and natural (e.g., spontaneous remission, cognitive development) (Micoulaud-Franchi & Fovet, 2018).

Evidence for putatively causal, neurofeedback-specific mechanisms relies on our knowledge of the physiological basis of neural activity and its relevance to cognition (for a review of neurofeedback mechanisms see Ros et al., 2014 and Sitaram et al., 2017). For example, the association between neural activity and cognition in animals (Babapoor-Farrokhran, Vinck, Womelsdorf, & Everling, 2017; Cao et al., 2016) suggests that self-regulation of brain circuits can alter behaviour and cognition. A number of neurofeedback experiments in animals (Schafer & Moore, 2011; Sterman, Howe, & Macdonald, 1970), and humans (e.g., Watanabe et al. 2017; Young et al., 2017) further support this view. Evidence suggesting that mechanisms other than neurofeedback-specific factors account for the effects of neurofeedback come from a number of recent studies and reviews that find comparable benefits between participants who receive veritable neurofeedback from their own brain and those who observe a sham-neurofeedback signal unrelated to their neural activity of interest (e.g., Schabus et al., 2017; Schönenberg et al., 2017b; Thibault & Raz, 2017).

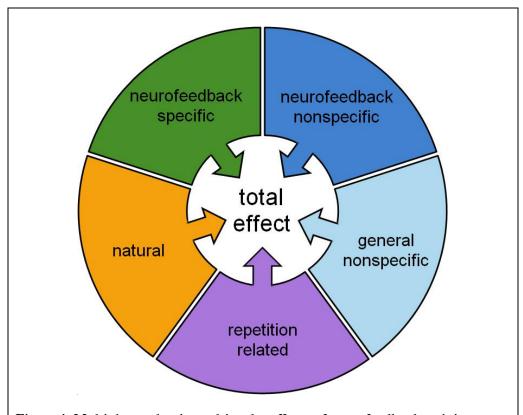


Figure 1. Multiple mechanisms drive the effects of neurofeedback training. Neurofeedback participants may benefit from: (1) the *specific neurophysiological process* of training a particular brain signal, depicted in green. *Nonspecific factors*, including (2) those

unique to the neurofeedback environment (e.g. trainer-participant interaction in a neurotechnology context), depicted in dark blue; and (3) those that are common across interventions (e.g., all other benefits from engaging in a form of cognitive training as well as the psychosocial and placebo mechanisms related to participating in an experiment), depicted in light blue. (4) Repetition-related effects, depicted in purple. (5) Natural effects, which can be positive (e.g., cognitive development in childhood) or negative (e.g., cognitive decline in older age), depicted in orange. These mechanisms may interact synergistically to create a greater overall effect, interact antagonistically to lessen the total benefit, or combine additively (see Finnerup, Sindrup, & Jensen, 2010; Rothman, 1974 for a discussion of this topic). By including control groups, carefully designing experiments, and measuring both brain activity and behaviour, researchers can better estimate the contribution coming from each of these mechanisms.

To advance the field of neurofeedback, scientists can benefit from designing future studies with the methodological rigour capable of disentangling the various mechanisms driving the effects of neurofeedback. As authors of the correspondence letters, alongside other researchers active in the field, we propose a standardized checklist outlining best practices in the experimental design and reporting of neurofeedback studies. We believe that widespread adoption of this checklist will help advance our scientific understanding of how neurofeedback affects brain function and behaviour.

Objectives of the checklist

This checklist is intended to encourage robust experimental design and clear reporting for clinical and cognitive-behavioural neurofeedback experiments (for a methodological review see Enriquez-Geppert et al., 2017). Because all neurofeedback aims to train brain activity, these guidelines generalize across EEG (electroencephalography), MEG (magnetoencephalography), fMRI (functional magnetic resonance imaging), fNIRS (functional near infrared spectroscopy) and other neurofeedback modalities. The checklist focuses mainly on aspects unique to the neurofeedback context (as general standards for each imaging modality already exist, e.g., Gross et al., 2013; Nichols et al., 2017; Pernet et al., 2018). It serves as a complement, rather than alternative, to the Consolidated Standards of Reporting Trials (CONSORT) guidelines (Schulz, Altman, & Moher, 2010). When submitting neurofeedback results for publication, we encourage researchers to include the checklist below and fill in the boxes with the page number identifying where in their manuscript each point is addressed. This checklist does not aim to inhibit the exploration of novel directions in neurofeedback research. On the contrary, it advocates robust designs and clear reporting to promote informed research decisions that can effectively build upon previous work. These guidelines are a first iteration. As neurofeedback research progresses, we invite the community to provide comments for improving this checklist. We hope these guidelines will help disentangle the relative contribution of the mechanisms outlined in Figure 1.

<u>C</u>onsensus on the <u>R</u>eporting and <u>E</u>xperimental <u>D</u>esign of clinical and cognitivebehavioural <u>N</u>euro<u>f</u>eedback studies (CRED-nf) best practices checklist 2019*

Pre-experiment 1a Pre-register experimental protocol and planned analyses 1b Justify sample size Control groups 2a Employ control group(s) or control condition(s) 2b When leveraging experimental designs where a double-blind is possible, use a double-blind 2c Blind those who rate the outcomes, and when possible, the statisticians involved 2d Examine to what extent participants and experimenters remain blinded 2e In clinical efficacy studies, employ a standard-of-care intervention group as a benchmark for improvement Solution and group as a collect data on psychosocial factors 3b Report whether participants were provided with a strategy 3c Report the strategies participants used 3d Report methods used for online-data processing and artifact correction 3e Report double solution and group effects for artifacts Feedback specifications 4a Report how the online-feature extraction was defined 4b Report and justify the reinforcement schedule 4c Report the feedback modality and content 4d Collect and report all brain activity variable(s) and/or contrasts used for feedback, as displayed to experimental participants 4e Report the hardware and software used Outcome measures Brain 5a Report neurofeedback regulation success based on the feedback signal 5b Plot within-session and between-session regulation blocks of feedback variable(s), as well as pre-to-post resting baselines or contrasts 5c Statistically compare the experimental condition/group to the control condition(s)/group(s) (not only each group to baseline measures)				Reported
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^{*}Darker shaded boxes represent *Essential* checklist items; lightly shaded boxes represent *Encouraged* checklist items. If a checklist item is "not addressed" in the manuscript, enter "N" in place of the page number. We recommend using this checklist in conjunction with the CRED-nf article, which explains the motivation behind this checklist and provides details regarding many of the checklist items.

Description of checklist items

Pre-experiment

Item 1a. Pre-register experimental protocol and planned analyses

Pre-register, for example, on a platform such as www.osf.io, as a randomized controlled trial (RCT) on *ClinicalTrials.gov* or the European Union Clinical Trials Register (EUCTR), or by submitting a *registered report* (see www.cos.io/rr for information concerning registered reports). *Essential* for clinical and replication studies, *encouraged* for others. Clearly label primary and secondary outcome variables. Indicate the number, frequency, and duration of neurofeedback sessions. In the publication, report which analyses were pre-registered and which were exploratory.

Item 1b. Justify sample size

Justify the sample size with a power analysis based on the smallest effect size of interest (e.g., minimal clinically important differences, see item 6a) or another method (e.g., Bayesian sequential sampling). Otherwise, label the experiment as a pilot study. If the pre-registered sample size is not met, state so. We do not recommend selecting a sample size based on an expected effect size derived from previous literature. Due to the publication bias that remains common across research fields, this practice can leave experiments underpowered (Albers & Lakens, 2018; Algermissen & Mehler, 2018).

Control groups

Item 2a. Employ control group(s) or control condition(s)

Employ a control group (between subjects) or control condition (within subjects). This could include a placebo-control (e.g. sham-neurofeedback, neurofeedback from a largely unrelated brain signal, or inversing the neurofeedback reward contingency) or another active non-neurofeedback control (e.g. a similar type of computerized cognitive training, biofeedback, or medication). See Sorger et al. (2018) for an in-depth review of control groups in neurofeedback research. Consider the potential for, and report any, adverse effects in both the experimental and control groups.

Item 2b. When leveraging experimental designs where a double-blind is possible, use a double-blind

For example, in experiments with a placebo-neurofeedback control group or within participant control conditions.

Item 2c. Blind those who rate the outcomes, and when possible, the statisticians involved Indicate which individuals were blinded, how blinding was achieved and whether the blind was maintained.

Item 2d. Examine to what extent participants and experimenters remain blinded For an overview on reporting whether blinding was successful, see Kolahi, Bang, & Park (2009).

Item 2e. In clinical efficacy studies, employ a standard-of-care intervention group as a benchmark for improvement

This design helps establish whether neurofeedback is superior to, or at least non-inferior to, standard treatments.

Control measures

Item 3a. Collect data on psychosocial factors

For example, participant motivation, treatment expectation, effort exerted, and subjective sense of success.

Item 3b. Report whether participants were provided with a strategy If strategies were provided, report the details of the strategies.

Item 3c. Report the strategies participants used

Item 3d. Report methods used for online-data processing and artifact correction For example, detection and rejection/correction of ocular and muscular artifacts (EEG, MEG), and of cardio-respiratory and movement artifacts (fMRI).

Item 3e. Report condition and group effects for artifacts

Report condition and group effects for the artifacts detailed for item 3d (to test whether artifacts are more prevalent in certain participants and conditions).

Feedback specifications

Item 4a. Report how the online-feature extraction was defined

For example, a frequency band, frequency band ratio, single region of interest, or functional connectivity measure. Was it individualized or fixed across all participants? How was it extracted (e.g., number and location of electrodes)?

Item 4b. Report and justify the reinforcement schedule

For example, justify the reinforcement schedule, or the feedback threshold criteria, in relation to existing neurofeedback literature and practice. Report how the feedback was given (e.g. continuous or periodic, proportional or binary). Report the amount of reward (e.g., percentage) per subject and across subjects.

Item 4c. Report the feedback modality and content

Identify the feedback modality (e.g., visual, auditory, tactile, proprioceptive), and the feedback format (e.g., video clip, simple graphic, melody, tone).

Item 4d. Collect and report all brain activity variable(s) and/or contrasts used for feedback, as displayed to experimental participants

Time points may include (i) a pre-training baseline, (ii) rest blocks, (iii) training blocks, (iv) a post-training baseline, (v) transfer run(s) without neurofeedback, and (vi) long-term follow-up. *Essential* (ii, iii), *encouraged* (i, iv, v, vi). Report the relevant units.

Item 4e. Report the hardware and software used Include the versions.

Outcome measures (brain)

Item 5a. Report neurofeedback regulation success based on the feedback signal

Identify the baseline or contrast used (e.g., subject specific data from a previous session, reference data based on averaged data from a normative group). Identify the comparator run (e.g., training run or transfer run).

Item 5b. Plot within-session and between-session regulation blocks of feedback variable(s), as well as pre-to-post resting baselines or contrasts

Plotting the session course by comparing the session beginning, middle, and end (for instance, by arbitrarily dividing sessions to segments or using session blocks) allows the assessment of within-session dynamics. Between-session comparisons allow the assessment of the whole training course on a temporally more abstract level.

Item 5c. Statistically compare the experimental condition/group to the control condition(s)/group(s) (not only each group to baseline measures)

Comparing experimental and control groups/conditions to their respective baselines, but not to each other fails to test whether the experimental intervention outperforms the control intervention(s) (Nieuwenhuis, Forstmann, & Wagenmakers, 2011).

Outcome measures (behaviour)

Item 6a. Include measures of clinical or behavioural significance, defined a priori, and describe whether they were reached

For example, by using minimal clinically important differences (MCIDs) to establish the magnitude of an effect to interpret as clinically meaningful (see Engel, Beaton, & Touma, 2018 for overview on establishing MCID values). Moreover, collect data on acceptability, safety, and adverse effects. In this paper, we are using

the term behaviour in the broad sense to encompass all non-physiological measures, including self-reports.

Item 6b. Run correlational analyses between regulation success and behavioural outcomes

Data storage

Item 7a. Upload all materials, analysis scripts, code, and raw data used for analyses, as well as final values, to an open access data repository, when feasible

Contributorship statement

Tomas Ros (TR), Stefanie Enriquez-Geppert (SEG), and Robert T. Thibault (RTT) developed the idea for a checklist of this type. RTT prepared an initial rough draft. TR, SEG, and RTT worked together to produce a complete first draft. Kymberly Young, James Sulzer, Surjo Soekadar, Ranganatha Sitaram, Michael Schönenberg, Frank Scharnowski, Manuel Schabus, Jean-Arthur Micoulaud-Franchi, David M. A. Mehler, Joel Lubar, David E. J. Linden, Rene J. Huster, John Gruzelier, Thomas Fovet, Niels Birbaumer, and Martijn Arns provided comments on the first complete draft. TR, SEG, and RTT worked together to implement the comments and produce a second draft. All authors provided comments on the second draft. TR, SEG, and RTT worked together to implement the comments and produce the final version.

References:

- Albers, C., & Lakens, D. (2018). When power analyses based on pilot data are biased: Inaccurate effect size estimators and follow-up bias. *Journal of Experimental Social Psychology*, 74(April 2016), 187–195. https://doi.org/10.1016/j.jesp.2017.09.004
- Algermissen, J., & Mehler, D. M. A. (2018). May the power be with you: are there highly powered studies in neuroscience, and how can we get more of them? *Journal of Neurophysiology*. https://doi.org/10.1152/jn.00765.2017
- Babapoor-Farrokhran, S., Vinck, M., Womelsdorf, T., & Everling, S. (2017). Theta and beta synchrony coordinate frontal eye fields and anterior cingulate cortex during sensorimotor mapping. *Nature Communications*. https://doi.org/10.1038/ncomms13967
- Campbell, D. T., & Stanley, J. C. (1983). Experimental and Quasi-Experimental Design for Research. Handbook of Research on Teaching. https://doi.org/10.1037/022808
- Cao, B., Wang, J., Zhang, X., Yang, X., Poon, D. C. H., Jelfs, B., ... Li, Y. (2016). Impairment of decision making and disruption of synchrony between basolateral amygdala and anterior cingulate cortex in the maternally separated rat. *Neurobiology of Learning and Memory*. https://doi.org/10.1016/j.nlm.2016.09.015
- Engel, L., Beaton, D. E., & Touma, Z. (2018). Minimal Clinically Important Difference: A Review of Outcome Measure Score Interpretation. *Rheumatic Disease Clinics of North America*, 44(2), 177–188. https://doi.org/10.1016/j.rdc.2018.01.011
- Enriquez-Geppert, S., Huster, R. J., & Herrmann, C. S. (2013). Boosting brain functions: Improving executive functions with behavioral training, neurostimulation, and neurofeedback. *International Journal of Psychophysiology*. https://doi.org/10.1016/j.ijpsycho.2013.02.001
- Enriquez-Geppert, S., Huster, R. J., & Herrmann, C. S. (2017). EEG-Neurofeedback as a Tool to Modulate Cognition and Behavior: A Review Tutorial. *Frontiers in Human Neuroscience*. https://doi.org/10.3389/fnhum.2017.00051

- Finnerup, N. B., Sindrup, S. H., & Jensen, T. S. (2010). The evidence for pharmacological treatment of neuropathic pain. *Pain*. https://doi.org/10.1016/j.pain.2010.06.019
- Fovet, T., Micoulaud-Franchi, J.-A., Vialatte, F.-B., Lotte, F., Daudet, C., Batail, J.-M., ... Ros, T. (2017). On assessing neurofeedback effects: should double-blind replace neurophysiological mechanisms? *Brain*, (August), 1–3. https://doi.org/10.1093/brain/awx211
- Gross, J., Baillet, S., Barnes, G. R., Henson, R. N., Hillebrand, A., Jensen, O., ... Schoffelen, J.-M. (2013). Good practice for conducting and reporting MEG research. *NeuroImage*, *65*, 349–363. https://doi.org/10.1016/j.neuroimage.2012.10.001
- Kamiya, J. (2011). The First Communications About Operant Conditioning of the EEG. *Journal of Neurotherapy*, 15(1), 65–73. https://doi.org/10.1080/10874208.2011.545764
- Kolahi, J., Bang, H., & Park, J. (2009). Towards a proposal for assessment of blinding success in clinical trials: Up-to-date review. *Community Dentistry and Oral Epidemiology*, *37*(6), 477–484. https://doi.org/10.1111/j.1600-0528.2009.00494.x
- Linden, D. E. J. (2014). *Brain control: developments in therapy and implications for society* (1st ed.). Basingstoke, Hampshire: Palgrave Macmillan UK. https://doi.org/10.1057/9781137335333
- Micoulaud-Franchi, J.-A., & Fovet, T. (2016). Neurofeedback: time needed for a promising non-pharmacological therapeutic method. *The Lancet Psychiatry*, *3*(9), e16. https://doi.org/10.1016/S2215-0366(16)30189-4
- Micoulaud-Franchi, J.-A., & Fovet, T. (2018). A framework for disentangling the hyperbolic truth of neurofeedback: Comment on Thibault and Raz (2017). *American Psychologist*, 73(7), 933–935.
- Nichols, T. E., Das, S., Eickhoff, S. B., Evans, A. C., Glatard, T., Hanke, M., ... Yeo, B. T. T. (2017). Best practices in data analysis and sharing in neuroimaging using MRI. *Nature Neuroscience*. https://doi.org/10.1038/nn.4500
- Nieuwenhuis, S., Forstmann, B. U., & Wagenmakers, E. (2011). Erroneous analyses of interactions in neuroscience: A problem of significance. *Nature Neuroscience*, *14*(9), 1105–1109. https://doi.org/10.1038/nn.2886
- Pernet, C., Garrido, M., Gramfort, A., Maurits, N., Michel, C., Pang, E., ... Puce, A. (2018). Best Practices in Data Analysis and Sharing in Neuroimaging using MEEG. *PsyArXiv*. Retrieved from http://www.humanbrainmapping.org/files/2016/COBIDAS-Final For Vote.pdf
- Pigott, H. E., Trullinger, M., Harbin, H., Cammack, J., Harbin, F., & Cannon, R. (2017). Confusion regarding operant conditioning of the EEG. *The Lancet Psychiatry*, 4(December). https://doi.org/10.1016/S2215-0366(17)30437-6
- Ros, T., Baars, B. J., Lanius, R. A., & Vuilleumier, P. (2014). Tuning pathological brain oscillations with neurofeedback: A systems neuroscience framework. *Frontiers in Human Neuroscience*, 8(December), Article 1008. https://doi.org/10.3389/fnhum.2014.01008
- Rothman, K. J. (1974). Synergy and antagonism in cause-effect relationships. *American Journal of Epidemiology*. https://doi.org/10.1093/oxfordjournals.aje.a121626
- Schabus, M. (2017). Reply: On assessing neurofeedback effects: should double-blind replace neurophysiological mechanisms? *Brain*, (September), 1–5.

- https://doi.org/10.1093/brain/awx212
- Schabus, M. (2018). Reply: Noisy but not placebo: defining metrics for effects of neurofeedback. *Brain*, (March), 1–2. https://doi.org/10.1093/brain/awy060
- Schabus, M., Griessenberger, H., Gnjezda, M.-T., Heib, D., Wislowska, M., & Hoedlmoser, K. (2017). Better than sham? A double-blind placebo-controlled neurofeedback study in primary insomnia. *Brain*.
- Schafer, R. J., & Moore, T. (2011). Selective attention from voluntary control of neurons in prefrontal cortex. *Science*. https://doi.org/10.1126/science.1199892
- Schönenberg, M., Wiedemann, E., Schneidt, A., Scheeff, J., Logemann, A., Keune, P. M., & Hautzinger, M. (2017a). Confusion regarding operant conditioning of the EEG Authors' reply. *The Lancet Psychiatry*, 4(12), 897–898. https://doi.org/10.1016/S2215-0366(17)30437-6
- Schönenberg, M., Wiedemann, E., Schneidt, A., Scheeff, J., Logemann, A., Keune, P. M., & Hautzinger, M. (2017b). Neurofeedback, sham neurofeedback, and cognitive-behavioural group therapy in adults with attention-deficit hyperactivity disorder: a triple-blind, randomised, controlled trial. *Lancet Psychiatry*, 4(9), 673–684.
- Schulz, K. F., Altman, D. G., & Moher, D. (2010). CONSORT 2010 Statement: Updated Guidelines for Reporting Parallel Group Randomized Trials OF TO. *Annals of Internal Medicine*, 152(11), 726–732. https://doi.org/10.7326/0003-4819-152-11-201006010-00232
- Sitaram, R., Ros, T., Stoeckel, L. E., Haller, S., Scharnowski, F., Lewis-Peacock, J., ... Sulzer, J. (2017). Closed-loop brain training: the science of neurofeedback. *Nature Reviews Neuroscience*, 18(2), 86–100. https://doi.org/10.1038/nrn.2016.164
- Sorger, B., Scharnowski, F., Linden, D. E. J., Hampson, M., & Young, K. D. (2018). Control freaks: Towards optimal selection of control conditions for fMRI neurofeedback studies. *NeuroImage*.
- Sterman, M. B., Howe, R. C., & Macdonald, L. R. (1970). Facilitation of spindle-burst sleep by conditioning of electroencephalographic activity while awake. *Science*. https://doi.org/10.1126/science.167.3921.1146
- Thibault, R. T., Lifshitz, M., & Raz, A. (2017a). Neurofeedback or Neuroplacebo? *Brain*, 140(4), 862–864. https://doi.org/10.1093/brain/awx033
- Thibault, R. T., Lifshitz, M., & Raz, A. (2017b). The Climate of Neurofeedback: Scientific Rigour and the Perils of Ideology. *Brain*, 1–3.
- Thibault, R. T., & Raz, A. (2016a). Neurofeedback: The power of psychosocial therapeutics. *The Lancet Psychiatry*, *3*(11), e18.
- Thibault, R. T., & Raz, A. (2016b). When can neurofeedback join the clinical armamentarium? *The Lancet Psychiatry*, *3*, 497–498.
- Thibault, R. T., & Raz, A. (2017). The Psychology of Neurofeedback: Clinical Intervention even if Applied Placebo. *American Psychologist*, 72(7), 679–688. https://doi.org/10.1037/amp0000118
- Watanabe, T., Sasaki, Y., Shibata, K., & Kawato, M. (2017). Advances in fMRI Real-Time Neurofeedback. *Trends in Cognitive Sciences*, 21(12), 997–1010. https://doi.org/10.1016/j.tics.2017.09.010

- Witte, M., Kober, S. E., & Wood, G. (2018). Noisy but not placebo: defining metrics for effects of neurofeedback. *Brain*, (April), 1–3. https://doi.org/10.1093/brain/awy060
- Young, K. D., Siegle, G. J., Zotev, V., Phillips, R., Misaki, M., Yuan, H., ... Bodurka, J. (2017). Randomized Clinical Trial of Real-Time fMRI Amygdala Neurofeedback for Major Depressive Disorder: Effects on Symptoms and Autobiographical Memory Recall. *American Journal of Psychiatry*, (20), appi.ajp.2017.1. https://doi.org/10.1176/appi.ajp.2017.16060637
- Zeyda, F., Aranyi, G., Charles, F., & Cavazza, M. (2015). An Empirical Analysis of Neurofeedback Using PID Control Systems. In 2015 IEEE International Conference on Systems, Man, and Cybernetics (pp. 3197–3202). IEEE. http://doi.org/10.1109/SMC.2015.555