# **(tedana Multi-echo fMRI noise removal software and resources**

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# tedana.readthedocs.io







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## **MULTI-ECHO FMRI**

Multi-echo fMRI involves collecting data at several echo times (TEs) during one acquisition. T<sup>\*</sup>, signal, like the fMRI BOLD response, scales across echoes. Multi-echo information can be used to better isolate T<sub>o</sub>\* signal changes.<sup>1,2</sup>

TE=5ms TE=30ms TE=55ms TE=105ms TE=130ms TE=130ms TE=130ms TE=180ms For the same finger tapping task, the response magnitude

#### **TEDANA ALGORITHM**



#### **IMPROVEMENTS DURING THE PAST YEAR**

Continued improvements to multi-echo fMRI educational materials and documentation.

Logging of data processing information including, hardware, OS version, Python module versions, & a permanent citation for the executed version of the decision tree. https://doi.org/10.6084/m9.figshare.25251433.v2



1. Open software to test and improve multi-echo methods with an emphasis on an ICA-based denoising method<sup>4-6</sup>. Currently built into AFNI and fMRIPrep pipelines.

2. Tools to make ICA-based denoising methods adaptable & understandable.

3. A community and resources for people interested in multi-echo fMRI whether or not they use tedana software

## WAYS TO CONNECT

Multi-echo questions: https://neurostars.org with 'multi-echo' or 'tedana' tags Subscribe to the tedana (low volume) newsletter: https://groups.google.com/g/tedana-newsletter Join the conversation: mattermost.brainhack.org/brainhack/channels/tedana Code and resources are open source. Contribute **at:** https://github.com/ME-ICA/tedana

New decision tree that fully aligns with the older MEICA<sup>4,5</sup> software.

Improvements & fixes to methods for calculating the number of usable echoes at each voxel.

Fitting ICA components to external time series (similar to AROMA<sup>7</sup>) to include non- $T_{0}^{*}$ reasons for component classifications, like head motion, CSF signal, and respiratory noise, in an integrated decision tree. (very soon to be added to tedana)

#### **EXAMPLE OF USING EXTERNAL METRICS IN**

**A DECISION TREE** 



## **IMPROVED RESULTS REPORT**

Tedana outputs an interactive report to help users understand their results and perform quality assurance.



A list of multi-echo content at OHBM: github.com/ME-ICA/ohbm-2024-multiecho







Var. Expl.: 0.94%

for voxels with at least one These two masks are newly

The quality of the fit to a  $T_{9}^{*}$ &  $S_0$  model (Root mean squared error) is useful for characterizing dropout and identifying potential limits of data (newly added).







#### REFERENCES

- 1. Poser, B., et al. (2006). "BOLD contrast sensitivity enhancement and artifact reduction with multiecho EPI: parallel-acquired inhomogeneity-desensitized fMRÍ." Magn Reson Med 55(6): 1227-35. 2. Posse, S., et al. (1999). "Enhancement of BOLD-contrast sensitivity by single-shot multi-echo functional MR
- imaging." Magn Reson Med 42(1): 87-97. 3. Barth, M., et al. (2001). "Characterization of BOLD activation in multi-echo fMRI data using fuzzy cluster
- analysis and a comparison with quantitative modeling" NMR Biomed 14:484-9. 4. Kundu, P., et al. (2012). "Differentiating BOLD and non-BOLD signals in fMRI time series using multi-echo
- EPI." NeuroImage 60(3): 1759-1770.
- 5. Kundu, P., et al (2017). "Multi-echo fMRI: A review of applications in fMRI denoising and analysis of BOLD signals." NeuroImage 154: 59-80.
- 6. DuPre, Salo et al., (2021). "TE-dependent analysis of multi-echo fMRI with tedana." Journal of Open Source Software, 6(66), 3669,
- https://doi.org/10.21105/joss.03669
- 7. Pruim, R.H.R., et al (2015). "ICA-AROMA: A robust ICA-based strategy for removing motion artifacts from fMRI data." NeuroImage 112: 267-77.

8. Anglada-Girotto, M. et al (2022). "robustica: customizable robust ICA" BMC Bioinformatics 23, 519

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Provisional accept  $\rightarrow$ Accept Provisional reject  $\rightarrow$ Reject

A researcher can create a file of "nuisance" time series, like head cardiac signals. These can be fit to components and decisions to keep or reject can be made based on the fits. This was designed to be highly flexible to allow a wide range of possible integrations. For example, the above method removes components that fit noise, but retains components with  $T_{a}$ signal that fits the task design.

Images of the mean  $T_2^*$  (left) and  $S_0$  (right) across time are newly added. More detailed explanations of all images in the report are added to:

https://tedana.readthedocs.io/en/stable/outputs.html#ica-components-report

## FUTURE PLANS

Work-in-progress to add RobustICA<sup>8</sup> into tedana which will motion, CSF signal, or respiratory and give more stable component estimations by identifying components that cluster across many interations of ICA

> Design and validate component selection processes that take advantage of the added external regressor functionality

> Continue to improve documentation with a focus on educational materials & tools using openly available multi-echo fMRI data