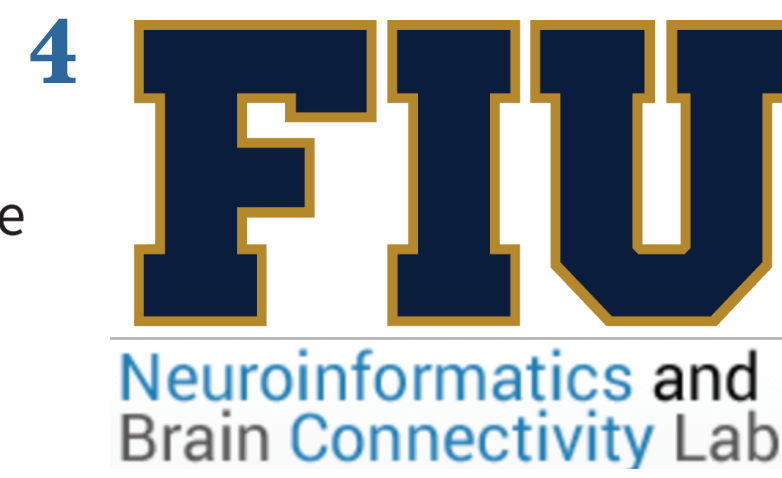


# tedana A growing multi-echo fMRI ecosystem

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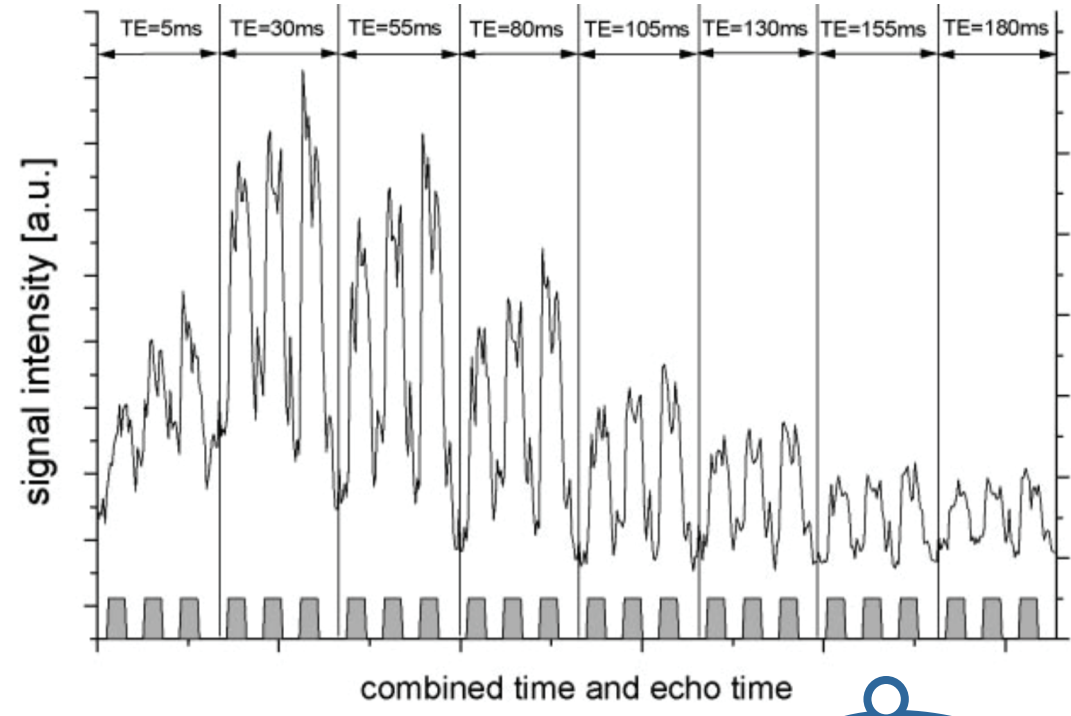
[tedana.readthedocs.io](https://tedana.readthedocs.io)



## WHAT IS MULTI-ECHO FMRI?

The fMRI BOLD response is T2\* weighted and the relative response magnitude varies with echo time (TE). Head motion and some scanner artifacts are S0-weighted and do not vary with TE.

Multi-echo fMRI involves collecting several TEs during one acquisition and the information can be used to better isolate T2\* signal changes.<sup>1,2</sup>



When a participant does the same finger tapping task with different TEs, the response magnitude varies with TE in a predictable manner. Image from Barth et al NMR Biomed 2001



1. Open software to test and improve multi-echo methods with an emphasis on an ICA-based denoising method<sup>4,5</sup>
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

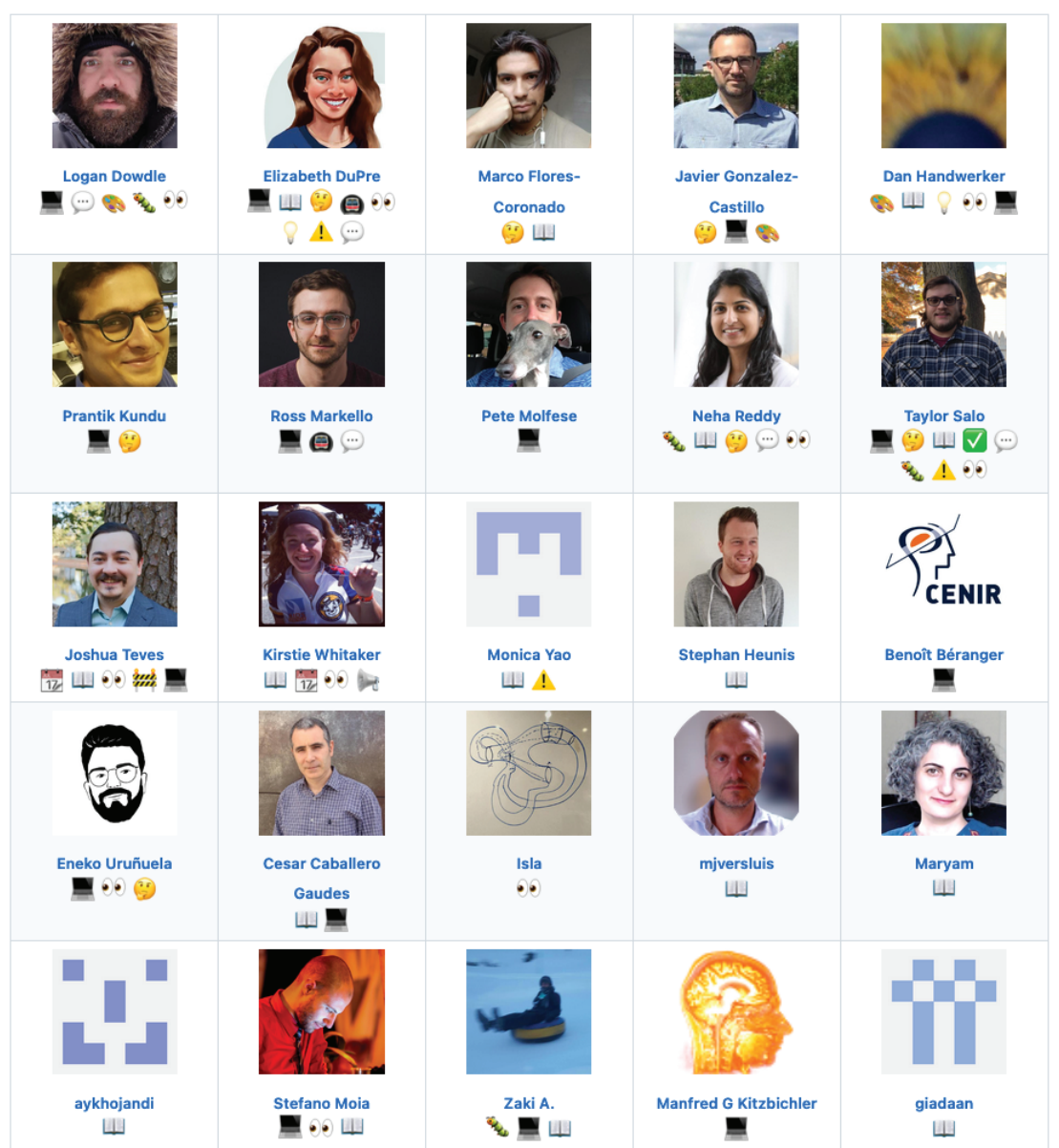
Subscribe to the tedana (low volume) newsletter: <http://tinyletter.com/tedana-devs>

Join the conversation:

[mattermost.brainhack.org/brainhack/channels/tedana](https://mattermost.brainhack.org/brainhack/channels/tedana)  
Code and resources are open source. Contribute at: <https://github.com/ME-ICA/tedana>

A list of multi-echo content at OHBM: <https://github.com/ME-ICA/ohbm-2023-multiecho>

## CONTRIBUTORS



and you!

## REFERENCES

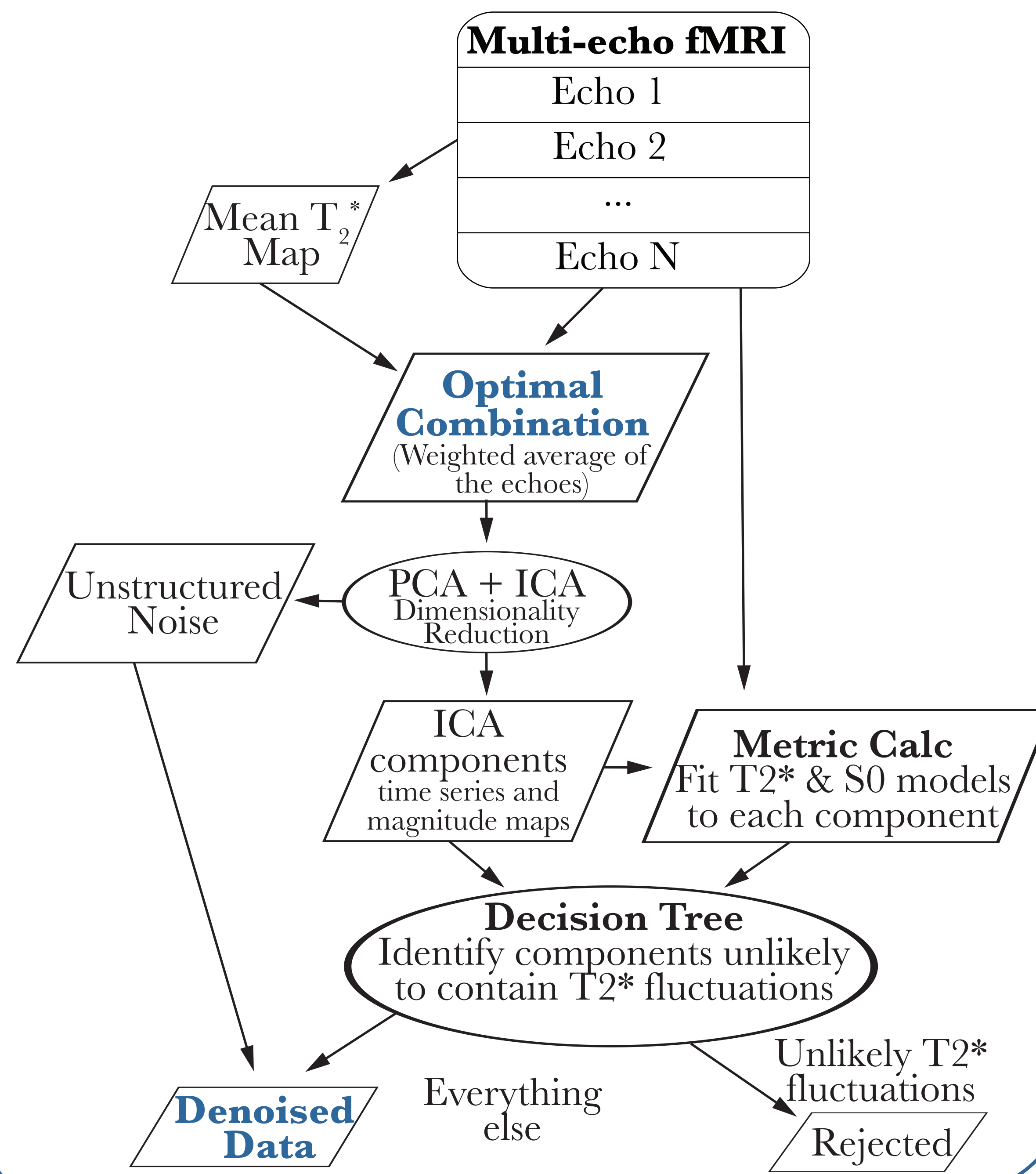
Tedana publication:  
DuPre, Salo et al., (2021). "TE-dependent analysis of multi-echo fMRI with tedana." *Journal of Open Source Software*, 6(66), 3669, <https://doi.org/10.21105/joss.03669>

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## TEDANA ALGORITHM

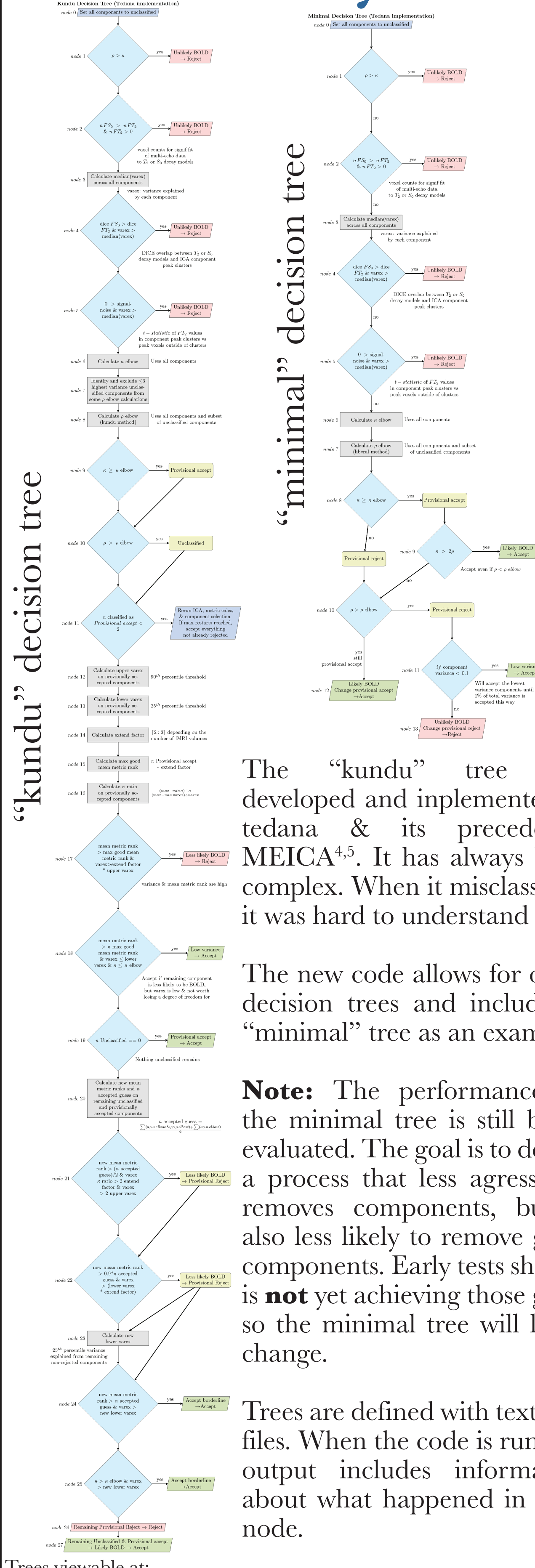


## IMPROVEMENTS DURING THE PAST YEAR

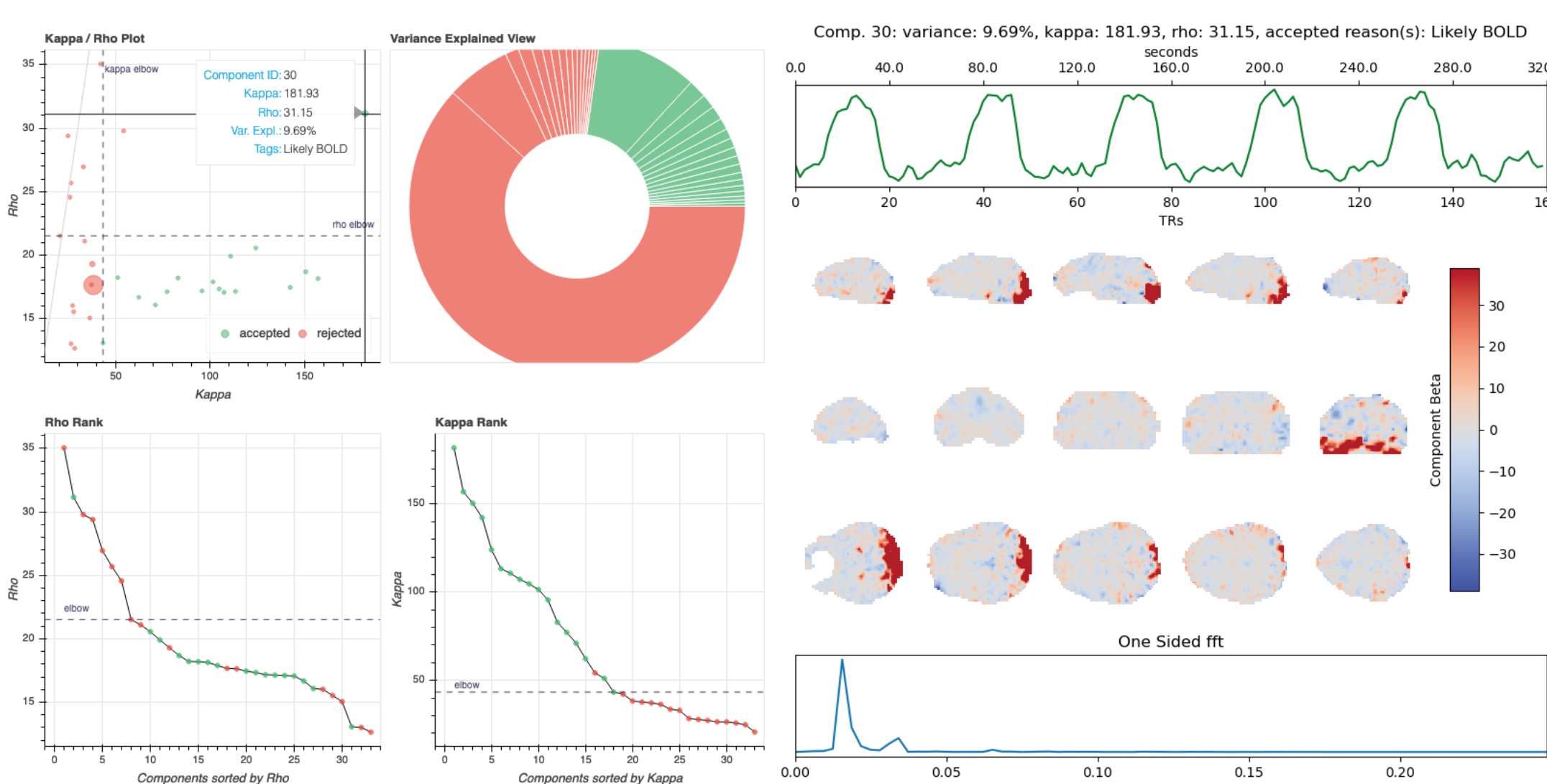
- Modularized "decision tree" step where ICA components are set as accepted or rejected
- Multiple decision trees can be included with tedana and users can input their own tree
- Now possible to add other metrics, like head motion or respiration, into a decision tree
- Full provenance tracking of the component classification process so that it is easier to see in which steps classifications changed.
- Description of new file outputs: <https://tedana.readthedocs.io/en/stable/outputs.html>
- New program 'ica\_reclassify' can manually change component classifications
- Over 10000 new & 4000 cut lines of code

Full release notes: <https://github.com/ME-ICA/tedana/releases/tag/23.0.1>

## Component classification flexibility



## Result reports



Interactive result reports now show lines for kappa and rho elbow thresholds. Hover text includes classification tags with descriptive language for how a component was classified.

Interactive demos for this run of a block design flashing checkerboard block design task are at: <https://me-ica.github.io/ohbm-2023-multiecho/>

The demo shows output for the kundu and minimal tree and reclassifies a component using the new *ica\_reclassify*

Component	initialized classification	Node 0	Node 1	Node 2	Node 4	Node 5	Node 8	Node 9	Node 10	Node 11	Node 13
1 ICA_00	unclassified	unclassified	unclassified	unclassified	unclassified	unclassified	provisionalreject	provisionalreject	provisionalreject	provisionalreject	rejected
2 ICA_01	unclassified	unclassified	unclassified	unclassified	unclassified	unclassified	provisionalreject	provisionalreject	provisionalreject	provisionalreject	rejected
3 ICA_02	unclassified	unclassified	unclassified	unclassified	unclassified	unclassified	provisionalreject	provisionalreject	provisionalreject	provisionalreject	rejected
4 ICA_03	unclassified	unclassified	unclassified	unclassified	unclassified	unclassified	provisionalaccept	provisionalaccept	accepted	accepted	accepted

New status table file shows how classifications changed during every node of the decision tree. Example at: [https://github.com/ME-ICA/ohbm-2023-multiecho/blob/main/tedana/tedana\\_results\\_minimal\\_five-echo/desc-ICA\\_status\\_table.tsv](https://github.com/ME-ICA/ohbm-2023-multiecho/blob/main/tedana/tedana_results_minimal_five-echo/desc-ICA_status_table.tsv)

## Breaking changes current tedana users should know about

- Manual classification changes moved from *tedana* to *ica\_reclassify*
- Descriptive *classification\_tags* replaced *rationale* number codes
- There are no more *ignored* components. Components that were previously *ignored* are now *accepted* with classification tags *low variance* or *Borderline Accept*.

Expanded documentation particularly focused on the new decision tree code at: [tedana.readthedocs.io](https://tedana.readthedocs.io)

## FUTURE PLANS

- Reliability of dimensionality estimation for PCA/ICA is an ongoing issue. Identify solution with general methods or methods that benefit from multi-echo information
- Continue to improve documentation and educational materials
- Improve interactive visualization of single-run results and full study results
- Improve decision process and combine multi-echo & other metrics
- Improve automated comparisons of result quality

Trees viewable at: [https://tedana.readthedocs.io/en/stable/included\\_decision\\_trees.html](https://tedana.readthedocs.io/en/stable/included_decision_trees.html)