# TRX: A community-oriented tractography file format

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# Introduction

File formats that store the results of computational tractography were typically developed within specific software packages. This approach has facilitated a myriad of applications, but this development approach has generated insularity within software packages, and has limited standardization. Moreover, because tractography file formats were developed to solve immediate challenges, only a limited breadth of applications within a single software package was envisioned, sometimes also neglecting computational performance. Given the growing interest in tractography methods and applications, and the increasing size and complexity of datasets, a community-driven standardization of tractography have become a priority. To address these challenges, our community initiated a discussion to design a new file format and agreed to participate in its conception, development, and, if successful, its adoption. Here, we propose TRX, a tractography file format designed to facilitate dataset exchange, interoperability, and state-of-the-art analyses, acting as a community-driven replacement for TCK [1], TRK [2], VTK, TT [3], TRAKO [4], qFIB [5], zFIB [6], NIML.TRACT [10] and DPY [8].

## **Background**

Following discussions on GitHub (<a href="https://github.com/nipy/nibabel/issues/942">https://github.com/nipy/nibabel/issues/942</a>), during a videoconference between the developers of several software libraries for tractography, and at the DIPY online group meeting, we identified key features that were desired by the community (both developers and users):

- 1. Maintain functionality currently implemented by other file formats;
- 2. Computational efficiency (both in speed and file size);
- 3. Extensibility so the file format could evolve more easily.

Feedback from different groups showed that developers desired features such as being based on open-source, well-maintained libraries, and robustness, while users prioritized new functionalities, simplicity, and low memory usage.

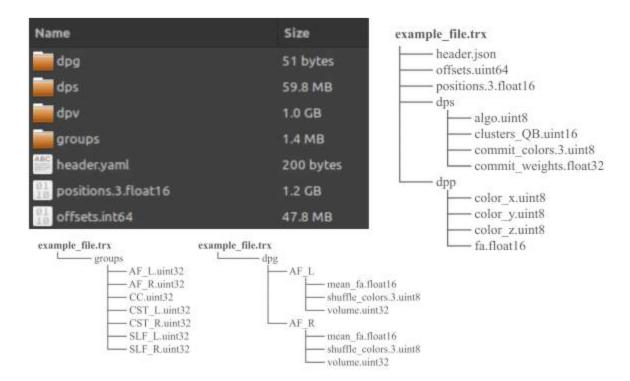
#### Results

A TRX file format candidate specification was designed to favor simplicity and human readability. Its data are organized following an intuitive naming convention that conveys dimensionality and data type. The specification allows storage of both data per vertex and per streamline (similar to TRK), streamlines-group, with both sparse and dense group indices representation. RASMM (world/scanner coordinates) for vertex coordinates is proposed (similar to TCK). The file format supports random-access with minimal upfront RAM requirements, and other low-level operations with virtually no RAM requirements, by using a data and offsets approach (similar to VTK9) and raw binary arrays that allow memory mapping. The file format supports choice over the data type for each raw data array (see Figure 1) and, optional, ZIP compression. Just like other file formats, efficient streamline compression [6] via linearization method is possible without modifying the current specification.

An initial benchmark for operations like partial file loading (Figure 2), concatenation (not shown), affine transformation (not shown), and file saving (Figure 2) was performed using the Python implementation and compared to Nibabel. A C++ prototype was also developed and proposed for community feedback.

### Conclusion

The goal of TRX is to become the first, community-driven, standard amongst tractography file formats. As with other file formats like NiFTI [9], we believe that TRX will serve the community well and the growing computational needs of our field. We encourage community members to consider early contributions to our proposal so as to ensure the new standard will cover the needs of the wider audience of software developers, toolboxes, and scientists. Our long-term plan is to integrate TRX within the Brain Imaging Data Structure (BIDS) ecosystem [8]. Community contributions and related discussions are encouraged using: <a href="https://github.com/frheault/tractography file format/issues">https://github.com/frheault/tractography file format/issues</a>.



**Figure 1:** File structure of the TRX file format. A filename convention conveys the meaning, dimensionality and data type for each data array. The header, positions (coordinates of streamlines) and offsets (starting position of streamlines in the array) are mandatory files. Optional data include the data per streamline (dps), data per vertex (dpv), groups and data per group (dpg). Specifications can be found at <a href="https://github.com/frheault/tractography\_file\_format/blob/master/trx\_file\_memmap/specifications.md">https://github.com/frheault/tractography\_file\_format/blob/master/trx\_file\_memmap/specifications.md</a>.



Figure 2: Load times (in seconds) for loading and saving a small (1 streamline) to a large file (6M streamlines). To facilitate visualization and comparison, the graph is shown on a logarithmic scale. DIPY is a Python implementation from DIPY [7] that does not support data per streamline / data per vertex (deprecated, TRK). Nibabel is the Nibabel API (version 3.0, TRK). Mapped is an implementation that allows random access (available on https://github.com/emanuele/load trk, TRK). The loading operation of TRX Disk is in fact, simply the memory mapping initialization, there is no "loading". For the saving operation, TRX Disk is simply a copy-paste operation, which showcases the baseline disk speed. TRX RAM is the memory mapping initialization and transfer of all data from disk to RAM. Python implementations are likely slower than the implementations of TrackVis or MI-Brain, but this nevertheless showcases the advantage of memory mapping even for slower languages. The Python prototype used for this benchmark can found at https://github.com/frheault/tractography file format/tree/master/trx file memmap.

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### Logo (optional)



