pyAFQ: Automated Fiber Quantification, in Python

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The White Matter

- Why study the white matter?
 - Can detect, characterize, and monitor diseases [1, 2, 3]
 - Changes during experiences of intensive learning [4]
 - Could account for individual variances in cognition [5]
- How do we study the white matter?
 - Diffusion MRI (dMRI) are used to characterize brain tissue
 - For example, diffusion tensors are used to study the white matter
 - Provides non-invasive and *in vivo* measurements



Axial slice of fractional anisotropy (FA) measurements from dMRI scans [1]

How do we make inferences from an individual brain?

- One common approach is to register to common template
 - Problem: individuals 3d geometry different
- Instead we look at the bundles using waypoint ROIs



Image from Yeatman, Richie-Halford, Smith, Keshavan, Rokem (2018)

So what is pyAFQ?

- pyAFQ performs tractometry automatically, in python
- Why python?
 - Open source scripting language
 - Wide ecosystem of software tools in python
 - Lingua franca for reproducible open source scientifi computing
- pyAFQ makes analysis faster and standardizes computational techniques
- There is a version of an existing software called <u>AFQ</u> written in Matlab
 - pyAFQ results closely match results from mAFQ



Data: Human Connectome Project

Visualizations generated by pyAFQ





Corticospinal tract Data: Jason Yeatman, Stanford

Gifs generated by pyAFQ





Arcuate Data: Jason Yeatman, Stanford

Gifs generated by pyAFQ





Uncinate Data: Jason Yeatman, Stanford

Intersubject reliability plot generated by pyAFQ



Data: Human Connectome Project

Integration with the ecosystem



Version 0.4 recently released

- Includes several new registration templates and techniques
- Can use <u>plotly</u> to generate HTML-based visualizations of bundles
- Added Integration with <u>pyBIDS</u>
- Bug fixes / other improvements

Next steps (Version 0.5):

- Integrate Particle Filtering Tractography from dipy
- Integrate Multi-Shell Multi-Tissue CSD from dipy
- Make it easier to use custom-made ROIs in the API

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- pyAFQ heavily draws from the free, open source python package: <u>dipy</u>

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