

# Toolbox for enhanced fMRI activation mapping using anatomically-adapted graph wavelets



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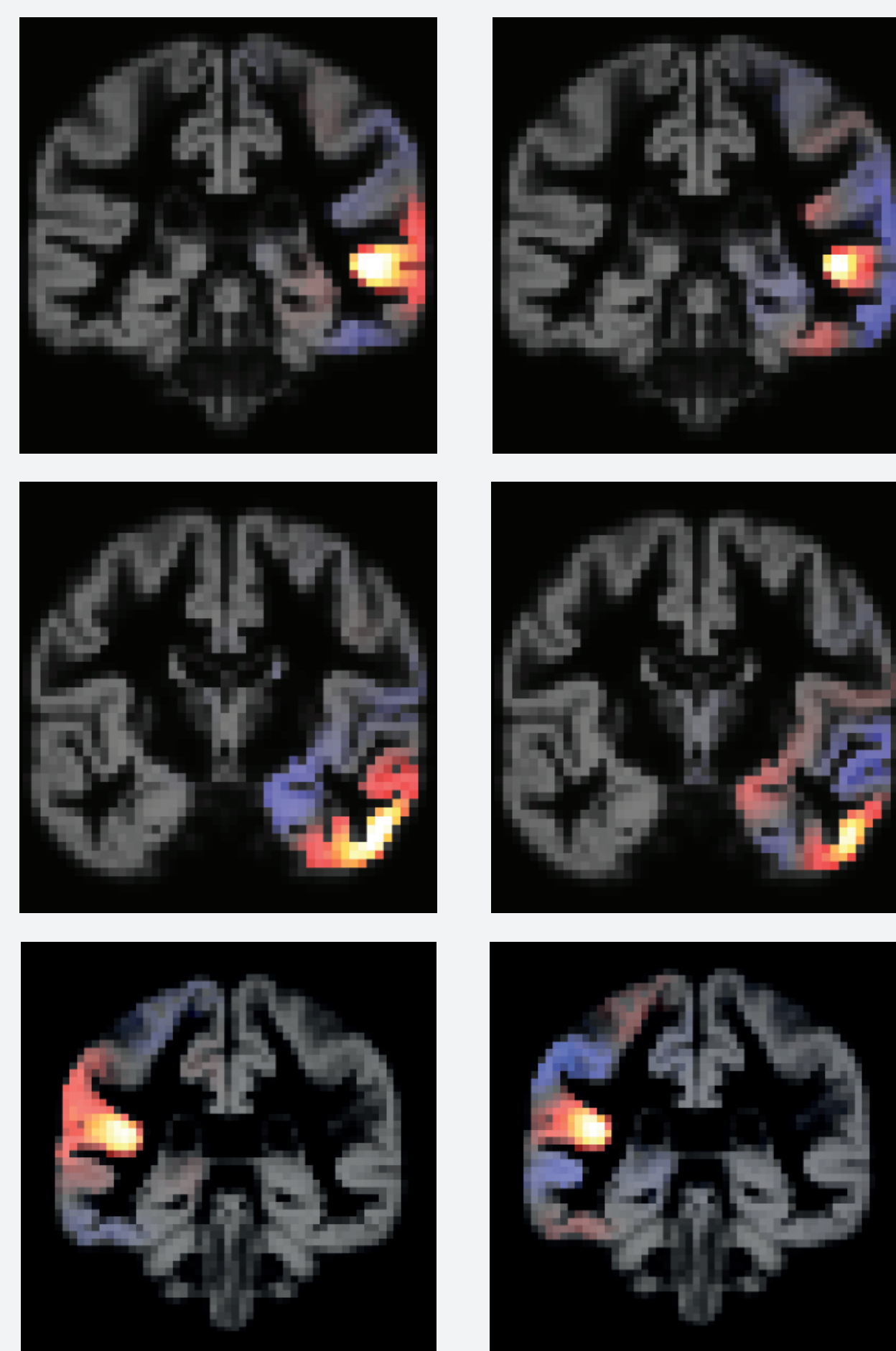
graph-based  
**gwSPM**  
 wavelet-based

## The method

### Abstract

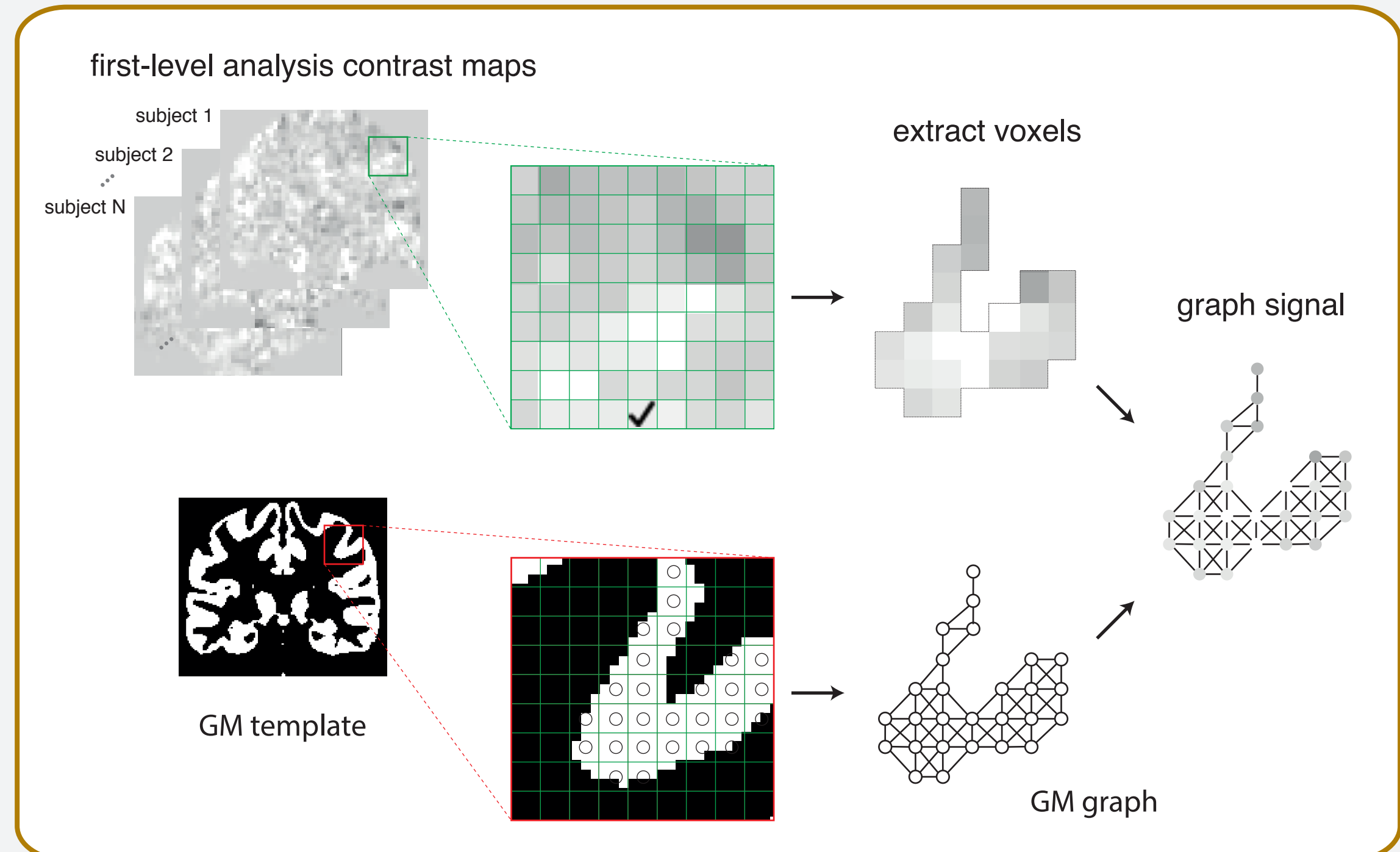
In fMRI studies with evoked activity, brain activity is detected by voxel-wise GLM fitting, followed by statistical hypothesis testing. Statistical parametric mapping (SPM), one of the most popular classical methods, relies upon Gaussian smoothing to deal with the multiple-comparison correction. As an alternative, we have recently introduced a graph-based framework for fMRI brain activation mapping [1]. The graph is designed such that it encodes the topological structure of the gray matter (GM). The approach exploits the spectral graph wavelet transform [2] for the purpose of defining an advanced multi-scale spatial transformation for fMRI data. The use of spatial wavelet transforms has the benefit of providing a compact representation of activation patterns. The framework extends wavelet-based SPM (WSPM) [3], which is a framework that combines wavelet processing of non-smoothed data with voxel-wise statistical testing while guaranteeing strong FP control. Here, we present an implementation of the proposed framework as a user-friendly, SPM-compatible toolbox that deals with multi-subject studies.

### Anatomically-adapted graph wavelets\*



\* wavelet = a spatially localized function

### Mapping an fMRI contrast map to a graph signal



Realizations of six wavelets that are adapted to the topological structure of the gray matter is illustrated. For ease of visual interpretation, the wavelets are overlaid on a template gray matter. Note that the wavelets are constructed in 3D space, and diffuse in 3D space, but only a single coronal slice of each is displayed.

The wavelets shown in each row are centered around the same location in the gray matter, the ones on the left have a smoother spatial profile compared to the ones on the right. A distinct set of wavelets is constructed for each location in the gray matter, but those of only three locations are displayed here.

## The toolbox

### Inputs to the algorithm:

T1 structural scans & first-level analysis contrast maps for a set of subjects.  
 The data for each subject should be co-registered.

### step 1

Gray matter (GM) template construction

### step 2

Construction of a whole brain GM graph & graph signals

The graph consists of two subgraphs that separately encode the structural connectivity of the cerebral and cerebellar GM.  
 The graph signals are constructed from first-level contrast maps after their normalisation to the template space.

### step 3

Second-level analysis with SPM

Input: first level contrast maps that were normalised to the defined template domain.  
 Output: the resulting SPM.mat is used in the following steps.

### step 4

GM-adapted wavelet transform design & decomposition of data

User interaction features: tuning of graph wavelet design; construction & visualization of realizations of wavelets at different scales, centered at different locations in GM.

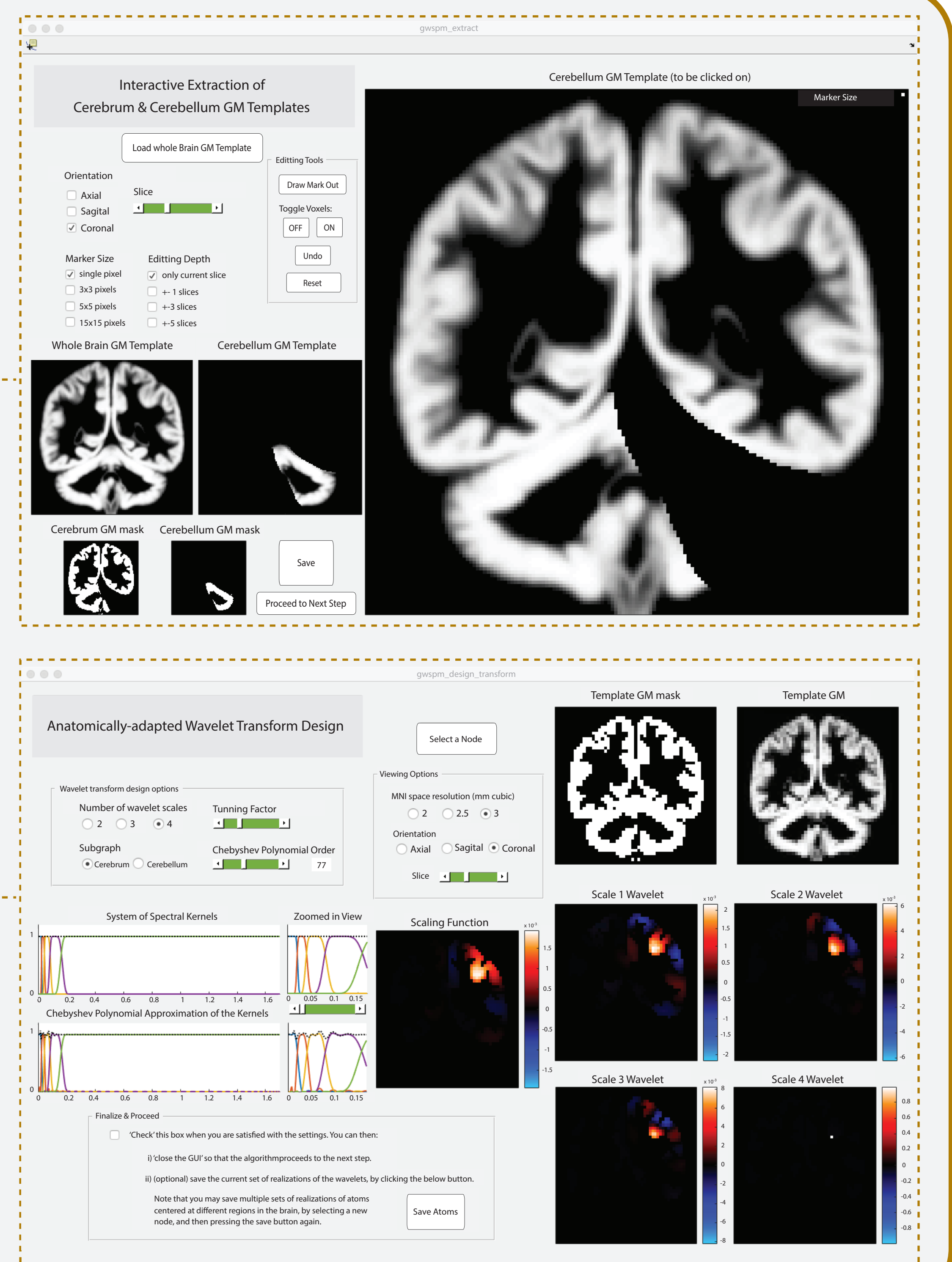
### step 5

Integrated wavelet denoising & spatial statistical testing

The wavelet denoising and statistical inference method used in this step is based on the theory developed in [3].

### step 6

Display of results



## Toolbox download

[miplab.epfl.ch/software/](http://miplab.epfl.ch/software/)

## Contact

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- [1]. H. Behjat, et al., "Anatomically-adapted graph wavelets for improved group-level fMRI activation mapping." *NeuroImage* 123, 185-199, 2015.
- [2]. D.K. Hammond, et al., "Wavelets on graphs via spectral graph theory." *Appl. Comput. Harmon. Anal.* 30(2), 129-150, 2011.
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## References

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