### Cortical Thickness

Pipeline v1.0 Overview

# Usage

#### Setup

```
SET BASE_PATH indicating the path to CorticalThickness folder.
```

#### Example:

BASE\_PATH=\${1:-"/neuro/labs/grantlab/research/MRI\_processing/jose.cisneros/CorticalThickness"}

#### Usage without Docker.

```
(base) [jose.cisneros@hanyang:x86_64-Linux]...rticalThickness$>python code/corticalThickness.py -h
    usage:
                            Cortical Thickness Pipeline by Jose Cisneros (May 5, 2022 ver.1) ========
               ______
            [-h] -ca CASE [-bp BASE_PATH] [-im IN_MRI] [-is IN_MRI_SEG] [-se ENABLE_SURFACE_EXTRACTION]
            [-ir ENABLE_INTENSITY_REFINEMENT] [-do OUTSIDE_DOCKER] [-rp RESULTS_PREFIX] [-icm INTENSITY_CLUSTERING_METHOD]
    optional arguments:
       -h, --help
                            show this help message and exit
       -ca CASE, --case CASE
                            Subject id
       -bp BASE_PATH, --base-path BASE_PATH
                             Path containing code & resources.
       -im IN MRI, --input-mri IN MRI
                            Input MRI .nii file path.
       -is IN_MRI_SEG, --input-segmented IN_MRI_SEG
                             Input MRI segmented .nii file path.
       -se ENABLE_SURFACE_EXTRACTION, --surface-extraction ENABLE_SURFACE_EXTRACTION
                             Enable Surface Extraction (default: True)
       -ir ENABLE_INTENSITY_REFINEMENT, --intensity-refinement ENABLE_INTENSITY_REFINEMENT
                             Enable Intensity Clustering for CP external boundary refinement. (default: True)
       -do OUTSIDE DOCKER, --outside-docker OUTSIDE DOCKER
                            Flag indicating if script running outside docker. (default: True)
       -rp RESULTS_PREFIX, --results-prefix RESULTS_PREFIX
                            Prefix for Results folder. (default: )
       -icm INTENSITY_CLUSTERING_METHOD, --intensity-clustering-method INTENSITY_CLUSTERING_METHOD
                            Soft Clustering Method use for Intensity Refinement. Options: GMM, FCM, sFCM (default: sFCM)
Output Folder: {BASE PATH}/Results/{CASE}
Example:
```

```
${BASE_PATH}/code/corticalThickness.py \
   -ca FCB028 \
   -im ${BASE_PATH}/Samples/FCB028/recon_to31.nii \
   -is ${BASE_PATH}/Samples/FCB028/segmentation_to31_final.nii
```

#### Usage with Docker.

```
(base) [jose.cisneros@hanyang:x86 64-Linux]...rticalThickness$>python code/corticalThicknessDocker.py
                      Cortical Thickness Pipeline using Docker by Jose Cisneros (May 9, 2022 ver.1)
usage:
          ========
                                                                                                       ========
       [-h] -ca CASE [-bp BASE_PATH] -im IN_MRI -is IN_MRI_SEG -o OUTPUT [-se ENABLE SURFACE EXTRACTION]
       [-ir ENABLE_INTENSITY_REFINEMENT] [-icm INTENSITY_CLUSTERING_METHOD]
optional arguments:
  -h, --help
                        show this help message and exit
  -ca CASE, --case CASE
                        Subject id
  -bp BASE_PATH, --base-path BASE_PATH
                        Path containing code & resources.
  -im IN MRI, --input-mri IN MRI
                        Input MRI .nii file with path.
  -is IN_MRI_SEG, --input-segmented IN_MRI_SEG
                        Input MRI segmented .nii file with path.
  -o OUTPUT, --output-folder OUTPUT
                        Output folder containing all generated files.
  -se ENABLE SURFACE EXTRACTION, --surface-extraction ENABLE SURFACE EXTRACTION
                        Enable Surface Extraction
  -ir ENABLE_INTENSITY_REFINEMENT, --intensity-refinement ENABLE_INTENSITY_REFINEMENT
                        Enable Intensity Clustering for CP external boundary refinement.
  -icm INTENSITY_CLUSTERING_METHOD, --intensity-clustering-method INTENSITY_CLUSTERING_METHOD
                        Soft Clustering Method use for Intensity Refinement. Options: GMM, FCM, sFCM
```

#### Example:

```
S{BASE_PATH}/code/corticalThicknessDocker.py \
    -ca FCB028 \
    -im ${BASE_PATH}/Samples/FCB028/recon_to31.nii \
    -is ${BASE_PATH}/Samples/FCB028/segmentation_to31_final.nii
    -o ${BASE_PATH}/Results
```

#### Useful information about Docker.

#### Setup:

- Option1: Get Docker Image building it with Dockerfile
  - o docker build -t cortical-thickness \${BASE PATH} -f \${BASE PATH}/deploy/Dockerfile
- Option2: Get latest Docker Image published.
  - o docker pull ghcr.io/josecisneros001/fnndsc-cortical-thickness
  - o docker tag ghcr.io/josecisneros001/fnndsc-cortical-thickness cortical-thickness

#### Publish new Docker Image

- o docker login ghcr.io
- # Build your image if it doesn't exist yet.
  - docker build -t ghcr.io/josecisneros001/FNNDSC-Cortical-Thickness .
- o # Tag it if already exists.
  - $\blacksquare \qquad \text{docker tag cortical-thickness ghcr.} \text{io/josecisneros001/fnndsc-cortical-thickness}$
- o docker push ghcr.io/josecisneros001/fnndsc-cortical-thickness

## Code - Pipeline

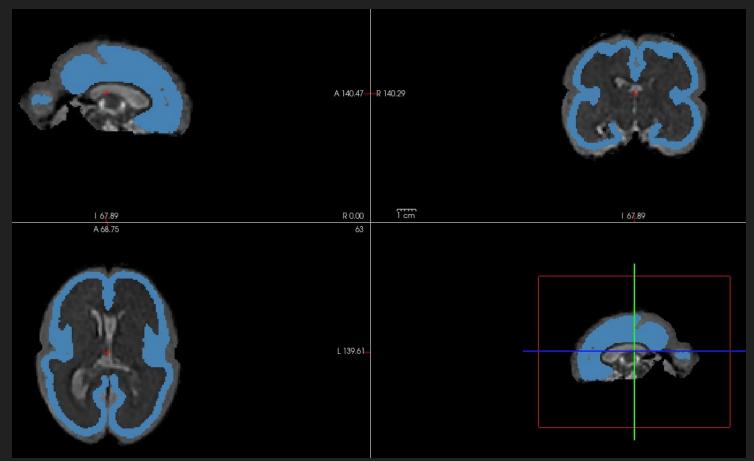
**Processing Step** 

# Segment and Join Cerebral Exterior Labels 1 & 42. Obtained from deep learning segmentation.
\${TARGET\_DIR}/\${CASE}/temp/cerebral\_ext.mnc

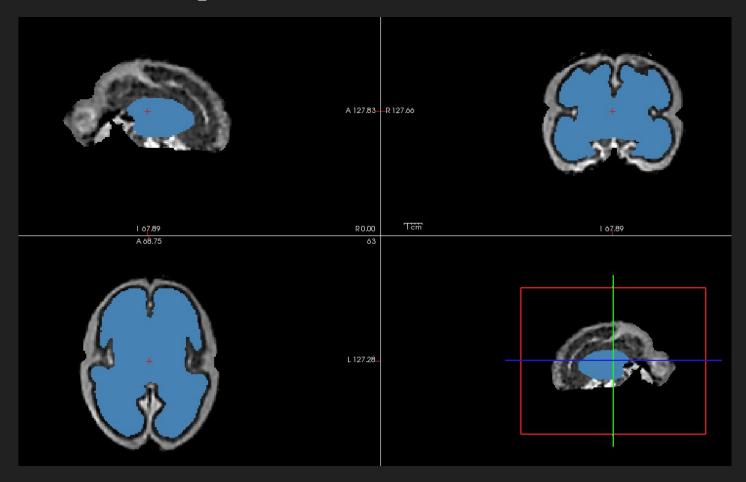


# Dilation Cerebral Exterior

\${TARGET\_DIR}/\${CASE}/temp/cerebral\_ext\_d.mnc

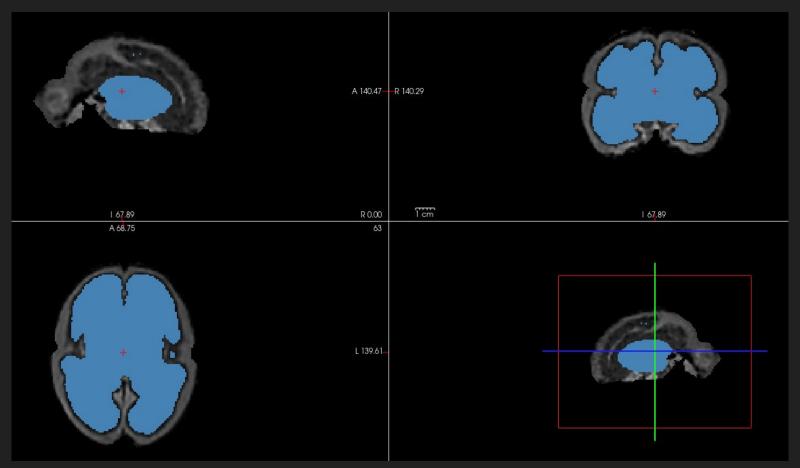


# Segment and Join Cerebral Interior Labels 160 & 161. Obtained from deep learning segmentation.
\${TARGET\_DIR}/\${CASE}/temp/cerebral\_int.mnc



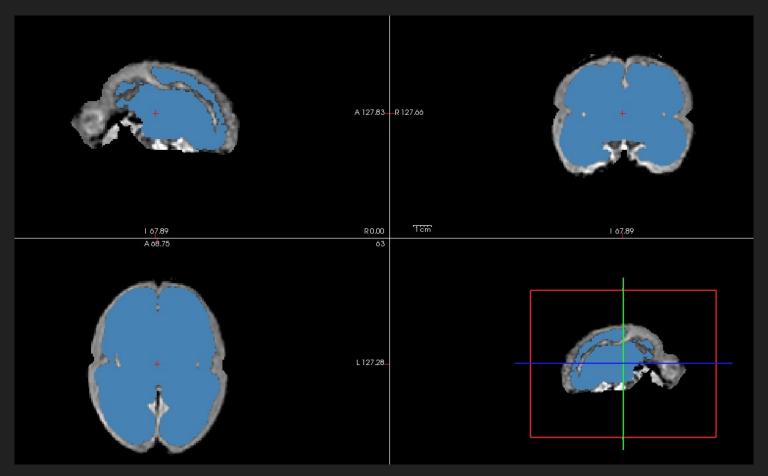
# Dilation Cerebral Interior

\${TARGET\_DIR}/\${CASE}/temp/cerebral\_int\_d.mnc



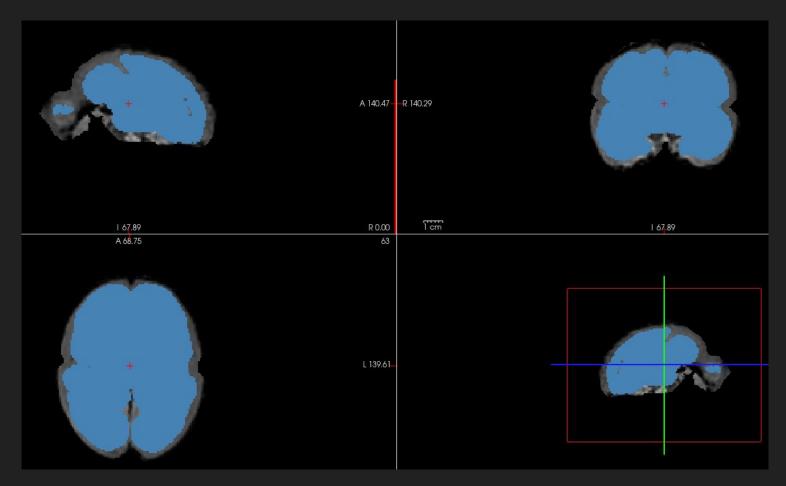
# Binarize all segmentations [from 1 to 161] Obtained from deep learning segmentation

\${TARGET\_DIR}/\${CASE}/temp/initial\_segmentations.mnc

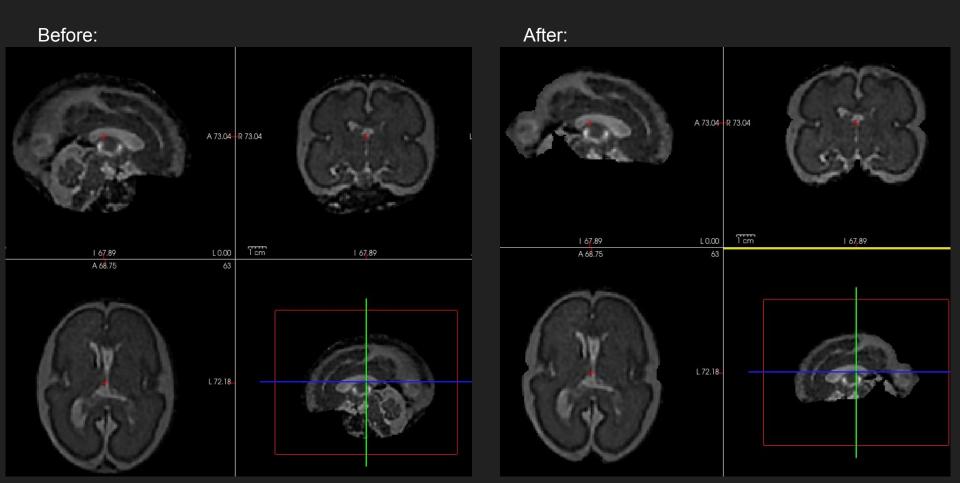


# Dilation Initial Segmentations

\${TARGET\_DIR}/\${CASE}/temp/initial\_segmentations\_d.mnc



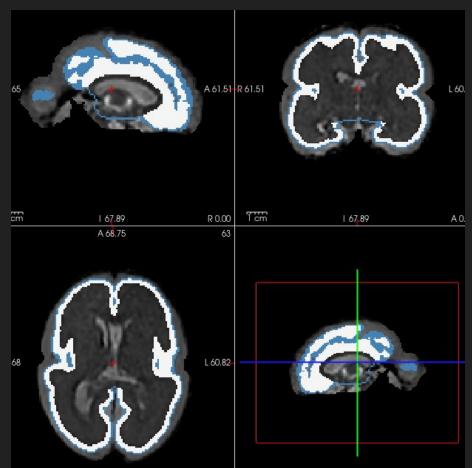
\${TARGET\_DIR}/\${CASE}/input/input\_mri\_processed.mnc



## Code - Pipeline

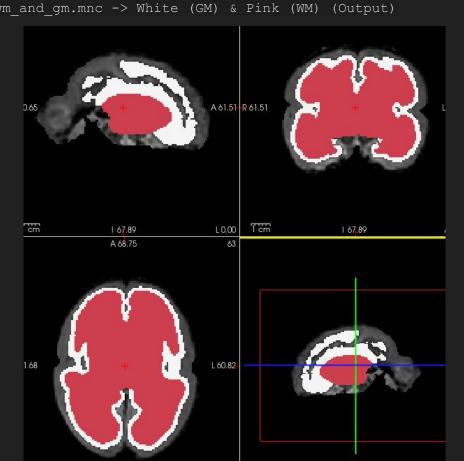
**Skeletonization Step** 

# GM External Boundary - 1 voxel apart.
\${TARGET\_DIR}/\${CASE}/temp/cerebral\_ext.mnc -> White (Input)
\${TARGET\_DIR}/\${CASE}/temp/gm\_ext.mnc -> Blue (Output)



```
# Join GM and WM, labeled, not binarized
${TARGET_DIR}/${CASE}/temp/gray.mnc (Input)
${TARGET_DIR}/${CASE}/temp/cerebral_int.mnc (Input)
${TARGET_DIR}/${CASE}/temp/wm and gm.mnc -> White (GM) & Pink (WM)
```

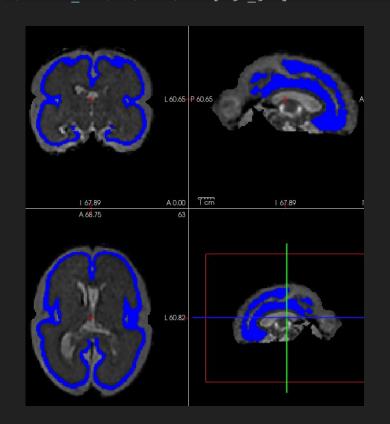
GM with GM/CSF outer boundary + WM Important detail to consider for the skeleton input. GM and WM need to have different labels, that's why the output has two different colors (Pink & White).

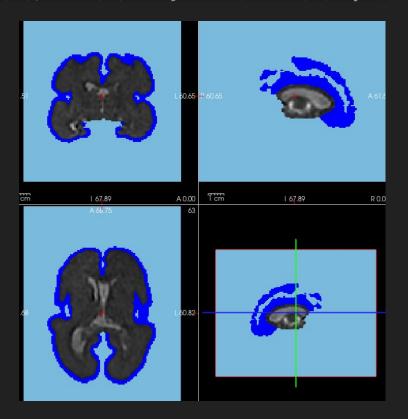


```
#### Prepare Skeleton Gray Scale input.
#### 11-Outside GM, 0 - WM, 255 - GM.
${TARGET_DIR}/${CASE}/temp/cerebral_ext.mnc (Input)
${TARGET_DIR}/${CASE}/temp/cerebral_int.mnc (Input)
```

CSF obtained with CP dilation + GM
Important detail that lightblue is everything the skeleton don't need to consider. First Image doesn't hide lightblue to show that there are parts of the brain not considered in skeleton.

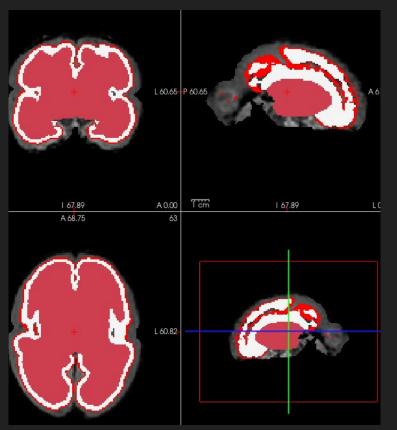
\${TARGET DIR}/\${CASE}/temp/gm grayscale.mnc -> Blue (GM), Dark (WM) & lightBlue (outside) (Output)

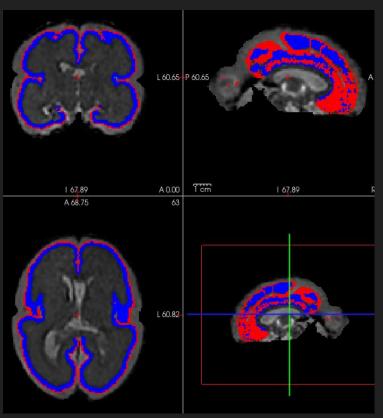




#### #### Skeleton

- \${TARGET DIR}/\${CASE}/temp/gm grayscale.mnc (Image 2 Blue) (Input)
- \${TARGET DIR}/\${CASE}/temp/wm and gm.nii (Image 1 White & Pink) (Input)
- \${TARGET\_DIR}/\${CASE}/temp/skeleton\_1\_corr.nii -> (Image 1&2 Red) (Output)



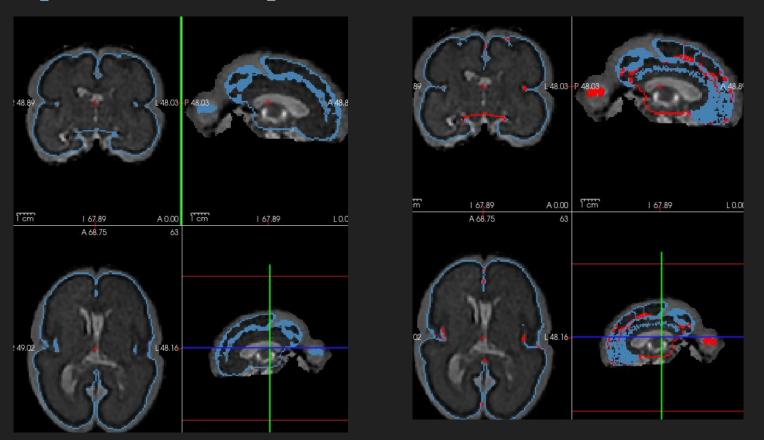


#### Join Skeleton with GM external boundary.Skeleton follows External boundary limited by DeepLearning in a 100%.

\${TARGET DIR}/\${CASE}/temp/gm ext.mnc (Input First Image)

\${TARGET DIR}/\${CASE}/temp/skeleton 1 corr.nii (Input Second Image Blue)

\${TARGET DIR}/\${CASE}/temp/skeleton corr.nii -> (Output Second Image Blue + Red)



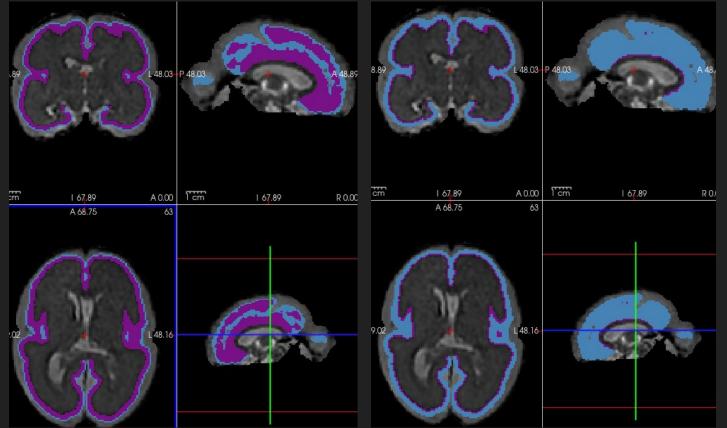
## Code - Pipeline

Intensity Refinement (Optional)

# Clustering Input Volume: GM -> 1 extra outer voxel and without 1 inner voxel.

\${TARGET\_DIR}/\${CASE}/temp/clustering\_input.mnc (Blue)
Purple - GM.

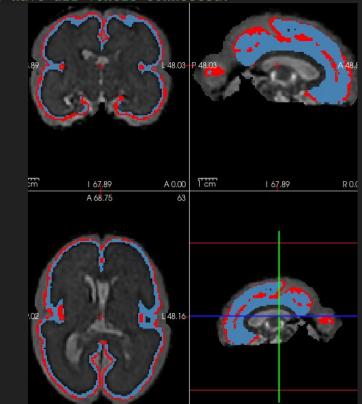
Input for Soft clustering method, divide voxels in two groups (Bright & Dark).



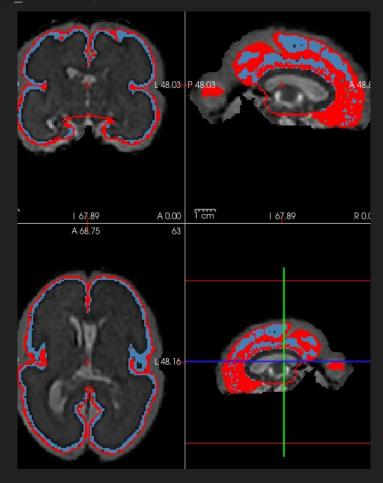
- # Current Pipeline has three soft clustering methods implemented. Choose by cmdline argument.
  - Gaussian Mixture Model (GMM)
  - FCM (Fuzzy c-Means
  - sFCM (Spatial Fuzzy c-Means

GMM & FCM are based only in Intensity, sFCM considers neighboring intensity, for this reason it has a better performance against noise and tends to have all voxels connected.

sFCM example



#### Join Clustering Output with Skeleton limiting inner boundary to skeleton.
\${TARGET\_DIR}/\${CASE}/temp/ps2\_csf.mnc (Red)



```
#### Get inner boundary
```

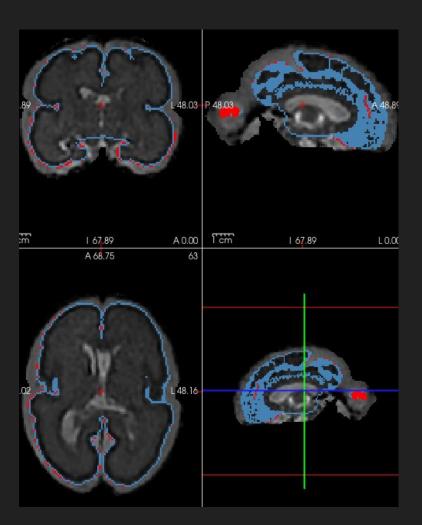
\${TARGET\_DIR}/\${CASE}/temp/ps2\_csf.mnc (Red)

Red Inner Boundary:

\${TARGET DIR}/\${CASE}/output/ps2.nii (Blue)

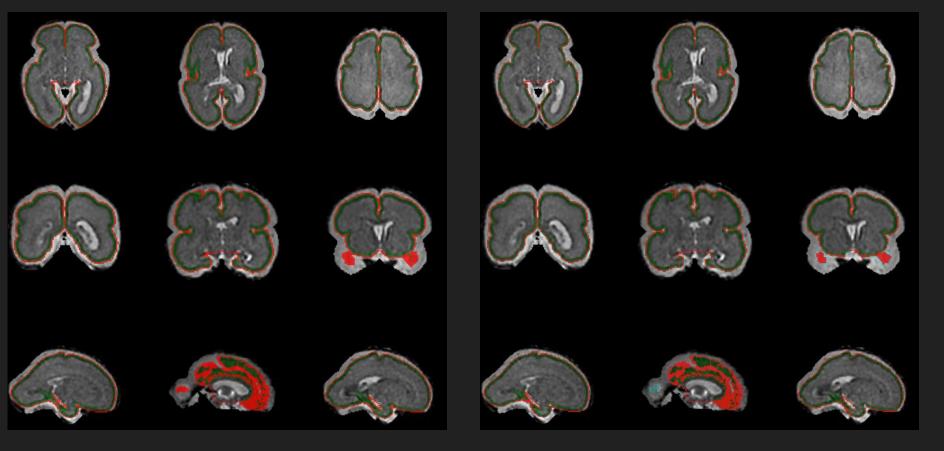
also called as:

\${TARGET\_DIR}/\${CASE}/output/skeleton\_output.mnc



### Skeleton

### Skeleton + Intensity Refinement

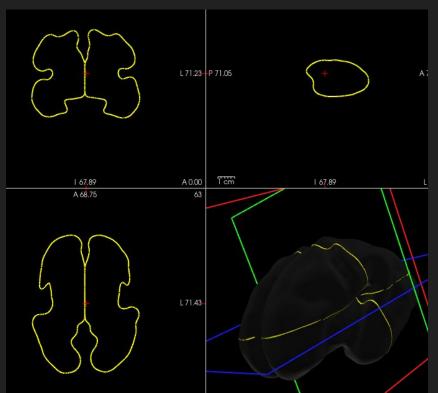


## Code - Pipeline

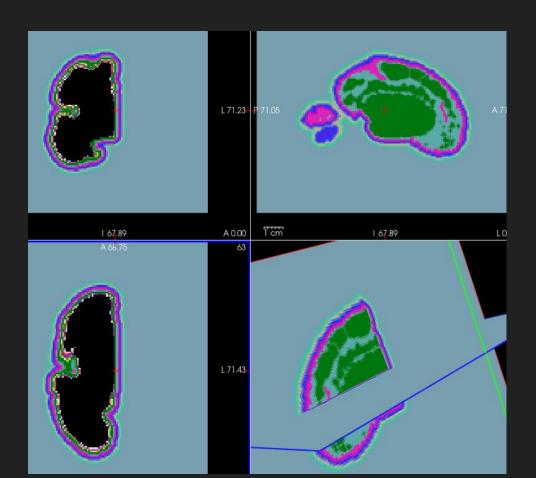
Surface Extraction

```
${TARGET_DIR}/${CASE}/surfaces/lh.smoothwm.native.obj
```

```
${TARGET_DIR}/${CASE}/surfaces/rh.smoothwm.native.obj
${TARGET_DIR}/${CASE}/surfaces/rh.smoothwm.native.asc
```

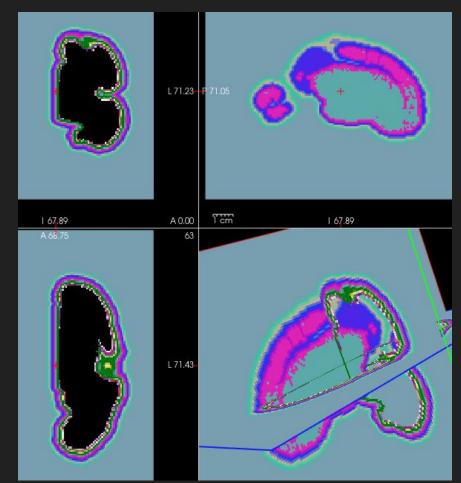


#### Generate Laplace Field for outer extraction.
\${TARGET\_DIR}/\${CASE}/surfaces/laplacian\_to31\_left\_fixed.mnc



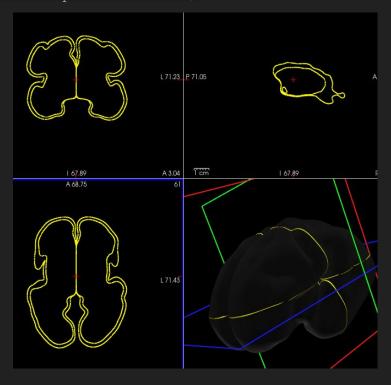
#### Generate Laplace Field for outer extraction

\${TARGET\_DIR}/\${CASE}/surfaces/laplacian\_to31\_right\_fixed.mnc



```
# Expand white Matter till Laplace Field, CP Surface Extraction
${TARGET_DIR}/${CASE}/surfaces/lh.pial.native.obj
${TARGET_DIR}/${CASE}/surfaces/lh.pial.native.asc
```

```
${TARGET_DIR}/${CASE}/surfaces/rh.pial.native.obj
${TARGET_DIR}/${CASE}/surfaces/rh.pial.native.asc;
```



## Code - Pipeline

Morphometrics Measurement

```
Format:
                                                                                                                                          15.021
                                                                                                                                          27.0097
                                                                                                                                          28.6648
                                                                                                                                          27.4705
                                                                                                                                          47.6426
morphometrics
                                                                                                                                          55.6526
                                                                                                                                          46.3256

    ■ native_rms_tlaplace_10mm_left.txt

                                                                                                                                          54.2754
                                                                                                                                          28.0118
 = native_rms_tlaplace_10mm_right.txt
                                                                                                                                          33.8271
                                                                                                                                          32.9404

    ■ native_rms_tlink_10mm_left.txt

                                                                                                                                          24,1953
                                                                                                                                          22.9465

    ■ native_rms_tlink_10mm_right.txt

                                                                                                                                          18,7177
                                                                                                                                          10.2492

    ■ native_rms_tnear_10mm_left.txt

                                                                                                                                          52.3813
                                                                                                                                          39.4696

    ■ native rms tnear 10mm_right.txt

                                                                                                                                          33.0017
 36.0228
                                                                                                                                          40.8147
 wm_sulcaldepth_right.txt
                                                                                                                                          18.3901
                                                                                                                                          56.9144
                                                                                                                                          36.5423
                                                                                                                                          48.1512
                                                                                                                                          26.8554
                                                                                                                                          40.9527
                                                                                                                                          25.3158
                                                                                                                                          44.0519
                                                                                                                                          39.5022
                                                                                                                                          36.461
                                                                                                                                          36.4782
                                                                                                                                          34.0717
                                                                                                                                          17.2389
                                                                                                                                          23.7858
                                                                                                                                          43.3553
                                                                                                                                          61.2423
                                                                                                                                          46.7108
                                                                                                                                      39 47,5814
```

40 32 8000