## SPECIAL SESSION ON NEUROIMAGING DATA PROCESSING STRATEGIES

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## K-Surfer: A KNIME Extension for the Management and Analysis of Human Brain MRI FreeSurfer/FSL Data

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## Summary

- Knowledge Discovery from Neuroimaging
  - Workflow for the Knowledge Discovery from Neuroimaging
- Pre-processing of Neuroimages:
  - FreeSurfer and FSL;
  - Overview on outputs produced by FreeSurfer/FSL;
  - Drawbacks on managing and analysing FreeSurfer/FSL outputs.
- The Konstanz Information Miner (KNIME)
- K-Surfer:
  - software architecture and features;
  - nodes and meta nodes.
- A case study using FreeSurfer tutorial data.
- Conclusion and Future Works.

#### Knowledge Discovery from Neuroimaing

- The processing of brain images has exponentially increased the quantity of data to be analysed.
- A Machine Learning approach has proved necessary where data from neuroimaging are merged with data from multiple sources, as in the case of Alzheimer's disease<sup>[1]</sup>.
- The aim is to provide the basis for decisions, both immediately and in the long term, especially for the early detection of neurodegenerative diseases.

<sup>[1]</sup> Jieping Ye, Teresa Wu, Jing Li, Kewei Chen. Machine Learning Approaches for the Neuroimaging Study of Alzheimer's Disease. *IEEE Computer Society* 2011; 44(4):99-101.

# Workflow for the Knowledge Discovery from Neuroimaging

- Acquisition of structural and/or functional neuroimages;
- 2. Pre-processing of neuroimages (e.g. Segmentation and reconstruction, tractography).
- 3. Merging of clinical, genomics or proteomics information (optional);
- 4. Data analysis by of statistical techniques and mining algorithms;

# Automatic approach to the pre-processing of Neuroimages

- Although automated pre-processing may introduce some overestimations<sup>[2]</sup>, it is definitely faster than manual segmentation.
- Software for neuroimaging processing could be roughly categorized into monolithic and modular implementations<sup>[3]</sup>.
- **FreeSurfer** and **FSL** are popular examples of the modular approach: their tools and scripts can be used in conjunction for obtaining best results.

<sup>[2]</sup> Cannataro M, Guzzi PH, Sarica, A. Data mining and life sciences applications on the grid. WIREs Data Mining Knowl Discov, 2013, 3:216238.

<sup>[3]</sup> D. E. Rex, J. Q. Ma, and A. W. Toga, 'The Loni Pipeline Processing Environment', Neuroimage, 19 (2003), 1033-48.

#### FreeSurfer and FSL



**FreeSurfer** is an open-source suite of modules for processing, analysing and visualising human brain MRI:

- Volume based and surface based analysis;
- Tractography, TRACULA (TRActs Constrained by UnderLying Anatomy).



The **FMRIB Software Library (FSL)** provides freely available image analysis and statistical tools for fMRI, MRI and DTI brain data.

#### Outputs produced by FreeSurfer/FSL

- Morphological measures:
  - volumes of 45 brain areas.
  - surface area, average thickness and thickness standard deviation of specific structures of left and right hemispheres (34 for the left and 34 for the right).
- Diffusion indices of white-matter pathways (18 reconstructed tracts):
  - average measures (axial diffusivity, radial diffusivity, mean diffusivity and fractional anisotropy);
  - diffusion values for each voxel of the tract (statistics as a function of position along the trajectory of a tract).

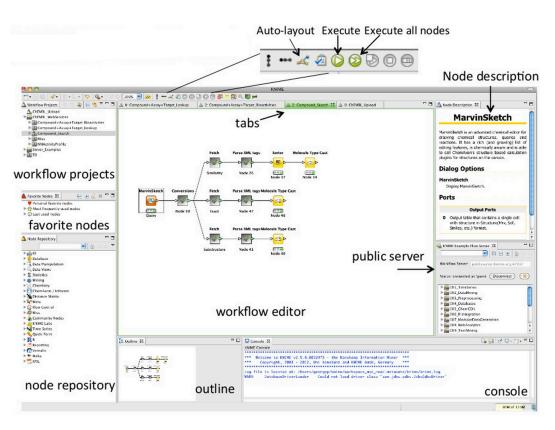
# Drawbacks on managing and analysing FreeSurfer/FSL outputs

- FreeSurfer/FSL tools and scripts use is not immediate and is suitable for expert users only.
  - E.g. for converting diffusion data into a table format:

    tractstats2table --inputs \$SUBJECTS\_DIR/diffusion/hugo/
    dpath/lh.ilf\_AS\_avg33\_mni\_bbr/pathstats.overall.txt -overall --tablefile \$SUBJECTS\_DIR/diffusion /
    lh.ilf.hugo.All.table
- No joining functionality for volume, thickness, diffusion values and demographical/clinical, genomics and proteomics data.
- At the moment, the only attempt to give an instrument for importing, managing and analysing FreeSurfer/FSL data into an analytics platform, is K-Surfer, a plugin for the Konstanz Information Miner (KNIME).

#### The Konstanz Information Miner





- A tool for data analysis, data manipulation, data visualization, data generating and reporting.
  - free and open-source;
  - one of the most popular data mining tools.
- Splits each process into small and understandable units (nodes) linked by pipelines.

#### K-Surfer

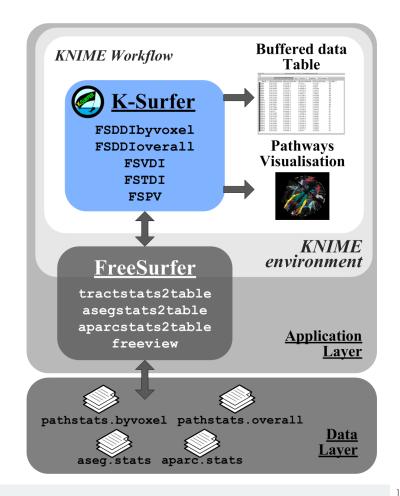
http://sourceforge.net/projects/ksurfer/



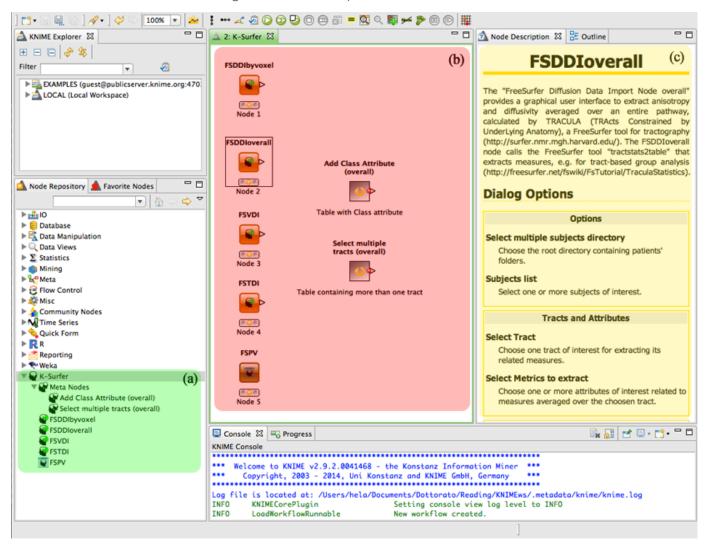
- K-Surfer is a novel KNIME plug-in that contributes a number of nodes and meta nodes to integrate FreeSurfer and FSL data into KNIME.
- K-Surfer simplifies the importing of multi-dimensional data for group analysis based on the volume, thickness and diffusion data of neuroimages.
- Its user-friendly nodes configuration dialogues do not require the user to write UNIX shell commands and scripts.

#### K-Surfer features

- Data from both local and remote machines;
- Uniqueness of row IDs;
- Name conventions for attributes following FreeSurfer specifications;
- New functionalities:
  - importing measure related to one or more brain tracts as a single step;
  - selecting subjects of different studies stored in different directories;
  - merging volume, thickness and diffusion data tables;



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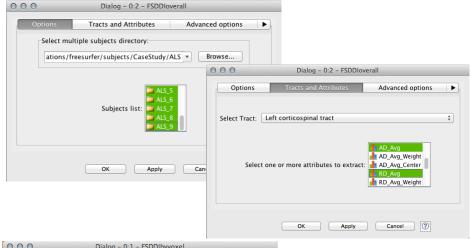
Screenshot of KNIME workbench (a) K-Surfer nodes category, (b) Workspace containing K-Surfer nodes, (c) Node Description for "FreeSurfer Diffusion Data Import overall".

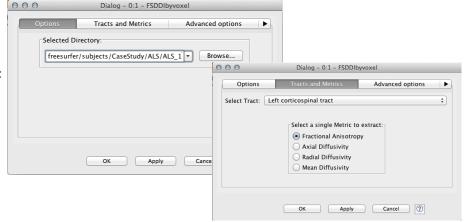
#### K-Surfer nodes

FSDDIoverall – FreeSurfer Diffusion
Data Import overall. Extracts
anisotropy and diffusivity values
averaged over an entire

pathway.

FSDDIbyvoxel - FreeSurfer
Diffusion Data Import by voxel.
Extracts measures as a function of position along the trajectory of the pathway.





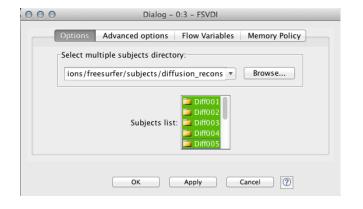
#### K-Surfer nodes

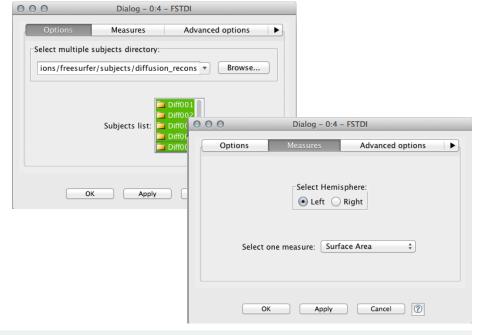


**Pata Import**. Extracts the volumes [mm<sup>3</sup>] of specific structures.

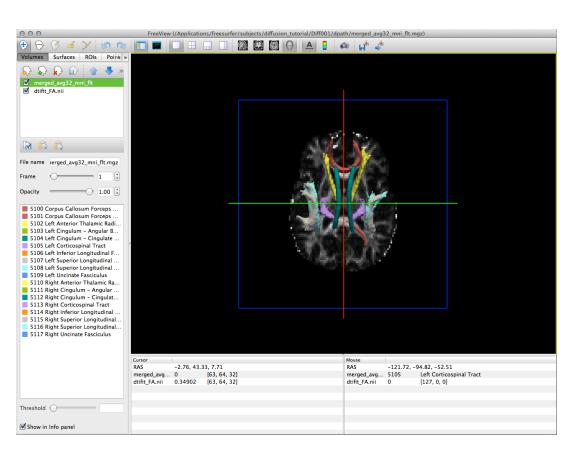


**Pata Import**. Extracts the thickness [mm] of specific structures.



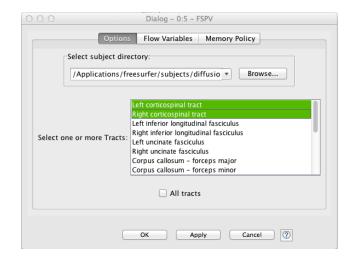


### K-Surfer nodes

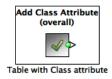




**FSPV - FreeSurfer Pathways Viewer**. Visualises the probability distribution of single white-matter pathways or all white-matter pathways.

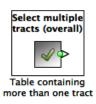


#### K-Surfer Meta Nodes



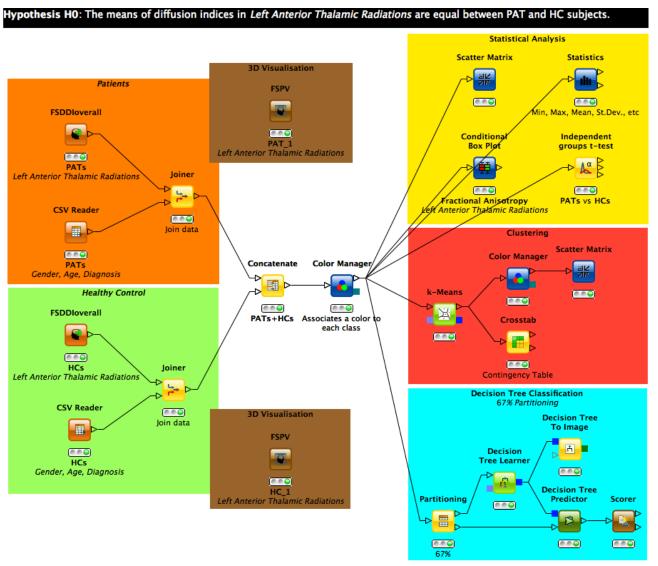
#### Add Class Attribute (overall).

Uses two FSDDoverall nodes to add to a diffusion data table a new column containing the class attribute. E.g. For group analysis, the user needs to add class feature, such as healthy control patients, or affected patients.



#### Select multiple tracts (overall).

Extracts the diffusion values of more than one tract at once, using the FSDDoverall node.



Case Study workflow for confuting the null hypothesis that "the means of diffusion indices in Left Anterior Thalamic Radiations are equal between PAT and HC subjects".

### Conclusion and Future Works

- A main bottleneck in brain MRI data analysis is the overwhelming availability of experimental data and the complexity of the pre-processing and data selection phases.
- K-Surfer automatizes the overall process and helps to reduce time costs and human errors by removing the need for lowlevel data manipulation.
- As future work:
  - new nodes, for example, for visualising cortical and subcortical segmentation.
  - extension to support data from other tools like Caret or 3D Slicer.



## **CADDementia**

A standardized evaluation framework for Computer-Aided Diagnosis of Dementia based on structural MRI data



# **K-Surfer** has been successfully used in the contest of the CADDementia challenge 2014

A Sarica, G Di Fatta, G Smith, M Cannataro, D Saddy Advanced feature selection in multinominal dementia classification from structural MRI data

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## Thanks for the attention.

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