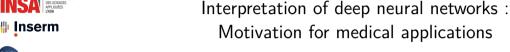
## **CREATIS** Medical Imaging Research Laboratory www.creatis.insa-lyon.fr







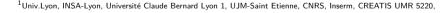






Introductory talk





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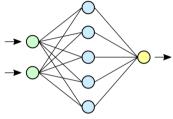






## Medical Image Analysis/Processing with deep learning





train on Train + monitor on Valid

 $\begin{tabular}{ll} Choose & adequate \\ architecture, & loss function, & ... \end{tabular}$ 

Report performance on the Test dataset.

### Limitations



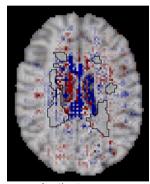
- ► Test set error
  - Dataset split: what if there is a bias in the original dataset?
- ► Classification between different dataset (e.g. diagnosis Healthy vs Pathology)
  - do you discriminate some Healthy vs Pathology features?
  - do you discriminate some dataset signatures?

## Understanding the decision?



Attribution maps : which pixels contribute the most in the decision

- positive contribution (red)
- negative contribution (blue)

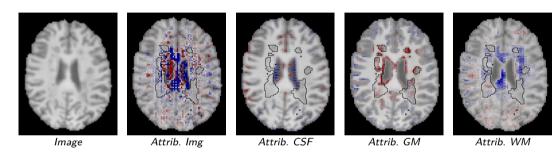


Attribution maps





# Example : Attribution maps for Healthy vs Multiple Sclerosis classification



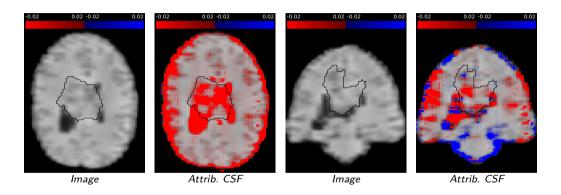
Healthy vs MS subject classification using probability maps as network inputs :

- More interpretable attribution maps
- ightharpoonup Accuracy : 85% ightharpoonup 95%



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## Example : brain tumors



Attribution of a brain tumor patient (Brats2020) vs healthy subject (IXI) deep classifier using probability maps as network inputs.



## Next Presentation:

## Debugging and Understanding Deep Learning Models

- Identify which pixels/voxels are important in the decision
- How to analyse hidden features
- Visualize what the network learn
- **•** ...



Narine Kokhlikyan Research scientist at Facebook



## Acknowledgments - References - Credits

- France Life Imaging ANR-11-INBS-0006.
- ► LABEX PRIMES (ANR-11-LABX-0063, ANR-11-IDEX-0007)
- MS dataset : www.ofsep.org
- Healthy subject dataset : brain-development.org/ixi-dataset
- Brats tumor dataset: Menze etal TMI 2015, Bakas etal, Nature Scientific Data, 2017
- Wargnier etal ISBI 2021

## Thanks for your attention!!