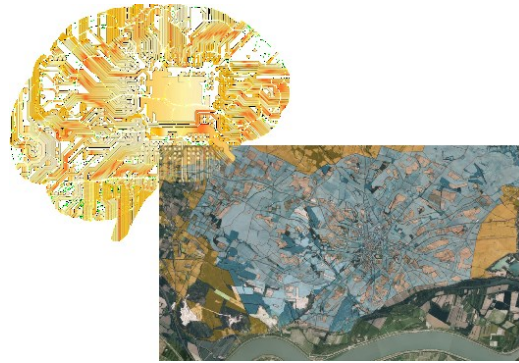


Deep Learning for Remote Sensing



Instructors:

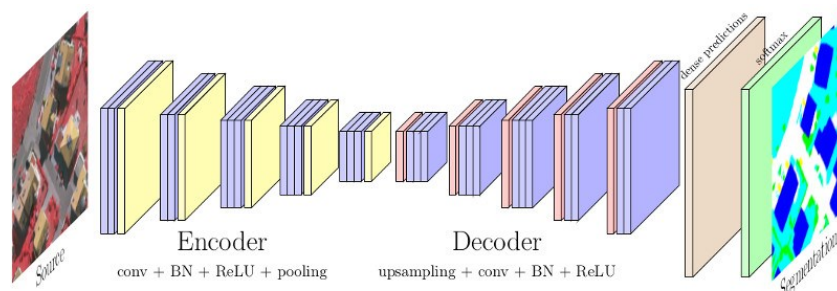
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Target audience: Graduate university students in the fields related to geomatics and environmental studies; staff from survey and mapping agencies; public authorities and interested parties involved in remote sensing data processing.



Deep Convolutional Neural Network with encoder-decoder architecture for dense classification.

Introduction: Deep Learning has led to significant breakthroughs in various fields including natural language processing and computer vision. Remote sensing also benefits from such methodological advances and deep networks currently achieve state-of-the-art results in many automatic tasks, such as object detection, semantic segmentation (e.g. for land cover mapping), change detection, etc. The goal of this course is to introduce deep learning, review the main architectures relevant for cartography, photogrammetry and other EuroSDR related fields, as well as to train the participants with available software and codes. The audience will be offered to know about and practice with recent architectures proposed by the lecturers.

It is complementary to the course “Topographic Maps through Description and Classification of Remotely Sensed Imagery and Cartographic Enhancement” that focuses on the traditional approach to automated classification (i.e. feature extraction and supervised



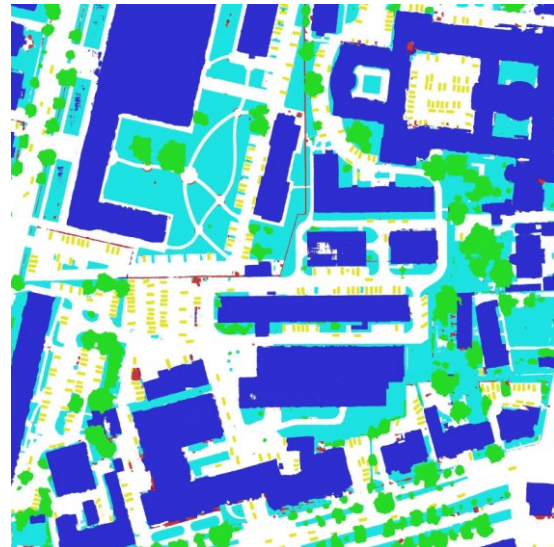
classification) while deep learning brings a paradigm change by learning both the features and the classifier, at the possible cost of higher labeled datasets and higher computational resources.

Course objective: After completing this course, the participants will be able to:

- use and deploy deep learning tools to solve remote sensing problems;
- get insight about the theoretical and mathematical concepts behind these deep neural networks;
- know how and when apply deep learning.

The audience will be welcome to come with their own data to discuss with the lecturers about the relevance of deep learning solutions in their context.

Course outline: The course provides the audience with an overview of deep learning techniques and tools used in the context of remote sensing. The pre-course seminar will introduce theoretical aspects: after explaining basic principles and best practices, it will cover 2D and 3D processing with deep learning. The e-learning part of the course will include more in-depth theoretical aspects and propose practical exercises and assignments. In particular, 2 in Modules 2 & 3, for each network/task, the course will include some practical experiments with available software libraries.



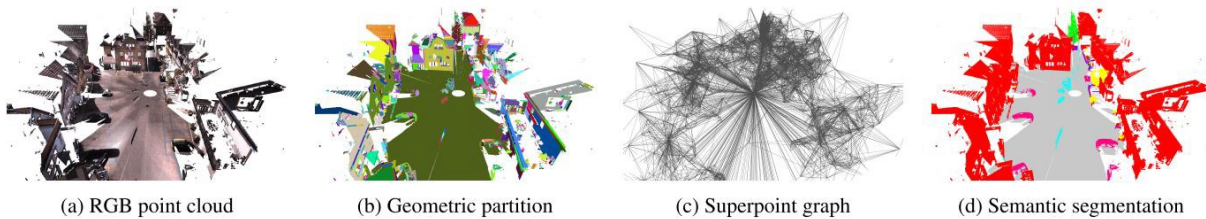
Urban mapping by semantic segmentation of VHR RGB imagery.

Module 1: Introduction to deep networks

The first module will aim to provide an introduction to deep networks. We will review the main principles, standard architectures such as multilayer perceptron and convolutional neural networks, and provide useful tips & tricks (data augmentation, dropout, fine-tuning, normalization, etc.).

Module 2: Deep learning on raster imagery

The second module will address raster imagery. We will present deep learning solutions for various problems, such as classification (patch-based approach, classification of deep features), semantic segmentation (FCN, SegNet, U-Net, etc), object detection (Faster-RCNN, YOLO, etc), instance segmentation (Mask R-CNN), multimodal fusion, change detection, hyperspectral processing. For each network/task, the module will include a description of the principles and some practical experiments.



LiDAR point cloud semantic classification with SuperPoint Graph.

Module 3: Deep learning on points clouds

The third and last module will address 3D point clouds analysis. We will describe deep networks designed for tasks such as shape classification (PointNet) and large-scale semantic segmentation (SnapNet, Patch 3D, superpoint graph). Similarly to the previous module, the module will include a description of the principles and some practical experiments.