Deep Learning for classification and segmentation for understanding clouds from satellite images

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The problem

Task: With a given satellite image, we predict segmentation masks for four cloud organization patterns: Sugar, Flower, Fish, and Gravel.

Motivation : Shallow clouds play a large role in the Earth's radiation balance and yet they are poorly represented in **climate models**.

Dataset: Gathered by the scientists of two meteorologic institutions and later was used to host a Data Science **competition on Kaggle**.

Problematics: The ground-truth masks presented in the **dataset** are quite **noisy** meaning they include a lot of areas that actually do not contain clouds at all. Also, the masks of different classes can overlap. These two facts significantly increase **problem complexity**.

Metric: Mean Dice coefficient is chosen as the metric to measure the model performance.



FIGURE - Canonical examples of the four cloud organization patterns.

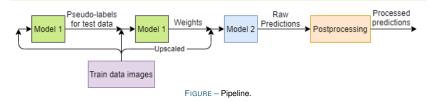
Research

Several aspects for studying:

- How training on different image sizes affects the final results?
- What is an optimal threshold value for pseudo-labels generation?
- Which encoder should be used with U-Net architecture?

What we propose:

- → Two-stage segmentation pipeline with progressive resizing & pseudo-labelling.
- → Post-processing procedure after the model generates predictions, namely, drop all the masks which pixel size¹ is less than some parameter k (can be optimized).



^{1.} Pixel size is defined as a number of pixels which belong to the same connected component

Summary

Results:

- Dice score: 0.658².
- Position: Top 6.2% [95th].
- Final leaderbord ranking by Dice coefficient differs by no more than ∼1,5% between the 1st and the 100th positions.

Ways to improve:

- Specific pre-processing which tackles the problem of noisy dataset.
- · Training on bigger image sizes.
- Better post-processing threshold selection.

^{2.} Perfect model achieves an accuracy of 1.