

Insights for a Reliable Model-selection in Multi-modal Biomass Estimation with Foundation Models and other Baselines

Authors: Kalifou René Traoré, Vytautas Jancauskas

Contacts: Kalifou.Traore@dlr.de, Vytautas.Jancauskas@dlr.de

Institution: German Aerospace Center (DLR), Earth Observation Data Science, Munich, Bavaria, Germany

Introduction

- > Biomass estimation supports numerous critical activities such as biodiversity monitoring and forest management.
- Grünblick is a scalable forest biomass estimation service.
- > We benchmark competitive baselines with features such as:
 - Multi-modal estimation, advanced feature extraction selection.
- > We propose and evaluate a metric for estimating the benefits of finetuning AGB multi-modal models.

Gain of Finetuning over Training from Scratch

$$G_{a,i}(t) = \frac{\sum_{S_j \in M_{s_i}} F_a(s_i, s_j, t) - F_a(none, s_j, t)}{Card(M_{s_i})}$$

Where:

- $ightharpoonup G_{a,i}(t)$: the relative gain in performance for a model a, pre-trainined using sensor s_i , evaluated after t epochs of fine-tuning.
- $F_{a}()$: the performance of a model a, pre-trained on sensor s_{pre} and evaluated after t epochs of fine-tuning using sensor $s_{finetuning}$.
- > M_{s_i} : the set of finetuning sensors that are compatible with pretraining on sensor s_i .

Influence of Sensor Fusion on the Estimations

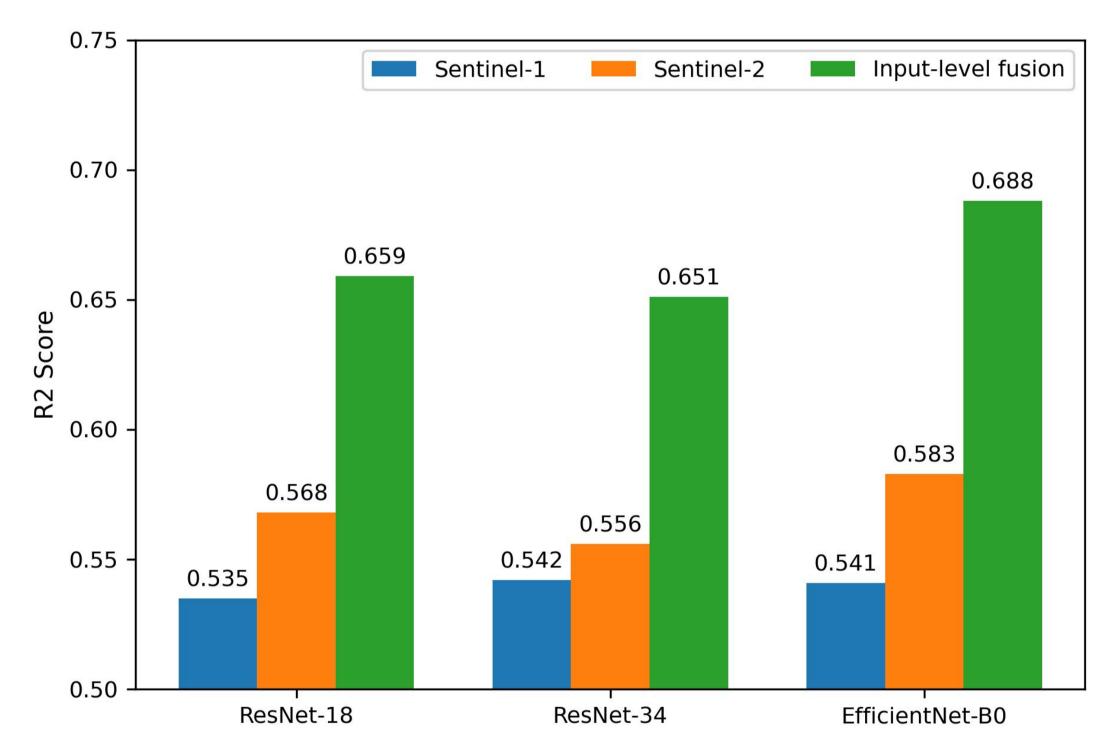


Figure 2. AGB estimation of a U-Net under variable sensor modalities.

- > Enhanced AGB estimation accuracy using sensor fusion.
- Modalities best taken advantage of by more efficient backbones.

Gain of Finetuning using various Sensors

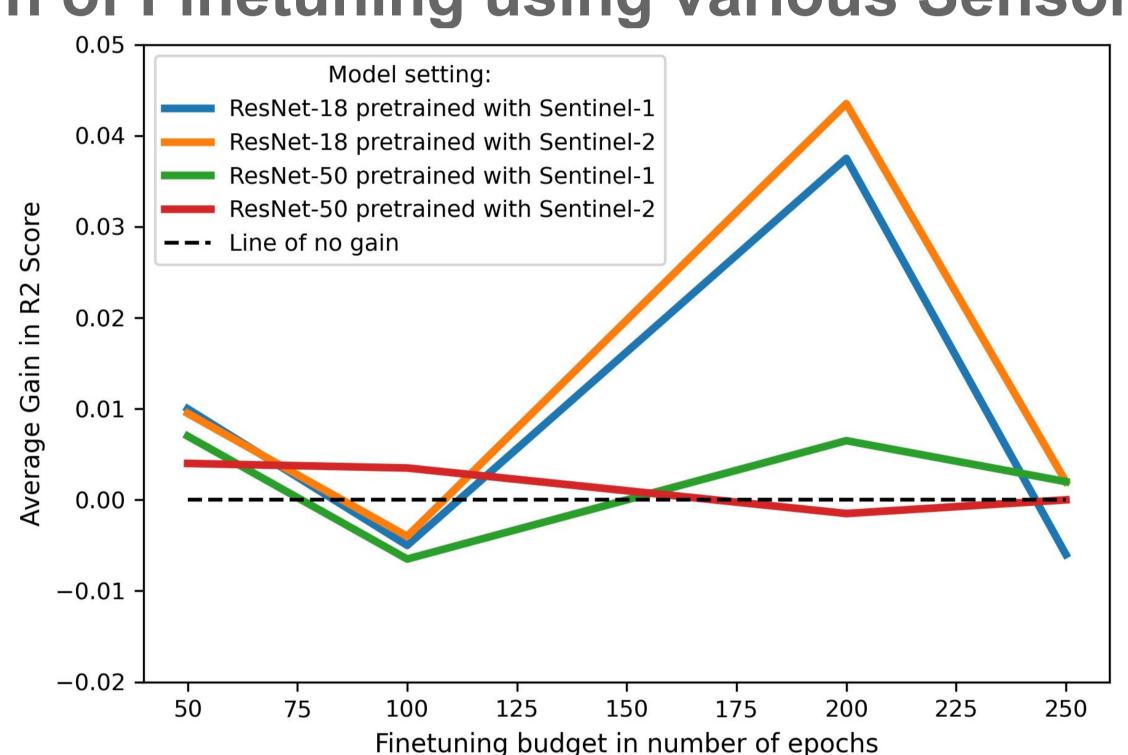


Figure 3. Gain in Finetuning of a U-Net under variable sensor modalities.

- > Pre-training can benefit when using enough training budget
- > Some architectures benefit more then others.

Datasets

> Sensors: Sentinel-1 and 2.

> Coverage: Finland, from 2017 to 2021.

> Volume: 13k images x 12 months.

Task: AGB Pixel-wise regression.

➤ More: Internal dataset collection - covering Canada (British Columbia).

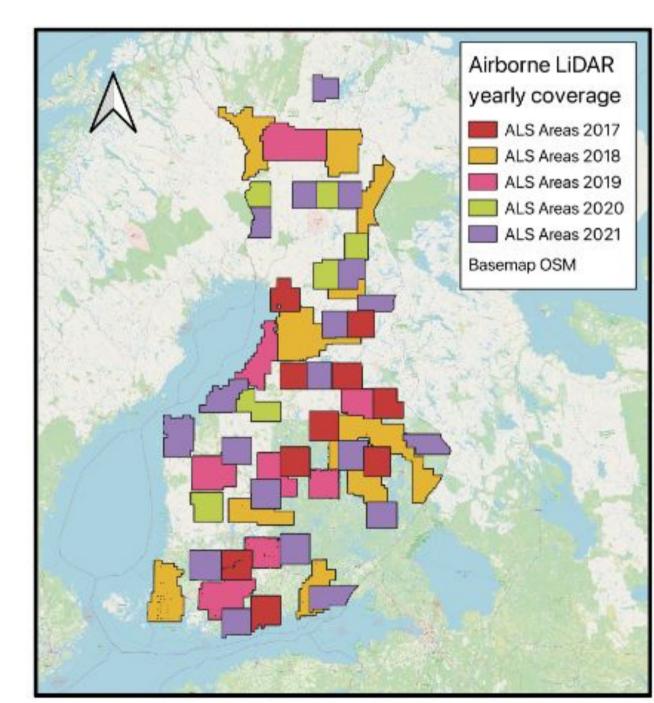


Figure 4. Lidar coverage by Biomassters.

Conclusion

- > We use Grünblick a scalable AGB estimation service, for studying model selection for forestry use-cases.
- > We propose and evaluate a metric for estimating the relative gain in performances of finetuning over training from scratch multi-modal models.
- ➤ Our systematic model-agnostic benchmark provides insights for a reliable model selection for AGB estimation.

References

Acknowledgment

Ma et al., Development of forest aboveground biomass estimation, its problems and future solutions: A review, Ecological Indicators, 2024.

Nascetti et al., Biomassters: A benchmark dataset for forest biomass estimation using multi-modal satellite time-series, NeuRIPS 2023.

