



### Team undefined

# **Machine Learning - Coding Challenge - Spring 2022**

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# The Team



**Nora Choukrani** Strong Background in Finance



**Ruben Gonzalez**Working in Quantitative Risk Modelling

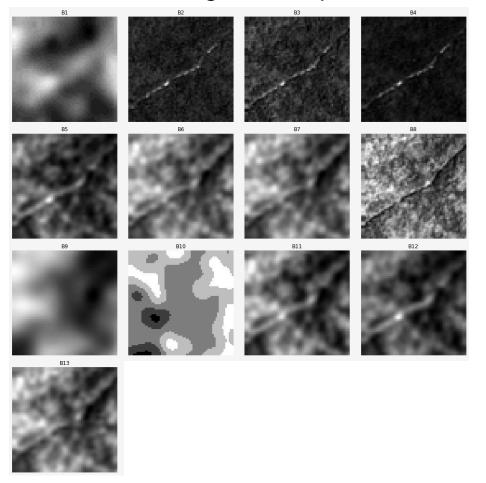


Alexander Lontke
Worked as a Machine Learning Engineer

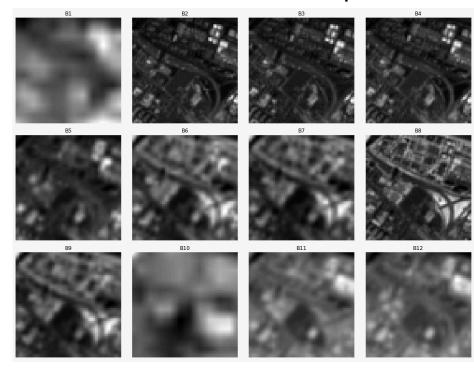


# Pre-processing and normalizing the data

### Training set sample



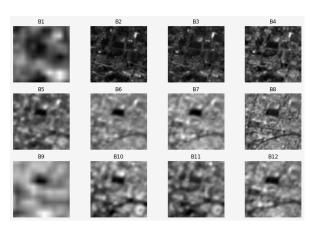
### Submission set sample





# B1 B2 B3 B4 B5 B6 B7 B8 B9 B10 B11 B12

Training set sample



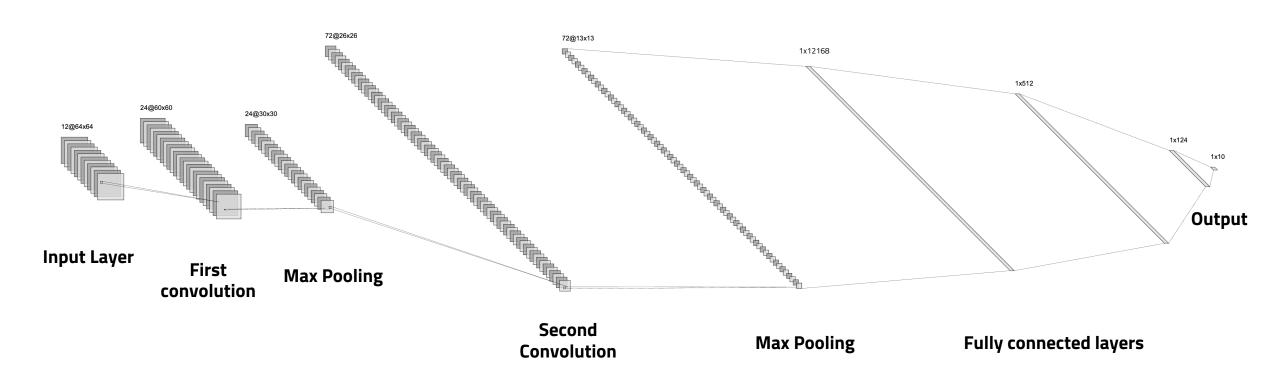
Submission set sample

# Pre-processing and normalizing the data

- **Step 1**: exclude the 10<sup>th</sup> band of the training samples to only keep 12 bands as in the testing sample
- **Step 2**: move band 9 of submission data to last index to conform to training set
- **Step 3**: normalize all bands of the training data set to a mean of 0 and a standard deviation of 1
- **Step 4**: normalize all bands of the submission data set to a mean of 0 and a standard deviation of 1



# The Model





### Training Epochs e, vs. Classification Error LCE 1.4 epoch train. loss epoch val. loss 1.2 epoch val. accuracy [Classification Error $\mathcal{L}^{CE}$ ] 1.0 0.8 Submission accuracy heuristic 0.6 0.2 0.0 10 20 30 50 [training epoch $e_i$ ]

# **Training and Evaluation**

### Setup:

- Cross Entropy Loss
- Stochastic gradient descent (LR=0.001)

### For experimental research:

- Training: 20'000 samples
- Validation: 7'000 samples
- Up to 200 epochs

### For submission:

- Training 27'000 samples
- No Validation set
- 20 epochs



# Validation Set - Report

| Class                       | Precision | Recall | F1-Score |
|-----------------------------|-----------|--------|----------|
| AnnualCrop                  | 0.92      | 0.95   | 0.94     |
| Forest                      | 0.98      | 0.99   | 0.99     |
| <b>HerbaceousVegetation</b> | 0.96      | 0.91   | 0.94     |
| Highway                     | 0.82      | 0.86   | 0.84     |
| Industrial                  | 0.91      | 0.95   | 0.93     |
| Pasture                     | 0.92      | 0.93   | 0.93     |
| PermanentCrop               | 0.92      | 0.89   | 0.91     |
| Residential                 | 0.98      | 0.92   | 0.95     |
| River                       | 0.94      | 0.96   | 0.95     |
| SeaLake                     | 1.00      | 0.99   | 0.99     |
| Weighted avg                | 0.94      | 0.94   | 0.94     |

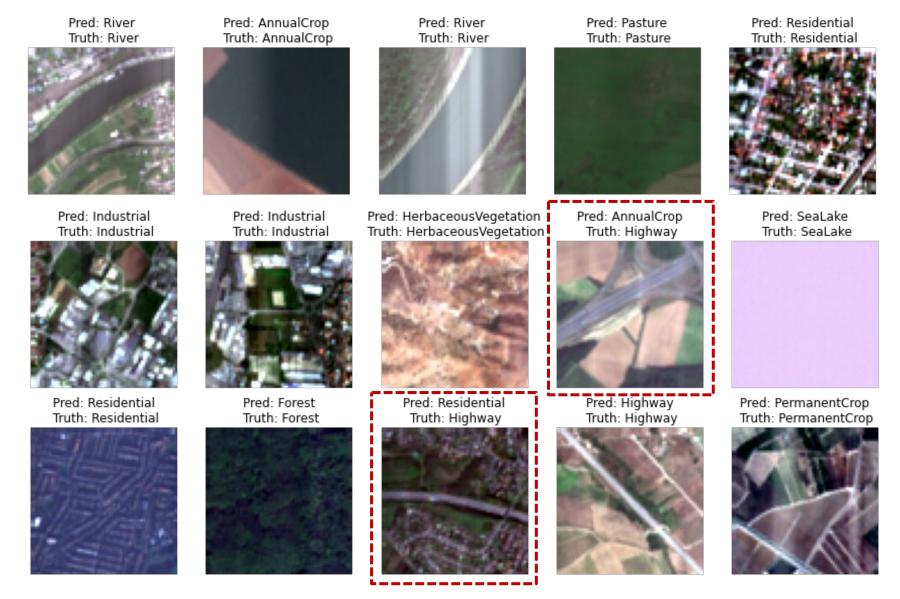


## **Validation Set - Confusion Matrix**





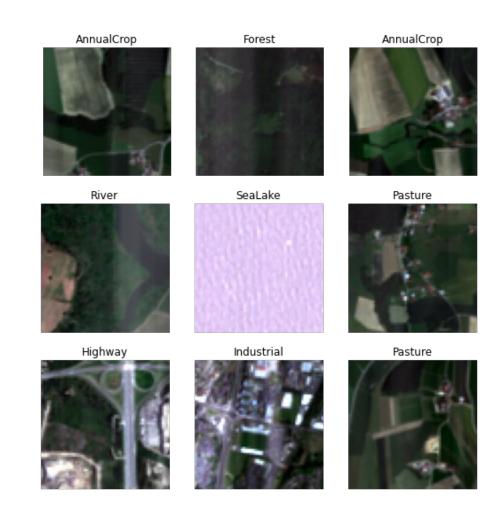
# **Validation Set - Visualization**





# **Submission Predictions**

| Class                       | Predictions Count |
|-----------------------------|-------------------|
| SeaLake                     | 1'012             |
| PermanentCrop               | 714               |
| Highway                     | 572               |
| River                       | 408               |
| AnnualCrop                  | 393               |
| <b>HerbaceousVegetation</b> | 365               |
| Pasture                     | 335               |
| Industrial                  | 180               |
| Forest                      | 149               |
| Residential                 | 104               |
| Total                       | 4'232             |





# **Additional Approaches**





# **Reflection and Outlook**

- Pre-processing of Sentinel Level-1C submission samples to Sentinel Level-2A
  - Would require original Sentinel data products
- Submission set seems unbalanced
  - Different normalization method might be more suitable
- Normalization approach considers bands independent from each other
  - Different normalization method might be more suitable
- We could try more variations of our CNN model architecture





# Questions?