



IEEE TRANSACTIONS ON MEDICAL IMAGING

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# Deep Learning-Based for Automatic Multi-Landmark Localization in Medical Images

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# Motivations

The motivations behind this project are based on the improvement of a simplistic and effective technique for detecting landmarks in medical images. Landmarks are very important in orthodontics and maxillo-facial surgery.

## 2D Cephalometric X-rays

# Data

### What ?

- Cephalometric radiographs (lateral) of 400 patients
- Folder with images and csv files for all 19 landmarks

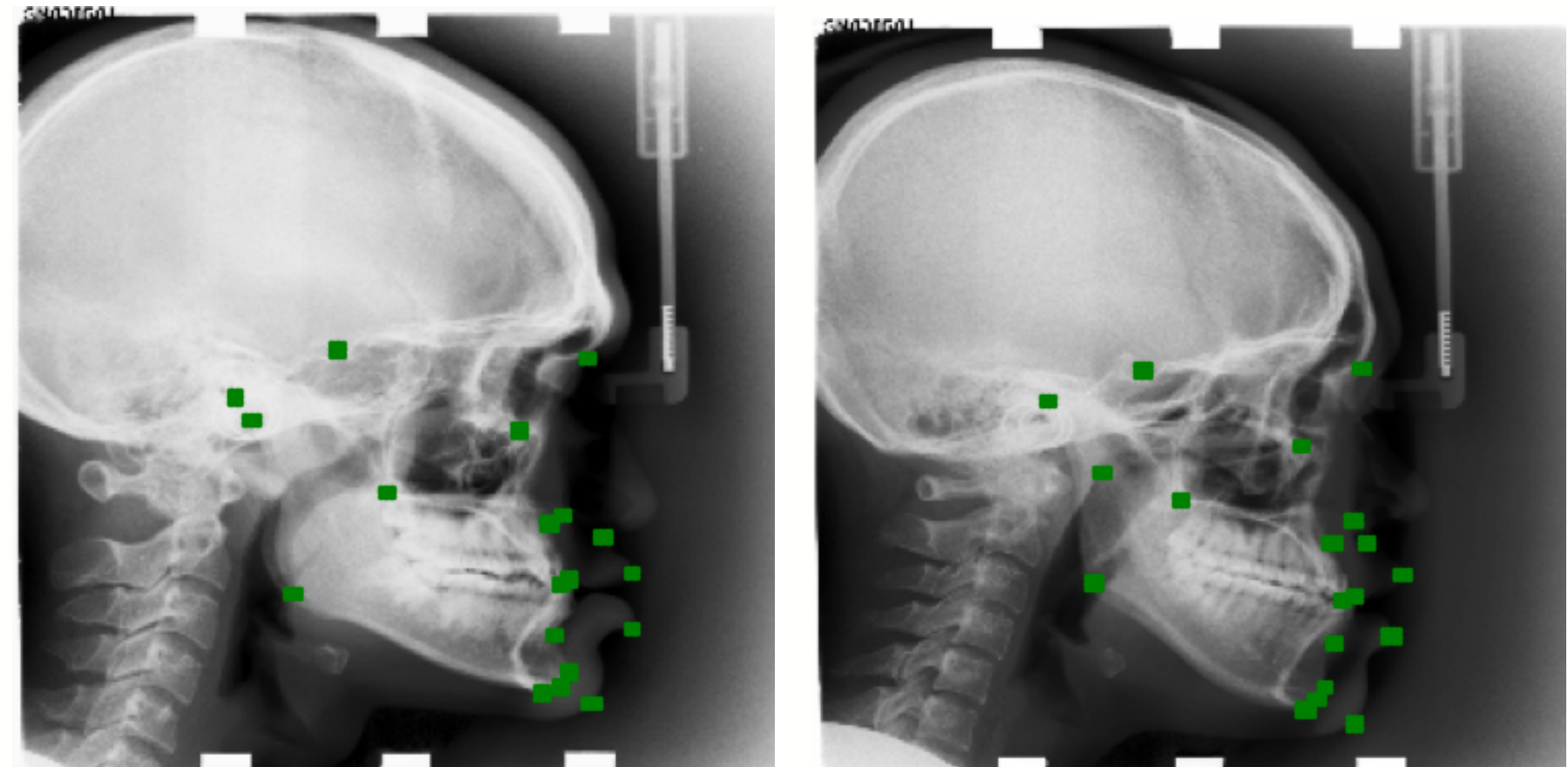
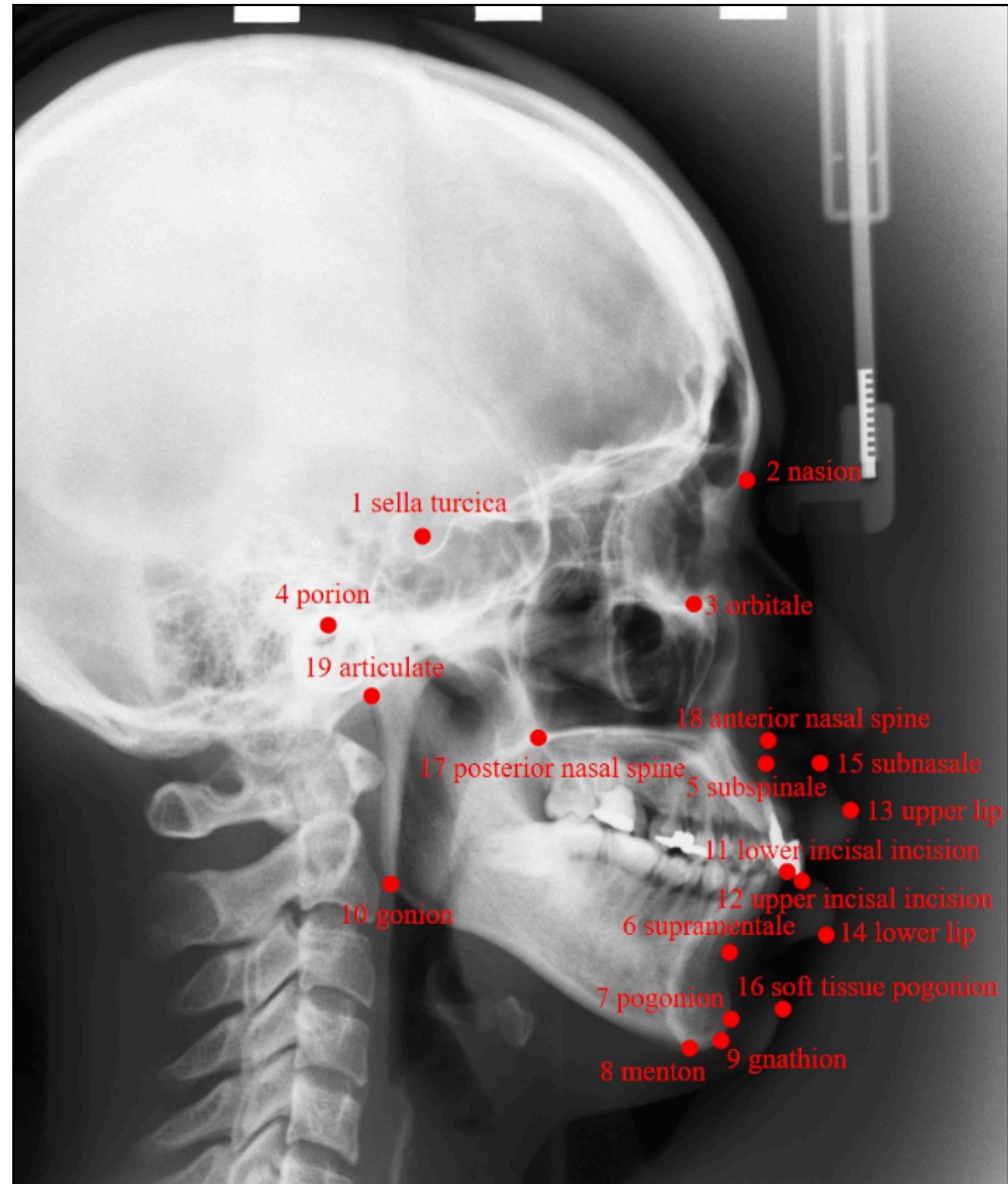


Fig : Cephalometric X-ray of two different patients, in which 19 different landmarks are indicated by a red cross.



# METHOD

## Pre-processing :

- Resizing images : from 2400 x 1935 to 256 x 256
- Normalization

## U-Net :

- Input : Images 256 x 256
- 4 Downsampling block : 64, 128, 256 and 512 filters
- Bottleneck : Conv2D with 1024 filters using ReLu + BatchNormalization + Conv2D and BatchNormalization
- 4 Upsampling block with 512, 256, 128 and 64 filters
- Output : Convolution 2D with 1 filter using Sigmoid

## About training :

- Loss function : dice\_loss to avoid imbalanced class
- Optimizer : Adam to converge faster and don't need to try lot of parameters

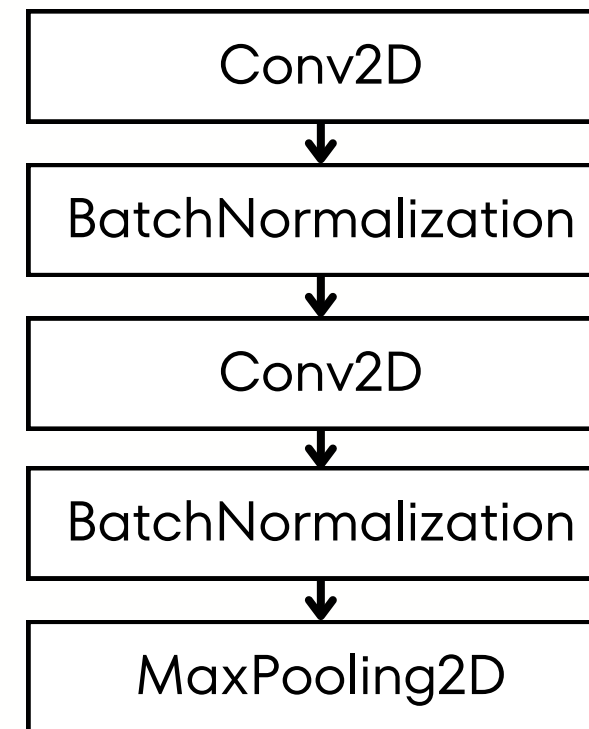


Fig : Downsampling block

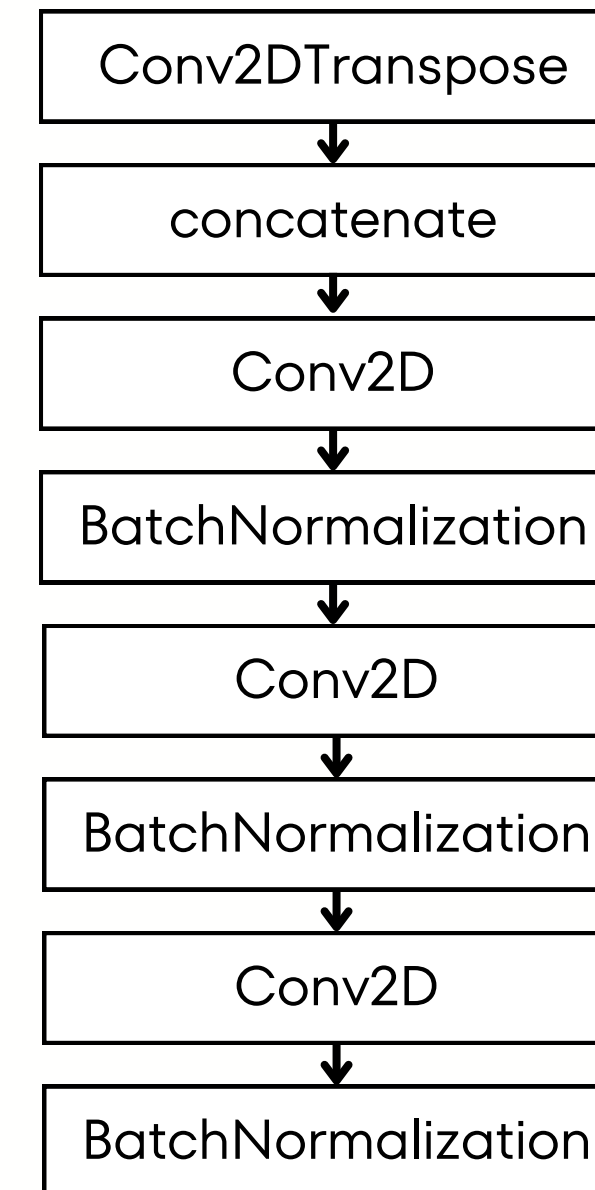


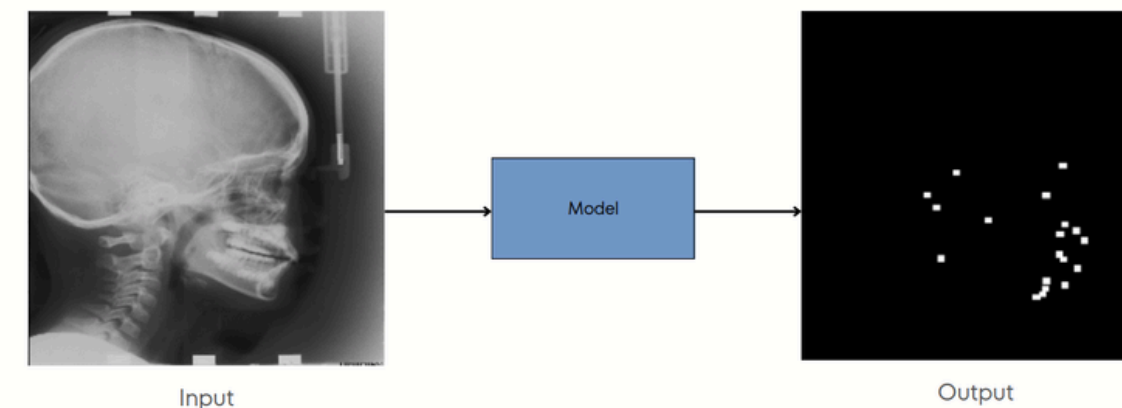
Fig : Upsampling block

**Language**

Python

**Librairies**

tensorflow and  
keras





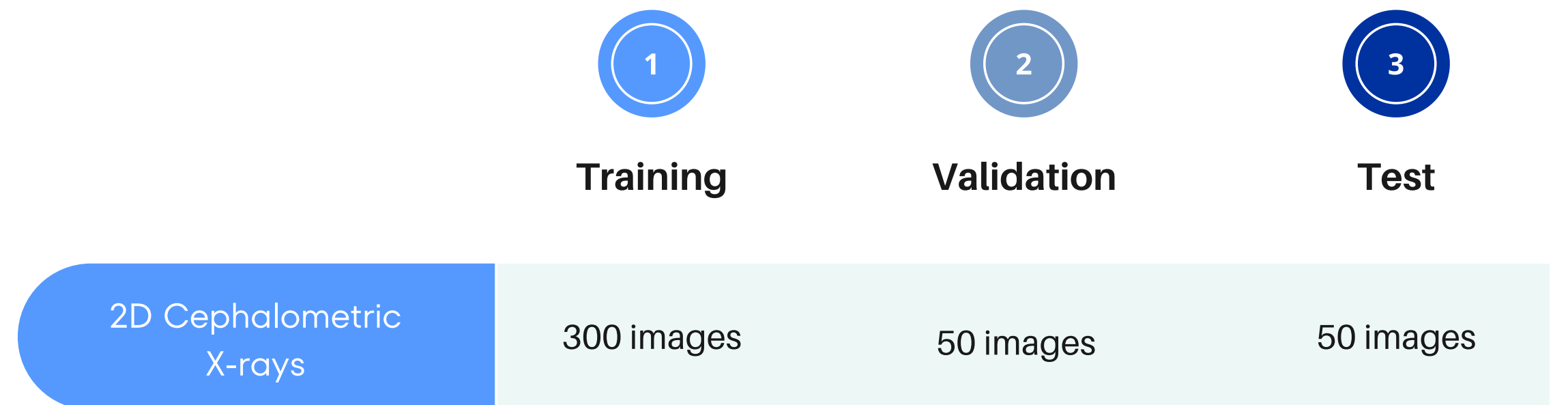
# Results

## Evaluation

- Median Euclidean distance to compare with SOTA

## Experiments

- Randomly splits of each dataset in training, validation and test set



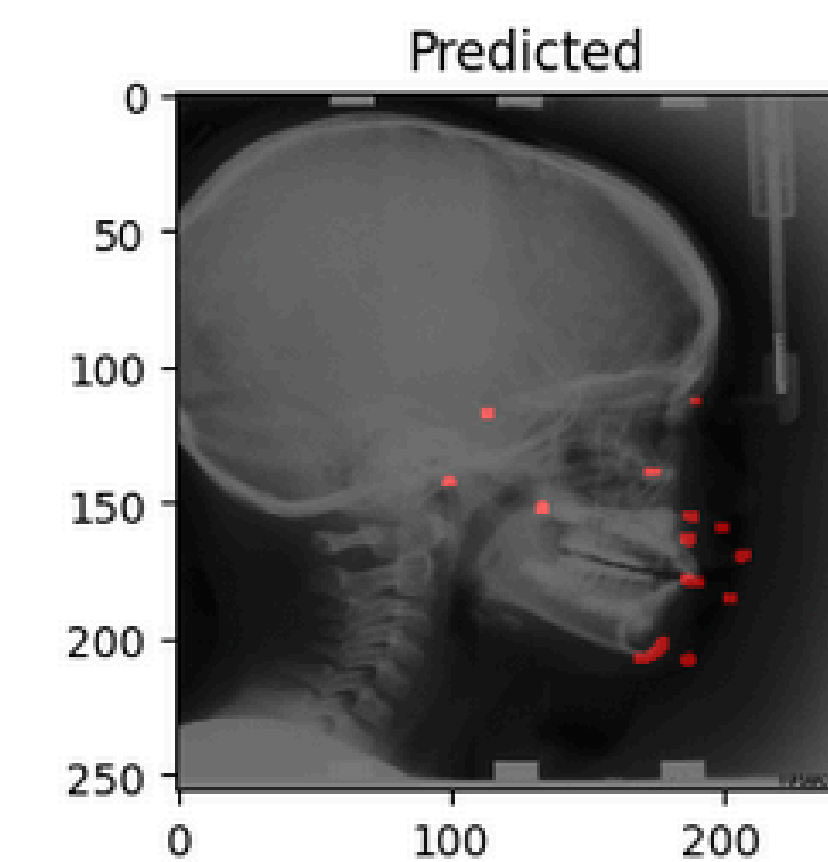
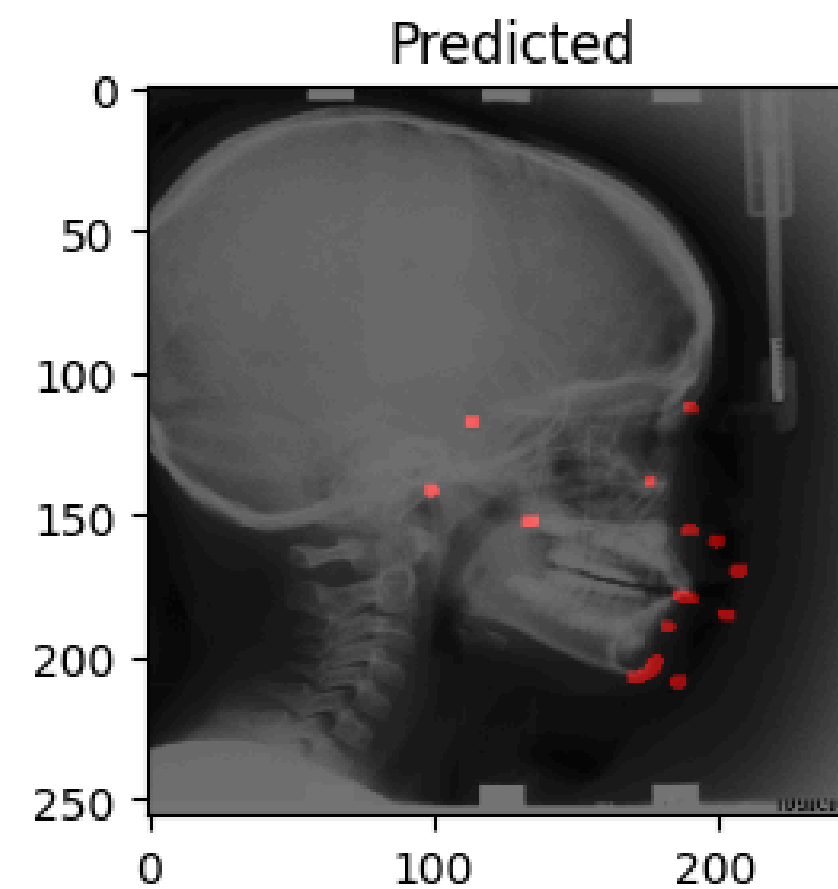
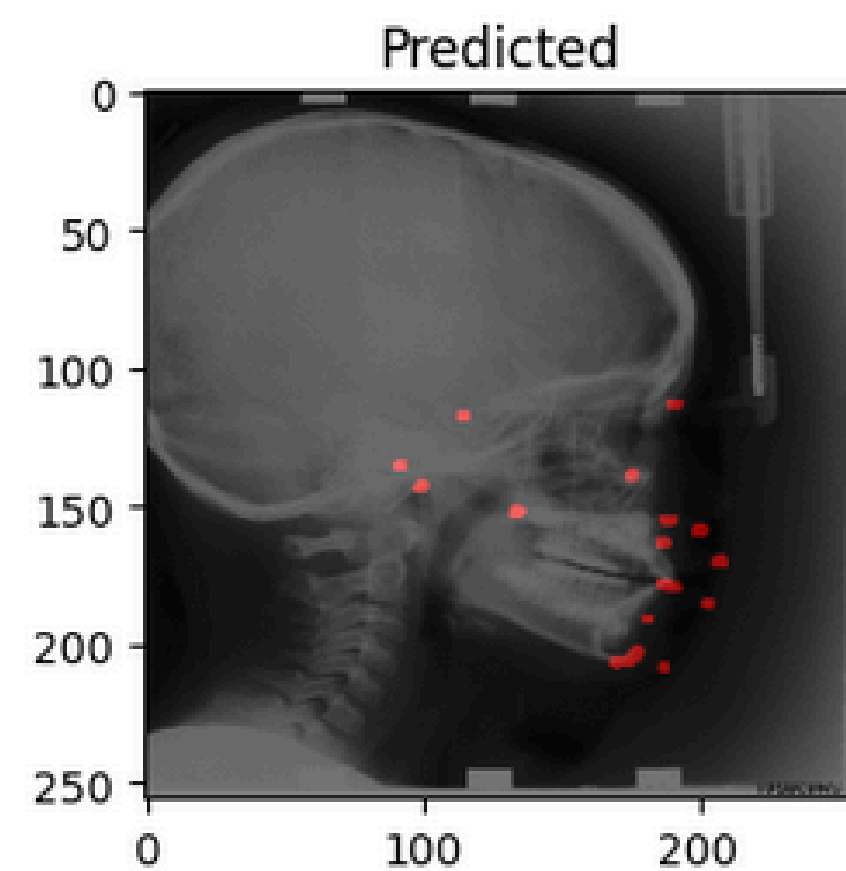
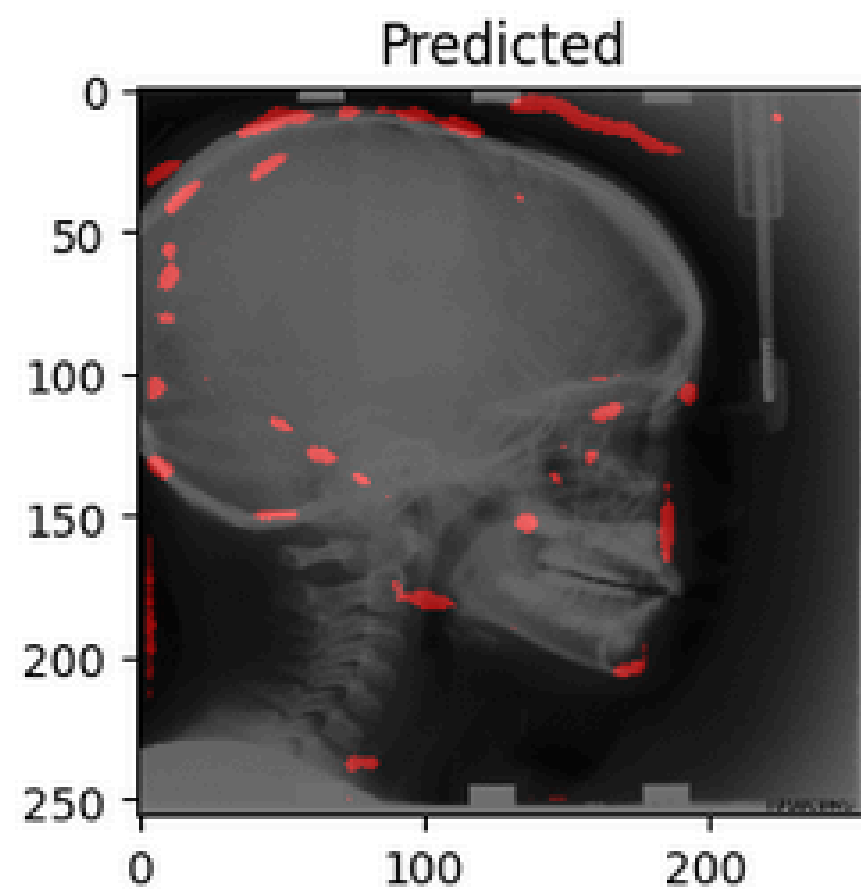
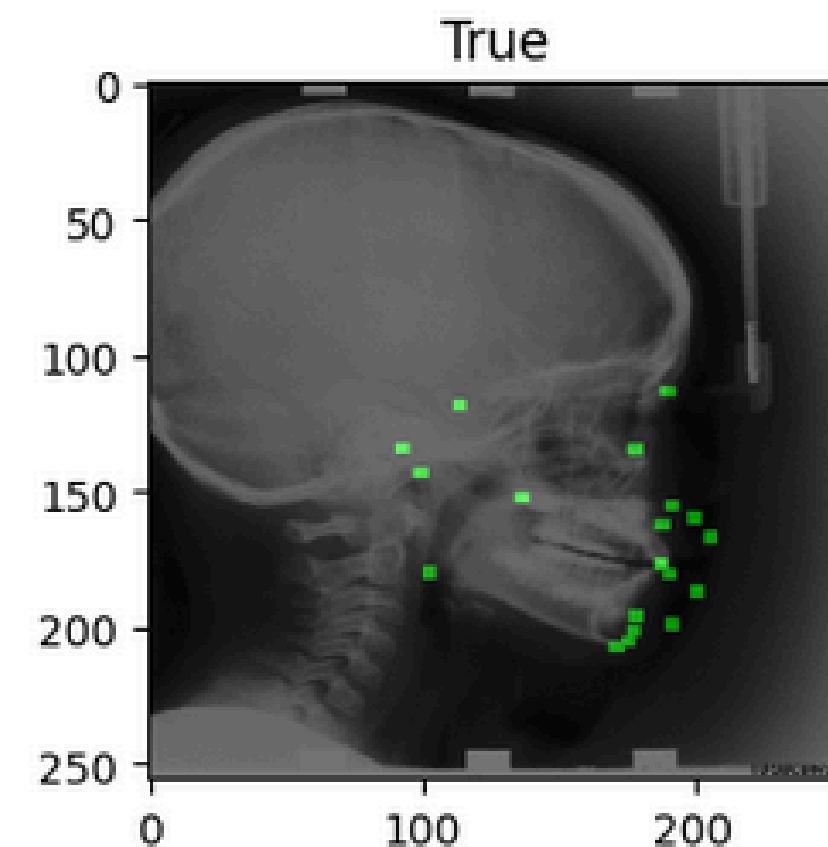
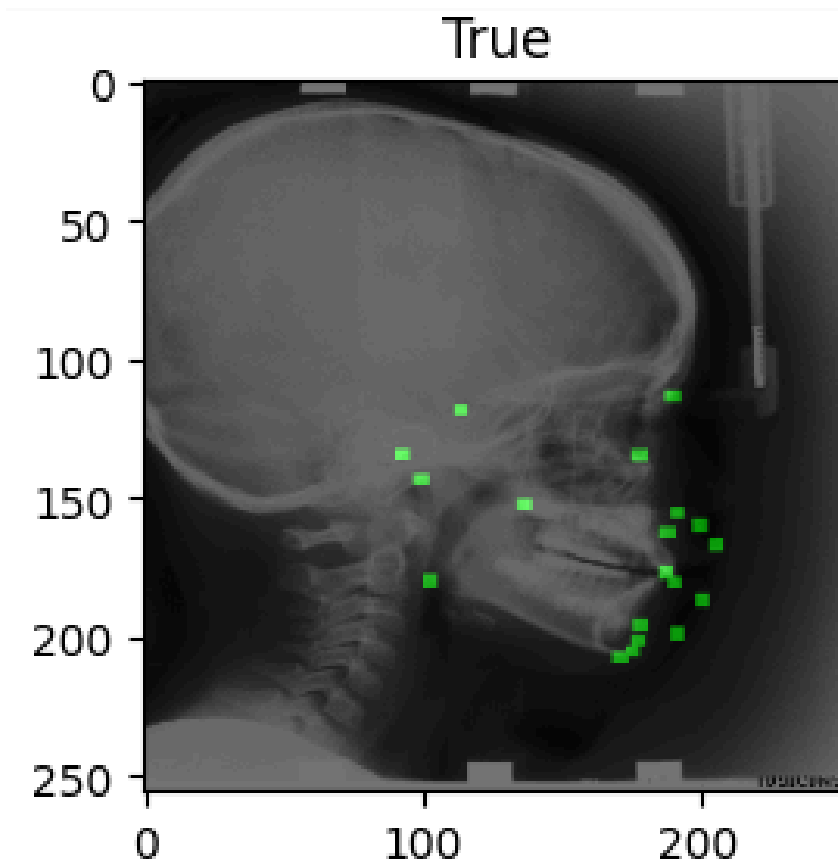
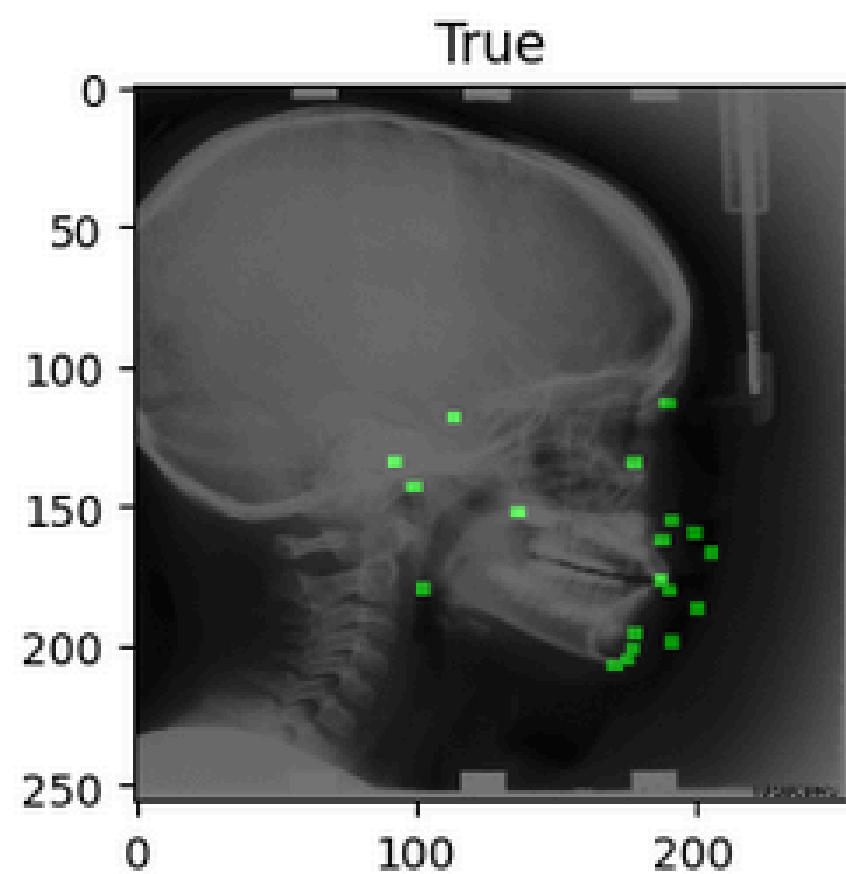
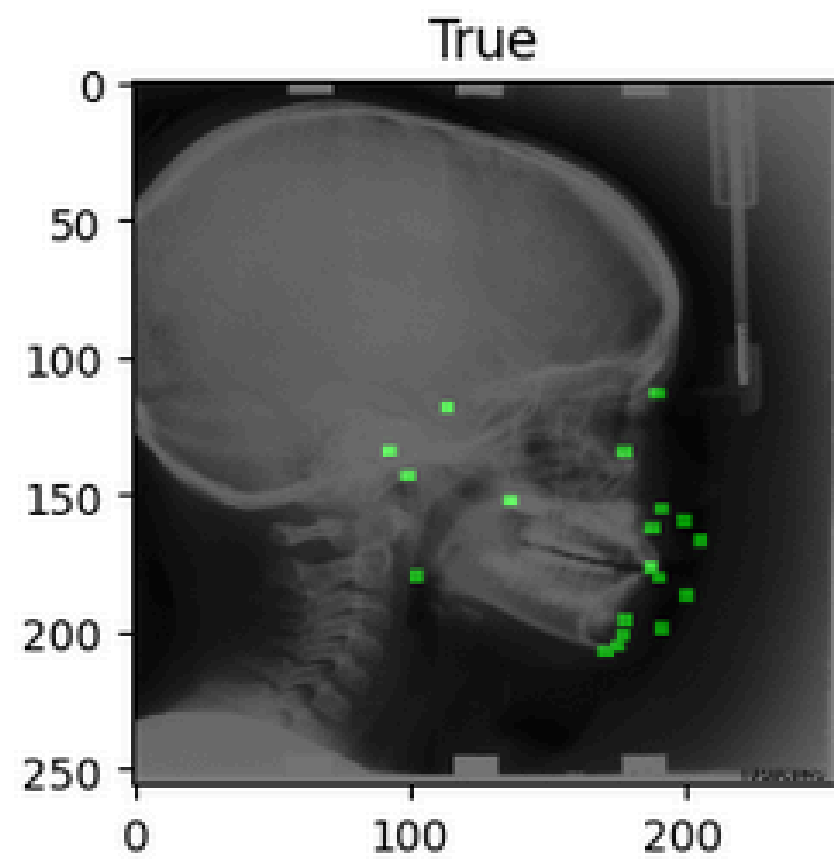


Fig : Predictions with 20, 75, 100 and 150 epochs

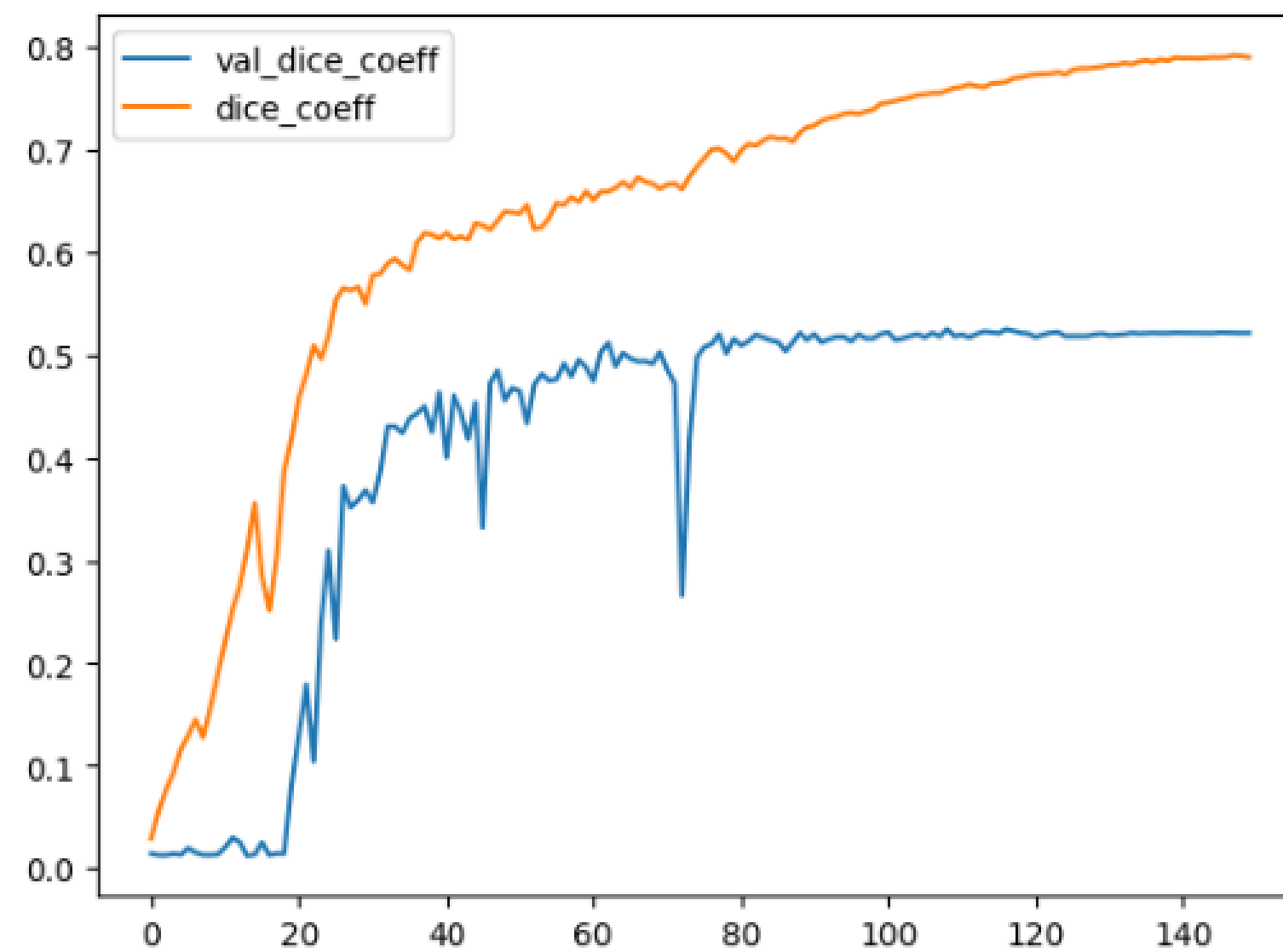
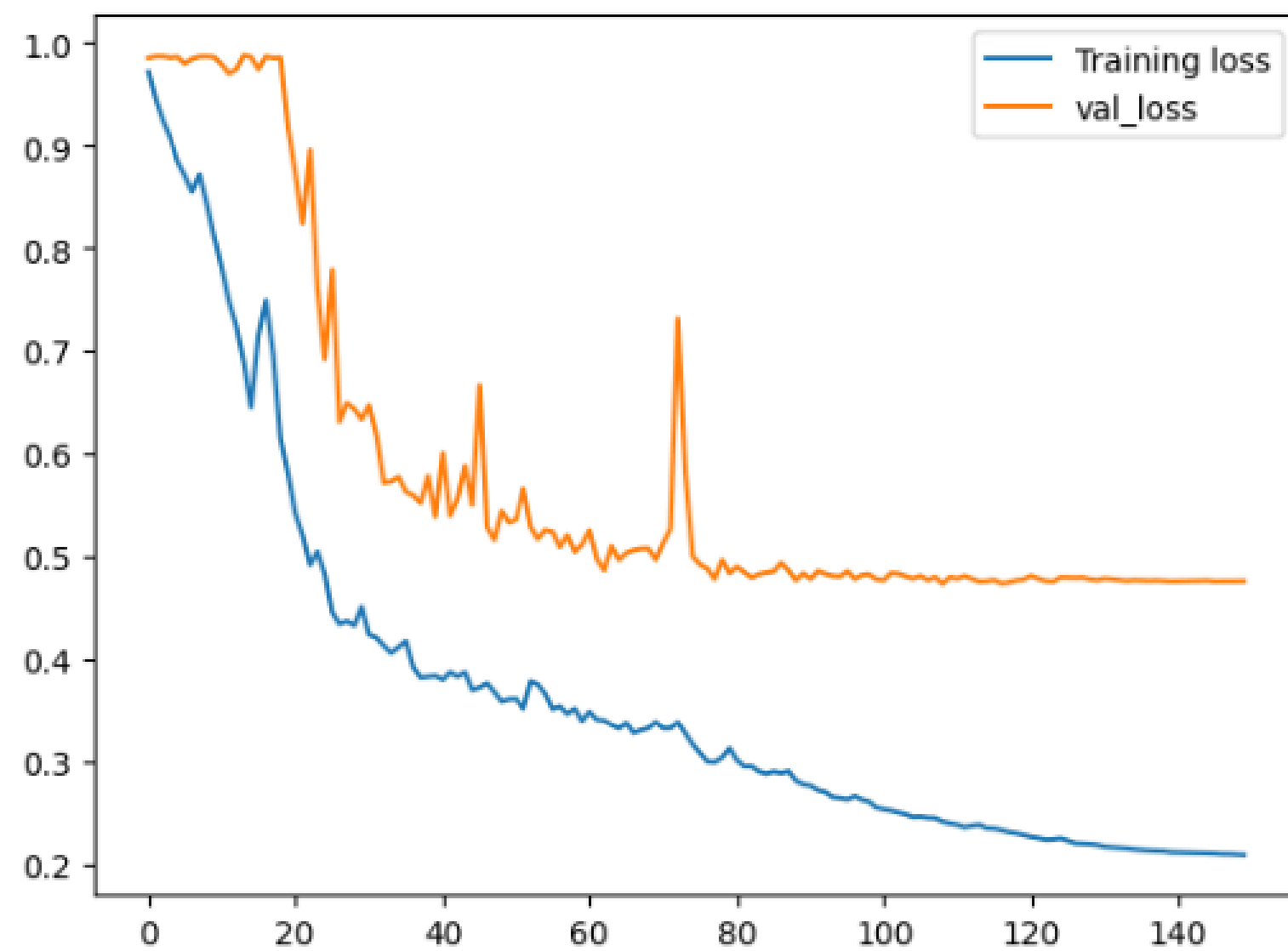


Fig : Loss with 150 epochs



# Comparison with SOTA

Method	Errors range
Julia M. H. Noothout et al.	0.46 to 2.12 mm
Lindner and Cootes	0.89 to 0.9 mm
Proposed methd	0.97 to 1.32 mm

# Conclusion

- Compare on different dataset like CCTA or Olfactory MR
- Locates landmarks quickly and easily
- Simple model to localize landmarks

# Thank you for your attention !



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Please review the code in the cell(s) to identify a possible cause of the failure.  
Click [here](#) for more info.  
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