

# An improved method for the segmentation of roots from X-Ray computed tomography 3D images : Routine v.2

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## Introduction & motivation

X-ray computed tomography (CT) is a powerful tool for the study of root system architecture (RSA) of plants grown in opaque soil (Fig. 1). The study of RSA is however only possible after performing root segmentation, i.e. the binarization of all root and background voxels. The objectives of this work are to develop a segmentation algorithm for which :

- ① the parameters are related to root properties (i.e. the root grey value and diameter);
- ② the number of parameters involved is reduced;
- ③ the root recovery rate is higher;
- ④ the segmented root diameters are better captured.

The ability of the new algorithm to fulfill these criteria will be evaluated by comparison with the former algorithm Routine (here referred to as "Routine v.1") on the benchmark dataset of the so called "worst case" scenario described in Gao et al. (2019).



Fig. 1 shows possible RSA studies by CT image analysis after performing root segmentation and registration of images obtained after 7, 14 and 21 days after sowing (DAS) of a *Zea mays* plant.

7 DAS  
14 DAS  
21 DAS

Fig. 1 Example of RSA study performed via CT images analysis.

## Methodology

Two keysteps were added to the Routine v.1 workflow (Fig. 3). The first one allows to enhance the contrast between the roots and the background whereas the second performs an automatic calculations of the sigma values to be used during the Gaussian smoothing with "Tubeness filter". The latter was established by analyzing the grey value transect of a root of a diameter  $d_r$  filtered with a sigma value  $\sigma$  (Fig. 2). We introduce a parameter  $q$  in order to normalize the results (i.e.  $q = \sigma/d_r$ , expressed in number of voxels). Setting  $q=0.5$ , retrieving the corresponding grey value (i.e. red dot on Fig. 2) and taking the scaling factor ( $f_s$ ) into account, we derive :

$$\sigma_i = d_{r,i} * f_s * 0.5$$

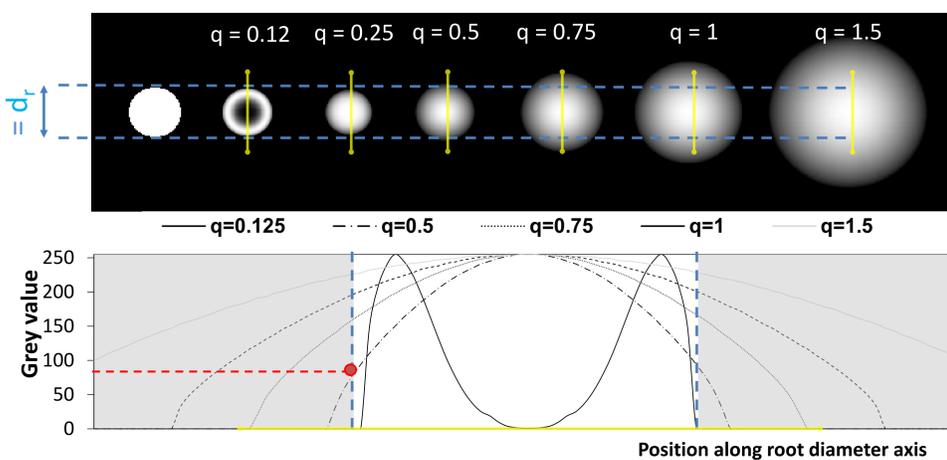


Fig. 2 Automatic calculations of the sigma values to be used during Gaussian smoothing

## 1 - Image acquisition

## 2 - Preprocessing

## 3 - Root segmentation

## 4 - Postprocessing

## 5 - Quantification & Analysis

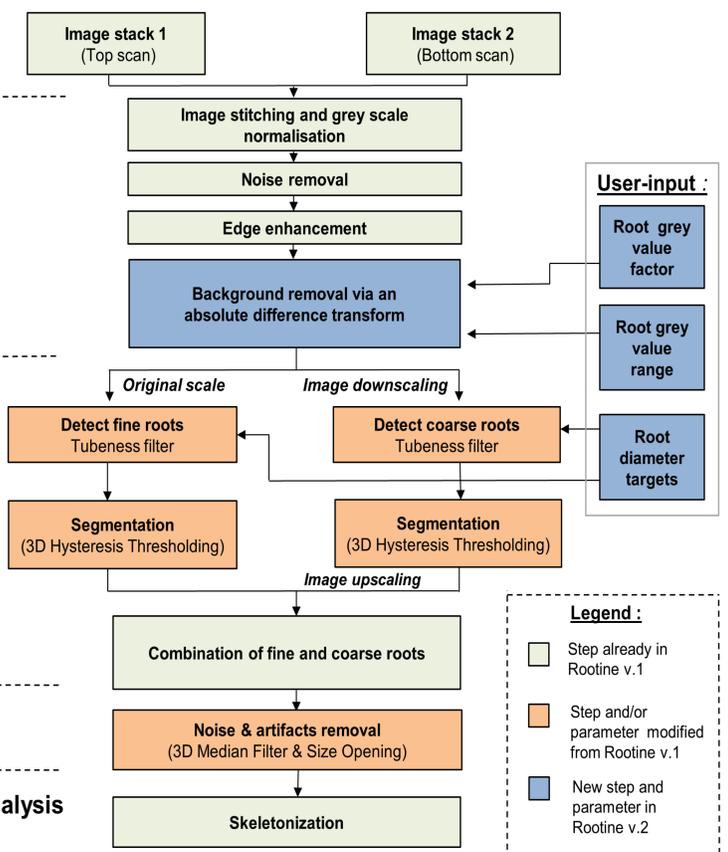


Fig. 3 Synoptic view of the Routine v.2 algorithm

## Results

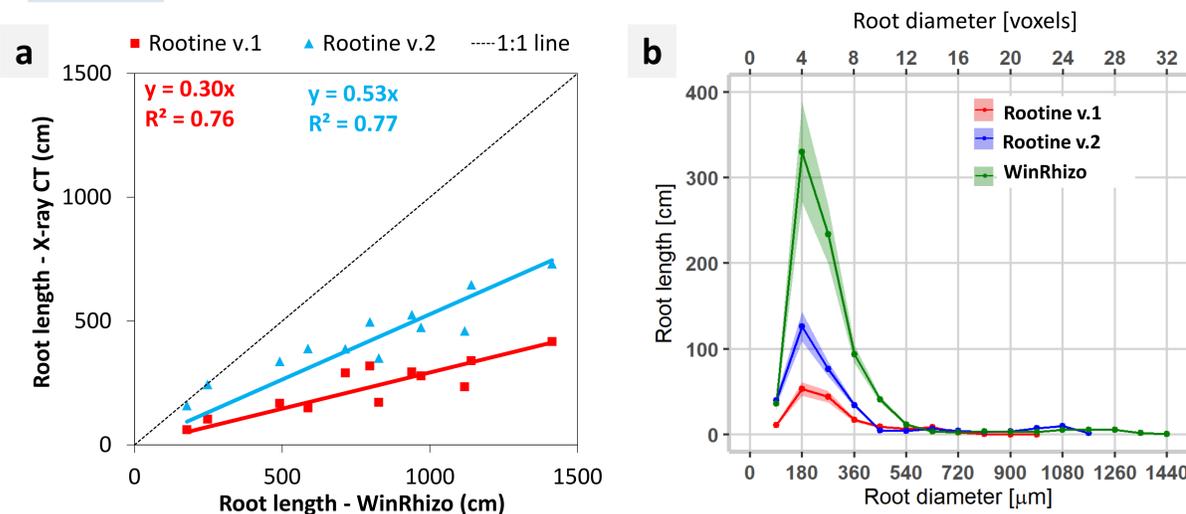


Fig. 4 Root recovery rate (a) and diameter evaluation (b) of Routine v.2 as compared to v.1 and WinRhizo data

## Discussions and conclusions

On the "worse case" benchmark dataset of Gao et al. (2019), Routine v.2 ...

- ① Performed **better** than Routine v.1 in terms of **root recovery** (Fig. 4a) and **diameter evaluation** (Fig. 4b);
- ② Involves **less parameters** to be calibrated by the user thanks to the addition of formalising steps (**7 vs. 13 in Routine v.1**);
- ③ Involves **parameters** which are **directly related to root properties**. This facilitates the interpretation of parameters and their effects for non-expert users.

## References :

1 - Gao, Wei, et al. "A shape-based method for automatic and rapid segmentation of roots in soil from X-ray computed tomography images: Routine." *Plant and Soil* (2019): 1-13.

This project was carried out in the framework of the priority programme 2089 "Rhizosphere spatiotemporal organization - a key to rhizosphere functions" funded by DFG (project number 403640293)