# High throughput phenotyping of root growth dynamics, lateral root formation, root architecture and root hair development enabled by PlaRoM

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This paper originates from a presentation at the 1st International Plant Phenomics Symposium, Canberra, Australia, April 2009.

**Abstract.** Plant organ phenotyping by non-invasive video imaging techniques provides a powerful tool to assess physiological traits and biomass production. We describe here a range of applications of a recently developed plant root monitoring platform (PlaRoM). PlaRoM consists of an imaging platform and a root extension profiling software application. This platform has been developed for multi parallel recordings of root growth phenotypes of up to 50 individual seedlings over several days, with high spatial and temporal resolution. PlaRoM can investigate root extension profiles of different genotypes in various growth conditions (e.g. light protocol, temperature, growth media). In particular, we present primary root growth kinetics that was collected over several days. Furthermore, addition of 0.01% sucrose to the growth medium provided sufficient carbohydrates to maintain reduced growth rates in extended nights. Further analysis of records obtained from the imaging platform revealed that lateral root development exhibits similar growth kinetics to the primary root, but that root hairs develop in a faster rate. The compatibility of PlaRoM with currently accessible software packages for studying root architecture will be discussed. We are aiming for a global application of our collected root images to analytical tools provided in remote locations.

Additional keywords: Arabidopsis, growth profiling, video imaging.

# Introduction

High throughput quantification of visible plant phenotypes has emerged as a valuable tool to characterise gene function, improvements of plant growth performance and biomass production. Therefore, an arsenal of tools that provide characterisation of diverse plant growth parameters has been developed. Initial approaches in the study of growth patterns in plants involved the use of rulers or digital callipers to determine the displacement of marked sectors. More recently, automated technologies using digital image processing have evolved to monitor organ development in a non-invasive manner. Most of these tools are appropriate to address very specific questions related to the complexity of whole-plant, organ or segmental growth. Because of this specification, only a small proportion of the dynamic and architectural parameters have been extracted from the sampled images. Thus, to optimise the information gain derived from kinematics of growing plants, it is desirable to develop a global network that links the accessibility to all presently available analytical tools.

Video imaging analysis has been used to determine the growth profiles of elongating plant organs such as pollen tubes, internodes, hypocotyls and leaves. However, less information is available about the growth responses of roots, mainly because of

their inaccessibility. However, detailed growth analysis of roots has several advantages over other organs: (1) that growth is essentially unidirectional and strongly dependent on carbohydrates exported from the source leaves, and (2) that the local changes in water potential are likely to be less marked than in leaves. One approach to quantify root growth patterns uses calculations of the displacement of the root tip over time. This is achieved by capturing a series of time lapse records or marking root tip position on a transparent surface. To quantify root growth kinetics commercial software such as WINRHIZO (Arsenault et al. 1995), OPTIMAS analysis software (Media Cybernetics, Bethesda, MD, USA) or IMAGE J (Abramoff et al. 2004) was introduced to assess defined growth parameters. Several laboratories are even providing freely available software packages to analyse root architecture and growth (Basu et al. 2007; Armengaud et al. 2009).

Previous approaches have shown that there are rapid adaptations of growth in responses to modulation in light intensities and periods (Aguirrezabal *et al.* 1994; Muller *et al.* 1998; Nagel *et al.* 2006). Furthermore, they demonstrated that there are different growth zones at the root tip, and that these are differentially affected by different treatments (Walter *et al.* 2003). Recent studies have quantified differences in root

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architecture (Armengaud et al. 2009). By combining curvature measurements with root diameter, the differential growth ratio between the greater and lesser curvature edges of a bending root was calculated by KineRoot (Basu et al. 2007). However, information on how roots respond to combined stimuli: varying carbohydrate status, different ratios of nutrients, nitrogen, phosphate or sulfur and combined nutritional and abiotic stress is sparse. Early studies by time lapse recordings with cherry (Prunus avium) root tips demonstrated significant increase in the averaged rate of growth in the night compared with the day (Head 1965). The root elongation rate of rice (Oryza sativa L.) seemed to show a rhythmic pattern, but the timing of the maxima and minima was not robust (Iijima et al. 1998). More recent studies with rice and tobacco found similar root tip velocities in the day and night in a 12-h photoperiod (Walter et al. 2002; Walter and Schurr 2005). However, the root elongation kinetics of the model plant Arabidopsis thaliana (L.) Heynh is not recorded in published literature.

The most recent platforms for non-invasive analysis of root growth provide accurate and reliable results with high temporal or spatial resolution, but they are time-consuming, often targeted and have a low throughput. However, the effect of environmental stimuli on biological processes especially growth and development is well known. Hence, it is difficult to reveal reliable patterns and detect small changes of root elongation from currently available data. We here describe a range of applications of a recently developed plant root monitoring platform (PlaRoM) that enables high throughput monitoring of growing seedlings with high spatial and temporal resolution and detection of root elongation profiles.

# Materials and methods

#### Plant material and cultivation procedure

Seeds of Arabidopsis thaliana (L.) Heynh wild-type accession (Col0) were surface-sterilised for 20 min with 10% sodium hypochlorite solution containing 0.1% surfactant (Triton X-100). After sterilisation, seeds were rinsed several times with sterile water and plated on the surface of solid nutrient agar (7.0% m/v) supplemented with half-strength MS medium (Murashige and Skoog 1962) (M02 555, pH 5.6; Duchefa, Haarlem, The Netherlands). After 4 days stratification, Petri dishes were placed vertically in the phytotron (21°C constant day and night temperature, 100 µmol m<sup>-2</sup> s<sup>-1</sup> photon flux density). Photoperiod was set to 12/12 h day/night. At day 9, seedlings that had developed roots of at least 1 cm were selected and distributed equally in a row 3 cm down the top on the surface of solid medium filled in 120 × 120 mm rectangular Petri dishes. For the extended night experiment two growth media were used for different Petri dishes, one of which was complemented by 0.01% sucrose. Sample plates were kept in the phytotron for 2 more days.

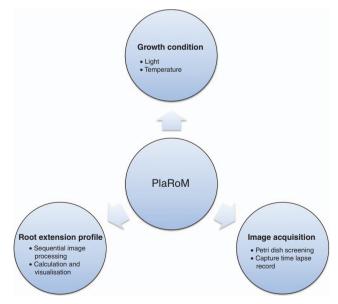
# Results and discussion

# Plant root monitoring platform (PlaRoM)

Plant phenotyping in a non-invasive way requires video imaging where the quality of images defines the resolution of the measurement. High throughput characterisation of growth, however, requires robotised equipment for imaging and adequate software application for processing these records. However, due to modulation of plant growth in response to abiotic stimuli (Franklin 2008; Walter et al. 2009), environmental conditions must be controlled and recorded in any growth study. To fulfil these requirements, we have developed a plant root monitoring platform (PlaRoM) that enables high resolution monitoring of up to 50. A. thaliana seedlings growing in controlled growth condition. PlaRoM controls the growth condition in which sample seedlings are growing, acquires images of growing seedlings and finally calculates the root extension profiles and plots the results over time (Fig. 1). Hence, the imaging platform consists of a custom designed phytochamber and the enclosed measuring head (Fig. 2). Two software applications were developed for PlaRoM. While the imaging application controls the imaging platform (constant growth condition and image acquisition), the root extension profiling application calculates the growth profiles from obtained images and plots the results.

# Controlled constant growth condition

A custom designed phytochamber housed the measuring head of PlaRoM (Fig. 2c). The top and front layers of this chamber were made up of transparent material. Hence, the photosynthetic, as well as imaging light sources, were placed outside the chamber to reduce heat production therein. The light intensity in the chamber



**Fig. 1.** Functional illustration of PlaRoM. The platform is made up of three major options; control of growth conditions, image acquisition and calculation of root extension profiles. Control of growth condition is achieved by the use of a cooling device together with a thermometer and thermostat. The application of digital sensors enables the controlling software application to record light and temperature status. The sample stage holds two Petri dishes and is mounted by the robot arm. Stepwise movements of the robot arm enable screening of the surface of Petri dishes. Shortly before each movement three time lapse records are captured. Finally, the PlaRoM software application applies the root tip detection algorithm to captured records of each individual root tip over time to provide the position of the root tip. These values are further averaged over several time periods and plotted over time.

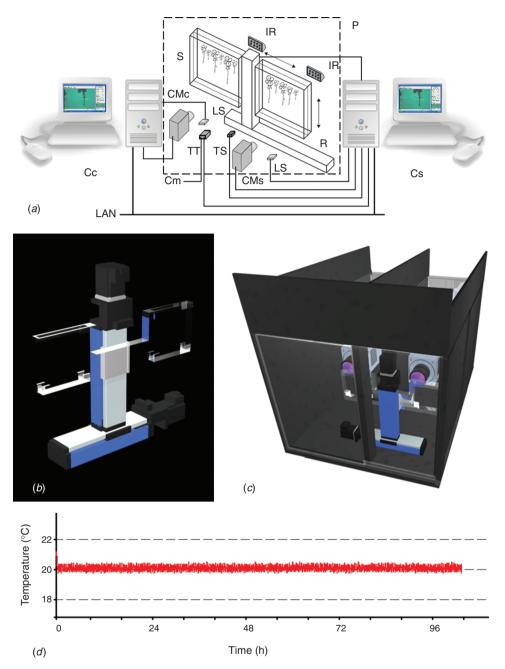


Fig. 2. Hardware component of the imaging platform. (a) Schematic illustration of the imaging platform. A computer controlled robot arm mounts two Petri dishes in front of the camera-microscope units. Imaging light is provided by infrared light sources. This measuring head in enclosed in a temperature controlled phytochamber. Each camera-microscope unit is connected to a microcomputer. Microcomputer are connected to each other through the LAN in client/server architecture. A light sensor connected to each microcomputer enables it to record light intensity. A thermometer and thermostat connected to the compressor enables accurate temperature setting by the server. In addition, a temperature sensor provides continuous measurement of temperature status by the server. Abbreviations: Cs, server microcomputers; Cc, client microcomputers; R, computer controlled robot arm; CM, camera microscope units; IR, infrared light sources; P, temperature controlled phytochamber; LAN, local area network; LS, light sensor; TT, thermometer and thermostat; Cm, connection to the compressor; TS, temperature sensor. (b) The robot arm consists of two perpendicularly arranged linear stages and holds the sample stage. The dual sample stage holds two Petri dishes on each side of the vertical axis in front of the microscope-camera units. (c) The phytochamber enclosing the measuring head. The  $110 \times 72 \times 58$  cm perspex shield was built with special attention to the accessibility of adjustment knobs and sample stage. With the front and top layers being consisted of transparent perspex, the imaging and photosynthetic light sources could be placed outside the chamber to avoid any heat production inside the phytochamber. (d) A typical temperature curve recorded during a measurement. Application of the cooling device together with the digital thermometer and thermostat provide constant temperature conditions inside the phytochamber.

at the surface of the leaves of the seedlings was typically 70–90 µmol m<sup>-2</sup> s<sup>-1</sup>. Control over temperature regimes was achieved by combination of a USB temperature sensor and a digital thermometer and thermostat regulating a cooling device. Further, operation of three fans circulated the air inside the phytochamber and, thus, prevented the development of a temperature gradient. A module in the imaging software application set the temperature through the digital thermometer and thermostat with 0.5°C accuracy (Fig. 2d). In addition, digital light sensors enabled the recording of photon flux densities at the start of each screening of the Petri dishes.

High throughput root growth phenotyping

#### Image acquisition

In order to study dynamics of root growth, high resolution time lapse records of several individuals with relative short time intervals are needed. Hence, the PlaRoM imaging platform screened the surface of two sample plates and captured time lapse records of the seedlings growing therein. In detail, a custom designed sample stage housed two Petri dishes, each monitored by a camera-microscope unit. The imaging light was provided by infrared light sources, each placed in front of a camera-microscope unit (Fig. 2a). The sample stage was mounted on a screening robot which provided its motion (Fig. 2b). The PlaRoM imaging software application controlled the screening of the Petri dish and capturing of time lapse records (a brief description of the robotised platform for monitoring a single Petri dish is outlined by Yazdanbakhsh and Fisahn 2007a).

# Petri dish screening

Central to the multi parallel recording of many roots was the screening robot. This robot consisted of two perpendicularly arranged linear stages (Fig. 2a, b). Stepwise movement of the robot arm, controlled by the imaging software application, enabled the movement of the sample stage in a plane. This automated motion enabled screening of a user defined area (corresponding to the rectangle [(XF, YF), (XT, YT)] in robot arm coordinate system, Fig. 3a) over the surface of each Petri dish over several days.

# Capturing time lapse records

EasyGrab, a software package that operates the frame grabbing card, provides a 768 × 576 pixel live video stream from the cameras. With the presently used magnification set by the microscopes, the video stream covers a 4.58 × 3.33 mm area over the surface of the Petri dish. Current magnification enables capturing images with  $5.96 \times 5.78 \,\mu \text{m pixel}^{-1}$ resolution (Fig. 3b). However, higher spatial resolution is possible by greater zoom. Stepwise movements of the robot arm were applied at user defined time intervals of at least 5 s (Fig. 3a). To assure the highest degree of reliability in detection of the root tip positions, reduce the effect of noise (mainly optical noise in the background), and obtain smooth curves, three time lapse records were captured at each position with 800-ms intervals. These records are stored in a subfolder of the measurement folder, labelled by the position of the viewing frame in robot arm coordinate system, and are used for calculation of root extension profiles. To facilitate the root tip

detection process each time lapse record is stored under a special filename format including its capturing time.

While capturing time lapse records, a module in imaging software application built an image of the whole screened area, and this was stored at the end of each completed screen. In detail, upon capture, a  $200 \times 200$  pixel 'scaled-down' copy of one of the obtained time lapse records was placed in position of a composed image relative to the corresponding view frame coordinates (Fig. 3c). These images present the growth status of all individuals during the measurement period.

# Root extension profiling

The root extension profiling software application analysed the time lapse records and provided the growth velocity profiles. Modules embedded in this application were developed for sequential image processing, calculation of the root extension patterns and visualisation of the obtained growth profiles.

# Sequential image processing

The sequential image processing module applied the root tip detection algorithm (Yazdanbakhsh and Fisahn 2007b) to a stack of images captured from each individual root. In detail, the user defined the root tip detection parameters and prepared a list of the indices of images showing the root tip in each view frame. For a measurement applied over 4 days with 30 min screening periods, the image stack contained ~600 records. This module applied the root tip detection algorithm to all corresponding records and detected the root tip position. Finally, the coordinates of the detected root tip together with the times of dawn and dusk were stored in an XML library under a name assigned to that individual.

#### Visualisation of root extension profiles

This module calculated the extension profile of an individual root, and plotted the values over time. Extension profiles were obtained from displacements of each individual root tip in consecutive time points during the measurement. This application provided plots of the calculated root extension profiles.

# Investigation of root extension profiles by PlaRoM

PlaRoM provided a powerful tool to investigate the dynamics of root extension profiles and marked higher throughput, spatial and temporal resolution over presently available methods to quantify root growth dynamics. High throughput monitoring of up to 50 individuals is performed simultaneously owing to the applied robotised motion system. Most of the previously described devices focus on the detection of one individual root. Screening two Petri dishes in 30 min time periods provides high resolution root extension profiles. Furthermore, the constant controlled growth conditions enable investigation of root extension patterns in different environmental conditions. Subsequently, we will demonstrate several applications of PlaRoM.

# Dynamics of primary root extension

The high spatial and temporal resolution provided by the platform enables analysis of root extension rate over short time

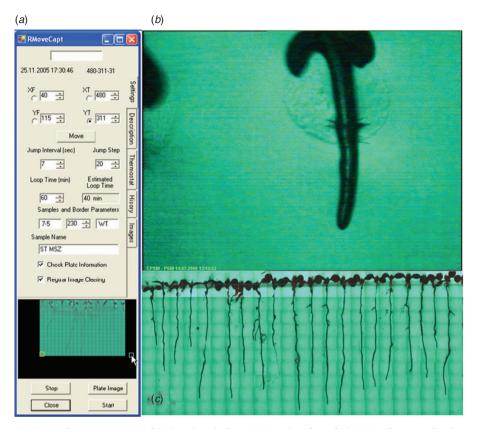


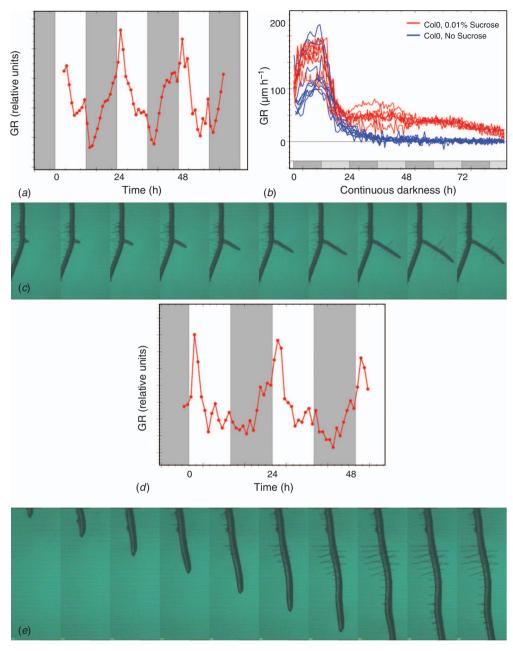
Fig. 3. Software component of the imaging platform. (a) User interface of PlaRoM software application subunit. The stepwise movement of the robot arm enables to screen the [(XF, YF), (XT, YT)] defined area over the surface of the Petri dish. Once the radio button behind any of the x or y values is selected a click on 'move' advances the sample stage to the corresponding (x or y) position. Each movement is performed after an at least 5-s time interval (defined in 'jump interval') and positions the sample stage 20 000 microsteps (in robot arm coordinate system, defined as the 'jump step' value ×1000) in horizontal and 70% of this value in vertical direction. Depending on the time needed for screening of the defined area (presented in 'estimated loop time'), the 'loop time' value can be defined by the user. This value sets the time gap between consecutive screenings. In comparative studies several wild-type and mutant seedlings are placed on the same plate. Hence, time lapse records taken from the area of the Petri dish containing wild type and mutants are labelled with the genotype name. Names of the two genotypes and the robot arm coordinate corresponding to their border are provided by the user in 'samples and border parameters'. Each measurement is labelled by a name provided by the user in 'sample name'. The sowing date and description of the growth medium are inserted by the user in the 'description' tab page. The user can set the desired temperature and read the current temperature status inside the phytochamber in the 'thermostat' tab page. Furthermore, a joint image of individually screened segments over the surface of the Petri dish is presented in the lower panel. Mouse click on any part of this composed image moves the robot arm to the corresponding position. (b) A typical time lapse records captured by the imaging platform. Due to the magnification set by the binocular microscope, the 768 × 576 pixel image covers an area of  $4.58 \times 3.33$  mm. (c) An example of the combined image produced by the imaging software application. This image presents the growth status of all seedlings in the screened area of the Petri dish and is stored after each screening round.

intervals. Furthermore, the platform can be used to study dynamics of root elongation in different light regimes. Root extension kinetics of *A. thaliana* primary roots (Fig. 4*a*) demonstrated the existence of similar pattern compared with that of previously described leaf growth profiles (Wiese *et al.* 2007). Root elongation rate declined during illumination, while a recovery emerged towards the end of this period. The main part of the night was characterised by an increase in root growth activity. We have intensively studied extension kinetics of *A. thaliana* primary roots in different light protocols which will be published

soon (Smith and Stitt 2007; N. Yazdanbakhsh and J. Fisahn, unpubl. data).

Root extension patterns in different growth media

PlaRoM enables the study of root elongation in different growth media, especially with its option to screen two Petri dishes simultaneously. Figure 4b displays the relaxation kinetics of A. thaliana wild-type seedlings during 90 h of darkness and its modulation due to 0.01% extracellular sucrose



**Fig. 4.** Investigation of root dynamics by PlaRoM. (a) A typical trace of 47 repeats showing the root extension kinetics of *Arabidopsis thaliana* wild type (Col0) entrained to  $12/12 \, h$  day/night cycles. This measurement was performed on 13-day-old seedlings over 63 h. GR: growth rate. (b) Relaxation kinetics of root elongation in extension of the night. *A. thaliana* wild-type seedlings were raised in two different Petri dishes with 0.01% and without extracellular sucrose in  $12/12 \, h$  day/night cycles. Subsequently, root relaxation kinetics was recorded during a 90 h period of darkness. Blue traces depict seedlings growing in the absence of sucrose while red traces represent presence of extracellular sucrose (n = 11, n = 9, respectively). Traces exhibit the absolute growth rate of individuals within the relaxation period. GR, absolute growth rate. (c) Representative image sequence showing the development of a lateral root in *A. thaliana* from early stages. Images with 4-h time interval are selected from records captured during a measurement. (d) A typical trace of 10 repeats showing the kinetics of lateral root growth in *A. thaliana*. This trace presents the growth characteristics of a 7-day-old lateral root that was recorded for 51 h. GR, growth rate. (e) Typical image sequence displaying the development of root hairs in *A. thaliana* root. Images with 3-h time interval are selected from records captured during a measurement.

(blue and red traces, n = 11, n = 7, respectively). Inhibition of root elongation in Col0 seedlings started shortly after the expected dawn. In the absence of sucrose, continuation of this gradual

decrease led to complete cessation of growth after ~24 h of extension of the night. In the presence of 0.01% sucrose, however, 8–10 h after extension of the night slight recovery of

root extension was detected (Fig. 4b). We note that root elongation increased in the anticipated night, and gained a local maximum at the anticipated dawn. This finding indicates that in continues darkness the presence of 0.01% sucrose modifies the relaxation kinetics of *Arabidopsis* roots in a characteristic way. This measurement demonstrates the ability of PlaRoM to detect the modulation of root elongation in response to very small amounts of extracellular carbohydrate.

# Comparison of root extension profiles among different genotypes

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PlaRoM can be used to study root extension profiles of several genotypes, including mutants. Hence, it is a suitable tool to investigate the role of certain genes (or the related physiological pathways) in the growth process. In particular, we have already investigated the defected root elongation patterns of a set of starch mutants, as well as circadian clock mutants in different light protocols including free running conditions. Among starch mutants pgm, sex1, mex1, dpe1 and dpe2 were investigated, all of which present different levels of nocturnal growth inhibition. The strongest defect of up to 80% inhibition of growth at the end of the night (Smith and Stitt 2007) is exhibited by pgm, while mex1 and dpe1 exhibit quite similar growth pattern compared with the wild type (data not shown). Furthermore, root extension patterns measured from circadian clock mutants (elf3, ef4 and the cca1-lhy double mutant) in different light protocols including free running conditions display deviations from that of the wild type. These deviations were detected in the second part of the day and night period. All mutants display inhibition of growth towards dawn and an increase of growth activity towards dusk. Furthermore, in free running experiment of continuous light, they present different time constants compared with that of the wild type, and elf3 mutant displays arrhythmic root extension pattern. Detailed investigation of the root extension patterns of Arabidopsis circadian clock mutants and their modification due to extracellular sucrose will be published separately.

# Kinetics of lateral root development

Lateral root (LR) formation is of great agronomic significance, since highly branched LRs could greatly increase the absorptive area of the root system that uptakes water and nutrients and provides physical support to the plant. Thus, the development of an optimal LR system is a key factor for the vigour of the plant in various conditions (Malamy and Benfey 1997). Root system architecture is a highly plastic trait, and varies both within and among species (Osmont et al. 2007). However, the basic root system morphology and its plasticity are controlled by inherent genetic factors. These mediate the modification of root system architecture, mostly at the level of root branching, in response to a suite of biotic and abiotic factors (Osmont et al. 2007). The PlaRoM imaging platform screens each sample plate for several days. Hence, any developmental process within each Petri dish can be followed from its initial stage. A series of images displaying the development of a lateral root is presented in Fig. 4c. LR development occurs at locations distal to the root tip, and progresses in parallel to elongation of the main root. Extension kinetics of lateral roots can be calculated from the displacement of the lateral root tip (Fig. 4*d*). Similar to the primary root, maximal growth activity was detected in the morning which decreases during the light period and increases during the major part of the night.

# Root hair development

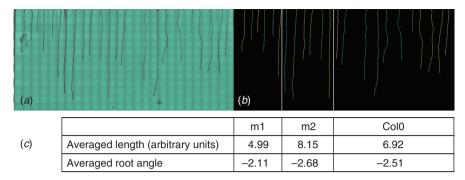
Root hairs are tubular structures that arise from root epidermal cells. The functional absorbing surface of a root hair is at the tip only. Hence, root hairs function to increase the apparent diameter of the root (Segal et al. 2008). A low-pH (pH 4) medium induced root hair formation in lettuce (Lactuca sativa L.) seedlings (Dolan and Davies 2004). Results suggest that factors essential to the formation of root hairs may be present in the shoot. The PlaRoM imaging platform provides high resolution images of root hair formation as well. Figure 4e presents a typical image sequence showing the development of root hairs. In this example, root hair development requires 12-15 h. This is a much faster time scale than the lateral roots. Root hair initiation has been reported to be controlled by the same genes that induce trichome formation (Schellmann et al. 2007; Ishida et al. 2008). Therefore, future application of the platform to mutants in trichome formation will provide novel phenotypes in root hair development.

# Compatibility and application of PlaRoM images to public image processors

The image files presenting the screened area over the surface of the Petri dish can be used by currently available software applications for investigation of root architecture. Depending on the capability of these programs in detection of big bitmap files, the image files with higher pixel resolution can also be produced by the imaging platform. In detail, higher magnification through the microscope enables detailed study of root hair development. Figure 5 presents the application of EZ-Rhizo (Armengaud *et al.* 2009) to one of the images collected by the PlaRoM showing the growth status of Col0 and two cell wall mutants with proteins of unknown function growing in a Petri dish (n=11, n=6, n=6, respectively). The software application detects the roots and provides the length and angle of main and lateral roots, as well as total number of lateral roots (Fig. 5; Armengaud *et al.* 2009).

# Outlook

Plant phenomics is a rapidly emerging area of research that combines the development of new imaging technologies with plant physiological and genomics data. Although electrical and mechanical engineering has advanced in many industrial branches, only limited progress has been reported on automated plant phenotyping and integration of these results into the framework of systems biology. Therefore, a new generation of scientific work is needed that incorporate expertise in systems analysis, electrical engineering and plant physiology. Development of PlaRoM provides one step into this next generation. The imaging platform enables simultaneous monitoring of several root tips over long time, and provides a great advantage over the currently available root monitoring systems. PlaRoM reveals the root extension pattern of different genotypes in constant growth conditions. Furthermore, it enables



**Fig. 5.** Analysis of root architecture by EZ-Rhizo. (a) The surface of a Petri dish was screened by PlaRoM. This Petri dish contained two cell wall mutants of *Arabidopsis thaliana* as well as wild-type Col0 (n=6, n=6, n=11, respectively). The  $4630 \times 2480$  pixel image was scaled down before analysis by EZ-Rhizo to fit the requirement of this software. (b) Image obtained after analysis by EZ-Rhizo. (c) Root length and angle parameters detected by the EZ-Rhizo software application averaged over individuals of each genotype.

to study the modulation of these patterns due to different light protocols, growth media, temperature regimes as well as presence of different bacteria in growth medium. Investigation of root extension patterns of more circadian clock related genes and their modulation due to extracellular sucrose will be published soon. In addition, effect of short light pulses, as well as different temperature regimes on root extension profiles of *Arabidopsis* will be studied in near future. With the possibility of applying already available software applications to the images obtained from PlaRoM imaging platform, we would like to study root architectures and development of lateral roots with high spatial and temporal resolution. Furthermore, obtained images enable us to accomplish a detailed study of root hair formation.

To optimise the availability and, thus, use of already existing data mining algorithms, we suggest a global network of digital image processing in the field of plant research. This should include a joint video image database of developing and growing plant organs to facilitate detailed mining of currently available digital imaging data and link those to genomics, proteome an metabolite databases.

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