Viewing stomata in action: Autonomous *in planta* imaging of individual stomatal movement links morphology and kinetics

T. E. van den Berg, R. G. P. Sanders, E. Kaiser and J. Schmitz

Summary

Stomata regulate plant gas exchange with the environment, balancing between water loss and CO_2 uptake. Gas exchange dynamics are influenced by traits such as stomatal morphology, size and density, which are commonly investigated using imprints and manual microscopy, methods that are destructive and time consuming. Moreover, these microscopic properties are statically sampled and related to the dynamic ensemble behavior: gas exchange of an entire plant or part of a leaf. Knowledge on how morphology, size and density of stomata influence the movement of individual stomata is limited. We developed a compact microscope system that can measure the kinetics of tens of stomata *in vivo* simultaneously, with sub-minute time resolution. The system can be deployed in the plant's growth environment, at minimal impact on leaf microclimate. The characteristics of our microscope and data analyses are described, and we demonstrate its capabilities on *Chrysanthemum morifolium* with novel insight into individual stomata's contribution to water-use efficiency.

Introduction

Due to climate-change driven rises in temperature and Vapor Pressure Deficit (VPD) (Novick *et al.*, 2016) and decreased rainfall in many agricultural areas (Dore, 2005), future crop yields are coming under pressure. Adaptation of agriculture is therefore essential to maintain food security for an increasing world population (Anderson *et al.*,

2020). A pillar for agricultural adaptation is the development of
varieties with increased water-use efficiency (WUE). To achieve this,
we need to thoroughly understand the role that stomata play in plant
WUE, defined as the rate of photosynthesis divided by the rate of
transpiration (Bertolino *et al.*, 2019; Buckley, 2019; Lawson & Vialet-
Chabrand, 2019; Nadal & Flexas, 2019), to breed for stomatal traits
underlying high WUE.

Stomata are the microscopic pores on plant leaves that
regulate their gas exchange, by dynamically opening and closing in
response to environmental and intrinsic stimuli (Lawson & Matthews,
2020). Their dynamic behavior (Lawson & Vialet-Chabrand, 2019),
morphology and density (Bertolino *et al.*, 2019; Duursma *et al.*, 2019)
are important for plant WUE. Stomatal conductance to CO_2 diffusion
into the leaf facilitates photosynthetic CO_2 fixation in the mesophyll,
and stomatal movement broadly aims to balance the CO_2 taken up by
photosynthesis with the water vapor lost through transpiration. Light
intensity changes of ~25-50 fold on single leaves are frequent in the
crop growth environment (Kaiser *et al.*, 2018). When the light
intensity drops, the photosynthetic demand for CO_2 decreases near-
instantaneously, while stomatal closure proceeds much more slowly.
Hence, stomata that at that moment are open more than strictly
necessary for CO_2 demand, waste water through unnecessary
transpiration. Likely, fast-closing stomata are thus more water use
efficient.

Stomatal clustering and density have major effects on WUE. The
tendency to form clusters of stomata, compared to evenly spaced out
stomata, negatively affects their function (and thereby WUE), by
decreasing their effective response speed (Lehmann & Or, 2015).
Higher stomatal density negatively impacts WUE, by increasing
stomatal conductance under dark conditions, because stomata are
often not fully closed (Duursma *et al.*, 2019). However, high stomatal
density may increase stomatal speed and thereby WUE in fluctuating
light, as it tends to correlate with small stomatal size (Bertolino *et al.*,

2019; Lawson & Matthews, 2020), indicating the complexity of

stomatal trait effects on WUE.

An increase in light intensity quickly causes photosynthetic demand

for CO_2 to increase, as biochemical limitations are lifted in the first

minutes of photosynthetic induction (Sakoda *et al.*, 2021). To meet

this demand for CO_2, stomata need to open to increase the rate of

diffusion of CO_2, leading to a transient limitation of photosynthesis

while opening. Transient limitations of photosynthesis in shade-sun

transitions cost an estimated 10-40% of potential crop CO_2

assimilation (Long *et al.*, 2022). More efficient, fast-responding

stomata could thus result in a CO_2 assimilation increase (McAusland

et al., 2016; Xiong *et al.*, 2018, 2022; Deans *et al.*, 2019; Acevedo-

Siaca *et al.*, 2020, 2021; De Souza *et al.*, 2020; Taylor *et al.*, 2020;

Eyland *et al.*, 2021), leading to similar potential increases in crop yield

(Garcia *et al.*, 2023).

Stomatal dynamics are most frequently studied using leaf-level gas

exchange measurements, and are then related to static microscopic

observations of e.g. leaf epidermal peels to stomatal density and

morphology. Measurements of bulk stomatal behavior, such as those

of leaf gas exchange, hide the variation in dynamics between

individual stomata (Kaiser & Paoletti, 2014), and studies that have

resolved individual stomatal dynamics are relatively rare (Kaiser &

Kappen, 1997, 2000, 2001; Kaiser, 2009; Grantz *et al.*, 2018).

Moreover, minimizing the boundary layer of still air surrounding the

leaf, as is common in gas exchange measurements (Busch *et al.*, 2024),

limits the study of stomatal behavior under frequently occurring

natural conditions, when a significant boundary layer is present.

Therefore, information is lacking on how local morphology and

density influence the ensemble of individual stomatal dynamics. Such

characteristics could lead to a better understanding of stomatal

control and thereby to breeding targets for WUE and yield (Haworth

et al., 2021). Additionally, it is essential to study such characteristics

in the field, e.g. to understand how plants with altered stomatal

characteristics respond to multiple stresses in different
developmental phases (Bertolino *et al.*, 2019).

Here, we describe a newly developed portable microscope, which can
measure the opening and closure of tens of individual stomata
simultaneously in the growth environment. Our method innovates on
previous methods by selective use of green light for imaging and blue
and red light as actinic light. In addition, we imaged the entire field of
view (FOV) of the leaf's surface. We did this by creating large image
stacks that were used to create leaf surface projections, in contrast to
autofocus of single pores. This enabled us to relate stomatal dynamics
to microscopic characteristics of the stomatal environment on the
epidermis such as the distance to other stomata. Acquisition and
analyses were largely automated, facilitating easy measurements. We
demonstrated our method on leaves of *Chrysanthemum morifolium,*
a greenhouse crop whose stomatal behavior can limit vase life
(Fanourakis *et al.*, 2021) and the rate of photosynthetic induction
(Zhang *et al.*, 2022).

Materials and Methods
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Microscope
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The design of our microscope focused on obtaining images with sub-
micrometer resolution at different focus planes to resolve the 3D
surface of the leaf with sub-minute time resolution. Additionally, the
design aimed to be minimally invasive to the leaf's microclimate.

We achieved high optical resolution with high quality optics
(plan APO series objectives, Mitutoyo, Japan and TTL200-S8 tube lens,
Thorlabs, United States), verified with a calibration target (micro V2,
Opto, Germany). The 20x objective (NA 0.42) enabled imaging of
~0.45 mm^2 (722x625 μm) of the leaf's surface. High time resolution of
stacks of 100 images spaced 1 μm apart on the axis parallel to the
imaging plane (z-axis; below the 1.6 μm depth of focus of the
microscope objective) was achieved with a fast and accurate step
motor (Z812, Thorlabs, United States, range of 12 mm, 0.2 μm

precision), which was controlled with autofocus software and a CMOS

camera (BFS-U3-244S8M-C; Teledyne-FLIR, Wilsonville, OR, USA). The

high sensitivity of the camera and on-camera pixel binning (2x2)

allowed us to achieve good quality images at a relatively low light

intensity (50 ± 10 μmol photons $m^{-2} s^{-1}$) and integration time (400 ±

100 ms). The use of long working distance objectives (20 mm) and leaf

clips that were laser-cut from transparent polycarbonate with 2 mm

neoprene cushions allowed us to clamp and image the leaf with low

obstruction to air flow and light. Imaging was strictly done with green

light (Effiring 525 nm; Effilux, Hürth-Efferen, Germany) in darkfield by

filtering light that passed through the objective with a bandpass filter

(FB550-40, 550 ± 8 nm, FWHM 40 ± 8 nm; Thorlabs, Newton, NJ, USA).

Monochromatic light was chosen, because it boosted image quality

by limiting chromatic aberrations. Green light was selected because

of its high reflectance and transmission by the leaf, higher optical

resolution achievable compared to near-infrared and a maximum

sensitivity of the camera in the green waveband. Optimization of

imaging light was achieved before each automated measurement by

manually changing the emission angle and diffusivity (by changing the

opacity of the window) of the imaging light. Blue-red actinic

illumination was emitted by a LED lamp (444/661 nm, 20/12 nm

FWHM, 52/48%; Seven steps to heaven, the Netherlands). Both

actinic and imaging light were controlled via LabVIEW (2018, National

Instruments, Austin, TX, USA) and intensity calibrated at the leaf

position with a PAR quantum sensor (Li-190R; Li-Cor Biosciences,

Lincoln, NE, USA). Leaves were clamped in the microscope leaf holder

equipped with embedded magnets at four contact points. The

portable microscope was mounted on a tripod and therefore

adjustable in height and angle to target leaves in a plant canopy (Fig.

1). Leaf Temperature and PAR intensity fluctuations during the

measurement were recorded with a leaf clip holder (2020-B)

connected to a portable fluorometer (MIN-PAM; Walz, Effeltrich,

Germany).

Figure 1. Example of the microscope in use at the vegetable garden of the University of Twente (the Netherlands). A. Side view of the entire microscope with a leaf of Zea mays clamped in the holder. B. Top view of a leaf of Cucumis sativa clamped in the holder. The leaf clip (1) holds the leaf in place via magnets embedded in the polycarbonate framework. Neoprene cushions ensure a minimal effect of the clamping on the surface of the leaf. The microscope objective (2) can focus automatically and the ring light (3) provides illumination for microscopy. The leaf clip from the mini-PAM (4) records fluctuations in PAR as well as ambient air temperature (A) or leaf temperature (B).

Software

Acquisition

The data acquisition software was developed in Labview. Camera settings, number of images per stack with different focus planes on the z-axis (z-stack) and stack depth, imaging and stimulus light intensity and duration, as well as autofocus settings that determined the position of the stack's center (methods: Roberts, Sobel, Gradient (Lthi *et al.*, 2010)) were controlled via Labview's user interface. Full protocol files with imaging, light timing as well as light intensity settings can be loaded into the software with a graphical user interface for inspection.

Analyses

Acquired z-stack images, in 16bit TIFF format belonging to each z-stack, were processed in several stages (Fig. 2) using Fiji open-source

software (Schindelin et al., 2012). Images were denoised (despeckle

and outlier removal), normalized for intensity (enhance contrast,

normalize) and aligned (SIFT linear stack alignment (Lowe, 2004)). SM

movie 1 is an example of a processed image stack. Next, the plugin

"extended depth of field" (Forster *et al.*, 2004) was used to generate

a focus projection of the leaf surface, reducing the stack to a single

image per timepoint. All timepoint focus projections were then

stacked again to generate a video of the entire experiment that was

again aligned to adjust for x-y axis movements of the leaf during the

experiment (SIFT linear stack alignment). This stack was then cropped,

to include only the area that was within view during the entire

experiment, shadow corrected with the pseudo flat field correction in

the BioVoxxel plugin (Brocher, 2015) and contrast enhanced using the

CLAHE algorithm (Reza, 2004) (Fig. 3 A-C). SM movie 2 is an example

of a processed video from an entire experiment, while SM movie 3 is

a zoomed version of a single stoma. Auto thresholding was done in

Percentile mode (Doyle, 1962), as it generated the best segmentation

of open pores for *Chrysanthemum morifolium* (Fig. 3D). SM movie 4

is the same video as SM movie 3 after thresholding. Stomata in the

stack were manually selected with the elliptical selection tool and

added in the region of interest (ROI) manager (ImageJ). Pore areas

were then quantified via the 'analyse particles' menu for each stoma

in the ROI manager, to quantify pore area and to generate masks for

visual inspection of pore shapes for the entire experiment (Fig 3D).

SM video 5 shows the masks generated from the stoma in SM videos

3 and 4.

Kinetics of stomatal aperture changes were loaded into Origin

(OriginLab Corporation, Nothampton, MA, USA) and, data of opening

and closing were fitted separately with the model (Vialet-Chabrand *et*

al., 2013):

Equation 1

$A(t) = (A_{max-i} \text{ - } A_{0-i})\, e^{-e^{\left(\frac{\lambda_i - t}{k_i} - 1\right)}} + A_{0-i}.$

Figure 2. Flow chart of image processing pipeline. Single images belonging to an
image stack were denoised and their contrast was enhanced by intensity
normalization. Images with different z-axis position in a stack were then aligned to
correct for minor x, y movements (surface parallel to the microscope's objective). The
extended depth of field plugin processed the stack to create a single focus projection
of leaf surface. Each surface projection timepoint was added together in a video of
the entire experiment. The images in these videos were again aligned to correct for x,
y movements, shade corrected and their contrast was enhanced. Automated
thresholding of time stacks was done with Percentile mode. Stomatal positions were
manually selected with the elliptical selection tool, pore area was segmented, and
quantified with the analyze particles menu.

Figure 3. Example of time-stack processing with a single surface projection. A. Surface

projection output from extended depth of field. B. Image in A processed with pseudo

flat field correction (PFFC). C. Image in B processed with contrast limited adaptive

histogram equalization (CLAHE). D. Image in C after thresholding with the Percentile

method. Red ROIs are drawn manually with the elliptical selection tool. E Voronoi

diagram drawn based on the elliptical selections of stomata in D. The scale bar

indicates 100 micrometer.

With A(t) the stomatal aperture at time t, A_{max} the maximum aperture

at steady-state, A_i the initial aperture at steady-state, λ the time lag of

the response (min) and k the time constant (min), a measure of the

rapidity of the response. For stomatal closure, A_{min-d} was defined as

the final aperture at steady-state with A_{0-d}, the aperture at the start

of the closing response. k and λ were separately quantified for open

and closing responses, using subscripts i and d, respectively.

Equation 2

$$A(t) = (A_{min-d} - A_{0-d})\, e^{-e^{(\frac{\lambda_d - t}{k_d} - 1)}} + A_{0-d}.$$

Quality of fit was assessed by reduced chi squared statistic of the fit

(ideally close to 1), the structure in the residuals (ideally random noise

without structure) and error estimates of the fitted parameters

(ideally <10%, but no larger than 100%). SM Fig. 1 provides an

example of fit of the kinetics for a single stoma.

Some stomata were excluded from data analysis. Reasons to exclude

stomata were: a) Bad segmentation due to low local image quality e.g.

stoma shaded by trichome, b) incomplete stomatal pore on the edge

of an image, c) lack of pore opening after a light intensity change, d)

low-quality fit, as judged by χ^2, residuals and uncertainty (>100% of

value) in the fitted parameters.

Guard cell length (GCL) was measured in Fiji by manual use of the

straight line tool in the image at t=90 min, the timepoint where

stomatal aperture was generally maximal.

A Voronoi plot (Fig. 3E), which connects lines with equal distance to

the borders of each neighbouring stoma, was created via the Voronoi

tool (in the Fiji software), and each surface was measured via the

'analyse particles' menu. Resulting data were used to test for

relationships between the leaf area that could be assigned to a given

stoma ('Voronoi area') and that stoma's aperture and kinetics. Only

Voronoi surface areas that were fully inside the image were

considered in this analysis.

Because our method depends on the automated focus projection of

the z-stack (the reduction into a single image that represents the

entire surface within the FOV), we compared it to the human

operator: manual selection of the best focus position per pore. We

compared the results for ten stomata with a good distribution within

the FOV for 100 stacked images per 119 time points during the long

term   shade-sun-shade   transition.   Further   image   processing,

segmentation and quantification of the pore area were automated
and following the identical protocol for both manual selection and
focus projection.

Plant material and growing conditions

Chrysanthemum

Experiments were conducted in a growth chamber equipped with
nine dimmable LED modules (DRWFR_RSE 400V 1.1D MP; Signify,
Eindhoven, the Netherlands) that produced a diurnal average of ~250
μmol m^{-2} s^{-1} of photosynthetically active radiation (PAR) at plant
height. A sinusoidal light pattern (16h light period, minimum PAR of
120 μmol m^{-2} s^{-1}, maximum PAR of 1200 μmol m^{-2} s^{-1}) was applied with
random drops in light intensity that mimicked natural irradiance
fluctuations. The timing and extent of drops in light intensity changed
daily, but the sinusoidal pattern and daily light sum remained fixed.
Temperatures were set at 23/20 °C (day/night). Relative air humidity
was 70%. Ventilation was 0.28-0.55 m s^{-1} of laminar flow.
Chrysanthemum morifulium (cv. Anastasia; Deliflor Chrysanten,
Maasdijk, the Netherlands) plants that had been grown in plastic pots
(diameter 14 cm, filled in with potting soil) were cut back at the third
or fourth node to allow for the formation of new axillary buds. Plants
were irrigated twice per day (at 7:00 and 19:00 h) with nutrient
solution, using an automatic ebb and flow system.

Stomatal aperture measurements

Stomatal apertures were measured on fully expanded leaves in the
middle between the leaf edge and the midrib. Care was taken not to
include veins in the FOV of the microscope, in order to maximize the
number of stomata in the FOV. A screen was used to shade the
measured plant from direct growth chamber lighting during aperture
measurements. Leaves were acclimated to 50 μmol m^{-2} s^{-1} blue-red
light and 50 μmol m^{-2} s^{-1} green imaging light for 60 minutes before
image acquisition was started. Image stacks were acquired every
minute for 120 minutes. After 30 minutes, the light intensity was
increased to 1000 μmol m^{-2} s^{-1} by increase of the blue-red light

intensity to 950 µmol m^{-2} s^{-1}. After 60 minutes, the blue-red light

intensity was switched back to 50 µmol m^{-2} s^{-1} (total intensity

including green measuring light: 100 µmol m^{-2} s^{-1}) for 30 minutes to

trigger stomatal closure.

Statistical Tests

All statistical tests were performed in Origin (OriginLab). Normality

tests for the distribution of fit or measured parameters were

performed with Shapiro-Wilkins test. KWANOVA and paired Wilcoxon

signed rank tests were used to test for significant differences between

sets of parameters that were not normally distributed. Spearman's

correlation was calculated between set of parameters that were not

normally distributed. For normally distributed data, students t-test

and Pearson correlations were used. The number of replicates and the

probability scores are mentioned with the test results.

Results

Our portable microscope enabled the imaging of stomatal dynamics

of *Chrysanthemum* in the growth environment by its selective use of

green light, with limited effects on stomatal movement (Jones *et al.*,

2022) for imaging at a low light intensity, while using stepwise

changes in red and blue light intensity to trigger changes in stomatal

aperture.

Comparison of stomatal pore area dynamics between automatic and manual selection of best focus per pore

The dynamics of the pore area in the focus projection images

(automatic) were generally well correlated with those in the manually

selected best single focus images (Fig. 4A, SM Fig. 2, table 1).

However, the pore area tended to be smaller when derived

automatically: pores were on average 10 µm^2 smaller in automatic

than in manual images, with slightly larger differences during the first

45 min of the experiment (Fig. 4B). To investigate if this difference in

pore area arose from spatial dependence of image quality, we

correlated the difference against positional coordinates of the

stomata. We found that these differences between automatic and

manual-derived pore area were neither correlated to the x, y position
of the pore in the image, nor to the distance of the pore to the image
edge, nor to the position in the stack of the manual images (Table 2).
Further, pore opening in the automatic images tended to be faster
than in the manual images, as indicated by the k_i parameter of the
model (Table 1), although this difference was not significant. Pore
closing speed was similar in both image sequences. In conclusion, the
automatic method can correctly asses the kinetic parameters of the
stomata but underestimates the true pore area.

Figure 4. A Example of kinetics of one stoma analyzed with the focus projection
(automatic) method or in the manually selected best single focus images (manual)
demonstrating their correlation. All individual stomata curve pairs are in SM Fig 2. B
Averaged difference in pore area between the same pore analyzed in the automatic
images and the Manual images in all timepoints of the shade-sun-shade transition.
The shaded area around the curve indicates the standard error of means. Light grey
blocks indicate shade periods.

Table 1. Averaged fit parameters of the kinetic model for the pore areas in the
automatic and manual images as well as Pearsons correlation coefficient between the
pore area kinetics in automatic and manual images. NS indicates no significant
differences between the means as tested with a paired T-test (for k_i and k_d) or non-
significant correlation (P>0.05). k_i and k_d were normally distributed (Shapiro-Wilkins
test). Errors indicate the SEM.

Method	k_i (min)	k_d (min)	Pearsons r	
(n=10)	NS	NS	automatic	manual
automatic	30 ± 2	2.8 ± 0.4	1	>0.97 (P<0.0001)
manual	36 ± 3	3 ± 1	>0.97 (P<0.0001)	1

368 *Table 2 Pearsons or Spearmans correlation coefficient between the average*
369 *automatic-manual difference and the x, y and z coordinate of the pore and the*
370 *distance to the image edge. Distance to image edge was not normally distributed in*
371 *contrast to the coordinates or the z-position in the stack (Shapiro-Wilkins test)*

Pearsons r or Spearmans ρ	X coordinate (r)	Y coordinate (r)	Distance to image edge (ρ)	z-position in stack (r)
manual-automatic	-0.16 (NS)	0.20 (NS)	0.24 (NS)	-0.36 (NS)

Movement of the leaf surface upon light intensity change

Because we recorded the changes in the position of the leaf surface

via automatic adjustments by the step motor of the microscope, we

could observe the movement of the leaf surface upon changes in light

intensity (Fig. 3C). Specifically, after the switch from 100 to 1000 µmol

$m^{-2} s^{-1}$, there appeared to be some shrinkage or bending of the leaf as

its surface moved away from the camera, whereas upon the transition

from 1000 to 100 µmol $m^{-2} s^{-1}$, the opposite happened (Fig. 5). These

leaf surface movements had no impact on imaging, because the FOV

of the leaf was always captured in focus within the stack. Leaf surface

movements resulted in a minor displacement of the position of the

leaf surface in the stack (SM Fig. 3). In conclusion, the active

repositioning of z-positions of each new image stack based on the z-

position of the leaf surface in the previous image stack, is necessary

because the leaf surface moves hundreds of micrometers during light

intensity changes.

Figure 5. Position on the z-axis of the imaged area of the leaf surface where the largest
area of leaf surface was in focus during the shade-sun-shade experiment. The red
curve indicates the average of six biological replicates, and the shaded area indicates
the standard error of the mean. The z-axis position at t=30 min was set to zero for
each measurement before averaging. The Focus position (y-axis) indicates the middle
position of the 100 images per one minute timepoint that were spaced 1 μm apart.

Stomatal dynamics of Chrysanthemum leaves during a shade-sun-shade transition.

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To further demonstrate the power of our method, we continued to
test the resolving power of the method in leaves of six plants split over
two cultivation periods. After image processing, ~78% (124/158) of
the stomata in the FOV were kinetically resolved (Fig. 6).

While overall stomatal aperture was in a steady-state in the
initial shade condition (Figure 6, 0-30 min), individual stomata
showed minor movements by either opening or closing only slightly.
After the light intensity was increased, 62% of stomata (77)
immediately opened their pores, while the rest showed a lag in their
response of up to 40 min (Fig. 6). A duration of 60 min at 1000 μmol
photons $m^{-2}s^{-1}$ was not sufficient to reach a steady-state pore opening
for most stomata, which led to more uncertainty in the fitted k_i
parameter than if a steady-state had been reached. Figure 7 and 8
show the distribution of the fitted parameters in violin plots.

The light intensity decrease led to an immediate closing
response of thirteen stomata (13%), with the rest lagging in their
response. Nineteen stomata did not close at all within the 30 min sun-
shade transition (20%). These 19 stomata had a significantly higher
steady-state aperture under high light intensity than the 78 stomata
that closed during the shade phase (A_{max-I} 78±6>60±3, mean+SE,
P<0.02, KWANOVA). In addition, they were not evenly distributed
among the biological replicates: of the 19 non-closing stomata, 15
were located on one biological replicate and the remaining four
stomata from two others (1 and 3 per replicate), while the remaining
replicates had none. A steady-state was reached for all but five of the
stomata that closed within the 30 min sun-shade transition, however
this new steady-state pore aperture at lower light intensity was larger

than the initial steady-state level of these stomata before the opening

light stimulus was applied (A_{min-d} 23±3 μm^2 > A_{0-i} 13±2 μm^2, mean+SE,

paired sample Wilcoxon Signed Ranks Test, P<0.005).

Figure 6. A Example of stomatal pore area changes upon a shade-sun-shade
transition. Single lines show values of 124 individual stomatal pores from six
chrysanthemum plants. The thick black curve represents the average, and the grey
area the standard error of the mean. During the second shade period, a temporary
loss of focus during one measurement caused fewer data points to be recorded. B
Kinetics of all stomata shown in A, normalized to 0 at t=29 min just before the light
intensity was increased and to 1 for the maximum aperture reached at 1000 µmol
photons $m^{-2}s^{-1}$, highlighting the differences in opening lag (λ_i) and stomatal closure.

 Figure 7. Distributions of parameters obtained from model fits to stomatal kinetics
(raw data shown in Fig. 6). A. Opening and closing lag (Li, Ld) as well as time constants
for opening and closing (ki, kd) B. Steady-state stomatal pore area in the initial shade
period A_0, in sun period A_{max-I} and the final shade period A_{min-d}. C Maximum opening
$dAdt_i$ and maximum closing speed dAdt. Red stars represent the mean and circles the
median of the data, 25-75% indicates the position were the middle 50% of the values
in the distribution can be found and the range within 1.5 IQR indicates which part of
the distribution are not considered to be outliers.

Figure 8 Distribution of A. guard cell length (GCL) of the stomata in Fig. 6 measured
in the last image during the high light period (t=89 min) and B. Voronoi area
representing the area on the leaf that is within the shortest distance to a given stoma.
Red stars represent the mean and circles the median of the data, 25-75% indicates
the position were the middle 50% of the values in the distribution can be found and
the range within 1.5 IQR indicates which part of the distribution are not considered to
be outliers.

Of the 78 stomata that opened and closed, only six had a larger k_i than k_d and those k_d were the very highest among the 78 values (Fig. 7A), meaning that for the majority of stomata, the steady-state when closing was reached faster than when opening.

Of all parameters, only guard cell length was normally distributed (Shapiro Wilkins test, p<0.001), therefore Spearman's nonparametric ρ was used to investigate correlations. A higher aperture during the first shade phase (A_{0-i}) was strongly correlated with a higher maximum aperture in the sun phase (Figure , A_{max-i}, ρ=0.89, p<0.001) and moderately correlated to the steady-state aperture during the second shade phase (A_{min-d}, ρ=0.55, p<0.001). A_{max-i} was also moderately correlated to k_i (ρ=0.63, p<0.001) and $dAdt_{max-i}$ open (ρ=0.54, p<0.001). The time-lag of the opening response ($λ_i$) was negatively correlated to A_{0-I}, A_{max-I}, k_i, GCL, Voronoi A_{min-d}, k_d and $λ_d$, and positively correlated to the closing speed $dAdt_{max-d}$. Interestingly, the time-lag of the closing response ($λ_d$) was correlated to A_0 (ρ=0.54, p<0.001) and A_{max-i} (ρ=0.54, p<0.001).

Figure 9. Spearman's correlation matrix between parameters of individual Chrysanthemum stomata (based on Fig. 7 and 8). A_0, fitted steady-state aperture under 100 μmol photons $m^{-2}s^{-1}$ PPFD. A_{max}, predicted steady-state aperture under 1000 μmol photons $m^{-2}s^{-1}$ PPFD; k_i, time constant for apertures to increase to A_{max} under 1000 μmol photons $m^{-2}s^{-1}$ PPFD; k_d, decrease from A_{max} to A_f under 100 μmol photons $m^{-2}s^{-1}$; l , initial lag in the response time of stomatal aperture to a step increase in PPFD; max dAdt, maximum rate of stomatal opening or closing to an increase or decrease in PPFD from 100 to 1000 μmol photons $m^{-2}s^{-1}$ or vice versa. Anatomical parameters of guard cell length (GCL) and width (GCW) were also compared. The Voronoi area represents the fraction of the leaf that is within the shortest distance to that stoma.

486   Among the anatomical parameters, Guard cell length (GCL) was moderately correlated to the maximum opening speed ($dAdt_{max-i}$, ρ=0.5, P<0.001), initial (A_{0-I}, ρ=0.38, P<0.001), maximum (A_{max-I}, ρ=0.41, P<0.001) and final aperture (A_{min-d}, ρ=0.24, P<0.05) as well as the Voronoi area (ρ=0.38, P<0.01). The Voronoi area was in addition moderately correlated with A_{0-i} (ρ=0.52, p<0.001), A_{max-i} (ρ=0.64, p<0.001) and the maximum opening speed ($dAdt_{max-i}$, ρ=0.58, P<0.001).

494   In conclusion, our method resolved 11 different kinetic and non-kinetic parameters for up to 78% of the stomata within the FOV to generate new insight into the WUE of individual stomata.

Discussion

The portable microscope presented here provides a new way to study the opening and closure of individual stomata in the growth

environment. This method facilitates analyses of individual stomatal
dynamics in relation to their local morphology and anatomy.

Our hardware and method are distinct from several previous
studies that imaged stomata *in situ* (Kaiser & Kappen, 1997, 2001;
Kaiser, 2009; Grantz *et al.*, 2018). The main differences and their
advantages and disadvantages are listed in Table 3.

Table 3 Differences between this work and prior studies (Kaiser & Kappen, 1997,
2001; Kaiser, 2009; Grantz et al., 2018) with their advantages and disadvantages

Difference	Advantage	Disadvantage	Study
525 nm versus 880 nm imaging light	Higher optical resolution	Imaging light is photosynthetically active	(Kaiser & Kappen, 1997, 2001)
Autofocus per stack instead of per pore	Imaging speed is not limited by number of stomata but only by stack size	Can cover stomata in only a small area of the leaf (~1 mm^2)	(Kaiser & Kappen, 1997, 2001; Kaiser, 2009; Grantz et al., 2018
Kinetic model fitting	Quantitative comparison of fit parameters	-	
No Gas exchange chamber	More natural boundary layer conditions	No information on leaf bulk gas exchange	(Kaiser & Kappen, 1997, 2001; Kaiser, 2009; Grantz et al., 2018

A major contrast with prior studies is that the way the leaf is clamped
was minimally invasive to the leaf's microenvironment, with free
transpiration on both sides of the leaf, because no gas exchange
measurements were performed. The boundary layer was not
regulated, reflecting a more natural condition. Another major
difference was the sampling of stomata: prior studies have randomly

sampled stomata distributed over a large area (>1 cm^2), whereas we
resolved as many stomatal kinetics as possible within ~1 mm^2, to
relate their kinetic behavior to the local morphology on the surface of
the leaf. In doing so, we reached a higher time resolution of, on
average, 21 stomata min^{-1} compared to 75 stomata once every 6-7
min (Grantz *et al.*, 2018). Another major difference is that we fit a
kinetic model to individual stomatal aperture kinetics to investigate
the relation of model parameters to parameters related to the local
morphology on the leaf surface.

A clear limitation of our method is the underestimation of pore area
compared to manual selection of the best focus per pore (Fig. 3). This
is especially concerning for pores that only opened minimally, as
these were likely found to be closed even when they were not actually
closed. Such pores are scored with large opening lags that are
erroneous. The minimal resolvable pore area is effectively limited
beyond the optical resolution of the microscope to ~10 μm^2 for the
20x objective used here. This limitation of the automated focus
projection method is not absolute but scales with the numerical
aperture of the objective. Minimally resolvable pore area can thus still
be improved at the cost of FOV size and working distance.   The
smaller pore area in the automated focus projection method is likely
due to differences in absolute contrast between the automatic and
the manual images that lead to different thresholding by the
percentile method. Implementation of the state-of-the art in
computer vision solutions, such as StomaAI (Sai *et al.*, 2023), for
stomatal measurements and segmentation may increase the
resolving power in the future.

The analysis of dozens of *Chrysanthemum* stomata led us to
the novel insight that a larger aperture at steady-state in high light
intensity (A_{max-i}) was positively correlated with the time lag for the
closing response (λ_d), with a large negative consequence for WUE
(Lawson & Blatt, 2014). Stomata with larger pores may suffer from a
larger lag in their response because of a stronger hysteresis.
Hysteresis is related to the opening speed at the time of the change

in light intensity, with opening speed ($dAdt_i$) positively correlated with

the maximum aperture (A_{maxi}).

Across a number of species, Deans et al (Deans et $al.$, 2019)

found that a large stomatal conductance at high light intensity was

correlated with fast closing response, to compensate in water-use

efficiency. We could not corroborate this for A_{max-i} and their rate of

closing dA/dt_{max-d} in individual stomata. *Chrysanthemum* stomata

with a large aperture thus have a disproportionately large negative

contribution on WUE normalized for their apertures, due to the

observed correlation between A_{max-i} and the time lag for the closing

response λ_i, combined with a similar closing speed as stomata with a

smaller aperture.

Stomatal size was found to be negatively correlated with WUE

across different *Arabidopsis* ecotypes (Dittberner et $al.$, 2018). A high

WUE is typically associated with a fast rate of stomatal closure

(Lawson & Vialet-Chabrand, 2019), and smaller stomata have indeed

often been observed to open or close faster than larger stomata

(Drake et $al.$, 2013; Kardiman & Ræbild, 2018; Durand et $al.$, 2019). In

contrast, we found a strong positive correlation between GCL and

maximum opening speed, as observed before for elliptical/kidney-

shaped stomata (McAusland et $al.$, 2016). The relation between

stomatal size and speed may thus be more complex than previously

assumed. This relation could be species dependent, as no correlation

between stomatal size and speed was found in a diverse range of

plants with differing stomatal morphologies and physiological

behaviors (Haworth et $al.$, 2018). Additionally, it may depend on the

type of stimulus, since e.g. step changes in light intensity and in VPD

often trigger different dynamics (Durand et $al.$, 2019).

The opening and closing speeds of stomata, that were not

correlated here, were found to be positively correlated in some

studies (Haworth et $al.$, 2021), but showed no correlation in others

(Xiong et $al.$, 2018). The correlation between opening and closing

speed may thus be species and/or condition dependent.

Mesophyll airspace formation is linked to functional pores

(Lundgren *et al.*, 2019), therefore we assumed that there was a

mesophyll airspace under each functional pore. We further assumed

that the diffusion pathway to the surrounding mesophyll was

approximately equal in all directions and that the majority of CO_2

feeding the mesophyll directly underneath the leaf surface was

supplied by stomata on that surface and not by stomata on the

opposite side of the leaf. Finally, we assumed that airspace and

mesophyll were homogeneously distributed below the pores. The

positive correlation of A_0 and A_{max} with the Voronoi area of the stoma

can be interpreted as the stoma matching its aperture to the local

demand for CO_2 from the direct mesophyll below. If a stoma has to

supply a larger area of mesophyll, its steady-state aperture will be

larger under all light conditions than that of a stoma that supplies a

smaller area of mesophyll. The same reasoning can be applied to the

opening speed: if one stoma 'feeds' a large mesophyll area with CO_2,

drawdown of C_i during photosynthetic induction will likely be stronger

compared to a stoma that supplies a smaller area, and the signal for

fast stomatal opening may thus be stronger. An alternative

explanation for the positive correlation of A_0 and A_{max} with the

Voronoi area may be that a larger Voronoi area supplies the guard

cells with more solutes, water and space to open than a smaller

Voronoi area.

Conclusions

We showed here that *in vivo* microscopy of stomata in the leaf's

growth environment could be used to generate stomatal opening and

closure dynamics in dozens of neighboring individual stomata. Our

method, which uses green light for imaging and generates focus

projections of the entire leaf surface within the FOV, resolved the

kinetics of 78% of *Chrysanthemum* stomata, on average 21 stomata

min^{-1} during a shade-sun-shade transition. Pore area kinetics were

fitted with a model developed for stomatal conductance time courses

and show the substantial variation between individual stomata.

Correlation between the fitted parameters led us to discover that

pores with larger apertures in high light have a larger lag time in their

closing response, and thereby contribute disproportionately to a

lower WUE.

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Competing interests

625   None declared

Author contributions

627   Conceptualization T.B. and J. S., Hardware T.B. R.S. Software T.B.,

628   R.S., Growing facilities E.K., Experimentation T.B., Data Analyses T.B.,

629   Writing the first draft T.B., Critical review of the manuscript T.B., E.K.,

630   J.S., Funding J.S.

Data availability

632   All data is available upon request. For more information and

633   software updates: GitHub - Plantenna/Stomata-microscope: Non-

634   invasive microscopic imaging of individual stomatal kinetics in the

635   growth environment with high resolution

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Supporting Information

SM Fig 1. Example of stomatal aperture dynamics of a single stoma
and the model fit for opening (t=30-90) and closing (t=90-120). Raw
aperture data is in black and the model fit curve in red.

SM Fig. 2 Stomatal aperture dynamics of focus projection images
(automatic) and manually determined best single focus images
(manual) demonstrating their correlation.

SM Fig. 3 Example of how the position of the best focus for a stoma
can change in a stack during the shade-sun-shade experiment due to
the movement of the leaf surface (Fig. 5).

SM Movie 1 Example of a processed z-stack (100images) of a single
timepoint in the experiment. Stomata positions are indicated by red
ovals.

SM movie 2 Example of the processed time stack (video) of a full
experiment (119 focus projections of the z-stacks of each timepoint).
Stomata positions are indicated by red ovals.

SM video 3 Example of the processed time stack (video) of a full
experiment, zoomed in on a single stoma.

SM video 4 The same video of 3 after thresholding.

SM video 5 The same video as 3 and 4 after segmentation.

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