Split-HaloTag® Imaging Assay for Sophisticated Microscopy of Protein-Protein Interactions *in planta*

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Abstract

An ever-increasing number of protein complexes participating in metabolic pathways and of

multi-protein intracellular networks have been identified in plant cells. Split-GFP based

protein-protein interaction assays combine the advantages of *in vivo* interaction studies in a

native environment with additional visualisation of protein complex localisation. However,

fluorescence proteins entail several drawbacks for sophisticated microscopy: high

photobleaching rate during long-term observations, correlation of fluorescence intensity to

expression level or blinking behaviour. With the HaloTag® system these drawbacks can be

overcome asthis reporter is able to form covalent irreversible bonds with several synthetic

photostable fluorescence ligands,which can be used in variable concentrations for optimal

fluorescence intensity. Therefore, we established the new Split-HaloTag® imaging assay to

enable sophisticated fluorescence imaging of protein-protein interactions. This is

demonstrated using an well-characterised interaction as an example for protein-protein

interaction at cellular structures: the molybdenum cofactor biosynthesis complex anchoring

to filamentous actin. Additionally, a specific interaction was visualised with advanced

subdiffractional polarisation microscopy in a more distinctive manner as example for

sophisticated imaging. Therefore, this assay is a promising new tool for continuative 3D-

imaging, single molecule tracking and super-resolution microscopy of protein-protein

interactions in plant cells*.*

Keywords

advanced microscopy, cytoskeleton, photostable fluorescence dyes, Gateway cloning,

Molybdenum cofactor biosynthesis complex, polarisation microscopy, protein-protein

interaction, Split-HaloTag® imaging assay

Abbreviations

BiFC: bimolecular fluorescence complementation; diAcFAM: diacetyl derivative of fluorescein;

FP: fluorescence protein; SPoD: Super-resolution by polarisation demodulation; TMR:

Tetramethylrhodamine

Introduction

Understanding the cellular biology of plants requires the characterisation of protein-protein interactions. An increasing number of protein networks and substrate channeling pathways have been identified (Zitnik *et al.*, 2019). The bimolecular fluorescence complementation (BiFC) , as one of many protein fragment complementation assays, is one of the most popular and frequently used methods for plants to study protein-protein interactions. It allows visualisation and localisation of protein interactions in living cells (Bhat *et al.*, 2006). Non-fluorescent reporter fragments are fused genetically to putative interaction partners and an interaction between the two allows formation of a bimolecular fluorescent complex (Kerppola, 2008). The advantage of using fluorescent proteins (FP) is a fluorescence signal without an invasive insertion of a chemical compound into the cell. However, some drawbacks of FPs can severely hamper microscopic analysis: a direct interlink between fluorescence intensity and fusion construct expression level, low quantum efficiency, blinking behaviour, a high photobleaching rate during long-term observations (Reck-Petersen *et al.*, 2006), photoswitching (Morisaki and McNally, 2014) as well as the tendency of FPs to form oligomers (Miyawaki *et al.*, 2003). These drawbacks are especially unfavourable when using sophisticated fluorescence imaging methods such as two-photon, single molecule, subdiffractional polarisation or super-resolution imaging. These methods typically require fluorescence dyes of high stability and brightness (Moerner and Kador, 1989; Orrit and Bernard, 1990; Bode *et al.*, 2008; Holleboom *et al.*, 2014; Liao *et al.*, 2010/2011; Godin *et al.*, 2014; Loison *et al.*, 2018; Camacho *et al.*, 2019).

However, self-labelling enzyme tags such as the HaloTag® have been shown to overcome these drawbacks of FPs and are suitable for such microscopy methods and super-resolution imaging (Grimm *et al.*, 2015; Lee *et al.*, 2010). The HaloTag® System (Promega, https://www.promega.de/) is based on the bacterial haloalkane dehalogenase DhaA (EC 3.8.1.5) from *Rhodococcus rhodochrous* (Liss *et al.*, 2015). The tag was modified to form covalent irreversible bonds with synthetic chloralkane ligands (Los *et al.*, 2008; England *et al.,* 2015). This covalent bond is formed rapidly under physiological environments and remains intact even under stringent conditions (Los and Wood, 2007). Numerous ligands are available for the HaloTag® including different fluorescent dyes with extended spectral range, photostability and membrane permeability such as the red fluorescent rhodamine derivative

TMR (tetramethylrhodamine), the green fluorescent Oregon Green or the yellow fluorescent

diacetyl derivative of fluorescein DiAcFAM. Furthermore, dyes can be varied in their dosages

to either label all or only a few molecules which is needed for single-molecule tracking

approaches. In addition, HaloTag® proteins keep their monomeric structure, so the tag will

not lead to oligomerisation of protein fusion partners (Banaz *et al.*, 2018). The usability of this

imaging system was shown successfully *in planta* (Lang *et al.,* 2006)

In 2012, Ishikawa and colleagues identified several split points within the HaloTag® protein

and demonstrated its reconstitution ability. These results gave rise to the idea of establishing

the Split-HaloTag® imaging assay *in planta.* This new approach is particularly useful for

characterising protein complex assembly at structural elements including cell membranes or

the cytoskeleton. The possibility of using these microscopy techniques will enable to study

local formation and dynamics of a given complex with improved details compared to BiFC and

conventional confocal laser scanning microscopy. Single-molecule tracking approaches with

limited fluorescent dye will enable the tracing of complex mobility at the cytoskeleton or

inside the membrane system. In this study, we used the previously described anchoring of the

molybdenum cofactor biosynthesis complex via molybdenum insertase Cnx1 to filamentous

actin (Kaufholdt *et al.*, 2017) for establishing of the new Split-HaloTag® imaging assay. In this

way, we demonstrate the advantages of this assay for imaging of *in vivo* protein-protein

interactions via advanced microscopy.

Material and Methods

Cloning of Split-HaloTag® Gateway destination vectors

The optimised HaloTag®-7 sequence (298 amino acids) from Promega

(https://www.promega.de/) was genetically split on position 155/156 aa into the N-terminal

fragment "NHalo" (aa 1-155) and the C-terminal fragment "CHalo" (aa 156-298) according to

the initial experiment of Ischikawa and colleagues (2012). In order to create Split-HaloTag®

GATEWAY® destination vectors, enabling C-terminal Split-HaloTag® reporter fusion, the binary

destination vectors pDest- *Cluc*-GW and pDest-GW-*Cluc* were used (Gehl *et al.,* 2011). PCR-

Primers were designed to fuse specific restriction enzyme recognition sequences at both

reporter fragments (Table S1). After amplification, *Cluc* fragments were exchanged by

restriction and ligation for *Nhalo* or *Chalo* residues using the restriction sites *Xba*I and *Spe*I (N-

terminal) and *Xho*I/*Sac*I (C-terminal), respectively (restriction enzymes purchased by Thermo

Fischer Scientific (https://www.thermofisher.com)), to create pDest-*Nhalo*-GW, pDest-*GW-*

Nhalo, pDest-*Chalo*-GW and pDest-*GW-Chalo* (Table S2).

Expression vectors

Coding sequences of Cnx6 (AT2G43760), Cnx7 (AT4G10100) and Map65 (amino acids 340–

587; AT5G55230) were fused to Split-HaloTag® fragments via a two-step fusion PCR with

Phusion-Polymerase purchased from Thermo Fischer Scientific

(https://www.thermofisher.com). For the first PCR, each single cDNA and reporter fragment

was created with an overlapping sequence to each, which enable assembly of fusion

constructs (used primers listed in Table S1). For the second step, the products of the first PCR

were assembled due to the overlapping matching sequences and then amplified a one single

fragment. This *att*B-site flanked constructs were subcloned via BP-reaction into the Donor

vector pDONR/Zeo to create entry vectors. Recombining these into pK7WG2 (Karimi *et al*.,

2002) using LR-reactions generated the expression vectors pExp-*Nhalo-cnx7*, pExp-*Chalo- cnx6*

and pExp-*Chalo-map65.*

All BiFC expression vectors and entry vectors with coding sequences of Cnx1 (AT5G20990)*,* LA

(Lifeact; amino acids 1–17 of the *Saccharomyces cerevisiae* protein ABP140), ABD2

(aminoacids 325–687; AT4G26700), CKL6 (amino acids 302–479; AT4G28540) and NLuc were

available and are described by Kaufholdt *et al*. (2016a). The entry vectors were used to clone

Split-HaloTag® expression vectors via LR-reactions into pDest-*GW-Nhalo* and pDest-*GW-Chalo*

to create pExp-*cnx1-Nhalo,* pExp-*la-Nhalo,* pExp-*ckl6-Nhalo,* pExp-*la-Chalo,* pExp-*abd2-Chalo*

and pExp-*Nluc-Chalo.*

Plant transformation

N. benthamiana wild type plants were cultivated in soil under greenhouse conditions. They

were used for *Agrobacterium*-mediated transient transformation of fusion constructs 7 to 12

weeks after germination as described by Gehl and colleagues (2011). *Agrobacterium* strain

C58C1/pMP90 carrying binary expression vectors were freshly grown (48 h at 28 °C) on solid

CPY media (0.1% (w/v) yeast extract, 0.5% (w/v) casein peptone, 0.5% (w/v) sucrose, 2 mg/L

MgSO$_4$ x 7H$_2$O (pH 7); 1.5% w/v agar) containing rifampicin (50 mg/L) and gentamycin

(50 mg/L) as well as kanamycin (50 mg/L). Helper strain p19 (Voinnet *et al.*,2003) was grown

on CPY medium containing rifampicin (50 mg/L) and kanamycin (50 mg/L). After growing for

20 h in 9 mL of liquid CPY at 200 rpm at 28 °C, cells transferred into fresh activation medium

(10 mM MES/KOH (pH 5.6), 10 mM $MgCl_2$,150 µM acetosyringone). Before infiltration of the

bacteria into the leaves, each strain was diluted in activation media to an optical density of

OD_{600} = 0.9 (final OD_{600} = 0.3). Then, three strains were mixed for each transformation: (i) One

strain containing a NHalo construct, (ii) one strain containing a CHalo-construct and (iii) the

helper strain p19. After incubation for 2 h at 50 rpm (28 °C), mixed *Agrobacterium* suspension

were infiltrated into abaxial site of young but fully expanded leaves. Plants were incubated for

3-5 days in the green house.

Staining of *N. benthamiana* leaves discs with HaloTag® ligands

Staining protocol was based on the work of Lang and colleagues (2006). Leaf discs of (6-

10 mm) of *N. benthamiana* leaves were transferred into a 20 mL syringe with screw lid and

infiltrated with 2-4 mL ligand solution (0.5, 1.0 or 2.0 µM TMR, DiAcFAM and Oregon Green in

10 mM MES/KOH (pH 5.6) and 10 mM $MgCl_2$). All dyes were purchased from Promega

(https://www.promega.de/). Syringes with leaf discs were wrapped in aluminium foil and

incubated for 0.5, 15, 30 or 60 min either on the work bench, on a tumbling shaker or on a

rotary tube mixer. After staining, the samples were washed with 10 mL washing solution by

closing the screw lid and moving the plunger up and down for 10 times. Washing steps were

repeated with fresh washing solution 6-12 times. Furthermore, one duration before the last

washing step of 0, 3 or 12 hours in washing solution was performed.

Confocal laser scanning microscopy

The confocal Laser Scanning Microscope LSM 510Meta from Zeiss (Göttingen, Germany) was

used. The cLSM-510META scanhead was connected to the Axiovert 200M. All images were

examined using either the Plan-Neofluar 10x/0.3 or the C-Apochromat 40x/1.2 water-

immersion objective. For excitation, both an argon laser (488 nm for BiFC, Oregon Green and

DiACFAM as well as chlorophyll fluorescence) and a Helium-Neon Laser (543 nm line for TMR)

was used. The emitted light passed the primary beam-splitting mirror UV/488/543/633 and

was separated by a secondary beam splitter at 545 nm. Fluorescence was detected with filter

sets as follows: BP 505-530 nm for BiFC (Em_{max}: 515 nm), Oregon Green (Em_{max}: 520 nm) and

DiAcFAM (Em_{max}: 521 nm); BP 560-615 for TMR (Em_{max}: 578 nm); LP 650 nm for chlorophyll

fluorescence. Bright field images were taken with the transmitted light photomultiplier. All

images were taken using ZEISS Microscope Software ZEN 2009 and processed with ZEN lite

and Fiji (Schindelin *et al.*, 2012). The shown images depict represented cells of several

analysed leaves from at least three independent transformations.

Super-resolution by polarisation demodulation microscopy

Principles of the experimental set-up are described by Hafi and colleagues (2014) and

modifications enabling the analysis of the dye´s 3D-orientations were described by Albrecht

et al. (2020). The cover slip was fixed to the microscope slide with nail polish. Linearly polarised

light deriving from a 488 nm continuous wave (CW) laser (sapphire 488-50, Coherent) was

used for excitation of Oregon Green molecules. The beam was expanded through a telescope

system. The polarisation was modulated at 15 frames per modulation period by rotation of a

λ/2-waveplate. The rotation was achieved through a chopper wheel (Optical Chopper

Systems, Thorlabs) which was synchronised to an electron-multiplying charge-coupled device

(EMCCD) camera (iXonEM+897 back illuminated, Andor Technology). Through the rotation of

2 wedge prisms lateral shift of the beam was caused that enabled measurements of the

fluorophores being excited from a different direction. Then, the beam was focused onto the

back aperture of the microscope objective (UPlanSApo, 60×, NA = 1.35 oil immersion,

Olympus), which was integrated in an inverted microscope body (IX 71, Olympus). Emitted

light was then passed through a dichroic mirror (beam splitter z 488 RDC, AHF) and an emission

filter (ET band pass 525/50, AHF). To further magnify the image and focus it the EMCCD

camera an additional lenses system was used. During the measurement 2,000 frames at

approximately 32 ms per frame were recorded. The first 200 frames were neglected for

calibration purposes. The raw fluorescence intensity of all modulation periods of the last 1,800

frames of a measurement was used for analyses. Images were "deblurred" by using

deconvolution algorithms. The "blurring" function or point-spread function (PSF) was

approximated by using the PSF-Generator Plugin for ImageJ

(http://bigwww.epfl.ch/algorithms/psfgenerator/). Using the PSF, the modulating

fluorescence intensities were deblurred using an iterative least-squares deconvolution while

accounting for the polarisation modulation. The least-squares functional was minimised by

using the FISTA Algorithm (Beck and Teboulle, 2009).

Results and Discussion

The Split-HaloTag® constructs created in this study are based on the enhanced HaloTag®-7 sequence (298 amino acids), which has been optimised and improved with regard to solubility, stability, binding kinetics and access to an optional TEV-cleavage site (Ohana *et al.*, 2009). It was split on position 155/156 aa into the N-terminal fragment "NHalo" (aa 1-155) and the C-terminal fragment "CHalo" according to the initial experiment of Ischikawa and colleagues (2012). The two amino acids important for covalent ligand binding are located on each of the two separate Split-HaloTag® fragments. The stable bond between HaloTag® protein and ligand is formed by the catalytic amino acid Asp^{106} as part of the "NHalo" fragment. In the mutated HaloTag® protein the substituted Asn^{272} (HaloTag®-7) as part of "CHalo" traps the reaction intermediate as a stable covalent adduct. Therefore, independent expression of "NHalo" or "CHalo" fragments will not enable ligand binding without each other (Fig. 1A/B), which is a fundamental aspect when using Split-HaloTag® imaging for investigation of protein-protein interactions. The cDNAs of the interaction partners were fused N- or C-terminally to the NHalo and CHalo fragments via fusion PCR and gateway cloning (see Materials and Methods). For high flexibility, Split-HaloTag® GATEWAY compatible destination vectors were generated which enabled a fast and easy cloning of expression vectors with coding sequences of different proteins of interest.

Reconstitution of Split-HaloTag® *in planta*

The complex formation of the heterotetrameric molybdopterin synthase (MPT) subunits Cnx6 and Cnx7 from *Arabidopsis thaliana* was used to demonstrate the capability of reconstitution of the Split-HaloTag® *in planta*. This protein pair was chosen as positive control due to their verified high binding strength (Kaufholdt *et al.*, 2013). The two interacting proteins (Fig. 1C) will bring the two HaloTag® reporter fragments in close spatial proximity and, thereby, guide the reconstitution of functional HaloTag® proteins.

After transformation of *Nicotiana benthamiana* epidermis cells and staining with the fluorescent ligand TMR, specific cytoplasmic fluorescence was observed as a thin layer at the cell periphery (Fig. 1D). Wild type leaves were stained similarly, and lacking fluorescence signals indicated the washing steps being sufficient to remove unbound ligands (Fig. 1E). Therefore, since the MPT synthase complex is localised in the cytoplasm, HaloTag® fragments

CHalo and NHalo were capable of reconstitution reconstitution guided by the strong
interaction of Cnx6 and Cnx7. After proving the general reconstitution, this new assay was
tested in a second approach including proteins attached to cytoskeleton structures such as
filamentous (F-) actin as well as microtubules. By applying this approach, it was possible to
test whether the Split-HaloTag® system allows for investigating the assembly of different
proteins at cytoskeletal elements. Both structures were not labelled directly to NHalo or CHalo
termini, but via binding proteins, as a fusion of larger reporter fragments directly to globular
actin or tubulin proteins might disturb their polymerisation processes. For F-actin labelling,
the binding domain of fimbrin from *A. thaliana* (ABD2; Sheahan *et al.*, 2004) as well as of
Abp140 from *Saccharomyces cerevisiae* (Lifeact/LA; Riedl *et al.*, 2008) were used.
Furthermore, microtubule binding domains of the two proteins Casein-Kinase-1-Like-6 (CKL6;
Ben-Nissan *et al.*, 2008) and the Microtubule Associated Protein 65 (Map65; Hamada, 2007)
from *A. thaliana* were investigated. The cytoskeleton binding proteins show no direct protein
interactions to each other. However, their affinity and subsequent binding and anchoring to
the cytoskeletal structures results in such spatial proximity that it is able to act as model for a
direct interaction of a cytoskeleton associated protein complex (Kaufholdt *et al.*, 2016a).

Expression of F-actin binding protein constructs followed by HaloTag® reconstitution and
staining resulted in a TMR specific fluorescence visible as transversely arranged filaments with
branches distributed throughout the cytoplasm (Fig. 1F). The approach with CLK6-NHalo and
CHalo-Map65 to label microtubules upon Split-HaloTag® reconstitution displayed filamentous
structures more equally distributed throughout the cell with less cross bridges compared to
actin filaments (Fig. 1G). These structures are typical for F-actin and microtubules,
respectively, which were observed in BiFC experiments before. In all interaction approaches
both actin filaments as well as microtubules, could successfully be visualised upon interaction
of cytoskeletal binding proteins. It has to be noted that staining and washing procedure can
cause severe stress and damage to the cells. In addition to the orange fluorescent ligand TMR
(Em_{max} 578 nm), the ligands Oregon Green (Em_{max} 520 nm) as well as DiAcFAM (Em_{max}
526 nm) were tested as all three dyes are cell-permeant and suitable for intracellular labelling
(Promega). As expected, also Oregon Green and DiAcFAM (data not shown) were able to bind
reconstituted HaloTag®. This demonstrates a general binding capability of the reconstituted
HaloTag® exemplary for a plurality of other available dyes depending on the individual setting.

Fig. 1: Testing Split-HaloTag® complementation upon protein interactions of MPT synthase complex as well as at cytoskeleton binding proteins.

Shown are images of *N. benthamiana* epidermis cells via confocal microscopy detecting TMR. Staining of leaf discs was performed 4-5 days after transformation. All images were taken with a C-Apochromat 40x/1.2 water immersion objective. Scale bars depict a length of 20 µm each. **(A/B)** Negative controls of single transformed Split-HaloTag® reporter constructs fused to ABD2. **(C)** Schematic illustration of Split-HaloTag® reconstitution guided by the MPT synthase subunits Cnx6 and Cnx7 **(D)** Cytosolic TMR fluorescence after transformation with NHalo-Cnx7 and Cnx6-CHalo. **(E)** Negative control of a wildtype (WT) leaf after staining. **(F)** TMR fluorescence at actin after transformation of actin binding constructs LA-NHalo and ABD2-CHalo. **(G)** TMR fluorescence at microtubules filaments after transformation of microtubules binding constructs CKL6-NHalo and CHalo-Map65.

Insights into the Staining Protocol

It has been described by Lang and colleagues (2006), who first introduced the HaloTag® system to plant cells, that especially destaining procedures are of great importance to reduce unspecific background fluorescence. For interaction studies, comparison of fluorescence intensity and fluorescence pattern is the main task, where each form of background will falsify the result. However, after using the published destaining protocol an excess of unbound dye remained in the tissue. Therefore, optimised staining and destaining procedures had to be

established. To improve staining protocols and to evaluate the best HaloTag® ligand several
different factors were investigated: (i) the size of analysed leaf discs (6; 8; 10 & 12 cm in
diameter), (ii) concentration of ligands (0.5, 1 & 2 μM), (iii) ligand incubation time (1 min up
to 1 h), (iv) number of subsequent washing steps (6 up to 12),, (v) incubation time in washing
solution (3 h up to 12 h) and (vi) aeration of leaf discs in washing solution.

During this optimisation process, several general observations were made. After TMR staining,
fluorescence was always detected in vascular tissue of transformed as well as wild type leaves
suggesting a nonspecific adhesion between TMR and molecules in leaf veins (Fig. 2A).
Furthermore, staining with more than 0.5 μM TMR combined with an insufficient number of
washing steps resulted in oversaturation and accumulation of unbound dye in the cytoplasm
of parenchyma cells (Fig. 2B). This amount of unbound TMR accumulation increased when
using larger or damaged leaf discs or older plants. Moreover, recycling of frozen TMR solution
led to unspecific aggregations inside the cells.

DiAcFAM staining gained an overall weaker fluorescence signal compared to TMR but no
staining of vascular tissue was observed (not shown). However, weak DiAcFAM signals (Em_{max}
521 nm) could easily be mistaken for typical plant background fluorescence at approx.
530 nm. Furthermore, accumulation of unbound ligands occurred especially in stomata after
DiAcFAM (Fig. 2C) but also after Oregon Green (Fig. 2D) staining. In addition, Oregon Green
resulted in accumulation inside vacuoles of parenchyma cells if incubated more than a few
seconds in staining solution (Fig. 2E).

After testing of the different staining parametersoptimal results for TMR staining were
obtained using leaf discs of a diameter of 6-8 mm, a final TMR concentration of 0.5 μM in 2 mL
fresh staining solution, 15 min incubation time and followed by eight subsequent washing
steps into a 20 mL syringe and an overnight incubation in washing solution. Samples were
incubated with 10 mL washing solution by closing the screw lid and moving the plunger up
and down for approx. 10 times. Immediately before microscope analysis two more washing
steps were performed. Both, overnight incubations either on a tumbling shaker or on a rotary
tube mixer were equally sufficient for all dyes, as long as there was sufficient air in the syringe
to allow leaf disc aeration.

Oregon Green showed optimal results if a 0.5 µM staining solution was exchanged with 2 mL

washing solution immediately after its infiltration and incubated for 15 minutes. Then, the

washing procedure was applied as described for TMR. This could reduce but not completely

avoid Oregon Green accumulation.

Overall, all exemplary tested dyes are suitable for intracellular labelling of HaloTag® proteins

in plant tissue, which leads to the assumption that other HaloTag® ligands will be suitable for

other experimental settings as well. From all three tested dyes, TMR was the brightest,

showing the least drawbacks. However, even after prolonged overnight incubation in

repeatedly refreshed washing solution TMR was still bound to vascular tissue. Therefore, leaf

area further away from vascular tissue should be used for analysis. In this study, both TMR

and Oregon Green showed ideal properties for confocal laser scanning microscopy despite

Oregon Green accumulations. Due to a different experimental set-up only Oregon Green was

used in SPoD microscopy. TMR showed the best applicability for usage within a Split-HaloTag®

complementation assay for staining *N. benthamiana* leaf discs.

Fig. 2: Evaluation of HaloTag® fluorescent Ligands TMR, DiAcFAM and Oregon Green.

Confocal microscopy of *N. benthamiana* leaf discs stained with TMR **(A/B)**, DiAcFAM **(C)** or Oregon

Green **(D/E)**. Images were taken either with a Plan-Neofluar 10x/0.3 **(A)** or with a C-Apochromat

40x/1.2 water immersion objective **(B-E)**. Scale bars depict a length of 100 µm **(A)** or 20 µm **(B-E)**. **(A)**

Unspecific TMR binding in vascular tissue. **(B)** Oversaturation of unbound TMR in parenchyma cells

after using 2 µM dye. **(C/D)** Accumulation of unbound ligands in stomata after DiAcFAM **(C)** and Oregon

Green **(D)** staining. **(E)** Accumulation of unbound Oregon Green in parenchyma cells.

Validation of Split-HaloTag® imaging upon protein-protein interaction at actin filaments

After proving the general capability of Split-HaloTag® fragment reconstitution, we aimed at

validating this new assay via an binding assay of the molybdenum insertase Cnx1 to F-actin as

a well-characterised example for an protein-protein interaction study at cell structures

(Kaufholdt *et al*. 2016a).. This established setting via cytoskeleton binding proteins for

interaction studies *in vivo* was used to investigate whether the Split-HaloTag® system

demonstrate the F-actin binding of Cnx1 in the same manner it was shown by BiFC

experiments before. Therefore, *in vivo* protein-protein interaction studies require adequate

negative controls as discussed by Kaufholdt *et al*. (2016a) in detail. As negative control protein,

the cytosolic protein NLuc (N-terminus of the luciferase from *Photinus pyralis*) was provided,

which had no interaction with the analysed proteins of interest (Gehl *et al*., 2011).

In the interaction approach, reporter fusion constructs of Cnx1 and the actin binding protein

LA, respectively, were co-expressed in *N. benthamiana*. For comparison, the BiFC approach

described by Kaufholdt et al. (2016a) was included, for which the reporter halves VYNE (N-

terminus of Venus) and SCYCE (C-terminus of SCFP) were used (Gehl *et al*., 2009). Both BiFC

and Split-HaloTag® complementation assay show almost identical results (Fig. 3 A/B). Both

TMR and GFP fluorescence were detected in a filamentous pattern concentrated at the actin

nucleus basket and thinned out at F-actin towards the cellular cortex. A typical pattern for

studying an actin interacting protein complex was observed in both approaches that is

reminiscent of a "starry sky" (Kaufholdt *et al*., 2016a) caused by F-actin anchoring of the

interacting proteins in close proximity to its synthesis by the two actin binding domains of LA

and Cxn1. When LA-NHalo was co-expressed with NLuc-CHalo in the negative control, TMR

specific fluorescence at actin filaments was detected, too. A background fluorescence was

expected caused by reconstitution by chance in the small cytosolic space, which is typical for

split-protein assays in plant cells (Gehl *et al*., 2009/2011). A negative control without any

fluorescence would be an unrealistic event in plants, which should be verified by an additional

abundance control (Kaufholdt *et al*., 2016b). Relating to the background, Split-HaloTag® has

the same performance as all known protein-protein interacting studies, however, in the

interaction approach stronger fluorescence or different pattern will demonstrate an

interaction. The TMR fluorescence was equally distributed within the cell of the negative

control and no starry sky could be observed (Fig. 3C). Consequently, identical results of both

BiFC and Split-HaloTag® were observed showing the characteristic "starry sky" like pattern

demonstrating its interaction with F-actin as it was discussed before by Kaufholdt *et al*.

(2016a) This proves exemplary the applicability of the Split-HaloTag® system on the basis of a

protein binding to the cytoskeleton.

Fig. 3: Split-HaloTag® Protein-Protein Interaction Studies of Cnx1 and Actin Filaments via Lifeact.
Shown are images of *N. benthamiana* epidermis cells via confocal microscopy of TMR or GFP. Staining of leaf discs was performed 4-5 days after transformation. All images were taken with a Plan-Neofluar 10x/0.3 **(A1/B1/C1)** or with a C-Apochromat 40x/1.2 water immersion objective **(A2/B2/C2).** Scale bars depict a length of 100 µm **(A1/B1/C1)** or 20 µm **(A2/B2/C2). (A)** Split-HaloTag® approach with Cnx1-NHalo and LA-CHalo. **(B)** BiFC approach with Cnx1-VYNE and LA-SCYCE. **(C)** Corresponding Split-HaloTag® negative control where Cnx1 was replaced by the independent protein NLuc. **(A)** and **(B)** were imaged with identical setting for optimal comparison of strength and pattern.

Application examples of Split-HaloTag® for sophisticated **imaging.**

The Split-HaloTag® imaging assay has been proven as a feasible method for imaging of protein interactions. However, conventional light and fluorescence microscopy are diffraction-limited to a resolution limit of approx. 200 nm in the lateral (x-y) and about 600 nm in the axial (z) direction (Cremer and Masters, 2013). Many subcellular structures are smaller which hampers their detailed observation (Huang *et al.*, 2009). To circumvent these restrictions, advanced

fluorescence imaging methods such as single molecule detection, subdiffractional polarisation

imaging or super-resolution microscopy (SRM) techniques have been developed to improve

the resolution and to allow studying molecular processes more detailed (Moerner and Kador

1989; Orrit and Bernard, 1990; Bode *et al*., 2008; Holleboom *et al*., 2014; Liao *et al*.,

2010/2011; Godin *et al*., 2014; Loison *et al*., 2018; Camacho *et al*., 2019). However, stable

fluorescence dyes emitting light at various wavelength are needed for such advanced imaging

techniques, which is hard to realise by standard fluorescence proteins (Banaz *et al*., 2018). The

Split-HaloTag® system has the advantage of using such stable dyes flexible on a fusion protein

complex. . Liss *et al*. (2015) for example used HaloTag® and a TMR ligand successfully in animal

cell cultures for correlative light and electron microscopy (CLEM) of protein dynamics with

ultrastructure details. Reck-Peterson and colleagues (2006) used the HaloTag® to label dynein

in sea urchin axonemes and tracked single molecules with a precision of a few nanometres to

reveal dynein´s stepping behaviour at microtubules. Small organic fluorophores can be used

in variable dosages to label only a few molecules and are available with different spectral

behavior. Moreover, several organic fluorophores especially for live-cell labelling and

subsequent imaging were recently developed with photoactivatable properties (Lee *et al.,*

2010) as well as with improved quantum efficiency and superior brightness while retaining

excellent cell permeability (Grimm *et al*., 2015).

As a first approach, interaction of Cnx1 and the actin binding protein ABD2 were performed

to show the resolution potential of stable TMR fluorescence for confocal laser scanning

microscopy. For this purpose, each layer of a cell has to be scanned in very thin optical slices

(µm range or less). Such a detailed imaging can take several minutes, which leads to high

damages through photo bleaching at standard fluorescence proteins. However, the stable

TMR fluorescence of a Split-HaloTag® enabled more defined results of cell images (Fig. 4A)

compared to BiFC approaches (Fig. 4B), which is demonstrated by the very thin filaments of

the actin network hardly detectable by BiFC.

Super-resolution by polarisation demodulation (SPoD) microscopy was used as second

example for demonstrating the performance of the Split-HaloTag® system. This advanced

fluorescence imaging technique is a subdiffractional polarisation imaging method that allows

measurement of the average orientation of fluorescent dyes attached to different structures

and was first described by Hafi and colleagues (2014). Fluorescent molecules are illuminated

via linearly polarised light. This causes the fluorophores to be excited at different times, which

results in a modulated fluorescence intensity from the fluorophores. Depending on the

orientation of the illuminated fluorophores (or more specifically the orientation of their

transition dipole moments), the observed fluorescence intensity will be phase-shifted, and

differently oriented fluorophores will emit periodic signals peaking at different points in time.

Therefore, the analyses via deconvolution algorithms allow a high resolution imaging of cell

structures (for details see Albrecht *et al*., 2020). . During each measurement, 2,000 frames

were recorded, which in itself is not problematic when using stable dyes. Split-HaloTag®

constructs with the two microtubule binding domains of CLK6 and Map65 were used for this

purpose. Overexpression of MAP65 isotypes is known to result in microtubule bundling (Mao

et al. 2006). After transformation and expression, leaf discs were stained with Oregon Green,

which wavelength was more appropriate for SPoD microscopy. The observed fluorescence

resulted in individual microtubules (Fig. 4B1). Albeit high amounts of background fluorescence

and out-of-focus signal complicated the recording and modulation analysis, subdiffractional

separation in a branching region of distinct fibres was observed in the deconvolved image (Fig.

4B2) and was supported by different phases as visualised by a simple red/green colour code.

These different phases in the branching region of the two fibres were already observable in

the raw modulation data. Certainly, future work is needed to enhance separation by different

phases in addition to pure image deconvolution for entire cell images. Nevertheless, Split-

HaloTag® imaging assay can be used for such advanced fluorescence imaging techniques,

which failed in case of BiFC.

Fig. 4: Analysis of Split-HaloTag® images via confocal microscopy and super-resolution SPoD microscopy.

Shown are representative *N. benthamiana* cells three days after transformation. **(A)** Interaction studies at actin filaments with Cnx1 and ABD2 via Split-HaloTag® **(A1)** or BiFC **(A2)**. Split-HaloTag® Staining was performed with TMR. Images were taken with a C-Apochromat 40x/1.2 water immersion objective. Scale bars depict a length of 20 μm. **(B)** SPoD microscopy of microtubules stained with Oregon Green after transformation of the Split-HaloTag® microtubules binding constructs CKL6-NHalo and CHalo-Map65. **(B1)** Diffraction limited image depicting averaged raw fluorescence intensity. **(B2)** Phase colour coded fluorescence intensity image after 1000 iterations of the deconvolution algorithm. The red/green colourcode support subdiffractional separation of the fibres at a distinct branching fork (arrow) that is not visible in the conventional diffraction of wide field image. However, future work is needed to enhance separation by different phases in addition to pure image deconvolution for entire cell images. The raw data scale bars depict 2 μm each.

Conclusion

In this study, the Split-HaloTag® imaging assay was established for the first time *in planta*. Vectors were cloned and reporter termini NHalo and CHalo were tested for reconstitution in both fusion orientations to the protein of interest and in all four orientation combinations to each other. The applicability of the system for interaction studies was demonstrated using previously published protein interactions forming the Molybdenum cofactor biosynthesis complex including its anchoring to F-actin. An additional infiltration of a fluorescent ligand into the cell with subsequent washing was a disadvantage compared to BiFC. A reconstitution background by change was observed in all split-protein assays. However, the benefit of the Split-HaloTag® system lies in the ability to visualise specific protein interactions in advanced imaging techniques. Therefore, this system can be used in future for sophisticated imaging techniquessuch as 3D-microscopy, polarisation-microscopy, single-molecule tracking or super-resolution imaging methods that require brighter and more stable fluorescence markers. Localisation of protein complexes can be observed with the split-HaloTag® imaging assay in a distinct manner. In live-cell microscopy, the method combines *in vivo* split-reporter analyses with the previous shown advantages of the HaloTag® like a large set of differently coloured fluorescent ligands, their photostability compared to fluorescence proteins and the ability to vary labelling intensity via dosage of dyes independent from protein expression.

471 Therefore, this assay is a new tool for sophisticated imaging of protein-protein interactions in
472 plant cells.

Supplemental information

474 Supplemental data are available online.

475 Table S1: Primers for Cloning and sequencing of Split-HaloTag® related constructs and vectors.

476 Table S2: Split-HaloTag® Destination and Expression vectors used within this work.

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Author Contribution

RMM, HB, PJW, RRM, RH and DK planned and designed the project. RMM, JNW, MB, CT, SF,
JS and DK cloned the vectors, performed plant transformation and the cLSM experiments. AA
and RM handled SPoD microscopy. All authors analysed and discussed the results. RMM, JNW,
RH and DK were primarily involved in drafting the manuscript and RMM and DK produced
figures and tables. JS, HR, PJW and RRM critically read the manuscript and improved the text,
all authors finalised it. RH and DK coordinated the work.

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