SHORT COMMUNICATION

Proliferation characteristics of cells cultured under periodic versus static conditions

Daniel F. Gilbert · Sepideh Abolpour Mofrad · Oliver Friedrich · Joachim Wiest

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Abstract In vitro culture models have become an indispensable tool for assessing a vast variety of biological questions in many scientific fields. However, common in vitro cultures are maintained under static conditions, which do not reflect the in vivo situation and create a non-physiological environment. To assess whether the growth characteristics of cells cultured at pulsed-perfused versus static conditions differ, we observed the growth of differentially cultured cells in vitro by life-cell time-lapse imaging of recombinant HEK293YFPI152L cells, stably expressing yellow fluorescent protein. Cells were grown for \sim 30 h at 37 °C and ambient CO₂ concentration in biochips mounted into a custom-designed 3D printed carrier and were imaged at a rate of ten images per hour using a fluorescence microscope with environment control infrastructure. Cells in one chip were

Daniel F. Gilbert and Sepideh Abolpour Mofrad have contributed equally to this work.

D. F. Gilbert (⊠) · S. A. Mofrad · O. Friedrich Institute of Medical Biotechnology, Friedrich-Alexander-Universität Erlangen-Nürnberg, Erlangen, Germany e-mail: daniel.gilbert@fau.de

D. F. Gilbert · S. A. Mofrad · O. Friedrich Erlangen Graduate School in Advanced Optical Technologies (SAOT), Friedrich-Alexander-Universität Erlangen-Nürnberg, Erlangen, Germany

J. Wiest Cellasys GmbH, Kronburg, Germany maintained under static conditions whereas cells in another chip were recurrently perfused with fresh media. Generated image series were quantitatively analyzed using a custom-modified cell detection software. Imaging data averaged from four biological replicates per culturing condition demonstrate that cells cultured under conventional conditions exhibit an exponential growth rate. In contrast, cells cultured in periodic mode exhibited a non-exponential growth rate. Our data clearly indicate differential growth characteristics of cells cultured under periodic versus static conditions highlighting the impact of the culture conditions on the physiology of cells in vitro.

Keywords Cell growth \cdot Biochip \cdot Microfluidics \cdot HEK293 - YFPI152L - Long-term time-lapse microscopy

Introduction

Common in vitro culture models in cell biology

In vitro culture models have become an indispensable tool for assessing a vast variety of biological questions in a broad spectrum of scientific fields. Common in vitro experiments applied for example in drug screening or chemical susceptibility testing, are based on the assessment of the function of cells, either grown in suspension, in a monolayer, or in three-dimensional configuration, e.g. in spheroids or in multi-cellconfiguration such as organ-on-chip approaches (Alexander et al. [2018](#page-7-0); Bhise et al. [2014](#page-7-0); Cho and Yoon [2017;](#page-7-0) Gu et al. [2004](#page-8-0); Walzik et al. [2015](#page-8-0); Wiest et al. [2005,](#page-9-0) [2006\)](#page-9-0). These cultures are typically being established by seeding cells in culture medium at defined density and volume into culture ware, such as flasks, dishes, multi-well plates or lab-on-a-chip devices, followed by incubation for several hours, days or even weeks according to the principles on 'Good Cell Culture Practice' (GCCP) (Pamies et al. [2017;](#page-8-0) Hartung et al. [2001](#page-8-0)). Typical in vitro culture models employed for the aforementioned applications include e.g. HEK293 (human embryonic kidney 293) cells. The cells are reported to represent an important manufacturing platform in bioengineering as this culture model allows production of recombinant proteins in large scale and at high efficiency (Hu et al. [2018](#page-8-0)).

Assay types for assessment of cellular growth characteristics

Cellular growth during the incubation period is typically measured by assessing the cell number using either label-free or label-based readout technologies in continuous mode (time-lapse evaluation) or by quantification of the cell number at experiment initiation and at the end of the incubation period (endpoint observation). Label-free technologies, such as optical or electrochemical methods measure the cell number by assessment of e.g. the cellular contrast in transmission light images, extrusion of H_3O^+ , cellular consumption of dissolved oxygen, electrophysiological activity or changes in the dielectricity of cells (Fang [2007](#page-7-0); Liu et al. [2014;](#page-8-0) Walzik et al. [2015;](#page-8-0) Weiss et al. [2013;](#page-9-0) Wiest et al. [2005\)](#page-9-0). Label-based approaches analyse the cell number based on luminescence or fluorescence markers reflecting, e.g. intracellular ATP content (e.g. CellTiterGlo[®] Assay Kit), nuclear DNA content (e.g. Hoechst 33342 stain), activity of nonspecific intracellular esterases (e.g. Calcein-AM) or the integrity and function of the cell membrane and membrane proteins such as ion channels (e.g. YFPI152L) (Kuenzel et al. [2016,](#page-8-0) [2017](#page-8-0); Menzner et al. [2015](#page-8-0); Gilbert and Boutros [2016;](#page-7-0) Gilbert et al. [2011\)](#page-8-0). A generic approach for label-based evaluation of cellular growth in continuous mode uses fluorescent proteins such as variants of green fluorescent protein

(GFP) for labeling. Fluorescent proteins are superior to label-based monitoring of cellular growth compared to e.g. loadable fluorescence indicators or luminescent markers, as these proteins are 1. typically fairly stable with respect to bleaching, 2. non-toxic, 3. cheap, i.e. resource effective, and 4. are not diluted by cell division, thus maintaining strong fluorescence intensity across several generations of cells. YFPI152L, a genetically engineered variant of yellow fluorescent protein (YFP), fulfills the requirements for fluorescence-based long-term life-cell analysis and has been successfully applied for a variety of biological questions including assessment of cellular growth in time-lapse experiments (Balansa et al. [2010,](#page-7-0) [2013a,](#page-7-0) [b;](#page-7-0) Chung et al. [2010;](#page-7-0) Gebhardt et al. [2010;](#page-7-0) Gilbert et al. [2009a](#page-7-0), [b](#page-7-0), [d;](#page-7-0) Kruger et al. [2005](#page-8-0); Talwar et al. [2013;](#page-8-0) Walzik et al. [2015\)](#page-8-0). Using this assaying method, the growth or proliferation rate of cells is typically quantified by analyzing either the number of single cells or the confluence, i.e. the percentage of the overall area covered by cells, in images obtained from automated fluorescence microscopy using high-content fluorescence imaging infrastructure (Gilbert et al. [2009c](#page-7-0); Schneidereit et al. [2017;](#page-8-0) Spitzer et al. [2016\)](#page-8-0).

Static versus periodic growth conditions

While many aspects of experimental conditions such as cell culture media composition, cell culture ware, composition of gaseous phase, mechanical stimulation and shear stress have been investigated in detail, the difference of static culture conditions versus periodic exchange of cell culture medium has only raised marginal interest (Yao and Asayama [2017;](#page-9-0) McGillicuddy et al. [2018](#page-8-0); van der Valk et al. [2018;](#page-8-0) van Midwoud et al. [2012](#page-8-0); Abolpour Mofrad et al. [2016](#page-7-0); Huh et al. [2010](#page-8-0); Inamdar and Borenstein [2011](#page-8-0); Khademhosseini and Langer [2016](#page-8-0); Liu et al. [2006,](#page-8-0) [2014;](#page-8-0) Pfister et al. [2015;](#page-8-0) Demmel et al. [2015](#page-7-0); Mahto et al. [2010](#page-8-0)). Static culture types are probably the most frequently employed in vitro model, but the culturing conditions obviously may create a nonphysiological environment. Due to the fact, that the medium remains unchanged throughout several days, the cells presumably suffer from decreasing availability of nutrients, build-up of cellular metabolites, and accumulation of indicators of cell stress as well as altered physiology and viability, compared to cells cultured under in vivo-like conditions that mimic the native environment of tissue. It is well known that the extracellular micro-environment acidifies in static cultures within minutes (McConnell et al. [1992](#page-8-0)), creating a non-physiological situation. Cells in their native environment in vivo are continuously perfused with extracellular fluid, creating a dynamic extracellular microenvironment of physiological abundance of nutrients and metabolites. To address the issue encountered with conventional in vitro cultures described above, (micro-) fluidics devices, allowing for continuous or periodical perfusion with fresh media, are increasingly being developed and proposed for in vitro models used e.g. in the context of drug susceptibility testing (Eklund et al. [2004;](#page-7-0) Marx et al. [2016;](#page-8-0) McConnell et al. [1992](#page-8-0); Weltin et al. [2014;](#page-9-0) Wolf et al. [1998](#page-9-0)).

To assess whether the growth characteristics of cells cultured at periodic i.e. dynamically changing, conditions differ from conventional, i.e. static, conditions, we aimed to observe the growth of differentially cultured cells in vitro by life-cell time-lapse fluorescence imaging. For assessing the growth characteristics, we aimed to employ recombinant HEK293^{YFPI152L} cells, stably expressing a variant of yellow fluorescent protein, and to quantify the growth area or confluence in image series. In order to evaluate whether the growth rates differ between the employed approaches, we further aimed to calculate the foldchange in growth area after 30 h culturing duration.

Materials and methods

Reagents

Poly-D-lysine (PDL) was obtained from Sigma (Taufkirchen, Germany). PDL was prepared as $10\times$ stock in water and stored at 4 °C.

Cell line

HEK293 cells (CRL-1573TM) were purchased from The American Type Culture Collection (ATCC, Manassas, VA, USA). Generation of the recombinant HEK293YFPI152L cell line is described in Walzik et al. [\(2015](#page-8-0)).

Cell culture

Recombinant HEK293YFPI152L were maintained in DMEM (Invitrogen, Darmstadt, Germany) supplemented with 10% fetal bovine serum (FBS, Biochrom, Berlin, Germany) and penicillin (100 U/ml)/streptomycin (100 mg/ml) (Invitrogen) and were cultured in T75 flasks (TPP, Trasadingen, Switzerland) at $37 °C$, 5% CO₂ according to standard procedures. Cells were passaged every 2–3 days and used in long term imaging experiments when approx. 80–90% confluent.

Preparation of cell chips

As a preparatory step prior to long-term imaging experiments and in order to promote adherence of cells onto the growth surface of the employed cell chips (Cellasys GmbH, Kronburg, Germany), cleaned and sterilized chips were filled with 200 μ l 1 \times poly-Dlysine (PDL, Sigma) and were incubated for 10 min at room temperature in a laminar flow hood. Upon aspiration of the PDL solution the chips were left in the laminar flow hood for approx. 10 min for drying. In a next step, PDL-coated chips were filled with 300 µl standard cell culture medium supplemented with a total of 6×10^4 cells and were placed into an incubator for 12–24 h.

Preparation of long-term imaging experiments

Approx. 30 min prior to long-term imaging experiments, the culture medium within the chips was replaced by 300 µl Leibovitz's L-15 medium (Merck, Darmstadt, Germany) without phenol red, supplemented with 10% fetal bovine serum and penicillin (100 U/ml)/streptomycin (100 mg/ml). To prevent evaporation of the culture medium during long-term experimentation, the chip to be used in static culture mode was closed with a plastic conical cap and was sealed with parafilm. The second chip to be used in periodic or pulsed-perfused culture mode was closed with a different lid, equipped with in- and outlets to allow for media exchange during experimentation. Both chips were mounted into a purpose-designed chip carrier and the assembled chip carrier was transferred to the motorized stage of a of a high-content long-term imaging system (Nikon Eclipse Ti, Nikon, Tokyo, Japan) equipped with a cell culture incubator (Okolab,

Fig. 1 Setup and workflow for long-term culture and parallel time-lapse imaging. a 3D printed chip carrier. The carrier was printed using the biocompatible thermoplast ABS and has the dimensions of a standard multi-titer plate. It provides wells for two biochips and a standard 6 cm cell culture dish (see 'h' in b). During life-cell imaging the culture dish is filled with 4 ml water, serving as a reference for the thermistor (see 'k' in b) and the environment control infrastructure of the microscope. Cells are imaged through a pinhole at the bottom of the carrier.

Pozzuoli, Italy) capable of maintaining a constant temperature during the time-lapse experiment. An image of the set-up including the assembled chip carrier is shown in Fig. 1a.

Long-term imaging experiments

Cells were imaged with a $10\times$ objective (CFI Plan Fluor DL 10X Phase, N.A. 0.30, Nikon). Illumination from a xenon lamp (Lambda LS, Sutter Instruments, Novato, CA, USA), passing through a filter block (C-FL Epi-FL FITC, EX 465–495, DM 505, BA 515–555,

b Setup for establishing static and periodic culturing conditions during time-lapse long-term imaging. (a) medium waste bottle, (b) peristaltic pump, (c) medium reservoir bottle, (d) waste tubing, (e) perfusion tubing, (f) imaging chamber, (g) 3D printed chip carrier, (h) water reservoir for thermistor, (i) chip for perfusion culture, (j) chip for static culture, (k) thermistor cable and connector. c Experimental workflow for comparative cell growth analysis. Details see text

Olympus, Tokyo, Japan) was used to excite and detect the YFPI152L fluorescence signal. Fluorescence was imaged by a sCMOS camera (NEO, Andor, Belfast, Northern Ireland, UK) and digitized to disk onto a computer (Dell Precision T3500, Dell, Round Rock, TX, USA) with Windows 7 operating System (Microsoft Corporation, USA). The primary resolution of the camera was 2560×2160 pixel. The experimental protocol involved imaging each chip every 6 min for a total of 30 h. Cells cultured in periodic culture mode were perfused repeatedly every 10 min for a period of 5 min and at a rate of 60 ll per minute with a total volume of 300 µl Leibovitz's L-15 medium without phenol red, supplemented with 10% fetal bovine serum and penicillin (100 U/ml)/streptomycin (100 mg/ml). Liquid-handling was performed with a peristaltic pump (Ismatec Reglo ICC 4CH, Cole-Parmer, Wertheim, Germany).

Image analysis

Image series of fluorescent HEK293^{YFPI152L} cells were automatically analyzed using a modified version of DetecTIFF[®] software (Gilbert et al. $2009c$) written in LabView (National Instruments, Dublin, Ireland). In brief, images were segmented using an iterative size and intensity-based thresholding algorithm and the image area covered by cells, i.e. the confluence, was calculated as percentage of the overall image area.

Data analysis and visualization

Image data were annotated in Microsoft Excel as well as analyzed and plotted using Origin 7G (OriginLab Corporation, Northampton, MA, USA). For comparison of cell growth, the fold-change, i.e. the increase of the growth area covered by cells within a period of 30 h, was calculated using the following equation:

$$
Averagefold change = \frac{Area_{final}}{Area_{init}}
$$

where Area_{init} is the growth area observed at experiment initiation and Area_{final} is the growth area calculated after 30 h culture duration. Statistical analysis was done based on one-way ANOVA tests, checking for data normality and performing post hoc tests (Dunn or Bonferroni method). 'n.s.' in the graph indicates that the difference between the analyzed populations is not statistically significant.

Linear and exponential fits were obtained using Origin 7G (OriginLab Corporation). The fit accuracy is expressed as coefficient of determination (R^2) .

Results

Custom infrastructure for comparative culture analysis

To assess whether the growth characteristics of cells cultured at periodically changing, conditions differ from conventional, i.e. static, conditions, we aimed to observe the growth of differentially cultured cells in vitro by life-cell time-lapse imaging. To support direct comparison of generated imaging data, we intended to observe the different cultures in the same experiment. As the dimensions of the employed biochips differ from those of standard culture ware, we purposely designed a chip carrier using computer assisted design (CAD, see Methods for details) and printed it with a custom-grade 3D printer. An image of the chip carrier without mounted chips is shown in Fig. [1a](#page-3-0), mounted chips as prepared for automated imaging are shown in Fig. [1](#page-3-0)b.

Experimental workflow for comparative cell growth analysis

In a first step prior to comparative imaging, recombinant and fluorescent HEK293^{YFPI152L} cells were seeded into biochips at defined density in DMEM, supplemented with fetal calf serum and antibiotics (see Methods for details) and were incubated at standard culture conditions over night (see step 1 in Fig. [1c](#page-3-0)). We decided to use recombinant HEK293^{YFPI152L} cells as the HEK293 (human embryonic kidney-derived) host cell line is robust and modest with respect to culturing conditions. Furthermore, HEK293 cells are a commonly employed culture model for answering a vast variety of biological questions in a broad range of laboratories worldwide. In addition, the cells stably express a variant of yellow fluorescent protein (YFP), exhibiting a high signal-to-noise ratio in fluorescence microscopy, and thus enable quantitative and automated analysis of cellular growth based on fluomicrographs obtained from life-cell time-lapse imaging. The next day, the standard culture medium was replaced by $300 \mu l$ Leibowitz's L-15 medium without phenol red. We used Leibowitz's L-15 medium without phenol red as it allows culturing cells at ambient $CO₂$ concentration and minimizes background contamination through scattered light in fluorescence microscopy as compared to phenol red-containing medium. Prepared chips were mounted into the chip carrier (see image in Fig. [1b](#page-3-0) and step 2 in Fig. [1c](#page-3-0)) and were transferred to the motorized stage of an automated Nikon Eclipse Ti microscope with cell culture incubator for maintaining a constant temperature during time-lapse experimentation. In this configuration, the cells were recurrently

imaged every 6 min for a total of ~ 30 h at 37 °C and ambient CO_2 concentration (see step 3 in Fig. [1](#page-3-0)c). Cell chips used in static mode were imaged in $300 \mu l$ Leibowitz's L-15 medium added prior imaging initiation as described above. Chips used in periodic mode were recurrently perfused with new medium during automated imaging using the setup shown in Fig. [1](#page-3-0)b as detailed in the Methods section. Generated images sequences were subsequently quantitatively analyzed using a modified version of DetecTiff© software (Gilbert et al. [2009c](#page-7-0)) (see step 4 in Fig. [1c](#page-3-0)).

Growth of cells cultured under periodic versus static conditions

Figure 2a shows representative images of recombinant HEK293YFPI152L cells at experiment initiation (start) and after 30 h imaging duration (end) captured from cells cultured in cell chips in static (upper row) and periodic culture mode (bottom row). For comparison of the growth characteristics of differentially cultured HEK293^{YFPI152L} cells, the growth area or cellular confluence was quantified in single images of the generated image series using image analysis software. Figure 2b shows time courses of the mean confluence (in $\%$, \pm SD) of HEK293^{YFPI152L} cells, cultured in static (black) and periodic (red) culture mode, respectively, averaged from a total of four biological replicates each. These data demonstrate that cells cultured under conventional, i.e. static conditions exhibit an exponential growth rate. Exponential growth of cells in vitro has previously been reported for different cell lines, including HEK293 cells and HEK293YFPI152L cells and thus, was somewhat expected (Walzik et al. [2015\)](#page-8-0). In contrast, cells cultured in periodic mode exhibited a non-exponential, linear growth rate within the observed time period. In order to evaluate whether the differences observed for the cellular growth rate also affected the overall increase in confluence, we calculated the average fold change in growth area for each culturing mode based on the first and last image taken during long-term experimentation. The histogram inset in Fig. [1b](#page-3-0) clearly indicates that the fold change values (mean \pm SD, N = 4) calculated for cells cultured in periodic (1.8 ± 0.6) and static mode (2.0 ± 0.7) ,

Fig. 2 Comparative analysis of cellular growth characteristics of HEK293^{YFPI152L} cells at static versus periodic culturing conditions. a Representative fluomicrographs of HEK293YFPI152L cells cultured in multi-parametric cell chips in static (upper row) and periodic (bottom row) culture mode at experiment initiation (start) and after 30 h imaging duration (end). Scale bar: $200 \mu m$. **b** Time courses of the average confluence (in %, mean \pm SD, N = 4) of cells cultured in static

(black) and periodic (red) culture mode, respectively, calculated from images as shown in (a). The time courses indicate exponential and linear growth for cells cultured in static and periodic mode, respectively. The inset histogram displays the average fold-change in growth area (mean \pm SD, N = 4) and indicates that the final growth area is comparable for both culture conditions after 30 h culture duration. 'n.s.': not significant. (Color figure online)

respectively, are not significantly different. This result is expected as normalization of the depicted time courses to the initial confluence value reveals intersecting curves at approx. 30 h culture duration.

In order to provide an additional and more comprehensive indicator, also reflecting the timecourse of the growth rate, we fitted the generated timecourse data using linear and exponential functions for assessing time-resolved growth characteristics of cells grown under dynamic and static conditions, respectively (see Methods for details). The fit accuracy is expressed as coefficient of determination (R^2) and was 0.97 ± 0.27 and 0.99 ± 0.17 for cells cultured in periodic mode and under static conditions, respectively.

Discussion

For the sake of feasibility and cost reasons, in vitro cultures are conventionally maintained under static rather than under periodic culture condition, because periodic cultures require a more complex infrastructure that is also much more resource-intensive compared to the conventional culturing approach. Static culture conditions, however, create a non-physiological environment presumably altering physiology and viability compared to in vivo-like culture conditions. The initial benefit of static cultures may thus be compromised by subsequent time-consuming and cost-intensive validation of experimental results using individual assay types and different culture approaches. Using long-term time-lapse fluorescence microscopy we have analyzed the growth of cells in vitro cultured under static versus periodic condition. Our data demonstrate that HEK293 cells cultured under conventional conditions exhibit an exponential growth rate, whereas HEK293 cells cultured in periodic mode exhibited a non-exponential, rather linear, growth rate. Exponential growth of cells in vitro has previously been reported for different cell lines, including stem cells and culture models such as HEK293YFPI152L, RKO, HCT116, Lim1215 or HT29 cells (Shekar and Ranganathan [2012;](#page-8-0) Witzel et al. [2015;](#page-9-0) Walzik et al. [2015;](#page-8-0) Yates et al. [2017\)](#page-9-0)_ENREF_46. Furthermore, exponential growth is initially expected as a single parent cell divides into two daughter cells during cell division.

There are numerous possible explanations for the phenomenon of the observed non-exponential and rather linear growth behavior of periodically cultured cells. For example, mechanical stress or stimulation of the cells may explain the observed differences. During cell division, adherent cells in vitro change their morphotype from flat and outspread to round and loosely attached. When the cells are perfused during cell division, the loosely attached cells may be mechanically dislodged from the bottom of the biochip and removed from the quantified cell population. Visual observation would be the gold standard and generally suitable for testing this hypothesis, but the acquired image series are not suitable as the employed sampling rate (ten images per hour) is too small for identification of cells being washed away during parallel cell division and perfusion. Also, a phenomenon called contact inhibition of proliferation, describing the inhibition of cell proliferation in a density dependent manner, may be involved in the observed linear proliferation characteristics in perfused cultures (Stoker and Rubin [1967](#page-8-0)). Mechanosensitive ion channels such as piezo proteins, have been associated with cellular development, volume regulation, cellular migration, proliferation, and elongation and may be activated through the liquid flow and hence, interact with cellular growth (Bagriantsev et al. [2014\)](#page-7-0). Besides mechanical stress or stimulation of the cells, another mechanism may explain the observed linear growth characteristics. Signaling molecules, secreted by the cells and involved in cell cycle progression, division and proliferation such as ligands of intracellular signaling pathways and growth factors may be accumulated at lower concentration in perfused cultures compared to static cultures and thus may cause slower cell cycle progression. Another consequence of the aforementioned accumulation of signaling molecules and factors may also affect synchronization of the cell cycle of the HEK293 cells in culture. However, none of the hypothesized mechanisms has been evaluated in detail as this was not within the scope of this study. We aimed at comparing the growth characteristics of HEK293 cells cultured under static versus periodic conditions and providing the results to the community for several reasons. First, to bring the relevance of perfusion cultures in the focus of up-to-date cell biology emphasizing the importance of the nutritional status of cells in vitro and in the context of GCCP (Coecke et al. [2005](#page-7-0); Hartung et al.

[2001;](#page-8-0) Pamies et al. [2017\)](#page-8-0) and second, to spark the interest for further experimentation towards gaining a deeper understanding of the phenomenon observed in the course of this study.

Despite the fact that our observation of a nonexponential and rather linear growth behavior of periodically cultured cells has been reproduced in a total of four independently conducted biological replicate experiments with recombinant HEK293 cells, further experimentation with additional in vitro culture models would be required for validation of our observations as a general phenomenon occurring in cultures of periodically cultured cells.

While this work focuses on in vitro cultures of HEK293 cells, the methodological approach could also be adapted for other cell lines and strategies, such as drug or toxicity screening, e.g. in the context of the 3Rs (Russell and Burch [1959](#page-8-0); Alexander et al. 2018).

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Authors' contribution J.W. and D.F.G. conceived the study. S.A.M. and D.F.G. conducted imaging experiments. D.F.G. analyzed and displayed imaging data. D.F.G. and J.W. and wrote the paper. All authors commented and agreed on the manuscript.

Compliance with ethical standards

Conflict of interest JW is CEO and shareholder of Cellasys GmbH.

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