



Published in final edited form as:

*Biomaterials*. 2022 April ; 283: 121454. doi:10.1016/j.biomaterials.2022.121454.

## Microphysiological model of the renal cell carcinoma to inform anti-angiogenic therapy

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### Abstract

Renal cell carcinomas are common genitourinary tumors characterized by high vascularization and strong reliance on glycolysis. Despite the many available therapies for renal cell carcinomas, first-line targeted therapies, such as cabozantinib, and durable responses are seen in only a small percentage of patients. Yet, little is known about the mechanisms that drive response (or lack thereof). This dearth of knowledge can be explained by the dynamic and complex microenvironment of renal carcinoma, which remains challenging to recapitulate *in vitro*. Here, we present a microphysiological model of renal cell carcinoma, including a tubular blood vessel model of induced pluripotent stem cell-derived endothelial cells and an adjacent 3D carcinoma model. Our model recapitulated hypoxia, glycolic metabolism, and sprouting angiogenesis. Using our model, we showed that cabozantinib altered cancer cell metabolism and decreased

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#### Author contributions

Conceptualization: M.V., E.J.A., D.J.B.; Data curation: M.V.; Formal analysis: K.M.D., J.R.L., S.R.; Funding acquisition: D.J.B.; Investigation: M.V.; Methodology: M.V., J.R.L., J.A.; Project administration: M.V., D.J.B.; Resources: D.J.B.; Software: M.V., S.R.; Supervision: M.V., D.J.B.; Validation: M.V.; Visualization: M.V., J.A., J.R.L.; Roles/Writing - original draft: M.V.; Writing - review & editing: M.V., E.J.A., D.J.B., J.A..

#### Declaration of conflict of interests

D.J.B. holds equity in Bellbrook Labs LLC, Tasso Inc., Turba LLC, Salus Discovery LLC, Stacks to the Future LLC, Lynx Biosciences Inc., Flambeau Diagnostics, and Onexio Biosystems.

sprouting angiogenesis but did not restore barrier function. This microphysiological model could be helpful to elucidate, through multiple endpoints, the contributions of the relevant environmental components in eliciting a functional response or resistance to therapy in renal cell carcinoma.

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## Introduction

Renal cell carcinoma (RCC) is a common genitourinary disease with poor prognosis despite treatment[1–5]. Unfortunately, no single treatment elicits responses in all RCC patients. Many targeted therapies against vascular endothelial growth factor (VEGF) pathways have been developed with the aim of reducing tumor microvessel density (e.g., sunitinib, cabozantinib, axitinib)[6], but treatment response is varied, and most patients eventually develop distant metastases[7]. Thereby, it remains a pressing need to better understand the mechanisms underlying response or resistance to therapy to improve outcome in RCC[8].

Cabozantinib, a small molecule tyrosine kinase inhibitor, is a targeted agent that blocks tumor angiogenesis through the VEGF receptor and limits tumor growth, dissemination, and metastasis through the HGF-MET pathway. Cabozantinib has shown increased objective response rate and progression-free survival compared to other drugs in the same category (e.g., sunitinib)[9], and is now prescribed as first or second-line therapy, either alone or in combination with immune checkpoint inhibitor therapy[10]. Recently, the development of clinically relevant disease models has been suggested as a strategy to overcome the absence of prognostic markers for RCC. Although there has been much interest in reproducing normal kidney function *in vitro*, few efforts have focused on reproducing the microenvironment of kidney cancer. Specifically for RCC, the characteristic high vascularization and strong reliance on glycolysis [11] (i.e., Warburg effect or uncoupling of glycolysis and TCA cycle in aerobic conditions in cancer cells)[12–14] are traits that remain challenging to reproduce in *in vitro* models. While some studies have aimed to study tumor angiogenesis and vascularization for anti-angiogenic therapy [15, 16], RCC-targeted drugs and their effects on the RCC tumor microenvironment (TME) remain unexplored. Therefore, there is a demand for *in vitro* models to investigate the effects of novel targeted therapies in the RCC TME [17].

Microphysiological systems (MPS) are 3D microfluidics-based models that aim to reproduce *in vivo* characteristics of tissues *in vitro*. MPS present advantages over traditional platforms to model many relevant aspects of the TME, including angiogenesis, hypoxia, tumor growth, migration, and altered response to therapy [18]. Within MPS, the use of both molecular and functional readouts (i.e., direct measurements of treatment efficacy on cells) have been useful in assessing drug efficacy of other cancer types *in vitro*[19]. Here, we developed a reproducible MPS model using a tubular vessel model of induced pluripotent stem cell (iPSC)-derived endothelial cells (iECs) and a 3-D compact mass of RCC epithelial cells to recapitulate the different steps of tumor angiogenesis *in vitro*.

Molecular and functional readouts revealed that our model captures key elements of the RCC TME dynamics, which is characterized by hypoxia and nutrient starvation, followed by tumor-induced angiogenesis. Additionally, we leveraged our platform to evaluate the effects of cabozantinib in the TME. Our observations revealed a switch of tumor metabolism and

molecular pathways to a less glucose-dependent metabolism. Further, we observed a partial restoration of normal vascular function, consisting of a decrease in angiogenic sprouting but not a recovery of normal permeability. Our model also recapitulated differential signaling pathway activation for the RCC cell lines, consistent with *in vivo* observations[20].

Reproducing more physiological cell organizations and responses, such as cell-induced hypoxia or angiogenic sprouting, presents important challenges in traditional *in vitro* platforms. Therefore, our findings highlight the utility of these models to reproduce complex tumor microenvironments to investigate targeted therapies. To our knowledge, this is the first *in vitro* model simulating tumor-endothelium interactions in the RCC microenvironment and studying the effects of clinically relevant drugs on both the tumor and the surrounding vessels. In addition, we anticipate that MPS models of the TME will allow us to decipher inter-and intracellular signaling relevant to drug response in hopes of optimizing therapeutic approaches against RCC.

## Materials and Methods

### Cell culture and maintenance

Induced pluripotent stem cell-derived endothelial cells (iECs, Cellular Dynamics International, R1022) were used between passages of 2–5. iECs were maintained in Vasculife Basal maintenance media kit (LifeLine Cell Technologies, LL-0003), supplemented with iCell Endothelial Cell Medium Supplement (Cellular Dynamics International, M1019)[21](hereafter called iEC media). iECs were cultured on conventional cell culture flasks, coated with bovine fibronectin (Sigma-Aldrich, F1141) (diluted to 30 µg/mL in distilled water) for 30 min at room temperature. Cells were grown to an 80% confluence before trypsinization with 0.25% trypsin with EDTA (Thermo Fisher, Gibco, R001100).

A498 (ATCC, HTB-44) and Caki-2 kidney carcinoma cells (a gift from the Lang Lab, UW-Madison) were cultured in iEC media as detailed above and grown until 85% confluence on conventional cell culture flasks and trypsinized as described for iECs.

While A498 is a typical clear cell RCC (ccRCC) cell line, the Caki-2 RCC subtype is less certain[22]. Caki-2 have clear cell histology, but there is debate on their von Hippel Lindau gene status and the lack of expression of HIF2a, which is atypical in ccRCC[23].

### Primary cell culture extraction and maintenance

Primary RCC cells were grown in Minimum Essential Medium (MEM) with L-Glutamine, supplemented with 10% of FBS (Corning, 45000–734), 1% Penicillin/Streptomycin (Gibco, 15140122), 1% MEM vitamin mixture 100× (Lonza, 13–607C), 0.5% ITS (Roche, 11074547001) Sodium Pyruvate 1 mM (Lonza, 13–115E), 100 µM of MEM NEAA (ThermoFisher, 11140–050), 0.4 µg/ml of Hydrocortisone (VWR, 101095–150), 5 ng/ml hEGF (Thermo-Fisher Scientific, PHG0311). The research protocol to obtain tumor and normal adjacent tissue following surgery at the University of Wisconsin Hospital (Madison, WI) was approved by the Institutional Review Board (2011–0719). Informed consent to use residual tissue was obtained from patients before surgery.

Primary cell isolation was performed as previously described[24, 25]. Briefly, a pathologist confirmed ccRCC diagnosis and tissue samples (ca. 3 cm<sup>3</sup>) were finely minced and digested. Digestion media was a mixture of MEM (Corning, 10-010-CV), 5 mg/ml collagenase (Thermo-Fisher 17100017), 5 mg/ml hyaluronidase (Sigma, H3506), 1 mg/ml of DNase I (Roche, 04716728001), dispase 1% (Worthington, LS02100), and 1% Penicillin-streptomycin. Samples were incubated in digestion media for 1 h at 37 °C. CD31 (i.e., Platelet/endothelial cell adhesion molecule-1, also called PECAM-1) a classical marker of endothelial cells was used for the removal of endothelial cells[26, 27] of this highly vascularized tissue, using anti-CD31-conjugated magnetic microbeads (Miltenyi Biotech, 130-091-935) and separation columns (Miltenyi Biotech, 130-042-401). CD31<sup>-</sup> cells were seeded in 75 cm<sup>2</sup> flasks (Corning, CLS430641U) at 3·10<sup>4</sup> cells/cm<sup>2</sup> and were characterized via immunofluorescence (Figure S8). Cell viability was high in iEC media, which enabled us to co-culture them with iECs in the microdevices.

### Microdevice fabrication

The microfluidic organotypic culture platform was adapted from the LumeNEXT approach previously reported[28, 29], with ports designed for passive pumping for the cell loading and media exchange. Briefly, we used standard polydimethylsiloxane (PDMS) micromolding techniques to create a microdevice consisting of two primary components: a culture chamber and a removable PDMS rod. Rods are drawn from 23-gauge needles (340 µm inner diameter). The chamber is formed by oxygen plasma bonding two distinct PDMS layers patterned using SU-8 on silicon master molds (SU8-100, MicroChem) onto a glass-bottom dish (MatTek, P35G-0.170-14-C). Certain variability ( ~ 10%) is expected in vessel diameter due to differences in the internal diameter of the needles, but no impact on readouts has been observed with this size variation. PDMS layers were made using the Sylgard 184 silicone elastomer kit (Dow Corning) with a 10:1 curing agent ratio. Layers were incubated in EtOH 70% overnight to remove uncured PDMS oligomers. Then, PDMS layers were aligned using fine tweezers and plasma bonded using a Diener Electronic Femto Plasma Surface System.

### Hydrogel preparation in microdevice

After assembly and UV-sterilization, devices were treated for 10 min with 1% poly(ethyleneimine) (Sigma-Aldrich, 03880) in water and with 0.1% glutaraldehyde (Sigma-Aldrich, G6257) in water for 30 min to enhance hydrogel attachment to the PDMS. Devices were washed four times with water and thoroughly dried before hydrogel injection. Type I rat tail collagen hydrogels were prepared at 6 mg/ml in ice to prevent premature gelation (detailed recipe in Table S1). Using a chilled tip, a mixture of collagen type I (Corning, 354249); NaOH 0.5 M (Fisher Scientific, S318); PBS 10x (Fisher Scientific, BP3991) and dH<sub>2</sub>O was then incubated on ice for 20 min. Provided the pH of the mixture be approximately 7.4 (Capitol Scientific, PH1170-7), the mixture was injected into the LumeNEXT device and polymerized for 15 min at room temperature, followed by 20 min at 37 °C. Afterward, the PDMS rods were gently pulled out of the polymerized collagen gel from the output port resulting in two lumen structures in the collagen gel.

## Cell culture and drug treatment in the microdevice

After rod removal, the lumen structure destined to seed the iECs was coated with fibronectin as described in previous sections and washed thrice with iEC media. iECs are then trypsinized and resuspended to a concentration of 15,000 cell/ $\mu$ L and loaded into the open lumen via passive pumping. Devices were then incubated for 1 h at 37°C to allow iECs to adhere, and then washed thrice with relevant media to remove unadhered cells before seeding the A498 cells.

A498 and Caki-2 cells were routinely trypsinized and resuspended at a concentration of 80,000 cell/ $\mu$ L. A second collagen hydrogel (4.5 mg/ml) was then prepared to embed the A498 cells (detailed recipe in Table S1). 2  $\mu$ L of this cell-hydrogel mixture was injected per lumen and left to polymerize as described in previous sections. After polymerization, a 15- $\mu$ L droplet of iEC media was added per device and replenished daily after 3 media washes.

Cabozantinib (Selleckchem, S1119) was resuspended in DMSO to a final concentration of 50 mg/ml. Aliquots were stored at  $-20^{\circ}\text{C}$  until used. Cabozantinib was diluted in iEC media to a final concentration of 1  $\mu\text{M}$  to treat the cells within the microdevices.

## Cell viability assays

Cell viability was evaluated in response to different doses of cabozantinib using the CellTiter-Glo® 2.0 Assay (Promega, G9241). Briefly, for 2D assays, cells were plated on a glass-bottom well plate (Corning, 3601) at a 3000 cells/well density. After 24 h, cabozantinib was added at the studied concentration. Subsequently, CellTiter-Glo® reagent was added directly to the cells (or hydrogels, in their case) in a 1:1 ratio. CellTiter-Glo lyses cells and performs a semi-quantitative analysis of ATP levels. ATP-dependent luminescence is known to correlate with cell numbers linearly. Samples were incubated for 60 min in the dark, and cell-induced luminescence was evaluated in a standard plate reader. Background intensity (no cells) was subtracted from the experimental conditions, and values were then normalized to vehicle controls. 2D dose-response curves were plotted with GraphPad Prism v7 using the inhibitor concentration vs response function.

## Real-time fluorescent detection studies

Lumens were treated with Premo™ FUCCI Cell Cycle Sensor (Thermo, P36237) to study iEC proliferation in the lumens). Premo FUCCI contains two different reporters coupled to TagRFP and EmGFP, expressed alternatively during the G1 or the S/G2/M phases. Premo FUCCI was added to the lumens at 1:10 in the cell culture media overnight to label proliferating cells in green, whereas non-proliferating cells appear red. Cells were imaged daily over 72 h to correlate dividing cells with the appearance of angiogenic sprouts in the lumens.

Real-time oxygen levels were assessed using Image-iT™ Red Hypoxia Reagent (Thermo-Fisher Scientific H10498) per the manufacturer's instructions. The stain was supplemented in the hydrogels and culture media to maintain adequate levels in culture.

To study cell death in the A498 3D culture, The systems were stained with 1:1000 propidium iodide and 1:1000 Caspase 3/7 reagent (Image-iT™ LIVE Red Caspase-3 and -7,

Thermo-Fisher Scientific I35102). Staining was incubated in both control and cabozantinib-treated samples for at least 5 hours to diffuse in the microdevice and then was imaged using confocal microscopy.

### Permeability studies

The barrier function of the iEC vessel models was assessed by measuring dextran diffusion across the vessel endothelium as previously described[30]. A 1  $\mu$ M solution of dextran (FITC-conjugated 40 kDa, D1845; TRITC-conjugated 70 kDa, D1818, both ThermoFisher Scientific) was prepared in iEC media. For each vessel, 5  $\mu$ L of dextran solution was injected through the small lumen port. Dextran diffusion was imaged with the Nikon TI® Eclipse inverted microscope every 5 min over 15 min. Effective permeability coefficients (expressed in cm/s) were calculated using the following equation[31]:

$$P = \frac{1}{I_0} \left[ \frac{I_F - I_0}{t_F - t_0} \right] \left( \frac{D}{4} \right), \quad \text{Eq.1}$$

where  $I_0$  is the total initial intensity outside the vessel,  $I_F$  is the total intensity outside the vessel at 15 min,  $t_0$  is the initial time point,  $t_F$  is the final time point of 15 minutes, and  $D$  is vessel diameter.

### Image analysis

Lumen confluency was calculated on phalloidin images after a binarization using a set threshold as previously described[24, 32]. Visual inspection of each threshold confirmed the accuracy in representing the initial image. Then, a consistent Region of Interest was defined to include only the lumen (i.e., not surrounding areas or sprouts). Finally, the percentage of pixels where the phalloidin signal was present was automatically measured for each lumen.

### Immunofluorescence staining

Microdevices were fixed after four days of culture by perfusing 4% paraformaldehyde in PBS through the lumen for 15 min. Lumens were washed three times with 0.1% Tween in PBS for 30 min between every step. First, cells were permeabilized with 0.2% Triton® X-100 for 30 min and blocked with 3% BSA in PBS overnight at 4 °C. Next, cells were incubated with the required primary antibody (references and concentrations in Table S2) diluted in 3% BSA, 0.1% Triton® X-100 in PBS (called “antibody dilution buffer”) overnight at 4°C. Cells were then stained with Texas Red®-X Phalloidin, corresponding secondary antibodies, and DAPI in antibody dilution buffer + 10% Goat Serum for 2 h at 4 °C. Finally, the lumens were washed to remove excess staining and minimize the background.

### qPCR

**mRNA extraction**—Device layers were separated to retrieve the lumens for mRNA extraction. Lumens in co-culture were manually separated using a razor and fine tweezers to section the hydrogel and selectively retrieve each cell type. Hydrogels were fragmented to ensure sample homogeneity by passing the sample repeatedly through a 23G needle until no hydrogel fragments were observable before the RNA isolation protocol. Then, RNA



was extracted using the Dynabeads™ mRNA DIRECT™ Purification Kit (Thermo Fisher, 61,011) according to the manufacturer's instructions[25]. At least 2 collagen hydrogels containing iEC lumens, A498 or Caki-2 were pooled per condition.

### RT-qPCR

RNA reverse transcription was performed with the RT2 PreAMP cDNA Synthesis Kit (Qiagen, 330451) before qPCR analysis. iECs were analyzed using a Qiagen RT2 profiler Angiogenesis panel (Qiagen, PAHS-024ZA) and RT2 SYBR® Green qPCR Mastermix (Qiagen, 330500) in a Roche 96–384 thermal cycler. Independent qPCR reactions were set for each primer, using the manufacturer's cycling conditions.

Data were analyzed using 4 reference (housekeeping) genes provided for normalization using the Qiagen online software (<http://pcrdataanalysis.sabiosciences.com/pcr/arrayanalysis.php>) for the arrays. We normalized the primer assays using the reference genes included in the arrays (B2M and ACTB).

### Magpix

Multiplexed protein secretion analysis was performed on iEC vessels and co-cultures with A498 or Caki-2 cells using the MagPix Luminex Xmap (Luminex Corporation) with the “Milliplex human angiogenesis growth factor panel bead kit” (R&D Systems, LXSAHM-10) per the manufacturer's protocol. Conditioned media was pooled from sets of 4 iPSC-derived vessels (and at least 2 independent experiments) using a p10 pipette over 2 days, yielding 120 µL per set. Data were collected with xPonent software (Luminex). Soluble factor concentrations in media were calculated using mean fluorescence intensities (MFI) by creating a standard curve for each analyte using a five-parameter logistic (5-PL) curve-fit.

### Imaging

Bright-field and fluorescent images were obtained using a Nikon TI Eclipse inverted microscope and processed using Nikon Elements and the National Institutes of Health ImageJ software. Confocal images were acquired using a Leica SP8 in the University of Wisconsin, Madison Optical Imaging Core.

### NAD(P)H/FAD imaging

Fluorescence lifetime images and intensity were taken on a custom-built inverted multiphoton microscope (Bruker Fluorescence Microscopy, Middleton, WI), as described previously[33–35]. Briefly, the system consists of a Ti:sapphire laser (Spectra Physics, Insight DS-Dual), an inverted microscope (Nikon, Eclipse Ti), and a 40× water immersion (1.15NA, Nikon) objective. NAD(P)H and FAD images were acquired sequentially for the same field of view. NAD(P)H fluorescence was isolated using an excitation wavelength of 750 nm and an emission bandpass filter of 440/80 nm. FAD fluorescence was isolated using an excitation wavelength of 890 nm and an emission bandpass filter of 550/100 nm. Fluorescence lifetime images were collected using time-correlated single-photon counting electronics (SPC-150, Becker, and Hickl) and a GaAsP photomultiplier tube (H7422P-40, Hamamatsu). A pixel dwell time of 4.8 µs was used to acquire 512 × 512-pixel images over 60 s total integration time. For intensity imaging, a pixel dwell time of 4.8 µs was used to

collect  $1024 \times 1024$  images. The photon count rates were maintained at  $1-2 \times 10^5$  photons/s to ensure adequate photon observations for lifetime decay fits and no photobleaching. The instrument response function was measured from the second harmonic generation of urea crystals excited at 900 nm, and the full width at half maximum (FWHM) was calculated to be 244 ps. A Fluoresbrite YG microsphere (Polysciences Inc.) was imaged as a daily standard for fluorescence lifetime. The lifetime decay curves fit a single exponential decay, and the fluorescence lifetime was measured to be 2.1 ns ( $n = 7$ ), which is consistent with published values.

### Quantification of fluorescence lifetime components

NAD and NADPH (indicated as NAD(P)H) and FAD fluorescence lifetime images of cells were analyzed using SPCImage software (Becker & Hickl) as described previously[34, 36]. Briefly, at each pixel, the fluorescence lifetime decay curve was deconvolved with the instrument response function and fit a two-component exponential decay model,

$$I(t) = \alpha_1 * \exp\left(\frac{-t}{\tau_1}\right) + \alpha_2 * \exp\left(\frac{-t}{\tau_2}\right) + C, \quad \text{Eq. 2}$$

where  $I(t)$  is the fluorescence intensity at time  $t$  after the laser excitation pulse,  $\alpha$  represents the fractional contribution from each component,  $C$  accounts for background light, and  $\tau$  represents the fluorescence lifetime of each component. A two-component model was used because NAD(P)H and FAD can exist in two conformational states, bound or unbound to enzymes[37]. For NAD(P)H the short and long lifetime components correspond with the unbound and bound conformations, respectively[37]. While the opposite is true for FAD, the short and long lifetime components reflect the bound and unbound conformations, respectively[37]. The mean lifetimes were calculated using the following equation,

$$\tau(m) = \alpha_1 \tau_1 + \alpha_2 \tau_2, \quad \text{Eq. 3}$$

for both NAD(P)H and FAD. The optical redox ratio was calculated from the NAD(P)H and FAD lifetime data by summing the photons detected at each pixel in the image to compute the total intensity. The intensity of NAD(P)H was then divided by the intensity of FAD for each pixel. Redox ratio values were normalized to the high-density (HD) condition taken at the same time point.

An automated cell segmentation pipeline was created in Cell Profiler. Briefly, a customized threshold code identified pixels belonging to nuclear regions. Cells were identified by propagating out from the nuclei within the image. An Otsu Global threshold was used to improve the propagation and prevent it from continuing into background pixels. The cell cytoplasm was defined as the cell borders minus the nucleus. Values for the  $\tau_m$ ,  $\tau_1$ ,  $\tau_2$ ,  $\alpha_1$ , and intensities of NAD(P)H and FAD, as well as the redox ratio, were averaged for all pixels within each cell cytoplasm.

## Results

We engineered a microphysiological model to mimic RCC tumor development, tumor pro-angiogenic signaling, and tumor angiogenesis typically observed in nearby renal vessels



(Figure 1A). Our model leverages PDMS and mold-casting of luminal structures (Figure 1B–C). One of the resulting tubular structures was lined with iECs to model a blood vessel, while the other lumen was filled with hydrogel-embedded RCC epithelial cells to mimic the tumor mass development in the renal tubule (Figure 1D). Few commercial options are available to model kidney endothelial cells. We chose a commercial cell source that could be used for general *in vitro* research: iPSC-ECs (iEC's). Our lab and others[38] have previously used these cells due to their advantages for *in vitro* modeling: they undergo angiogenic sprouting and have a lower barrier function than other models[21]. The higher permeability is more consistent with renal capillaries, which are fenestrated to facilitate the solute exchange with adjacent renal tubules [39].

We began characterizing our model with an iEC endothelial vessel model in monoculture. This model showed little angiogenic sprouting, with most invading cells detached (Figure 2A). Bigger sprouts were hollow, consistent with *in vivo* observations (Figure 2B), and cell proliferation occurred in the same timeline as the sprouting process (Figure 2C). Angiogenic sprouts were visible after 72 h (Figure 2C, right), consistent with early steps of the angiogenic cascade[40].

We then compared iEC vessel barrier function as compared to a common control (HUVEC lumen model) and a cell-free negative control (a cell-free tubular collagen structure), using two fluorescently labeled dextrans differing in molecular weight (40 and 70 kDa) (Representative diffusion images in Figure 2D). iEC lumens exhibited lower barrier function than HUVEC lumen models, but both were significantly more efficient at retaining the dextran than cell-free hydrogel controls ( $9.09 \pm 2.02 \cdot 10^{-6}$  cm/s for iEC,  $3.70 \pm 0.73 \cdot 10^{-6}$  cm/s for HUVEC,  $1.22 \pm 0.19 \cdot 10^{-4}$  cm/s for the cell-free control) (Figure 2F–G).

We then evaluated the crosstalk between kidney tumor cells and nearby blood vessels in the MPS. We co-cultured our iEC vessel model with a high-density (hereafter called HD model) 3D dispersion of kidney cancer cells (A498 or Caki-2) within the adjacent luminal structure. The layout allows a constant distance between the luminal structures, and the seeding density was optimized to recreate the high density and levels of necrosis of RCC (Fig S1) [41]. The gradient of dead cells peaking in central clusters was consistent with the appearance of a necrotic core [42, 43] at 40 million/ml for A498 and Caki-2.

Next, we validated the tumor-like properties of the high-density tumor model (HD) and compared it to the lowest concentration assessed during our optimizations (Fig S1 C) (10 million/ml, hereafter called LD) (Figure S1A phase contrast), where no cell death gradient was observed. We evaluated hypoxia, hypoxia-related gene expression, metabolic activity, and growth factor secretion – all known hallmarks of RCC tumors.

An oxygen-sensitive dye revealed an increase in hypoxia over time for both cell types (Figure 3A–C). Next, via qPCR, we analyzed the changes in expression of hypoxia-related genes, such as carbonic anhydrase ix (CA9) and hypoxia-inducible factor 2A (*EPAS2*, also called *HIF2A*), which we found to be overexpressed in our tumor models (*HIF2A* only in A498) after 48 h (Figure 3D).

Finally, we assessed the changes in ATP concentration compared to the LD control (Figure 2E) over 4 days. Since ATP-dependent luminescence linearly correlates with cell number[44], the decreases in normalized ATP luminescence point to lower live cell numbers of Caki-2 and A498 than the LD control. Heterogeneity in cell proliferation in the model was verified in Caki-2 via ki-67 staining (Figure S6), where we found ki67<sup>+</sup> cells to be predominantly located in outermost regions of the model.

Overexpression of pyruvate dehydrogenase kinase (*PDK*)-1 and 3 in A498 indicated a shift towards an anaerobic glucose metabolism, consistent with the upregulation of *SLC2A1* and 2 (which codify glucose transporters Glut1 and 2)(Figure 2D). Next, we corroborated these results using multiphoton optical metabolic imaging (OMI) on our platform's A498 model as a functional readout of cell metabolism. OMI is a technique that leverages the autofluorescence of NADH, NADPH (which are spectrally overlapping and hereafter denoted NAD(P)H), and FAD. The NAD(P)H/FAD ratio is commonly known as the redox ratio and is affected by the intracellular metabolism and microenvironment[36, 45]. The redox ratio significantly increased in our A498 tumor model, indicating a shift to more glycolytic metabolism (Figure 3F–G). We complemented the redox ratio with NAD(P)H fluorescence lifetime imaging microscopy (FLIM) and report the NAD(P)H mean lifetime ( $\tau_m$ ). FLIM is a measurement of the fluorescence decay time of the molecule NAD(P)H, which is known to vary according to the binding state of NAD(P)H: slower when NAD(P)H is bound to protein or faster when it is free in the cytoplasm[46]. HD conditions showed a decreased NAD(P)H  $\tau_m$  compared with our LD control (Figure 3H–I). These lifetime results are consistent with decreased protein-binding activity for NAD(P)H, while the redox ratio results are consistent with decreased NAD(P)H concentration relative to FAD, in line with our previous qPCR and CellTiterGlo results. Although we did not look at FLIM measurements in Caki-2, the increases in *PDK*-1 and *SLC2A1* and 2 points to the same effects (Figure 3D).

Hypoxic tissues secrete pro-angiogenic growth factors to, in turn, increase the supply of oxygen and nutrients. Multiplexed bead-based ELISA (Figure 3 J–K) revealed significant increases in VEGF-A, G-CSF and PIGF (compared to iEC monocultures).

Next, we assessed the effects of the tumor cells in the endothelial model. First, CD31 (an endothelial junctional marker, Figure 4A) staining revealed increased angiogenic sprouting compared with iEC alone. Specifically, in co-cultures with A498 both the number and length of angiogenic sprouts increased (Figure 4H–I), whereas with Caki-2 only the sprout length increased. Additionally, both co-cultures showed significantly increased vessel permeability (Figure 4C–F), accompanied with decreased vessel confluency (18.8% for the co-culture with A498 and 38.5% with Caki-2) (Figure 4G)). Furthermore, the expression of CD105 (a marker of endothelial resistance to TGF $\beta$  signaling, anti-angiogenic mediator and suggested stemness marker)[47, 48] decreased overall in iECs in the A498 co-culture model (Figure 4B). Some staining was observed in A498s, consistent with previous reports of CD105 expression in RCC[48, 49]. A qPCR array revealed many significant gene upregulations in the endothelium (Figure 4J), including several pro-inflammatory genes (i.e., IL-6, TGF-A), which could explain the increase in permeability; as well as traditional pro-angiogenic cascade mediators (i.e., VEGFA, FGF2, MDK, VEGFB, NRP1, MMP14).

Cabozantinib is a small tyrosine-kinase inhibitor targeting: VEGFR-1,-2 and -3, Tie-2, FLT-3 (expressed by vascular cells), and RCC tumor overexpressed molecule MET. Cabozantinib is thought to block tumor angiogenesis, proliferation, dissemination, and metastasis. Our model is ideal for studying the functional effects and crosstalk resulting from cabozantinib treatment in the TME *in vitro*.

A dose-response curve showed 1  $\mu$ M cabozantinib preserved cell viability (around 80%) (Figure S2). High viability enabled studying treatment effects on cell death and metabolism in surviving cells. Further, pharmacodynamic studies show cabozantinib concentrations in patient serum range similarly[50].

First, we assessed phenotypic changes in the iEC vessel resulting from cabozantinib treatment. CD31 expression was less localized in cell-cell junctions and more disorganized (Figure 5A). However, sprout number and length were restored iEC monoculture-like levels (Figure 5B–C). However, vessel permeability to 40 kDa dextran (Figure 5 D–F) and vessel confluency (Figure 5G) were not restored. Notably, iEC permeability values showed a significant increase in the Caki-2 co-cultures after treatment, parallel to the significant increase in vessel confluency (Figure 5I). Next, we compared iEC monoculture to cabozantinib iEC-A498 models via qPCR to assess the recovery of normal vascular function (Figure 5H) and found significant downregulation of pro-angiogenic and inflammatory markers (e.g., VEGFA, VEGFC, TGFA, TNF), and migration-related genes (e.g., MMP2, ITGAV). MDK, a pro-angiogenic and pro-metastatic gene, and ITGB3, a known regulator of endothelial cell migration [51], were the only significantly upregulated genes.

Next, (Figure 5I–J) secreted factor analyses after treatment showed significant decreases, mostly in the treated A498 co-culture models: VEGF-C, G-CSF (both A498 and Caki-2), HB-EGF, and FGF-1. However, the most upregulated factors, VEGF, and G-CSF, remained much higher in the treated co-cultures than in the monocultures, indicating that the downstream signaling pathways may remain activated after treatment.

Overall, similar effects were observed when using primary cells in co-culture with iPSC-ECs in the system (Figure S7): increased sprout length, increased permeability in co-culture and lower lumen confluency than in monocultures, an effect that worsened after cabozantinib treatment.

In addition, since cabozantinib targets molecular pathways involved in tumor metabolism, proliferation, and dissemination, we assessed molecular and functional effects of cabozantinib on tumor cells in our MPS (Figure 6A), using qPCR (Figure 6C for A498, Figure S3 for Caki-2) and the readouts described in previous sections (i.e., metabolic imaging, proliferation, cell fate). Despite the treatment, we observed numerous A498 and Caki-2 cells invading the surrounding 3D matrix. Interestingly, A498 cells migrated individually (Figure 6A left), whereas Caki-2 cells exhibited a collective movement, showing spheroid-like clusters of cells protruding into the matrix (Figure 6A right) after 72h. Overall, migration was still observed after cabozantinib treatment in both tumor cell lines.

Interestingly, qPCR analysis of genes related to cell migration (Figure 6B red) revealed a decrease in CDH1, a key player in epithelial to mesenchymal transition (i.e., a pro-migratory phenotype), in A498, and a reduction in MMP-3 would suggest less ECM remodeling typically required for cell migration. Since CDH1 expression in Caki-2 was low (i.e., Ct >30), leading to higher uncertainty of results, we decided not to report changes in this gene. Conversely, MMP3 was not expressed at all by Caki-2, therefore pointing to a different mechanism of cell migration, consistent with our observations in the model.

Next, we found upregulation of hypoxia-related genes after treatment: EPAS1 in A498 and CA9 in Caki-2 (Figure 6B blue). Significant dysregulations in PDK expression were also found: PDK3 was downregulated in A498 and PDK1 in Caki-2. Notably, we did not detect PDK3 in Caki-2. Further, the decrease of SLC2A1 expression in A498 pointed to a less oxidation-reliant metabolism (Figure 6B cyan), consistent with the increases observed in redox ratio and NAD(P)H  $\tau_m$ . The increase in redox ratio indicates a reduced oxidation-reduction state, whereas the increase in NAD(P)H  $\tau_m$  indicates increased NAD(P)H protein-binding activity after treatment. Both increases suggested a metabolic shift to a low density (LD)-like phenotype.

The expression of proliferation marker CCNE1 (Figure 6B red) did not change due to cabozantinib treatment. Consistent with these results, cabozantinib had no significant effect on normalized ATP levels (Figure 6H), suggesting stable cell numbers. At this point, we considered that cell viability could be decreasing due to the treatment (Figure 6G). While cabozantinib-treated A498s showed an increase in apoptosis consistent with the increase in expression of BAD (an inhibitor of anti-apoptotic proteins), propidium iodide-stained cells also increased after treatment, pointing to increases via both caspase-dependent and -independent cell death. Conversely, Caki-2 cells showed an increase in propidium iodide staining and a decrease in RNA expression of Caspase7 (Figure 6B green). These results point to increases in cell death in treated cancer cells through different mechanisms.

Finally, we looked at inflammatory mediators via qPCR, which increase endothelial permeability and promote angiogenic responses (Figure 6B green). Inflammatory mediators decreased in both tumor models after treatment, although the specific mediators were different: IL1B decreased in A498 tumor models after treatment while IL-6 decreased in Caki-2. IL-6 is a key regulator of endothelial cell adhesion and permeability, so the reduced levels after treatment are consistent with endothelial function recovery.

## Discussion

Over the years, numerous therapies have been approved for RCC, including many tyrosine-kinase inhibitors (TKI). However, most therapies show heterogeneous responses across patients, making clinical treatment decisions challenging. This clinical heterogeneity, along with frequently observed resistance to TKI suggests that our understanding of the RCC TME, and its influence in TKI response (or resistance) mechanisms is limited [52, 53].

The most frequent RCC drivers are mutations in the tumor suppressor gene Von Hippel Lindau (VHL), which plays a key role in regulating molecular pathways related to hypoxia

and angiogenesis. Targeting RCC tumor-associated vasculature using TKIs has been the most popular therapeutic approach for decades. Microphysiological systems (MPS) have demonstrated high potential in recapitulating numerous complex tumor microenvironments (TME). Despite the advantages of MPS in recapitulating sprouting angiogenesis, hypoxia, and nutrient gradients, little attention has been brought to developing MPS of RCC[17].

In this paper, we developed an MPS of RCC to assess the efficacy of anti-angiogenic therapies on key tumor hallmarks: vascular integrity, angiogenic sprouting, tumor-vascular signaling, metabolism, and proliferation. To our knowledge, this is the first MPS to assess functional effects of therapies. Particularly, sprouting angiogenesis assays and relevant luminal structures, which alters cell behavior[54, 55], are challenging to recapitulate using traditional cell culture techniques[24]. Our model appears to provide a more physiologically relevant structure and environment to recapitulate RCC more closely than traditional *in vitro* models. Interestingly, we observed that CD105, a marker of cell stemness[56], decreases in the endothelial cells in our model as a result of the co-culture, suggesting an adaptation of our iECs to a more differentiated phenotype due to TME created in our model.

Our epithelial models (high density or HD) recapitulated a central necrotic area and overall low proliferation due to a depleted environment. Further these models showed a hypoxic response that developed within 24h, as shown via qPCR and live-cell oxygen-sensitive staining, consistent with the highly hypoxic RCC[57]. While RCC cells are known to have the molecular hypoxia response pathways constitutively activated, our results point to an increase in the activity of this pathway in a nutrient- and oxygen-depleted microenvironment, which are known initiators of angiogenesis in nearby vessels[58]. Interestingly, the nutrient and oxygen-depleted environment is consistent with the heterogeneity in proliferation shown via ki-67 staining for the Caki-2 model.

Next in the angiogenic cascade is an increase in glucose consumption and transport due to a decoupling of glycolysis and TCA cycle. Both effects were observed in our HD model compared to the same cells at lower density (LD) via gene expression changes and metabolic imaging. Metabolic imaging provided real-time quantitative measurements of the redox ratio and metabolic phenotype at a single-cell level. Overall, molecular analysis and metabolic imaging demonstrated that tumor cells adapted to the nutrient-depleted microenvironment by shifting to a more glucose-dependent metabolism. Interestingly, the two cell lines we chose have stark differences between each other, starting with the VHL mutational status and 2D cell proliferation rate. Yet, the similarities in behavior and microenvironmental contributions to angiogenesis of both tumor models (A498 and Caki-2) are striking.

Tumor angiogenesis cascades respond to highly hypoxic nearby tissues (or tumors) secreting relevant growth factors and activating the angiogenesis cascade. Angiogenic cascade initiators VEGF and G-CSF were high in our models. Next, our model exhibited the main hallmarks of tumor angiogenesis: increased permeability, vessel leakiness, and increased angiogenic sprouting in the endothelial vessel.

Cabozantinib – targeting VEGFR1, 2, 3, and MET amongst other kinases –approved by the FDA in 2015, has demonstrated increased objective response and progression-free survival in clinical trials against other agents[9, 59]. However, *in vitro* studies of cabozantinib effects in the RCC TME are scarce. Here, we evaluated cabozantinib effects in each angiogenic cascade hallmark. In the vessel, the primary target of cabozantinib[60], angiogenic sprouting was suppressed in both co-culture models, suggesting that cabozantinib effectively blocks tumor angiogenesis. iEC migration detached from the lumen increased after cabozantinib treatment, which would point to an endothelial cell disconnection from the sprouts[61].

Cabozantinib blocks the VEGF pathway, key for endothelial cell survival, which could explain the decrease in vessel confluency and increased permeability in A498 treated co-cultures. Surprisingly, treated vessels in the Caki-2 co-culture partially recovered their confluency and permeability. Further, the iEC gene expression profile in treated co-cultures resembled the iEC monoculture condition more than the untreated co-culture. Finally, while A498 co-cultures showed a higher secretion of pro-angiogenic factors (e.g., VEGFA), Caki-2 responded better to VEGF targeted therapeutic Cabozantinib. This result highlights the importance of the TME and functional readouts in assessing the effectiveness of anti-cancer therapeutics among RCC subtypes, as recent literature highlights[6, 20, 62, 63].

Cabozantinib had no effect on tumor cell proliferation or at preventing migration outside of the model. Gene expression did not detect clear changes in metabolic activity of the tumor cells due to treatment. Several genes were significantly downregulated, and others were upregulated as a potential compensatory mechanism. Metabolic imaging results showed lower dependence on glycolysis and decreased free NAD(P)H in the cytosol, pointing to a recovery of the low-density A498 tumor cell phenotype. Treated cells are not as nutrient and oxygen-deprived, which points to cabozantinib being effective at suppressing aggressive tumor metabolism pro-angiogenic activity. Decreased metastasis[13] and improved overall prognosis[64] have both been reported for cabozantinib. A decrease in pro-angiogenic activity in our model can be inferred from the decrease in pro-angiogenic growth factors after treatment, which remained higher from that observed in the monoculture conditions. These results highlight the value of functional reports as a complement to molecular readouts for a full picture of drug efficacy *in vitro*.

Finally, treatment affected tumor cell viability; although, surprisingly, the pathways were different for both cell types, recapitulating *in vivo* observations[20]. These results are encouraging since cabozantinib decreased cell viability independently of the genetic profile of the tumor cells[22]. CellTiterGlo results revealed substantial cell viability after treatment. Future studies could investigate longer-term effects of cabozantinib on the tumor to evaluate potential developments of resistance and their underlying mechanisms.

Additional cell types are found and play important roles in the RCC TME, mainly immune cell infiltrates[65], which are especially important due to the rise of immunotherapies[66]. These cell types should be considered to develop a more comprehensive model to try and predict treatment efficacy of contemporary therapeutic regimens and evolving combination therapies[6, 67]. Our model has shown potential for interrogating drug efficacy at a mechanistic level, so in the future it could be leveraged to study resistance mechanisms [42,



68]. Further, this model excels at recapitulating and revealing heterogeneous behaviors in the tumor microenvironment, such as the effect of nutrient and oxygen-deprived environments. This crucial advantage, along with the amenability of this model for histology (Figure S4) and micromanipulation (e.g., microdissection)(Figure S5), provides a robust platform to investigate emerging properties of the TME that may escape traditional *in vitro* models in future studies using techniques like RNAseq or spatial transcriptomics. Notably, we have also demonstrated the ability to interrogate primary tumor samples using this model, which opens the door to personalized medicine applications of this model. Although this application would require further characterization of these samples and validation with clinical markers, the more physiologically relevant TME model presented here is uniquely suited to identify novel biomarkers and improve clinical decisions.

## Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

## Acknowledgements

The authors would like to thank the University of Wisconsin Carbone Cancer Center (UWCCC) for the use of its Shared Services to complete this research. NIH grants R33 CA225281–01.

## Data availability

All raw data used in this study is available on request to the authors.

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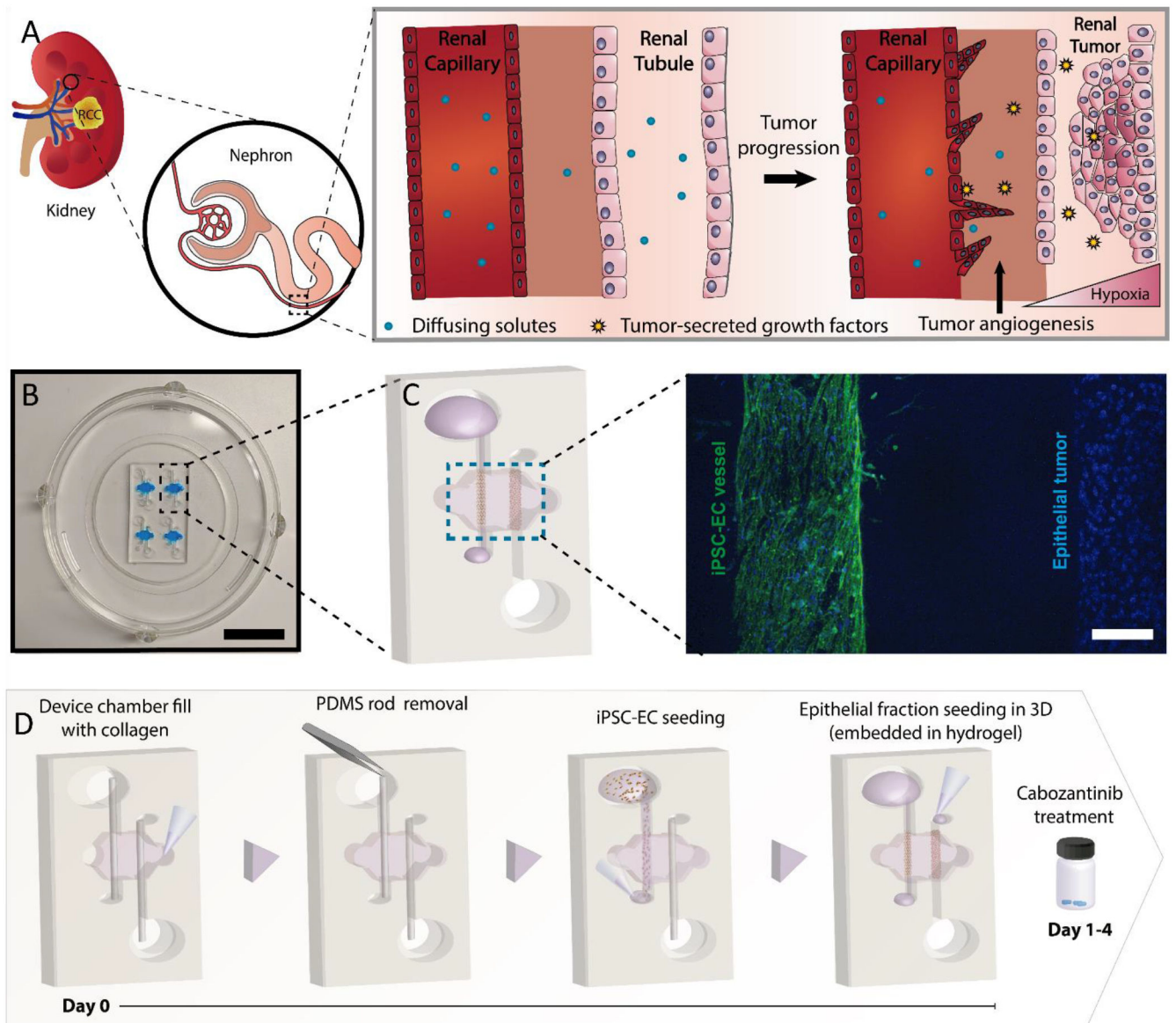
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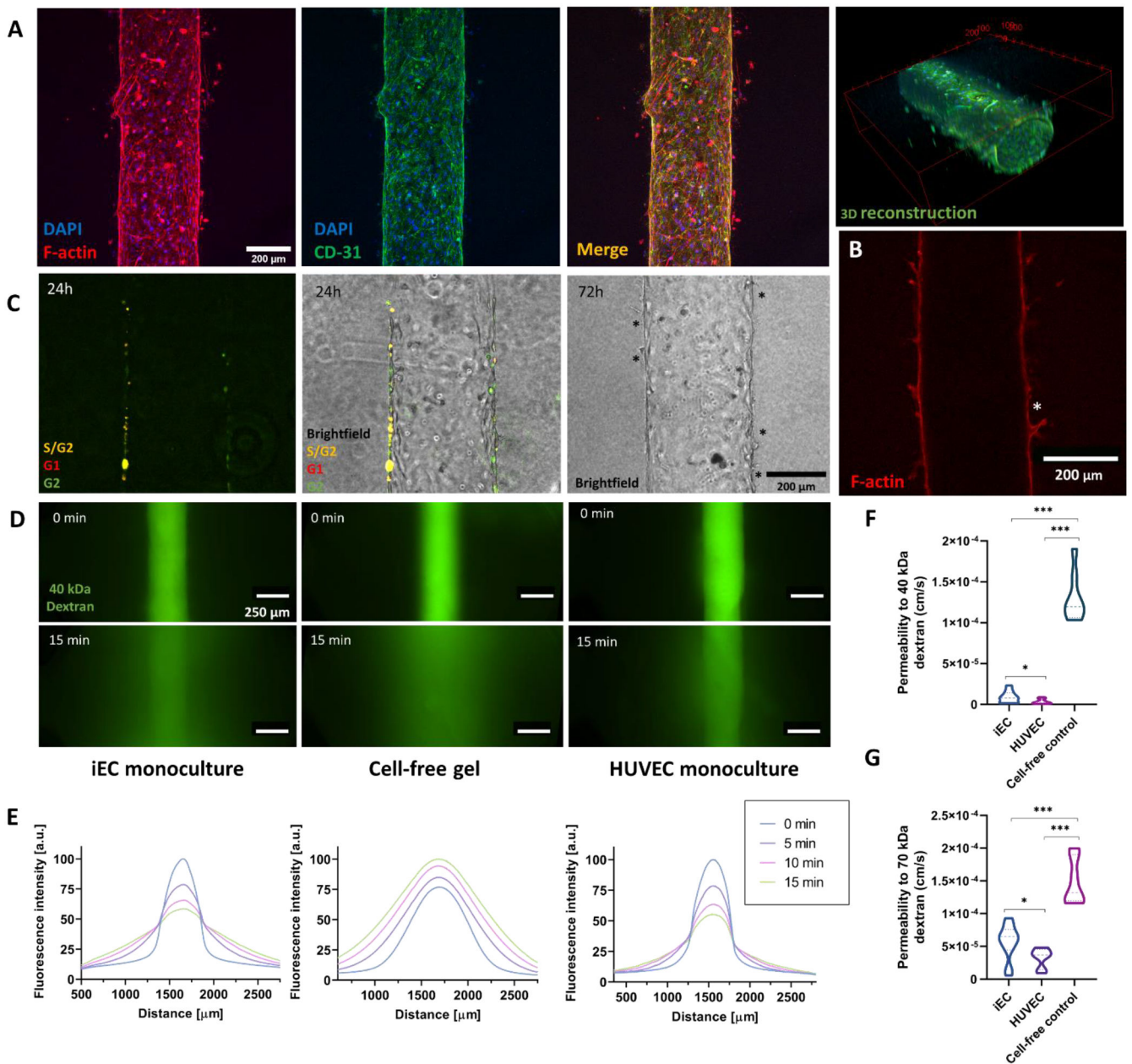




**Figure 1: Renal cell carcinoma on a chip.**

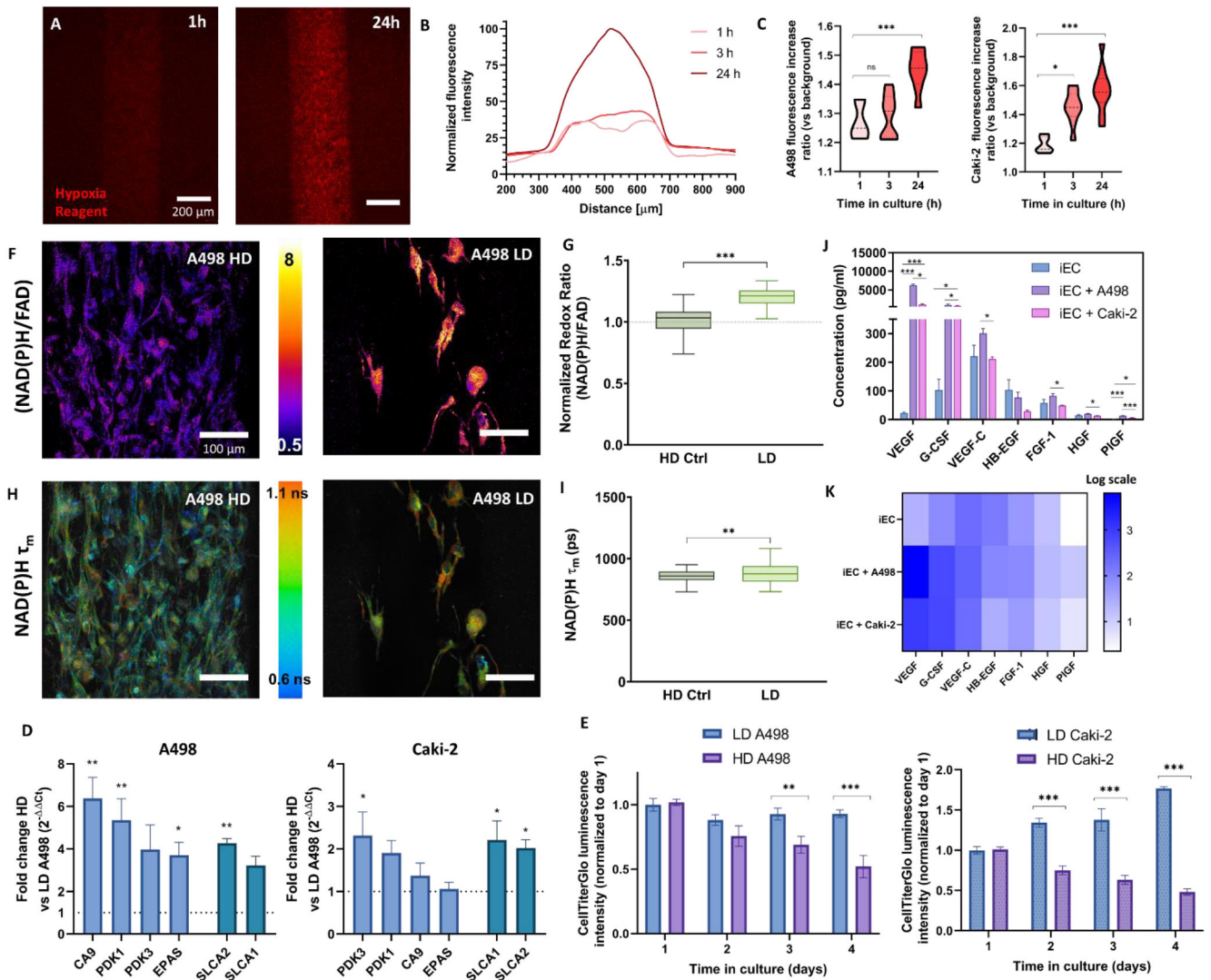
Schematic illustrating the biological processes reproduced in the microdevice. A) Illustration of the tumor progression and angiogenesis model. The model includes a renal capillary and epithelial tubule as a renal tumor develops, along with the increase in angiogenesis in the nearby vasculature. B) Picture of the microdevice and schematic of the co-culture organization in the device. C) Projected confocal image of an iEC-Epithelial co-culture stained with CD31 (green, iEC) and DAPI (blue, all nuclei). D) Schematic depicting the co-culture procedure in the microdevice and timeline for the cabozantinib treatment. Cells shown on the right are epithelial cells.





**Figure 2: iPSC-EC (iEC) endothelial vessel model establishment and characterization.**

A) iEC lumen stained with F-actin, CD31, and DAPI. 3D reconstruction of the tubular lumen using the CD31 staining. B) Cross-section of an iEC lumen stained with F-actin. The asterisk highlights a hollow sprout. C) Proliferation occurs within 24 – 72h in the lumen close to sprouting events (depicted with black asterisks). D) iEC vessel barrier function assessment via 40 kDa-FITC diffusion assays through the lumen compared to cell-free tubular structures (cell-free gel) and HUVEC vessels. Images are taken every 5 min for 15 min. E) Fluorescence plot profiles at 0 and 15 min are shown for each condition. F) Permeability coefficient comparison for 40 kDa and G) 70 kDa dextran.  $N = 4$  replicates per experiment from 3 independent experiments. Bars represent average  $\pm$  S.E.M. \* $p < 0.05$ ; \*\* $p < 0.01$ ; \*\*\* $p < 0.001$ .



**Figure 3: Establishment and characterization of the ccRCC epithelial tumor portion of the co-culture model.**

A) Projected Z-stack of images of the hypoxia dye of the HD (high density) A498 model in real-time. The fluorescence of the dye is inversely proportional to the oxygen tension. B) Line profile representation of the hypoxic response of the A498 tumor model within the first 24h. C) Quantification of the hypoxia dye intensity over time for A498 (left) and Caki-2 (right). D) Representative redox ratio images of A498 resulting from an increase in A498 density (HD vs LD) and E) Tukey box plot of redox ratio normalized to HD control condition. F) Representative NAD(P)H mean fluorescence lifetime ( $\tau_m$ ) images. Scalebar = 100  $\mu$ m. G) Tukey box plot of  $\tau_m$  quantification. H) Bead-based ELISA panel of secreted pro-angiogenic factors by the iEC monoculture model compared to A498 and Caki-2 co-culture models. ANOVA + Tukey test was used to determine significance. I) Results from (F) shown as a logarithmic scale heatmap for improved visualization. J) ATP levels of LD and HD of A498 (left) and Caki-2 (right) tumor models over 4 days. K) Gene expression changes in the HD A498 (left) and Caki-2 (right) tumor models compared to the LD. Genes are grouped left to right in metabolism (blue) and glucose transporters (cyan).

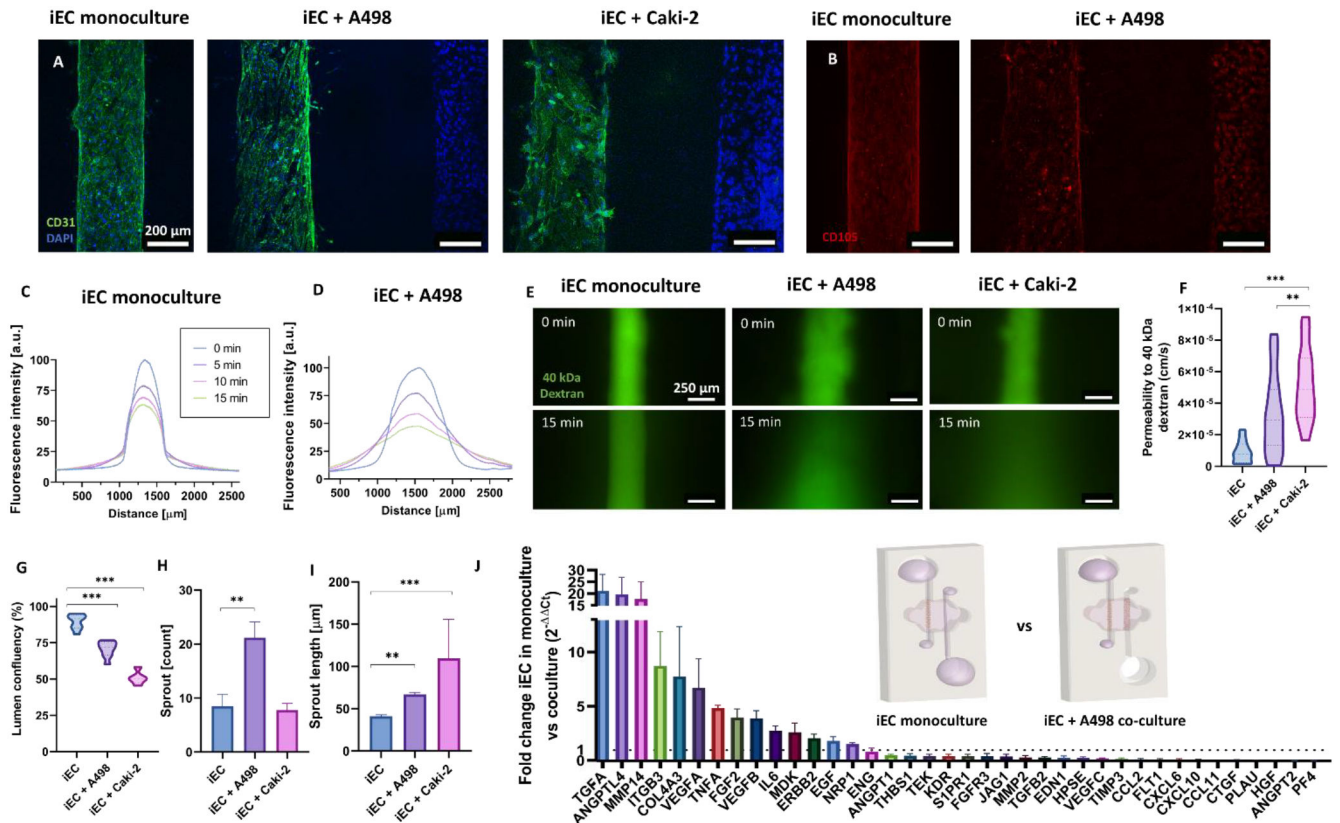
I-J) N = 4 replicates per experiment from 3 independent experiments. Paired t-tests were used to determine significance in D-E. Kruskal-Wallis and post-hoc Dunn tests were used to determine significance in C, G, and I. Bars represent average  $\pm$  S.E.M. \*p < 0.05; \*\*p < 0.01; \*\*\*p < 0.001.

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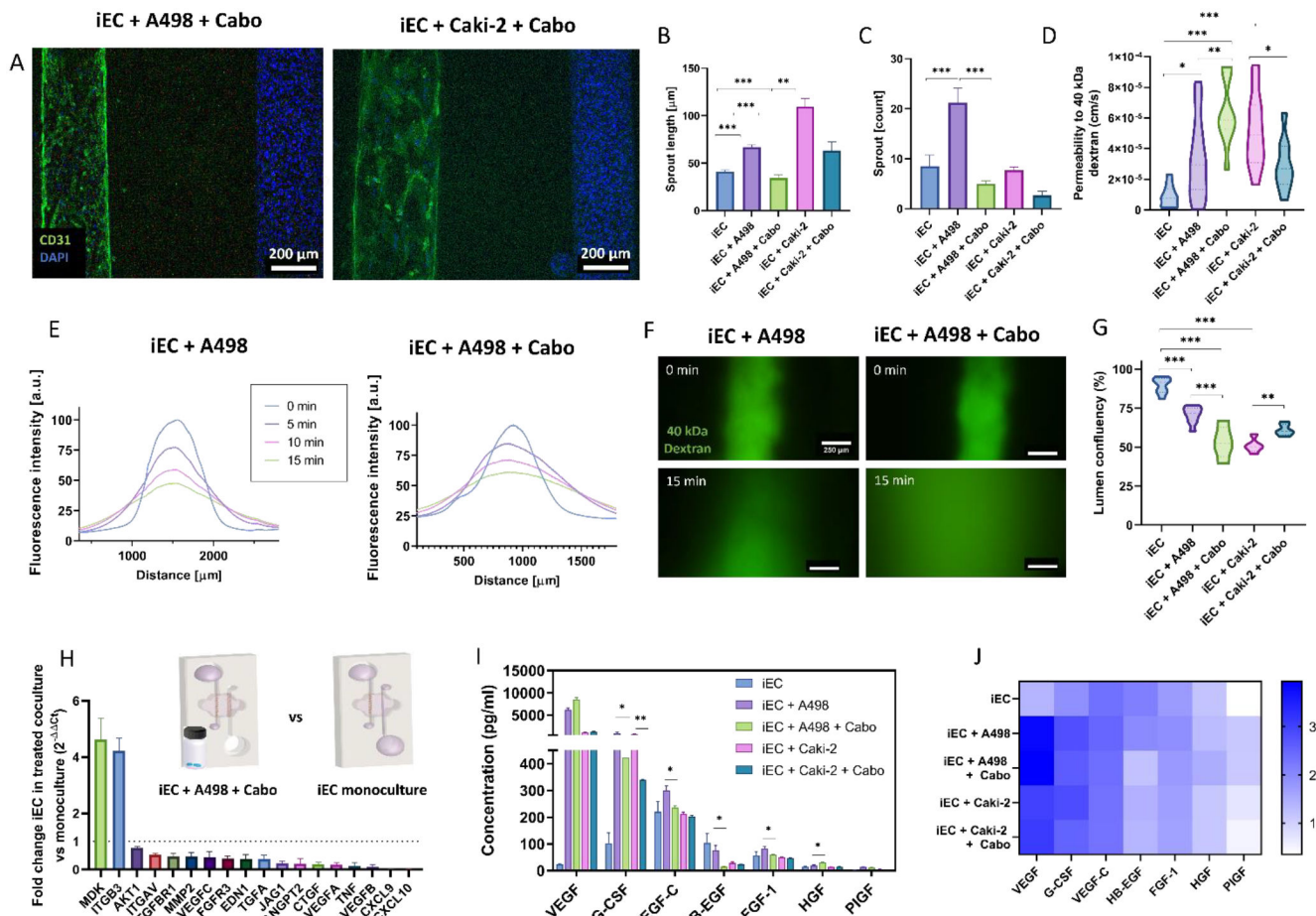
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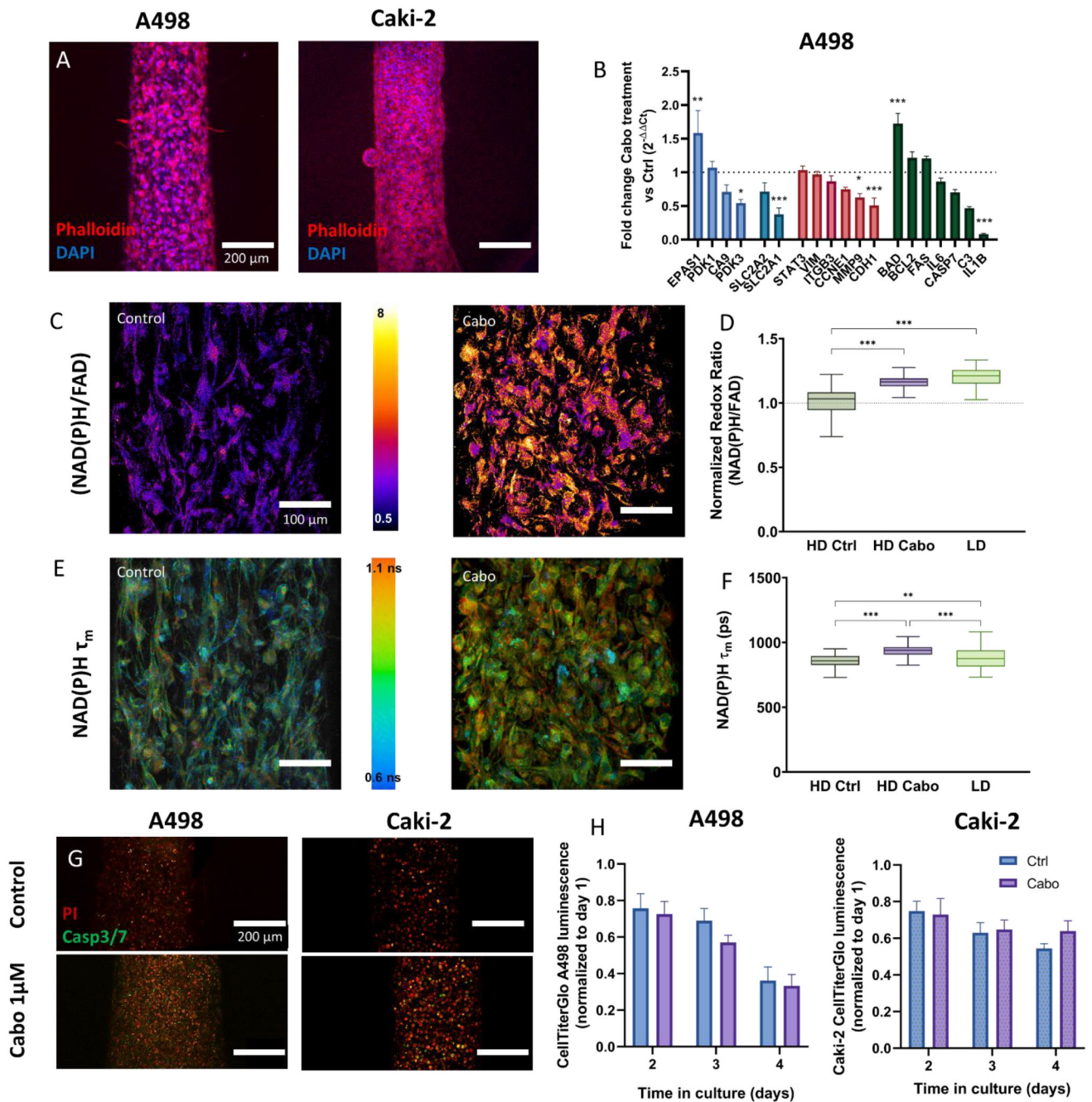


**Figure 4: Co-culture effects in the endothelial vessel model.**

A) Projected z-stack images of CD31 and DAPI-stained monoculture and co-culture models. B) CD105 expression decreases in the A498 co-culture model. C-D) Plot profile of the diffusion of a 40 kDa-FITC conjugated dextran through the (A) monoculture vessel model and (B) A498 co-culture model. E) Images of the dextran diffusion for the monoculture and co-cultures at times 0- and 15-min. F) Confluency of the iEC lumens calculated as the area occupied by F-actin staining. G) Permeability coefficient calculated from 40 kDa diffusion data. H) Quantification of the sprout number increase and I) sprout length increase in the co-cultures as compared to the monocultures. J) Waterfall plot of the significant gene expression changes between monoculture and A498 co-culture conditions. N = 4 replicates per experiment from 3 independent experiments. Bars represent average  $\pm$  S.E.M. One way-ANOVA test and Tukey post-hoc test were used to determine significance in all graphs except J, where FDR-corrected t-test was used. \*p < 0.05; \*\*p < 0.01; \*\*\*p < 0.001.







**Figure 6: Cabozantinib induces metabolic changes and cell death in the epithelial tumor model.**

A) Z-projected confocal image of the A498 (left) and Caki-2 (right) tumor model. Scalebar = 200  $\mu\text{m}$ . B) qPCR changes in the A498 tumor model after treatment. Genes are grouped left to right in categories: metabolism (blue), glucose transporters (cyan), adhesion and migration (red), and cell survival (green). C-F) Metabolic imaging changes in A498 resulting from cabozantinib treatment. (C) Representative redox ratio images and (D) Tukey box plot of redox ratio normalized to HD control condition, (E) Representative NAD(P)H mean fluorescence lifetime ( $\tau_m$ ) and (F) Tukey box plot of  $\tau_m$  quantification. Scalebar = 100  $\mu\text{m}$ . G) Changes in A498 and Caki-2 viability as a result to treatment. Z-projected



confocal images of A498 stained with propidium iodide (red) and Caspase3/7 live staining reagent (green). H) Normalized CellTiterGlo measurements of untreated and treated A498 (left) and Caki-2 (right) tumor models' overtime. n = 4 replicates per experiment from 3 independent experiments. Bars represent average  $\pm$  S.E.M. FDR-corrected t-test was used for (B), whereas a Kruskal-Wallis test and Dunn post-hoc test was used for (D and F). \*p < 0.05; \*\*p < 0.01; \*\*\*p < 0.001.

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