# A Whole Genome-Wide Arrayed CRISPR Screen in Primary Organ Fibroblasts to Identify Regulators of Kidney Fibrosis

SLAS Discovery 2020, Vol. 25(6) 591–604 © 2020 The Author(s)

DOI: 10.1177/2472555220915851 journals.sagepub.com/home/jbx

(S)SAGE

Robert J. Turner<sup>1</sup>, Stefan Golz<sup>2</sup>, Carina Wollnik<sup>1</sup>, Nils Burkhardt<sup>2</sup>, Ina Sternberger<sup>1</sup>, Uwe Andag<sup>3</sup>, and Hauke Cornils<sup>1</sup>

#### Abstract

Kidney fibrosis presents a hallmark of chronic kidney disease. With ever-increasing patient numbers and limited treatment options available, novel strategies for therapeutic intervention in kidney disease are warranted. Fibrosis commonly results from a wound healing response to repeated or chronic tissue damage, irrespective of the underlying etiology, and can occur in virtually any solid organ or tissue. In order to identify targets relevant for kidney fibrosis, we aimed to employ CRISPR screening in primary human kidney fibroblasts. We demonstrate that CRISPR technology can be applied in primary kidney fibroblasts and can furthermore be used to conduct arrayed CRISPR screening using a high-content imaging readout in a whole genome-wide manner. Hits coming out of this screen were validated using orthogonal approaches and present starting points for validation of novel targets relevant to kidney disease.

#### **Keywords**

arrayed CRISPR screen, fibrosis, target identification

## Introduction

Genetic screens present an unbiased approach to identify factors contributing to biological phenotypes and, with this, the opportunity to identify novel targets for therapeutic intervention.<sup>1-3</sup> CRISPR technology especially holds promise in this context compared with RNAi technology since CRISPR has the power to generate real knockouts as compared to variable knockdowns, hence overcoming one of the hurdles of RNAi technology.<sup>4–7</sup> Especially the combination of CRISPR with lentiviral delivery has proven to be a powerful screening tool.<sup>2,8-11</sup> Delivery of CRISPR components using lentivirus allows the targeting of proliferating and nonproliferating cells, selection for transfected cells, and long-lasting activity of the CRISPR system, thereby maximizing the chance of target editing. Additionally, the integrated lentivirus genome allows the use of pooled screening setups. In pooled screens, a population of cells is infected with a pooled library and the integrated lentivirus genome allows pool deconvolution using next-generation sequencing (NGS) after the experiment.<sup>1</sup> However, while beneficial in terms of library generation and experimental setup, pooled screening approaches are limited in terms of assay readout. Arrayed libraries, on the other hand, allow the combination of CRISPR screening with a vast array of readout options, such as high-content imaging, time-resolved fluorescence energy transfer (TR-FRET), or quantitative PCR (qPCR).<sup>12</sup> In addition, with respect to their basic setup,

arrayed CRISPR screens are comparable to phenotypic screens and assays developed for phenotypic screening can be adapted for genetic screens and vice versa. A combination of both screening approaches could therefore maximize the use of a disease-relevant assay for drug discovery.

Here we aimed to evaluate arrayed CRISPR screening in a high-content-based assay developed to identify novel regulators of kidney fibrosis. Organ fibrosis represents a multifactorial condition that can affect virtually every solid organ.<sup>13,14</sup> Independent of the source of damage, activation of the resident tissue fibroblasts and their transition into myofibroblasts (pericyte-to-myoblast transition [PMT]) resulting in excessive generation of extracellular matrix is a common feature of organ fibrosis.<sup>15</sup> Targeting the activation of tissue resident fibroblasts and their progression to a myofibroblast phenotype has thus been an opportunity for

<sup>1</sup>In Vitro Biology, Evotec SE, Hamburg, Germany
<sup>2</sup>Lead Discovery, Bayer AG, Wuppertal, Germany
<sup>3</sup>Metabolic Disease, Evotec International GmbH, Göttingen, Germany

Received Nov 28, 2019, and in revised form March 2, 2020. Accepted for publication March 3, 2020.

Supplemental material is available online with this article.

#### **Corresponding Author:**

Hauke Cornils, Target Identification/In Vitro Pharmacology, Evotec SE, Essener Bogen 7, Hamburg, 22419, Germany. Email: Hauke.cornils@evotec.com therapeutic intervention. Primary cells, challenged by an agent relevant for the disease, in combination with a readout reminiscent of a disease manifestation present an attractive system for pharmacological and genetic target identification.<sup>16,17</sup> Here we describe the development of a fibrosis-relevant high-content assay in primary human kidney fibroblasts (HKFs) that we combined with CRISPR technology for a whole genome-wide genetic hit identification campaign for novel targets in kidney fibrosis.

## **Material and Methods**

#### Reagents

Blasticidin (R21001), puromycin (A11138-03),  $4 \times$  LDS sample buffer (NP0008/7),  $10 \times$  sample reducing agent (NP0004/9), NuPAGE 4%-12% Bis-Tris Plus gels 10well (NW04120BOX), NuPAGE antioxidant (NP0005),  $20 \times$ NuPAGE transfer buffer (NP0006), Alexa Fluor 488 goat anti-mouse IgG2a (A21131), and Alexa Fluor 488 goat anti-mouse IgG (H+L) (A11029) were purchased from Thermo Fisher Scientific. (Fisher Scientific GmbH, Schwerte, Germany) Triton-X100, mouse monoclonal antialpha-smooth muscle actin (anti-aSMA; clone 1A4), mouse monoclonal anti-collagen type I (C2456), saponin from Quillaja bark (S4521), albumin human (A9731), albumin fraction V (1120180100), and transforming growth factorβ1 (TGF-1) human (A7481) were purchased from Sigma. Design rhodamine phalloidin (PHDR1) was obtained from Cytoskeleton (tebu-bio, Offenbach, Germany). DRAQ5 (DR51000) was obtained from Biostatus (Shepshed, UK). Fasudil hydrochloride (0541/10), GSK 269962 (4009/10), imatinib mesylate (5906/100), and SB431542 (1614/10) were purchased from Bio-Techne GmbH (Wiesbaden-Nordenstadt, Germany). Dasatinib (S1021), nintedanib (S1010), bortezomib (S1013), and carfilzomib (S2853) were purchased from Selleckchem (München, Germany). Polybrene (TR-1003-G) was obtained from Merck (Darmstadt, Germany). Normal goat serum (S-1000) was obtained from Vector Labs (Biozol Diagnostica, Eching, Germany). IRDye 680RD conjugated goat anti-mouse IgG (926-68070) and IRDye 800CW conjugated goat anti-rabbit IgG (926-32211) was obtained from LI-COR (Bad Homburg, Germany). GAPDH (14C10) rabbit monoclonal antibody (mAb; 2118) and Cas9 (7A9-3A3) mouse mAb was obtained from Cell Signaling Technology (Leiden, Netherlands). BioCoat Collagen I 384-well microplates and purified mouse anti-Smad2/3 clone 18 (610842) were from Becton Dickinson (Heidelberg, Germany). MKL1/MRTF-A mouse mAb (sc-390324) was from Santa-Cruz.

#### Lentivirus Constructs and Screening Library

Cas9 lentivirus (LentiArray Cas9 Lentivirus [A32064]) was from Thermo Fisher Scientific. gRNA lentivirus was

ordered from Sigma as QuickPick KO gRNAs with two different gRNAs/means per target gene, and for hit follow-up activities two additional gRNAs were chosen: The "Guaranteed Predesigned gRNA" panel from Sigma is based on the predicted efficiency score. Designs for QuickPick clones were taken from the Sanger Arrayed CRISPR library (Sigma), an arrayed lentivirus gRNA library encompassing the whole genome with two different gRNAs/means per target provided in two separate wells of a 384-well plate.12 The Sanger Arrayed library was also used for genome-wide screening. Titers of the used lentivirus were determined using a p24-based enzyme-linked immunosorbent assay (ELISA) at the vendor and multiplicities of infection (MOIs) in assays were calculated as the fraction of added transduction units (TU) per cell in the well during infection. For the Sanger library, p24 titer information is given for 20 representative wells/384-well plate; in total, 5.5% (n = 2040) of the lentivirus contained in the library p24 titer is provided.

## Cell Culture

HKFs (ASE-5213) were purchased from CellSystems (Troisdorf, Germany). Cells were maintained at 37 °C in a humidified 5% CO<sub>2</sub> atmosphere and cultured in FibroLife S2 Medium Complete Medium (LL-0011) from CellSystems (Troisdorf, Germany) containing 100 IU/mL penicillin and 100  $\mu$ g/mL streptomycin (15140-122) from Thermo Fisher Scientific.

Human pulmonary fibroblasts (HPFs; C12360) were purchased from PromoCell (Heidelberg, Germany). Cells were maintained at 37 °C in a humidified 5% CO<sub>2</sub> atmosphere in Dulbecco's modified Eagle's medium (DMEM)/Ham's F-12 (1:1) with 2.5 mM L-glutamine (11320-074), 10% fetal calf serum (FCS; 10500-054) from Thermo Fisher Scientific, and 100 IU/mL penicillin and 100  $\mu$ g/mL streptomycin.

Normal rat kidney (NRK-49f) cells (CRL 1570) were purchased from ATCC (Wesel, Germany). Cells were maintained at 37 °C in a humidified 5% CO<sub>2</sub> atmosphere in DMEM (30-2002) from ATCC, 10% FCS, and 100 IU/mL penicillin and 100  $\mu$ g/mL streptomycin.

## PMT Assays

For PMT in HKFs, cells were seeded into BioCoat Collagen I 384-well microplates at a density of 4000 cells/well in FibroLife S2 medium complete medium and left overnight at 37 °C in a humidified 5%  $CO_2$  atmosphere. The following day, the media was removed and the cells were washed two times in an assay media consisting of DMEM/Ham's F-12 (1:1), with 2.5 mM L-glutamine, 0.1% FCS, and 100 IU/mL penicillin and 100 µg/mL streptomycin. Plates were incubated overnight at 37 °C in a humidified 5%  $CO_2$  atmosphere with a final addition of assay media. The following day, either test compounds, reference compound

SB431542, or DMSO controls (final DMSO concentration of 0.25%) were preincubated with the cells for 15 min at 37 °C in a humidified 5% CO<sub>2</sub> atmosphere. Cells were stimulated by the addition of TGF- $\beta$  at a final assay concentration of 0.3 ng/mL (EC<sub>80</sub>), and the plates were incubated for 48 h at 37 °C in a humidified 5% CO<sub>2</sub> atmosphere prior to fixation and staining. To assess collagen deposition, the PMT assay was adapted by extending the TGF- $\beta$  (1 ng/mL) treatment to 72 h in the presence of ascorbic acid (100  $\mu$ M).

To assess PMT in HPFs, these were seeded into BioCoat Collagen I 384-well microplates at a density of 2500 cells/ well in an assay medium (DMEM/Ham's F-12 (1:1), with 2.5 mM L-glutamine, 0.3% FCS, and 100 IU/mL penicillin and 100  $\mu$ g/mL streptomycin. Plates were incubated overnight at 37 °C in a humidified 5% CO<sub>2</sub> atmosphere. The following day, compound treatment was done as described above and cells were stimulated by the addition of TGF- $\beta$  at a final assay concentration of 3 ng/mL (EC<sub>80</sub>), and the plates were incubated for 48 h at 37 °C in a humidified 5% CO<sub>2</sub> atmosphere prior to fixation and staining.

For experiments with NRK-49f cells, the cells were seeded into BioCoat Collagen I 384-well microplates at a density of 4500 cells/well in an assay medium (DMEM, 0.3% FCS, and 100 IU/mL penicillin and 100 µg/mL streptomycin). Plates were incubated overnight at 37 °C in a humidified 5% CO<sub>2</sub> atmosphere. The following day, compound treatment was done as described above and cells were stimulated by the addition of TGF- $\beta$  at a final assay concentration of 3 ng/mL (EC<sub>80</sub>), and the plates were incubated for 48 h at 37 °C in a humidified 5% CO<sub>2</sub> atmosphere prior to fixation and staining.

## Immunofluorescence Staining

To stain for aSMA and Cas9, the media on the cells was discarded by inversion of the plate and cells were fixed for 20 min with 4% paraformaldehyde (PFA) solution in phosphate-buffered saline (PBS). After fixation, plates were washed three times with PBS and blocked by the addition of a blocking buffer (3% v/v normal goat serum, 2% w/v albumin fraction V, and 0.1% saponin in PBS) for 30 min at room temperature. The blocking buffer was discarded by inversion of the plate and the plates were incubated with anti-aSMA antibody (4  $\mu$ g/mL) or anti-Cas9 antibody (5  $\mu$ g/ mL) in blocking buffer for 1 h at 37 °C. Plates were washed three times in PBS and incubated for a further 1 h at room temperature with Alexa Fluor 488 goat anti-mouse IgG2a (1 µg/mL) and rhodamine phalloidin (28 nM) in blocking buffer. Plates were washed three times in PBS before the addition of Draq5 (10 µM in PBS). Plates were sealed and images were acquired on a PerkinElmer Opera QEHS imaging device using a  $10 \times$  air objective for aSMA and  $20 \times$  air objective for Cas9. Per sample, 5 fields of view were acquired with  $2 \times 2$  binning.

To stain for SMAD2/3, plates were fixed with 4% PFA solution in PBS and then blocked in a blocking buffer (5% v/v normal goat serum and 0.2% v/v Triton X-100 in PBS) for 1 h at room temperature. Plates were washed three times with PBS and anti-SMAD2/3 mAb was added (1.25  $\mu$ g/mL) in antibody dilution buffer (5% v/v normal goat serum in PBS), and the plates were incubated for 2 h at room temperature. Plates were washed three times in PBS and Alexa Fluor 488 goat anti-mouse IgG (H+L) in antibody dilution buffer was added (1  $\mu$ g/mL), and the plates were incubated for 1 h at room temperature. Plates were washed three times in PBS before the addition of Draq5 (10  $\mu$ M in PBS). Plates were sealed and images were acquired on a PerkinElmer Opera QEHS imaging device as described above.

To assess collagen I staining, the media was discarded by inversion of the plate and cells were fixed for 10 min with methanol at 4 °C. After fixation, plates were washed three times with PBS and blocked by the addition of a blocking buffer (6.25% v/v FCS in PBS) for 30 min at room temperature. The blocking buffer was discarded by inversion of the plate and the plates were incubated with anti-collagen type I antibody (4 µg/mL) in blocking buffer for 2 h at room temperature. Plates were washed three times in PBS and incubated for a further 1 h at room temperature with Alexa Fluor 568 goat anti-mouse IgG1 (y1) (1 µg/mL) in blocking buffer. Plates were washed three times in PBS before the addition of Draq5 (10 µM in PBS). Plates were sealed and images were acquired on a PerkinElmer Opera QEHS imaging device as described above.

#### Image Analysis

Once the images were acquired on a PerkinElmer Opera QEHS imaging device, the associated ACapella scripting environment was used to analyze the data. To quantify aSMA expression levels, DRAQ5 was used for cell nuclei detection and rhodamine-labeled phalloidin as an actin marker was used to estimate the cell area. Within the cytoplasmic area, which was calculated as the cell region minus the nucleus region, the aSMA intensity was determined per cell (Suppl. Fig. S1). Normalization against the aSMA background intensities outside the cell was used to counteract day-to-day staining intensity variation. Actin staining intensities were used to determine the area not covered by cells (Suppl. Fig. S2). A fallback method was used for images where no background could be found. In those cases, the first peak of an intensity histogram of the aSMA intensities per field was chosen as background intensity substitute. Per cell, an intensity ratio was calculated by dividing the cytoplasmic aSMA intensity by the average aSMA intensity of the background. Cells were selected as positive if the intensity ratio was  $\geq 6$  (Suppl. Fig. S3). The ratio of positive cells over all cells detected per sample was used to calculate the percentage of positive cells.

To detect collagen I positive cells, a similar approach to that for aSMA was used. For the collagen assay nuclei detection was based on the DRAQ5 signal, which was also used for cell outline detection. In cases where cytoplasmic DRAQ5 staining was not above background, a ring-like region around the nucleus was used as a substitution to determine the cytoplasmitic region. Similar to the background normalization done for the aSMA readout, the collagen I intensity estimated within the cytoplasm was normalized against the mean background intensity. Per cell, an intensity ratio was calculated by dividing the cytoplasmic collagen I intensity by the average collagen I intensity of the background. Cells were selected as positive if the intensity ratio was  $\geq 3$  (Suppl. Fig. S4). MKL1 intensities were determined as for collagen I, except that whole cell intensities were used. The intensity ratio cutoff was set at 2.

To assess SMAD2/3 translocation, DRAQ5 was used for nuclei detection and cell outline estimation. SMAD2/3 intensity was determined within the nucleus and cytoplasm region separately and used to calculate a SMAD2/3 intensity ratio. Here, SMAD2/3 intensity within the nucleus was divided by SMAD2/3 intensity within the cytoplasm region. The ratio was calculated per cell and then averaged per field and per well. If the ratio was above a threshold of 3, a cell would be counted as positive for SMAD2/3 translocation to the nucleus (**Suppl. Fig. S5**).

## Western Blotting

Samples were combined with LDS sample buffer and reducing agent and heated for 10 min at 95 °C. Sodium dodecyl sulfate–polyacrylamide gel electrophoresis (SDS-PAGE) was done using NuPAGE 4%–12% Bis-Tris gels and transferred to nitrocellulose using the XCell II Blot Module (Thermo Fisher Scientific). Membranes were blocked in LI-COR blocking buffer and then incubated with the primary antibodies overnight. Primary antibodies were used at 1:250 (anti-Cas9), 1:500 (anti-MKL1), and 1:1000 (anti-GAPDH) in Tris-buffered saline with Tween 20 (TBST). After washing with TBST (three times for 10 min), blots were incubated with the appropriate IRDye-labeled secondary antibodies for 2 h and washed again as above before visualization using Odyssey infrared imaging (LI-COR Biosciences).

## Transcriptomics Analysis

HKFs (64,000 cells/well) and HPFs (40,000 cells/well) were seeded into 24-well tissue culture plates in their appropriate cell culture media and overnight at 37 °C in a humidified 5% CO<sub>2</sub> atmosphere. The following day, the cells were washed two times in assay media and a final volume of assay media was added and the plates were left overnight at 37 °C in a humidified 5% CO<sub>2</sub> atmosphere. The following day, cells were stimulated by the addition of TGF- $\beta$  at EC<sub>80</sub>, and the plates were incubated for 4 h at 37 °C in a

humidified 5% CO<sub>2</sub> atmosphere prior to RNA isolation using the Qiagen Rneasy Mini Kit. RNA sequencing libraries were generated using the Illumina TruSeq Stranded mRNA Library Preparation kit and run on an Illumina Hiseq2500 device using  $1 \times 50$  bp single-end reads. RNAseq reads were aligned to the human reference genome (GRCh38) using STAR (v2.5.3a).<sup>18,19</sup> Reads per gene were counted using the "—quantMode GeneCounts" option of STAR aligner, using Ensembl 91 genome annotation as a reference. Counts were log normalized in R (v3.4.1) and a principal component analysis (PCA) was constructed based on 500 genes with the highest variance of expression level using the R function prcomp.

## HKF Cas9 Cell Line Generation

HKFs at early passage were seeded into 12-well plates at a density of 100,000 cells/well in FibroLife S2 Medium Complete Medium and left overnight at 37 °C in a humidified 5% CO<sub>2</sub> atmosphere. LentiArray Cas9 Lentivirus was added in the presence of 8  $\mu$ g/mL polybrene at a final MOI of 5. The plate was spun at 930g, 30 °C for 1 h and then incubated overnight at 37 °C in a humidified 5% CO<sub>2</sub> atmosphere. Selection was done using blasticidin at 5  $\mu$ g/mL until noninfected control well cells were dead. Cells were expanded for characterization and storage.

## CRISPR PMT Assay

HKF-Cas9 cells were seeded into BioCoat Collagen I 384well microplates at a density of 750 cells/well in FibroLife S2 Medium Complete Medium and left overnight at 37 °C in a humidified 5% CO<sub>2</sub> atmosphere. The following day, the cells were spin infected at 930g/30 °C with gRNA lentivirus at different MOIs in the presence of polybrene (8 µg/mL) for 1 h. Plates were incubated overnight at 37 °C in a humidified 5% CO<sub>2</sub> atmosphere. The following day, the media was removed and fresh media was added containing puromycin (0.6  $\mu$ g/mL), and the cells were incubated for another 5 days at 37 °C in a humidified 5% CO<sub>2</sub> atmosphere. The media was removed and the cells were washed two times in assay media and incubated overnight at 37 °C in a humidified 5% CO2 atmosphere with a final addition of assay media. The following day, cells were stimulated with TGF- $\beta$  at a final assay concentration of 1 ng/mL for 48 h at 37 °C in a humidified 5% CO2 atmosphere and further processed as described above. To assess for differences in SMAD2/3 translocation, cells were treated as described above; however, treatment following starvation was only for 6 h.

## Whole Genome-Wide Screening Assay

Due to the liability of lentivirus to freeze and thaw cycles, two screening-ready intermediate plates were generated from each stock plate (containing 20 µL of 10,000 TU/µL average per construct) prior to screening. To this end, 15 µL of cell culture media was added in an intermediate plate (Multidrop) and 2 µL of lentivirus from each stock plate was added using a CyBi Selma with a 384-well head (Analytik Jena). Plates were stored at -80 °C until needed. One day prior to screening, HKF-Cas9 cells were seeded into BioCoat Collagen I 384-well microplates at a density of 750 cells/well in 30 µL of FibroLife S2 Medium Complete Medium (Multidrop) and left overnight at 37 °C in a humidified 5% CO<sub>2</sub> atmosphere. The following day, 5  $\mu$ L of 8× polybrene medium (8  $\mu$ g/mL final) was added onto the cells (Multidrop), followed by transfer of 6 µL of virus supernatant from intermediate plates using a CyBi Selma with a 384-well head (Analytik Jena). With the titer information available for the library we calculated the resulting MOI during infection. Supplemental Figure S7 shows the distribution of MOIs across the screening plates. With the added amount of lentivirus during screening, a median MOI of 9.2 is achieved and only for only 6.6% would result in an MOI of >20. Assay controls (nontargeting and ACTA2 expressing gRNA lentivirus) were prediluted and added to screening plates separately using a multiwell pipette at an MOI of 5. Cells were spin infected for 1 h at 930g/30 °C and left overnight at 37 °C in a humidified 5% CO<sub>2</sub> atmosphere. The following day, the media was removed and 40  $\mu L$  of fresh media was added (Multidrop) containing puromycin (0.6 µg/mL), and the cells were incubated for another 5 days at 37 °C in a humidified 5% CO<sub>2</sub> atmosphere. After 5 days, the media was removed and the cells were washed two times in assay media and incubated overnight at 37 °C in a humidified 5%  $CO_2$  atmosphere with the final addition of 40 µL of assay media (Multidrop). After the overnight incubation in assay media, cells were stimulated by the addition of 10 µL of TGF- $\beta$ -containing medium to a final assay concentration of 1 ng/mL for 48 h at 37 °C in a humidified 5% CO<sub>2</sub> atmosphere. Plates were then fixed with 4% PFA solution and processed for imaging.

#### Data Analysis

Z' factors and signal-to-background (S/B) ratios were calculated as described.<sup>20</sup> For pathway analysis, gProfiler<sup>21</sup> was used with the following parameter: Statistical Domain scope=Allknowngenes;SignificanceThreshold=Benjamini-Hochberg FDR; User Threshold=0.05. Enrichment analysis focused on Wikipathways. Error bars show the standard deviation of technical replicates ( $\geq$ 3). EC<sub>50</sub> and IC<sub>50</sub> values were determined using the Prism software nonlinear regression and a four-parameter fit (GraphPad Prism Software, La Jolla, CA). RNAseq and image analysis were processed as described above. All experiments except primary screening, hit confirmation, and RNAseq analysis have been independently repeated at least once.

## Results

## Establishment of a High-Content Assay for Fibroblast Activation in Primary Kidney Fibroblasts

In order to establish a phenotypic cellular PMT assay, we focused our activities on using primary kidney fibroblasts, thus establishing a cellular system that employs the diseaseaffected cell type from the affected organ, as organ-specific differences in fibroblasts have been described. The induction of aSMA is a widely described marker for PMT, which can robustly be induced by treatment with TGF- $\beta$ ,<sup>22,23</sup> a master inducer of fibrosis. As shown in Figure 1A, we were able to identify three different primary fibroblast lines that show low baseline levels of aSMA and induction upon TGF-β treatment. Following optimization of assay parameters such as cell density and treatment time, we were able to develop a robust assay for measuring the induction of aSMA following TGF- $\beta$  treatment with comparable EC<sub>50</sub> values for each of the three lines (Fig. 1B). For further characterization, we focused on cells coming from two donors (HKF-515 and HKF-616), as the third (HKF-714) had a noted history of hypertension and also failed in coping with lentivirus infection (data not shown). Using RNAseq, we further confirmed that these two HKF lines show similarities at baseline as well as following a short (4 h) treatment with TGF- $\beta$ . In addition, these are different from another primary human fibroblast cell type coming from the lung (Fig. 1C). We furthermore evaluated a set of pharmacological tools to modulate the activation of fibroblasts in our HKFs in comparison with a rat kidney fibroblast cell line and the aforementioned primary human lung fibroblasts.<sup>24</sup> As seen in Figure 1D, the response to pharmacological manipulation is very similar between the HKFs, with noted differences from the other cell line models, confirming that primary human fibroblasts established from kidney show cell type- and origin-specific responses and thus present relevant models for further development.16,25 Finally, we aimed to extend our characterization of the HKFs to two additional PMT-relevant readouts: increase in fibroblast proliferation and increased collagen production.<sup>26</sup> As expected, TGF-B treatment increases both cell numbers and collagen production with similar EC<sub>50</sub> values to those observed for aSMA induction (Fig. 1E and Suppl. Fig. S4). Furthermore, both readouts can be inhibited by the ALK5 inhibitor SB431542 (Fig. 1F and Suppl. Fig. S4). Taken together, these data show that primary HKFs demonstrate cell type- and origin-specific responses, and that they can be used to set up a robust PMT assay.

## Application of CRISPR Technology in Primary Kidney Fibroblast Model

Having identified two cell lines with robust responses to  $TGF-\beta$  stimulation, we tested whether these would be amenable



**Figure 1.** Development of a PMT assay in primary HKFs. (**A**) Induction of smooth muscle actin and stress fibers in three different kidney fibroblast lines. Representative images of cells from three different fibroblast lines at baseline and following TGF- $\beta$  stimulation. Cells were seeded at 4000 cells/well I day prior to a 24 h starvation followed by a 48 h stimulation with 10 ng/mL TGF- $\beta$ . Cells were fixed and stained using aSMA antibody as well as phalloidin and DRAG5 as nuclear markers. Scale bar = 250 µm. (**B**) Quantification of aSMA induction following TGF- $\beta$  treatment in DRC. HKFs were seeded and treated as described for PMT assays with increasing concentrations of TGF- $\beta$ . Induction of aSMA was quantified using an Acapella-based script as described. (**C**) Characterization of fibroblast lines using RNAseq. Cells were seeded overnight at 80% confluence and starved for 24 h prior to a 4 h stimulation with TGF- $\beta$  at EC<sub>80</sub> at least in duplicate. Cellular RNA was harvested and prepared for analysis by RNAseq. PCA was constructed based on 500 genes with the highest variance of expression level using R. (**D**) Pharmacological characterization of fibroblast lines using the Rho kinase inhibitors fasudil hydrochloride and GSK 269962, the c-Abl inhibitor imatinib mesylate, the Alk5 inhibitor SB431542, and the tyrosine kinase inhibitors nintedanib and dasatenib. Cells were treated as described for PMT assay and analyzed for aSMA induction. (**E**) Characterization of increase in cell numbers and collagen following TGF- $\beta$  treatment. HKF515 cells were treated as in **B**, but following incubation they were analyzed for collagen and cell counts. (**F**) Inhibition of proliferation and collagen response by SB431542. Cells were treated as in **D** but analyzed for collagen and cell count.

to genetic manipulation using CRISPR technology. With the prospect of maximizing editing rates due to constitutive expression of the CRISPR components and the opportunity to select transfected cells, we focused on using a lentivirusbased CRISPR system for these tests. We derived stable Cas9-expressing cell pools from early passage cells and characterized these for Cas9 expression. As shown in Figure 2A,B, Cas9 is expressed above the background in all cells in the selected pool. Furthermore, the cells continued to proliferate in culture, allowing them to be passaged up to p18 and thus providing a system for further manipulation and expansion to support a screening initiative. We confirmed that expression did not affect the morphology of the cells as well as the baseline aSMA level (Fig. 2C). Following TGF-B treatment, aSMA and stress fibers are induced in Cas9-expressing cells (Fig. 2C). Importantly, the response to TGF- $\beta$  in dose–response curves (DRCs) is also not blunted in terms of both  $EC_{50}$  and efficacy (Fig. 2D), thus confirming that lentivirus infection or Cas9 expression per se does not affect the PMT assay. As the next step, we evaluated whether Cas9 would be active in the selected pools. To this end, we infected Cas9-expressing cells with lentivirus containing gRNAs targeting the gene for aSMA (ACTA2), selected the cells, and treated them according to our PMT assay. As shown in Figure 2E, the induction of aSMA following TGF- $\beta$  treatment is severely impaired in cells infected with gRNAs against ACTA2, whereas it is not affected in cells expressing a nontargeting gRNA. We confirmed this finding by directly assessing the level of MKL1 following the infection of Cas9-expressing cells with lentivirus targeting MKL1. After selection, cells were analyzed for MKL1 level using immunofluorescence and Western blotting (Suppl. Fig. S6). With both gRNAs targeting MKL1, a reduction of MKL1 protein was observed. Taken together, these data show that lentivirus-based CRISPR can be applied in primary kidney fibroblasts.

Next, we tested whether CRISPR technology could be used to manipulate targets upstream of aSMA. We focused on the genes for TGF- $\beta$  receptors (TGFBR1 and TGFBR2) as well as MKL1. While TGFBR1 and TGFBR2 mediate direct activation of the ACTA2 gene following TGF-B treatment via the SMAD pathway, MKL1 has been shown to function by integrating cytoskeletal cues into aSMA activation.<sup>22,23,27</sup> As shown in Figure 3A, gRNAs targeting TGFBR1 and TGFBR2 are able to reduce aSMA induction, albeit to various degrees. Importantly, also targeting MKL1 reduces aSMA induction, thus indicating that more indirect regulatory inputs into the ACTA2 gene can also be identified using CRISPR in the PMT assay. Despite showing an effect in our PMT assay, targeting TGFBR1 and TGBFR2 did not completely block aSMA induction, even if targeting TGFBR1 and TGBR2 in combination (data not shown). TGF- $\beta$  treatment induces cell proliferation and, as shown in Figure 3B, targeting of TGFBR1 and TGFBR2 effectively

blocked TGF-β-induced proliferation,<sup>26</sup> while gRNAs against ACTA2 or MKL1 had no effect on this phenotype. This indicates that unedited cells can mask TGFBR1/2targeted cells in assays with prolonged incubation time. We therefore also evaluated the effect of targeting TGFBR in a more proximal assay by testing for impact on TGF-βinduced translocation of SMAD2/3 into the nucleus.<sup>28</sup> As shown in Figure 3C, translocation of SMAD2/3 was impaired by ~50% by targeting TGFBRs, thus showing that despite comparably little effect on aSMA induction, TGFBR-induced pathways can still be impaired using CRISPR in this format. Taken together, these data show that CRISPR technology can be applied in primary HKFs and that it has the potential to efficiently manipulate ACTA2 as well as genes upstream of ACTA2, and that effects on aSMA can be measured in an imaging-based PMT assay.

## Setup of Large-Scale Screen and Primary Screen

Having confirmed that CRISPR technology can efficiently be applied in primary fibroblasts, we aimed to extend the assay to screening an arrayed library encompassing the whole genome.<sup>12</sup> While the general setup of an arrayed lentivirus-based CRISPR library is similar to other formats such as siRNA or small-molecule libraries, due to the production process the amount of active virus provided differs between wells.<sup>12</sup> Differing titers could pose a challenge for large-scale screening if the assay is affected by high amounts of virus. As shown in Figure 4A, we do observe an effect of high MOIs (>20) on the induction of aSMA following TGF- $\beta$  treatment in primary kidney fibroblasts. This indicates that, if possible, the added amount of lentivirus should fall between MOIs of 2 and 20. As shown in Supplemental Figure S7, for the majority of these the assigned MOI falls between 2 and 20; only 6.6% would result in an MOI of >20 and thus in potentially false-positive hits, which needs to be taken into account during hit follow-up. We evaluated our assay for large-scale screening by performing robustness evaluations. We generated control plates using ACTA2 and nontargeting gRNAs and tested whether our workflow for large-scale lentivirus infection, cultivation, and processing would result in a high assay window and Z' values suitable for screening and hit identification. Figure 4B depicts the results from a set of eight high/low plates run on two separate assay days. For all plates, a high assay window and corresponding Z' scores of >0.5 were achieved. We thus continued to screen the whole genome with our PMT CRISPR assay. During primary screening, the assay proved to be robust and a mean Z' of 0.75 was achieved (Fig. 4C). The cutoff for hit identification was set to  $3\sigma$  corresponding to an inhibition of the normalized aSMA signal of 20.2% (Fig. 4C), resulting in 3388 gRNAs (10.2%) considered as hits from this primary analysis (Fig. 4D). The hits were fairly equally distributed across plates; 15 plates showed



**Figure 2.** Application of CRISRP technology in primary HKFs. Cells were infected with Cas9 carrying lentivirus at p2, stable pools selected with blasticidin and expanded until p9 (HKF515-Cas9), alongside control cells without Cas9 that were expanded to the same passage (HKF515). (**A**) Imaging-based characterization of stable Cas9-expressing cell pools. Cells from Cas9 stable pool and control cells were fixed and stained using an anti-Cas9 antibody. Images were analyzed for a fraction of Cas9-positive cells. Scale bar = 50  $\mu$ m. (**B**) Characterization of stable Cas9 cells using Western blotting. Cas9-expressing and control cells were extracted and analyzed for a Cas9 corresponding band at 150 kDa. (**C**) Analysis of TGF- $\beta$  response in Cas9 stable cells. HKF515-Cas9 and control cells were seeded into 384 wells and subjected to PMT assay. Scale bar = 250  $\mu$ m. (**D**) Analysis of aSMA induction in DRCs following TGF- $\beta$  treatment in cells expressing Cas9. HKF515-Cas9 and control cells were seeded into 384 wells in triplicate, subjected to PMT assay, and stained for aSMA. Images were analyzed for a SMA-positive cells. (**E**) Assessment of Cas9 activity in Cas9-expressing cells. HKF515-Cas9 cells were seeded into 384-well plates and infected with gRNA carrying lentivirus targeting either ACTA2 or control loci at an MOI of 5. Following selection for 3 days with puromycin, cells were subjected to PMT assay with 10 ng/mL TGF- $\beta$  and analyzed for induction of aSMA using image analysis. Scale bar = 250  $\mu$ m.

less than 10 hits/plate, whereas 12 plates had >50 hits (**Suppl. Fig. S8**). One benefit of the screened library is that the two gRNAs per gene are provided in separate wells, thus allowing us to prioritize hits according to whether both

(2/2 hits) or only one (1/2 hits) gRNA targeting a gene is considered a hit (**Fig. 4D**).<sup>12</sup> Our whole genome-wide CRISPR screen identified 449 genes for which both gRNAs resulted in a significant reduction of aSMA level.



**Figure 3.** Characterization of CRISPR effectivity on PMT response in kidney fibroblasts. (**A**) Effect of known PMT regulators on aSMA induction. HKF515-Cas9 cells were seeded into 384 wells and infected with the indicated lentivirus at an MOI of 5 (N = 3) followed by puromycin selection. Cells were subjected to PMT assay with 10 ng/mL TGF- $\beta$  before fixation and staining for aSMA level. Images were analyzed for aSMA level. (**B**) Assessment of effect of CRISPR-mediated target deletion on TGF- $\beta$ -induced proliferation. HKF515-Cas9 cells were seeded into 384 wells and infected with the indicated lentivirus at an MOI of 5 followed by puromycin selection. Cells were subjected to PMT assay with 10 ng/mL TGF- $\beta$  or left untreated before fixation and analysis of cell count. (**C**) Analysis of CRISPR constructs targeting TGFBR1/2 on SMAD2/3 translocation. HKF515-Cas9 cells were infected with the indicated overnight and treated with TGF- $\beta$  for 6 h before fixation and analysis of SMAD2/3-positive nuclei using imaging. The percentage of SMAD2/3-positive nuclei upon TGF- $\beta$  treatment is shown.

Importantly, among these hits were ACTA2, MKL1, and TGFBR2, as well as the co-SMAD SMAD4. As expected, TGFBR1 scored as a 1/2 hit, thus suggesting that 1/2 hits can also be of value. Before moving into further evaluation of individual hits, we performed a hit confirmation from the backup screening material. As the lentivirus needed to be picked manually from these library plates, we opted to apply more stringent conditions than set for hit identification to reduce the number of gRNAs to pick. For the aSMA readout we set the cutoff at a mean aSMA inhibition of 30% for the two individual guides. We also included 1/2 hits, but still kept the mean cutoff, thereby preferring gRNAs with a strong effect on aSMA. Additionally, we set a cutoff for the cell count at a mean of 50% for the two guides. While infection stress or cytotoxicity affects cell numbers, TGF- $\beta$ 

treatment results in proliferation; therefore, effects of valid screening hits on cell numbers were expected (**Fig. 2B**). We performed hit confirmation for 356 genes selected using these cutoffs. As shown in **Figure 4E**, we confirmed 84.5% of the primary screening hits using this approach. Next, we performed pathway enrichment analysis on these confirmed hits (**Fig. 4F**). As expected, we observed enrichment of pathways centering around TGF- $\beta$  signaling ("canonical and non-canonical TGF- $\beta$  signaling," "TGF- $\beta$  receptor signaling," "TGF- $\beta$  signaling pathway") or having a strong contribution to the pathway ("hypothesized pathways in pathogenesis of cardiovascular disease"). Other enriched pathways have been linked to fibrosis ("proteasomal degradation,"<sup>29–32</sup> "Epithelial-to-mesenchymal transition,"<sup>14</sup> or "VEGF signaling");<sup>14</sup> thus, these results show that our



**Figure 4.** Whole genome arrayed CRISRP screening in primary HKFs. (**A**) Evaluation of increasing MOI on CRISPR PMT assay. HKF515-Cas9 cells were seeded as described and infected with increasing MOI prior to being subjected to CRISPR PMT assay. (**B**) Robustness evaluation for CRISPR PMT assay. HKF515-Cas9 cells were infected with control lentivirus (MOI of 5) in eight full 384well plates and following selection were subjected to PMT assay. Images were analyzed for aSMA level. Z' factors were calculated from nontargeting and ACTA2-infected wells. (**C**) CRISPR screening performance and statistical evaluation. aSMA data from all screening plates were normalized and separation of assay signal for controls is shown. Vertical line indicates hit cutoff 3σ. Z' was analyzed from controls and summarized below. (**D**) Correlation of aSMA inhibition for both gRNAs targeting the same gene. aSMA inhibitions for both gRNAs targeting the same gene are depicted and colored according to effect. (**E**) Hit confirmation from screening material. gRNAs were picked from screening backup material and used for confirmation of screening hits in the CRISPR PMT assay. (**F**) Pathway enrichment analysis for confirmed hits. Hits with a confirmed effect on aSMA readout and less than a 50% reduction in cell number were subjected to gProfiler. Pathway enrichment on Wikipathways is shown.



**Figure 5.** Overview of hit follow-up activities. (**A**) Evaluation of proteasome inhibitors in PMT assay. Following treatment, HKF515 and HKF616 cells were subjected to PMT assay and analyzed for effects on aSMA level and cell count. Images were analyzed for aSMA level and cell numbers. DRCs for HKF515 are shown. IC<sub>50</sub> values for aSMA readouts for bortezumib and carfilzomib, alongside SB431542 for both HKF lines, are shown in the table. (**B**) Overview on hit follow-up activities using lentiviral CRISPR on HKF-515-Cas9 cells. For a set of 20 target genes, fresh lentivirus aliquots carrying four gRNAs per target gene were evaluated in PMT assay at an MOI of 5. The performances of the gRNAs per gene were categorized as 0/4-4/4 and summarized in a pie chart. (**C**) Overview on hit follow-up activities using tool compounds on HKF-515 cells. For 6 of 15 targets confirmed in **B**, tool compounds were available. These were evaluated in PMT assay in DRC. A compound was scored as active if the IC<sub>50</sub> in PMT was <1E-06.

whole genome screening efforts identified relevant pathways and suggest that this presents a valid approach to also identify novel targets important in regulating kidney fibrosis.

## Orthogonal Confirmation of Proteasome Inhibition as Effective in Blocking Kidney Fibroblast Activation

We have observed a strong enrichment of confirmed hits around proteasomal degradation. As a proof of concept whether our screen was able to identify relevant hits in the area of kidney fibrosis, we tested the proteasome inhibitors bortezumib and carlizomib in our PMT assay. As shown in **Figure 5A**, both are able to block induction of smooth muscle actin following TGF- $\beta$  treatment in kidney fibroblasts. Although both inhibitors are cytotoxic at high concentrations, especially for bortezumib there is a clear difference between inhibition of aSMA induction and reduction of cell numbers below the numbers observed for SB4311542. Importantly, these finds could be reproduced in a second donor (HKF\_616) (**Fig. 5A**). Proteasome inhibitors have been shown to block PMT in fibroblasts from lung, skin, and liver, and our findings confirm that these are also functioning similarly in kidney fibroblasts from humans.<sup>29–32</sup> Confirming our findings, a recent report shows that

bortezomib attenuates renal fibrosis in mice.<sup>33</sup> Aiming to identify novel targets relevant in kidney fibrosis, we similarly followed up 20 selected hits using CRISPR and tool compounds, where applicable. For all 20 targets we ordered four new gRNA lentiviruses and evaluated them in the CRISPR PMT assay. As shown in Figure 5B, we could confirm 13 (65%) of the selected 20 hits with at least two of the four freshly ordered gRNA lentiviruses. Four targets could not be confirmed with any of the four gRNAs, and these could therefore present false-positive hits stemming from virus titers outside of the range determined for the CRISPR PMT assay. Three targets were scored as 1/4; these could stem from off-target editing of the active gRNA, as we also progressed hits scored as 1/2 from the primary screen. For 6 of the 13 confirmed targets, tool compounds were available; we therefore evaluated whether these would be active in our PMT assay. As shown in Figure 5C and Supplemental Figure S9, only one of these failed to show an activity in the PMT assay at concentrations below 10 µM. Taken together, these findings may also indicate that the other targets identified during this screen have similar properties to those shown for the proteasome inhibitors and thus could present novel targets in kidney fibrosis.

## Discussion

Phenotypic drug discovery approaches have the prospect of higher translatability of preclinical findings to the clinic,<sup>17,34</sup> especially if phenotypic approaches are developed combining an assay system with a clear link to the disease by using primary or induced pluripotent (iPS)-derived human cells, a readout close to disease pathology, and a disease-relevant trigger preferentially without exogenous stimulation.<sup>16</sup> However, while phenotypic drug discovery has the potential to discover first-in-class small-molecule drugs, identifying the relevant targets responsible for this activity can pose a significant roadblock in the development of a compound.<sup>34</sup> Unbiased genetic screening approaches such as RNAi or CRISPR offer to bridge phenotypic and target-based drug discovery.<sup>35</sup> Ideally, both screening approaches utilize the same disease-relevant assay and thereby have the prospect of complementing each other: on the one hand providing interesting chemical matter and on the other hand identifying targets modulating the disease-relevant phenotype.

Here we describe the development of a phenotypic screening assay in the area of kidney fibrosis employing primary disease-relevant cells from the affected organ combined with a disease-relevant readout and relevant trigger. Although treatment with TGF- $\beta$  presents an exogenous trigger and has potential to introduce bias into the results by identifying stimulus-related mechanisms, TGF- $\beta$  has been shown to be increased in kidneys from chronic kidney disease patients and shown in mouse models to be responsible for increased matrix deposition and fibroblast proliferation.<sup>22,36</sup> Our data show that a robust PMT assay can be developed using primary kidney fibroblast, showing increased proliferation, accumulation of collagen, and induction of aSMA. Importantly, our pharmacological as well as transcriptional characterization shows that primary kidney fibroblasts are different than an established fibroblast cell line from rat kidney and normal lung fibroblasts, thus suggesting that this model can identify factors specific to human kidney fibrosis in addition to more general fibrotic regulators.<sup>25,26</sup>

Our main interest in this work was to evaluate whether CRISPR technology can be applied to such a primary cell system and whether this approach could be used to screen a whole genome library to identify novel targets in kidney fibrosis. Our data shows that a lentivirus-based CRISPR can not only be applied in primary kidney fibroblasts, but also be expanded to screen a whole genome-wide library. While several reports have shown successful utilization of CRISPR technology in primary fibroblasts from different origin,<sup>26,37,38</sup> to our knowledge this work describes the first whole genome-wide screen in such a model. Our data shows that in this setting, our highly robust CRISPR PMT assay can identify both TGF- $\beta$ -dependent (TGFBR1/2, SMAD4) and independent factors (MKL1).<sup>23</sup> With the example of proteasomal inhibition we also identified modalities of fibrosis attenuation that potentially involve both of these modalities.29

Lentivirus-based systems offer the possibility to apply CRISPR technology to a vast number of proliferating and nonproliferating cell types and have shown its potential in numerous pooled screens published in different biological settings.<sup>1,5</sup> Here we show that this can also be achieved with an arrayed lentivirus-based library. Arrayed libraries significantly broaden the assay readouts that can be screened using such a library, and also do not involve NGS-based screening deconvolution.<sup>12,39</sup> On the other hand, arrayed lentivirus-based libraries also present certain challenges that need to be taken into account when attempting to perform an array-based CRISPR screen. As lentiviruses are intrinsically liable to freeze and thaw cycles, which result in reduction of titer,<sup>40</sup> these need to be carefully tracked during a screening campaign and minimized, for example, by generating replicate screening plates from the original plate as backups in case of plate failure or as a source for hit confirmation activities. Furthermore, titers for each lentivirus in the library differ, which results in a spread of MOI in the assay that can impact the cells due to infection stress. In our example, we estimated that up to 6.6% of hits could be false positives due to high lentivirus titer. The four targets, which we were not able to confirm with any gRNA during hit follow-up activities, could therefore present examples of false positives stemming from high virus titer. Chemically synthesized sgRNA libraries would offer an alternative without these liabilities, but potentially at the expense of a more limited applicability across cell types and lower efficiency. In both cases, hits should be followed up by employing orthogonal approaches such as RNAi, RNP-based CRISPR, or tool compounds to eliminate false positives stemming from using a certain screening approach. Independently of these challenges, we were able to identify high-confidence hits in our screen and confirm these in hit follow-up activities. These hits present potentially new exciting targets in the context of kidney fibrosis.

#### Acknowledgments

We would like to thank all members of the Evotec/Bayer Kidney collaboration for helpful discussions and insight during this project.

#### **Declaration of Conflicting Interests**

The authors declared the following potential conflicts of interest with respect to the research, authorship, and/or publication of this article: Robert J. Turner, Carina Wollnik, Ina Sternberger, Uwe Andag, and Hauke Cornils are employed by Evotec SE and Evotec International GmbH, and their research and authorship of this article was completed within the scope of their employment with Evotec SE and Evotec International GmbH. Stefan Golz and Nils Burkhardt are employed by Bayer AG, and their research and authorship of this article was completed within the scope of their employment with Bayer AG.

#### Funding

The authors received no financial support for the research, authorship, and/or publication of this article.

#### References

- Schuster, A.; Erasimus, H.; Fritah, S.; et al. RNAi/CRISPR Screens: From a Pool to a Valid Hit. *Trends Biotechnol.* 2019, 37, 38–55.
- Shalem, O.; Sanjana, N. E.; Zhang, F. High-Throughput Functional Genomics Using CRISPR-Cas9. *Nat. Rev. Genet.* 2015, *16*, 299–311.
- Behan, F. M.; Iorio, F.; Picco, G.; et al. Prioritization of Cancer Therapeutic Targets Using CRISPR-Cas9 Screens. *Nature* 2019, 568, 511–516.
- 4. Evers, B.; Jastrzebski, K.; Heijmans, J. P.; etal. CRISPRKnockout Screening Outperforms shRNA and CRISPRi in Identifying Essential Genes. *Nat. Biotechnol.* **2016**, *34*, 631–633.
- Fellmann, C.; Gowen, B. G.; Lin, P. C.; et al. Cornerstones of CRISPR-Cas in Drug Discovery and Therapy. *Nat. Rev. Drug Discov.* 2017, *16*, 89–100.
- Lin, A.; Giuliano, C. J.; Palladino, A.; et al. Off-Target Toxicity Is a Common Mechanism of Action of Cancer Drugs Undergoing Clinical Trials. *Sci. Transl. Med.* 2019, *11*, eaaw8412.
- Morgens, D. W.; Deans, R. M.; Li, A.; et al. Systematic Comparison of CRISPR/Cas9 and RNAi Screens for Essential Genes. *Nat. Biotechnol.* 2016, *34*, 634–636.
- 8. Koike-Yusa, H.; Li, Y.; Tan, E. P.; et al. Genome-Wide Recessive Genetic Screening in Mammalian Cells with a

Lentiviral CRISPR-Guide RNA Library. *Nat. Biotechnol.* 2014, *32*, 267–273.

- Shalem, O.; Sanjana, N. E.; Hartenian, E.; et al. Genome-Scale CRISPR-Cas9 Knockout Screening in Human Cells. *Science* 2014, 343, 84–87.
- Wang, T.; Wei, J. J.; Sabatini, D. M.; et al. Genetic Screens in Human Cells Using the CRISPR-Cas9 System. *Science* 2014, *343*, 80–84.
- Yu, J. S. L.; Yusa, K. Genome-Wide CRISPR-Cas9 Screening in Mammalian Cells. *Methods* 2019, 164-165, 29–35.
- Metzakopian, E.; Strong, A.; Iyer, V.; et al. Enhancing the Genome Editing Toolbox: Genome Wide CRISPR Arrayed Libraries. *Sci. Rep.* 2017, *7*, 2244.
- Pakshir, P.; Hinz, B. The Big Five in Fibrosis: Macrophages, Myofibroblasts, Matrix, Mechanics, and Miscommunication. *Matrix Biol.* 2018, 68–69, 81–93.
- Falke, L. L.; Gholizadeh, S.; Goldschmeding, R.; et al. Diverse Origins of the Myofibroblast—Implications for Kidney Fibrosis. *Nat. Rev. Nephrol.* 2015, *11*, 233–244.
- Friedman, S. L.; Sheppard, D.; Duffield, J. S.; et al. Therapy for Fibrotic Diseases: Nearing the Starting Line. *Sci. Transl. Med.* 2013, *5*, 167sr1.
- Vincent, F.; Loria, P.; Pregel, M.; et al. Developing Predictive Assays: The Phenotypic Screening "Rule of 3". *Sci. Transl. Med.* 2015, 7, 293ps15.
- Swinney, D. C.; Anthony, J. How Were New Medicines Discovered? *Nat. Rev. Drug Discov.* 2011, 10, 507–519.
- Zerbino, D. R.; Achuthan, P.; Akanni, W.; et al. Ensembl 2018. Nucleic Acids Res. 2018, 46, D754–D761.
- Dobin, A.; Davis, C. A.; Schlesinger, F.; et al. STAR: Ultrafast Universal RNA-seq Aligner. *Bioinformatics* 2013, 29, 15–21.
- Zhang, J. H.; Chung, T. D.; Oldenburg, K. R. A Simple Statistical Parameter for Use in Evaluation and Validation of High Throughput Screening Assays. J. Biomol. Screen. 1999, 4, 67–73.
- Raudvere, U.; Kolberg, L.; Kuzmin, I.; et al. g:Profiler: A Web Server for Functional Enrichment Analysis and Conversions of Gene Lists (2019 Update). *Nucleic Acids Res.* 2019, 47, W191–W198.
- Meng, X. M.; Nikolic-Paterson, D. J.; Lan, H. Y. TGF-β: The Master Regulator of Fibrosis. *Nat. Rev. Nephrol.* 2016, *12*, 325–338.
- Hinz, B. Formation and Function of the Myofibroblast during Tissue Repair. J. Invest. Dermatol. 2007, 127, 526–537.
- Nanthakumar, C. B.; Hatley, R. J.; Lemma, S.; et al. Dissecting Fibrosis: Therapeutic Insights from the Small-Molecule Toolbox. *Nat. Rev. Drug Discov.* 2015, 14, 693–720.
- Foote, A. G.; Wang, Z.; Kendziorski, C.; et al. Tissue Specific Human Fibroblast Differential Expression Based on RNAsequencing Analysis. *BMC Genomics* 2019, *20*, 308.
- Weigle, S.; Martin, E.; Voegtle, A.; et al. Primary Cell-Based Phenotypic Assays to Pharmacologically and Genetically Study Fibrotic Diseases In Vitro. J. Biol. Methods 2019, 6, e115.
- Miralles, F.; Posern, G.; Zaromytidou, A. I.; et al. Actin Dynamics Control SRF Activity by Regulation of Its Coactivator MAL. *Cell* 2003, *113*, 329–342.
- Li, P.; Oparil, S.; Novak, L.; et al. ANP Signaling Inhibits TGF-β-Induced Smad2 and Smad3 Nuclear Translocation and Extracellular Matrix Expression in Rat Pulmonary

Arterial Smooth Muscle Cells. J. Appl. Physiol. (1985) 2007, 102, 390–398.

- Fineschi, S.; Reith, W.; Guerne, P. A.; et al. Proteasome Blockade Exerts an Antifibrotic Activity by Coordinately Down-Regulating Type I Collagen and Tissue Inhibitor of Metalloproteinase-1 and Up-Regulating Metalloproteinase-1 Production in Human Dermal Fibroblasts. *FASEB J.* 2006, 20, 562–564.
- Koca, S. S.; Ozgen, M.; Dagli, F.; et al. Proteasome Inhibition Prevents Development of Experimental Dermal Fibrosis. *Inflammation* 2012, *35*, 810–817.
- Saeki, I.; Terai, S.; Fujisawa, K.; et al. Bortezomib Induces Tumor-Specific Cell Death and Growth Inhibition in Hepatocellular Carcinoma and Improves Liver Fibrosis. J. Gastroenterol. 2013, 48, 738–750.
- Mutlu, G. M.; Budinger, G. R.; Wu, M.; et al. Proteasomal Inhibition after Injury Prevents Fibrosis by Modulating TGFβ<sub>1</sub> Signalling. *Thorax* 2012, *67*, 139–146.
- Zeniya, M.; Mori, T.; Yui, N.; et al. The Proteasome Inhibitor Bortezomib Attenuates Renal Fibrosis in Mice via the Suppression of TGF-β1. *Sci. Rep.* 2017, *7*, 13086.

- Moffat, J. G.; Vincent, F.; Lee, J. A.; et al. Opportunities and Challenges in Phenotypic Drug Discovery: An Industry Perspective. *Nat. Rev. Drug Discov.* 2017, *16*, 531–543.
- Heilker, R.; Lessel, U.; Bischoff, D. The Power of Combining Phenotypic and Target-Focused Drug Discovery. *Drug Discov. Today* 2019, *24*, 526–532.
- Isaka, Y. Targeting TGF-β Signaling in Kidney Fibrosis. *Int. J. Mol. Sci.* 2018, *19*, 2532.
- Martufi, M.; Good, R. B.; Rapiteanu, R.; et al. Single-Step, High-Efficiency CRISPR-Cas9 Genome Editing in Primary Human Disease-Derived Fibroblasts. *CRISPR J.* 2019, 2, 31– 40.
- Aumiller, V.; Strobel, B.; Romeike, M.; et al. Comparative Analysis of Lysyl Oxidase (Like) Family Members in Pulmonary Fibrosis. *Sci. Rep.* 2017, 7, 149.
- Agrotis, A.; Ketteler, R. A New Age in Functional Genomics Using CRISPR/Cas9 in Arrayed Library Screening. *Front. Genet.* 2015, 6, 300.
- Tiscornia, G.; Singer, O.; Verma, I. M. Production and Purification of Lentiviral Vectors. *Nat. Protoc.* 2006, *1*, 241– 245.