

Three-Dimensional Cell Culture Conditions Affect the Proteome of Cancer-Associated Fibroblasts

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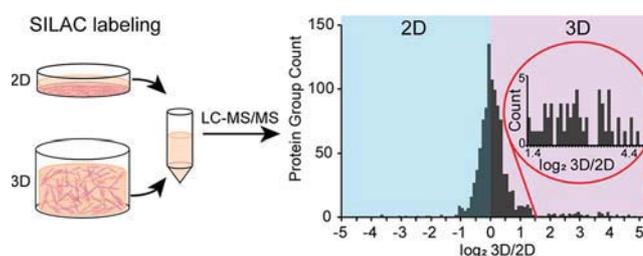
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Supporting Information

ABSTRACT: *In vitro* cell culture systems are an invaluable tool for cell biological research to study molecular pathways and to characterize processes critical in human pathophysiology. However, the experimental conditions in two-dimensional (2D) cell cultures often differ substantially from the *in vivo* situation, which continuously raises concerns about the reliability and conferrability of the obtained results. Three-dimensional (3D) cell cultures have been shown to closer mimic *in vivo* conditions and are commonly employed, for example, in pharmacological screens. Here, we introduce a 3D cell culture system based on a mixture of collagen I and matrigel amenable to stable isotope labeling by amino acids in cell culture (SILAC) and quantitative mass spectrometry-based proteomics analyses. We study the extra- and intracellular proteomic response of skin fibroblast isolated from healthy volunteers in comparison to cancer-associated fibroblasts (CAF) on 3D culture conditions. Both, control cells and CAF, change their proteomic composition based on the culture conditions. Critically, cell type differences observed in 2D are often not preserved in 3D, which commonly closer resemble phenotypes observed *in vivo*. Especially, extracellular matrix and plasma membrane proteins are differentially regulated in 2D versus 3D.

KEYWORDS: 3D, matrigel, collagen, fibroblasts, skin, cancer, mass spectrometry, bottom-up proteomics, CAF, extracellular matrix



INTRODUCTION

Biomedical science profited enormously from the introduction of *in vitro* tissue cultures, which allow routine analysis and perturbation of cell biological processes. Commonly, mammalian cells are kept in two-dimensional (2D) cultures using coated tissue flasks or dishes made of plastic. Although 2D cell cultures have well proven their usefulness, purists still claim that “cells grown on plastic” do not allow substantial insights into *in vivo* processes and pathways, advocating the use of diverse model organisms. Especially, new drug candidates still have to be tested extensively in preclinical animal models. However, animal models also present diverse pitfalls. It is now widely recognized that due to interspecies variations, animal models often do not recapitulate all aspects of human diseases, hampering successful drug development.¹ One *in vitro* technique that can bridge the wide gap between human 2D cell cultures and animal models and also address distinctions of species is three-dimensional (3D) human cell culture. Especially in drug development and testing, 3D cell culture models hold great promise.¹

In cancer research, several studies showed that 3D human cell cultures closer mimic the *in vivo* situation compared to 2D cultures.^{2–4} This could be especially true for the study of the

role of the tumor stroma, that is, the role of cancer-associated fibroblasts (CAF), the major stromal cell type, involved in tumor progression.⁵ CAF were shown to remodel the protein composition of the extracellular matrix (ECM) as well as its physicochemical properties.^{6,7} CAF are stimulated by inflammatory conditions often observed in solid tumors and represent activated fibroblasts having similarities with wound-associated fibroblasts.^{8,9} Critically, CAF were shown to promote tumor growth by secretion of growth factors and hormones¹⁰ and to promote cancer cell invasion by ECM deformation, generating tracks that can guide migration of cancer cells.⁷ A global analysis on how CAF alter the ECM is still missing, and it is not well understood how and which ECM proteins stimulate cancer cell growth and migration. To address these fundamental questions, we aimed to develop a quantitative mass spectrometry (MS)-based proteomics protocol that allows the identification and accurate quantification of CAF proteins and of their microenvironment.

To study the cellular response to 3D culture conditions by proteomics approaches, mainly 3D spheroid cultures or 3D cell

layers were used.^{11–13} So far, stable isotope labeling by amino acids in cell culture (SILAC)-based quantitative MS analyses¹⁴ of 3D cell cultures were performed of endothelial cells grown in matrigel using a SILAC labeled 2D spike-in¹⁵ or of SILAC-labeled embryonic stem cells.¹⁶ Recently, a SILAC protocol for organoids was published obtaining 85% label incorporation after 30 days in culture.¹⁷ Critically, to our knowledge, all published studies purified cells/organoids prior MS analyses and focused on the characterization of intracellular proteomes. The protein compositions of the microenvironments were not studied. However, because of the specific role CAF play in cancer cell invasion, our aim was to establish an approach addressing both the intracellular and extracellular compartments. Thus, we developed a SILAC-based protocol, allowing the complete labeling of fibroblasts grown in a 3D matrix consisting of a mixture of collagen I and matrigel. Such cultures are commonly used in cell biological assays to study the capacity of fibroblasts to deform ECM,^{7,18} a proxy to study the promotion of cancer cell invasion by stromal cells. In the current study, we focused on the technical aspects of 3D cell cultures without addressing the heterogeneity of primary human cell types. We performed comparative expression proteomics experiments of CAF and normal human skin fibroblasts (NHF) isolated from healthy volunteers and analyzed cell type-specific responses to 3D culture conditions.

■ EXPERIMENTAL SECTION

Cells

NHF were isolated from the foreskin of a circumcised 4 year-old healthy boy as described previously.¹⁹ CAF were isolated from a head and neck squamous cell carcinoma as published.⁷ The study was approved by the Ethics Committee of Freiburg University and conducted according to the Declaration of Helsinki.

Stable Isotope Labeling by Amino Acids and 3D Cell Culture

For the establishment of 3D cultures, NHF and CAF were cultured and passaged in SILAC-Dulbecco's modified Eagle's medium (Thermo Fisher Scientific), supplemented with 10% dialyzed fetal bovine serum (Gibco), 1% penicillin/streptomycin (Invitrogen), 1% L-glutamine (PAN Biotech), 84 mg L⁻¹ L-arginine (Sigma-Aldrich), 146 mg L⁻¹ L-lysine (Sigma-Aldrich), and 125 mg L⁻¹ proline (Sigma-Aldrich) for 10 days, followed by 1 week in serum-free medium. Insulin (10 mg L⁻¹)-transferrin (5.5 mg L⁻¹)-selenium (0.0067 mg L⁻¹) supplement (Gibco) was used as a serum substitution. In addition, fibroblasts were treated with 50 µg mL⁻¹ ascorbate for proper collagen production.²⁰ Finally, 5 × 10⁵ fibroblasts were embedded in 1 mL of collagen I (4.6 mg mL⁻¹)-matrigel (2.2 mg mL⁻¹)⁷ containing 5× SILAC DMEM and cultured for up to 5 days under serum-free conditions in the presence of insulin-transferrin-selenium and ascorbate. The 5× SILAC DMEM was made with powdered DMEM (Thermo Fisher Scientific) and 420 mg L⁻¹ L-arginine, 730 mg L⁻¹ L-lysine, and 625 mg L⁻¹ proline. For the preparation of the collagen I-matrigel matrix, 5× DMEM was diluted 1:10. Thus, the final concentration in the gel was 42 mg L⁻¹ L-arginine, 73 mg L⁻¹ heavy L-lysine, and 62.5 mg L⁻¹ proline. Every other day, medium was replaced by fresh regular SILAC medium (see above).

For 2D culture, 10 cm culture plates were coated with 5 mL of 20 µg mL⁻¹ collagen I (Corning) and 27 µg mL⁻¹ matrigel

(growth factor-reduced, Corning) in 0.02 M acetic acid for 1 h at 37 °C and 5% CO₂. Primary fibroblasts for the super-SILAC mix were grown in 2D and labeled with 42 mg L⁻¹ L-arginine, 73 mg L⁻¹ L-lysine (Sigma-Aldrich), and 80 mg L⁻¹ proline. "Heavy" L-arginine-¹³C₆-¹⁵N₄ (Arg10) and L-lysine-¹³C₆-¹⁵N₂ (Lys8) or "medium-heavy" L-arginine-¹³C₆ (Arg6) and L-lysine-²H₄ (Lys4) amino acids were used. The "light" label was not used. Biological replicates were obtained by swapping labels.

Protein Solubilization and MS Sample Preparation

Cells were lysed after 5 days of 2D or 3D culture in 1 mL of 2× RIPA buffer.²¹ Pellet and supernatant were separately processed for in-gel digestion. Samples were concentrated on a 10 kDa cutoff filter (Sartorius) and supplemented with SDS-PAGE loading buffer. Disulfide bonds were reduced with 1 mM DTT (Sigma-Aldrich) for 5 min at 95 °C and alkylated using 5.5 mM iodoacetamide (Sigma-Aldrich) for 30 min at 25 °C. The mixing ratio was determined by setup experiments: aliquots were mixed, proteins digested, and peptides quantified by MS. Samples were mixed in a 1:1 peptide ratio. Protein mixtures were separated by SDS-PAGE using 4–12% Bis-Tris gradient gels (Invitrogen). Gel lanes were cut into 10 slices, proteins therein were digested with trypsin (Promega), and peptides were processed on STAGE tips as described.¹⁹

Mass Spectrometry

MS analyses were conducted on an LTQ Orbitrap XL and 3D cultures were also analyzed on a QExactive Plus mass spectrometer (both Thermo Fisher Scientific). For the LTQ Orbitrap XL, samples were separated by an Agilent 1200 HPLC, for the QExactive an EasyLC 1000 (Thermo Fisher Scientific) was coupled to the mass spectrometer. Chromatography was conducted with in-house packed Reprosil-Pur 120 ODS-3 (Dr. Maisch) fused silica HPLC-columns with 75 µm inner diameter. Samples were applied to the column with a gradient of A (0.5% acetic acid) and B (0.5% acetic acid in 80% ACN) with increasing ACN proportion for peptide separation. Samples were loaded with 2% B; a separation gradient was run for 100 min increasing the percentage of buffer B to 35%. The spray voltage was 2.3 kV with no sheath and auxiliary gas flow and an ion-transfer tube temperature of 200 °C (250 °C for the QExactive). The data were acquired in the data-dependent mode and switched automatically between MS and MS/MS with a maximum of 1 × 10⁶ ions in MS. The top five (top 10 for the QExactive) most abundant peptides were isolated in the linear ion trap and fragmented with 35% collision energy (25% for the QExactive) and a target value of 5000. Parent ions with a charge state of $z = 1$ and unassigned charge states were excluded from fragmentation. The mass range for the LTQ Orbitrap was set to 350–2000 m/z with a resolution of 60 000, for the QExactive Plus the mass range was 370–1750 m/z with a resolution of 70 000.

Identification and Quantification of Proteins Using MaxQuant

Raw mass spectra data files were searched with the MaxQuant software version 1.4.1.2²² using a UniProt *Homo sapiens* database from March 2016, containing 21 033 entries. The defined fixed modification was carbamidomethylation of cysteines, whereas methionine oxidations and protein amino-terminal acetylations were set as variable modifications. Three missed cleavages were allowed for enzymatic cleavage with trypsin/P. Quantitation was done with a setting of double or

forward 5'-ACA GGC GAG AAA GTG CCA GA-3', reverse 5'-TGT GTA TTC CGT GGC AGG CT-3'; for MYOF, forward 5'-TCA GAA CGA GAG CCG CTA CC-3', reverse 5'-TTA TCG CCG TTC GCA TCC GT-3'. Data were normalized to HPRT, which was used as internal control with the following primers: forward 5'-TGA CAC TGG CAA AAC AAT GCA-3', reverse 5'-GGT CCT TTT CAC CAG CAA GCT-3'.

Western Blot

Three-dimensional gels were dissolved in 2× RIPA buffer supplemented with phosphatase and protease inhibitors (Roche). Lysates were dissolved with a syringe and DNA was digested with 0.1% v/v benzonase (Empvive Bio). Samples were centrifuged for 12 min at 13 500 rpm at 4 °C. The volume of the supernatant was reduced on a 10 kDa cutoff filter (Sartorius) and supplemented with SDS-PAGE loading buffer. Proteins were separated by SDS-PAGE and blotted onto nitrocellulose membranes. The membranes were blocked for 30 min in 5% BSA in 1× TBS with 0.1% Tween-20. Primary antibodies were anti-GAPDH, HRP (sc-25778HRP), and anti-MYOF (sc-376879), both Santa Cruz Biotechnology. Antibodies were diluted 1:1000 in TBS-0.1% Tween with 5% BSA and incubated with the membranes overnight at 4 °C. The HRP-conjugated sheep anti-mouse secondary antibody (GE Healthcare) was diluted 1:10 000 in 5% BSA in TBS-0.1% Tween and incubated with the membrane for 1 h at room temperature. Chemiluminescence was detected by SuperSignal West Femto Maximum Sensitivity Substrate (Thermo Scientific).

Data Analyses

Data analysis was performed using Perseus.²⁴ Significantly regulated proteins were identified by performing outlier tests relative to the respective log₂-transformed total data set (Significance A, $p < 0.05$). To determine intensity-dependent outliers, Significance B ($p < 0.05$) was used.²² Generation of protein networks was done in STRING DB.²⁵ Network analysis and GO-term statistics were done with Cytoscape 3.5.1²⁶ and BINGO 3.0.3.²⁷ Calculation of ontology enrichment was conducted on the background of the entire data set. Ontology nodes with a p -value ≤ 0.03 were determined as significant. For the 2D data set, proteins with a p -value ≤ 0.01 were evaluated on the background of 1117 proteins. For 3D, proteins with a p -value ≤ 0.05 were analyzed on the background of 961 proteins.

RESULTS AND DISCUSSION

NHF and CAF Grown in 2D Differ in Their Proteomes

As CAF were characterized to promote tumor cell invasion compared to NHF,^{7,28} we asked if these phenotypic differences were reflected by proteome alterations under standard 2D cell culture conditions. Using a super-SILAC approach the proteomes of NHF and CAF cultured in 2D on coated dishes were analyzed quantitatively by geLC-MS/MS (Figure 1A; see Experimental Section for details).²⁹ Serum leads to fibroblast activation triggering wound repair responses³⁰ and promoting expression of genes commonly expressed in tumors.⁹ Thus, to be able to discriminate fibroblasts activated *in vivo*, that is, CAF, from nonactivated fibroblasts, we implemented a serum-free cell culture strategy.

We identified 2577 proteins of which 1147 could be quantified in at least one replicate each using an LTQ-Orbitrap

XL ($n = 2$, Supplementary Figure S1, Supplementary Table S1). Out of the 1147 common proteins, 142 proteins were significantly differentially regulated between NHF and CAF (Figure 1B; $p \leq 0.05$). 74 proteins showed a significantly higher protein abundance in NHF than in CAF, whereas 68 proteins were enriched in CAF. Interestingly, 74 of the differentially regulated proteins are known to interact according to STRING DB (Figure 1C).³¹ We performed GO-term enrichment analyses to identify cellular pathways/processes, which might be affected by the altered proteome composition in CAF. Proteins involved in adherens junction ($p = 0.007$), cell-cell adhesion ($p = 0.01$), wound healing ($p = 0.003$), nucleotide metabolic processes ($p = 0.007$), and proteins localizing to the cell surface ($p = 0.02$) were significantly differentially regulated (Figure 1D and Supplementary Figure S2), corroborating the finding that CAF are a terminally modified cell type that can be propagated *in vitro*. Among others, we identified an upregulation of catenin beta-1 (CTNNB1), which was shown to be critical for CAF to guide collective cell migration.³² CTNNB1 is a key component of the canonical Wnt signaling pathway, which was linked to the pro-invasive phenotype of CAF.³³

Although we detected significant differences between CAF and NHF that could be linked to the tumor-promoting phenotype of CAF observed *in vivo*, we were wondering if we missed important information due to the limitations of our cell culture model. Therefore, we decided to establish a cell culture system that highlights *in vivo* relevant, phenotypic differences between CAF and NHF and, importantly, that allows the quantitative comparison of CAF and NHF proteomes.

Contraction of 3D Cell Cultures Is a Readout for Tumor Invasion-Promoting Effects of Stromal Cells

Fibroblasts can be propagated in 3D cultures based on a mixture of collagen I and matrigel. Critically, activated fibroblasts remodel and contract the gel³⁴ and the extent of contraction was shown to correlate with the ability of fibroblasts to promote tumor cell invasion.^{35,36} To not conceal phenotypic differences between CAF and NHF, fibroblast subtypes were again kept serum-free. As expected, intrinsically activated CAF contracted the matrix significantly stronger and faster than NHF (Figure 2). After 1 day, CAF showed an

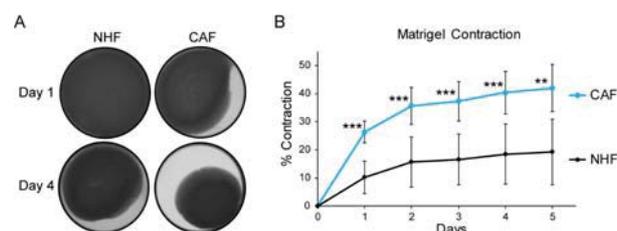


Figure 2. CAF contract 3D matrices stronger than NHF. (A) Pictures of NHF and CAF grown in 3D culture show the activated phenotype of CAF by (B) significantly enhanced gel contraction (NHF $n = 6$, CAF $n = 8$, two-tailed, homoscedastic t -test). *** $p \leq 0.001$, ** $p \leq 0.01$, * $p \leq 0.05$.

average matrix contraction by 26%, whereas NHF contracted the gel only by 10% ($p < 0.001$). After 5 days, CAFs reduced the gels by 42% of its original size and NHF by 26% ($p < 0.01$). To identify the differentially regulated molecular mechanisms in CAF grown in such a collagen I and matrigel-based 3D culture, we adapted the culture conditions

and established a SILAC-based quantitative proteomics approach addressing both the cellular proteome of fibroblasts and the ECM embedding the cells grown in 3D.

3D-SILAC for Quantitative MS Analyses

As collagen I is isolated from rat-tails and matrigel from Engelbreth-Holm-Swarm mouse sarcoma cells, both products contain unlabeled proteins that may get reused by cells. In addition, both products may contain free, unlabeled amino acids, which would negatively interfere with SILAC labeling. Hence, we established a SILAC protocol based on powdered DMEM to be able to modify medium compositions at will (see [Experimental Section](#) for details). However, before analyzing label incorporation using our new setup, we comprehensively mapped the matrigel and collagen I solution proteomes to identify all proteins that potentially share peptides between mouse/rat and human orthologues and to be able to exclude these proteins for the determination of labeling efficiency. We detected 435 murine proteins in matrigel of which laminin subunit beta-1 and gamma-1, nidogen-1, vimentin, and fibrinogen gamma chain showed the highest intensities in agreement to published data.¹⁶ 176 of these share common peptides with human orthologues. The purified collagen I solution contained 56 different rat proteins with the highest intensities for collagen alpha-1 and alpha-2 chains, vimentin and actin, and all of these share peptides with human orthologues ([Supplementary Table S2](#)). For the determination of metabolic labeling efficiencies, we excluded respective proteins.

Using an analogous cell culture protocol as for 2D, we performed 3D-SILAC-based quantitative proteomics analyses. After 10 days in full SILAC medium and an additional 7 days in serum-deprived medium in 2D culture, fibroblasts were transferred for 5 days to serum-deprived 3D cultures ([Figure 3A](#)). Incubation with 42 mg L⁻¹ heavy L-arginine and 73 mg L⁻¹ heavy L-lysine showed a median labeling efficiency of 90.3% and 93.7%, respectively ([Supplementary Figure S3](#)). To optimize label incorporation, we cultured fibroblasts in DMEM

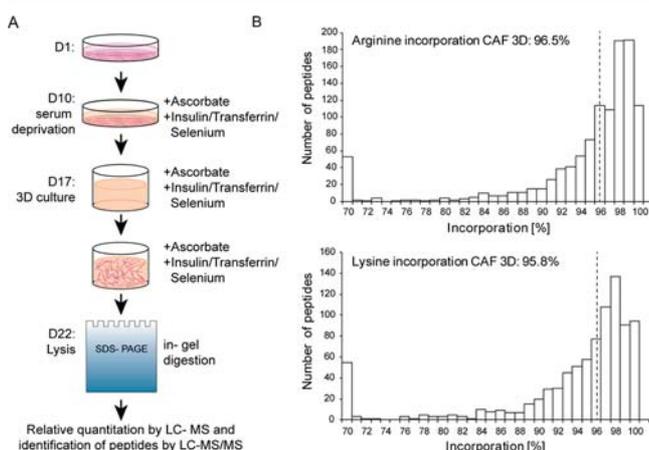


Figure 3. 3D-SILAC setup. (A) SILAC labeling strategy for primary human fibroblasts grown in 3D culture. Fibroblasts were SILAC labeled for 10 days in full medium and further incubated for 7 days in serum-deprived medium in 2D. After 5 days in 3D, cells were lysed and processed by geLC-MS/MS. (B) Isotopic label incorporation of CAF. The 1275 lysine- and 1130 arginine-containing peptides were analyzed for their incorporation efficiency (Arg10, Lys8) in relation to unlabeled peptides (Arg0, Lys0). The dotted lines mark the median labeling efficiencies.

containing 84 mg L⁻¹ heavy L-arginine, 146 mg L⁻¹ heavy L-lysine, and 125 mg L⁻¹ proline to counteract arginine-to-proline conversion. We reached 95.8% labeling efficacy of lysine- and 96.5% of arginine-containing peptides ([Figure 3B](#)), which is similar to results obtained in 2D.³⁷ Arginine-to-proline conversion was below 4% ([Supplementary Figure S3](#)). Thus, this 3D-SILAC approach permits an accurate quantitative analysis of different cell types and their produced ECM grown in 3D cultures as well as a characterization of the influence of culture conditions on cellular proteomes.

Cells Grown in 3D Upregulate Proteins Involved in ECM Organization and Establishment of Cell-ECM Contacts

First, we asked which pathways were affected by 3D culture conditions independently of the used cell type and quantitatively compared the proteomes of CAF and NHF grown in 3D to respective cells grown in 2D cultures ([Figure 4A](#)). SILAC-labeled cells grown for 5 days in 3D or in 2D,

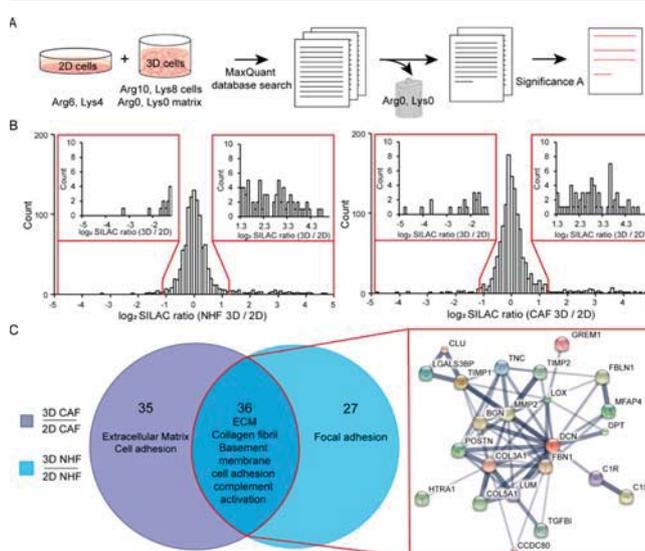


Figure 4. Comparison of 2D and 3D culture conditions. (A) Experimental workflow and data processing. MaxQuant database searches were performed using “triple SILAC” as quantification mode. Light SILAC-labeled proteins were excluded from further analysis. (B) Histogram of 3D versus 2D protein ratios of NHF (left) and CAF (right). Enlarged are log₂ SILAC ratios smaller than -1.3 and greater than 1.3. 3D culture conditions led to an upregulation of protein subsets. (C) GO-term enrichment analysis (FDR < 0.05, BH corrected) for significantly up- and downregulated proteins in CAF, NHF, or in both is shown (significance A, *p* < 0.05, BH-corrected). A STRING DB analysis of the 36 commonly regulated proteins identified proteins known to potentially interact.

respectively, were mixed in a 1:1 peptide ratio and analyzed by LC-MS/MS. To be able to discriminate cellular peptides from 3D matrix peptides, cells were exclusively labeled by “medium-heavy” and “heavy” amino acids, whereas the “light” label was used to identify nonlabeled matrigel and collagen I peptides, which were excluded from further analysis ([Figure 4A](#)). We identified 1515 proteins of which we could quantify 1107 proteins in two replicates each ([Supplementary Figure S4](#) and [Supplementary Table S3](#)). Interestingly, comparison of the two culture conditions showed a significant upregulation of protein populations in 3D cultures ([Figure 4B](#); Significance A, *p* < 0.05). According to a GO analysis, 3D cell cultures stimulate the expression of proteins involved in ECM organization (FDR

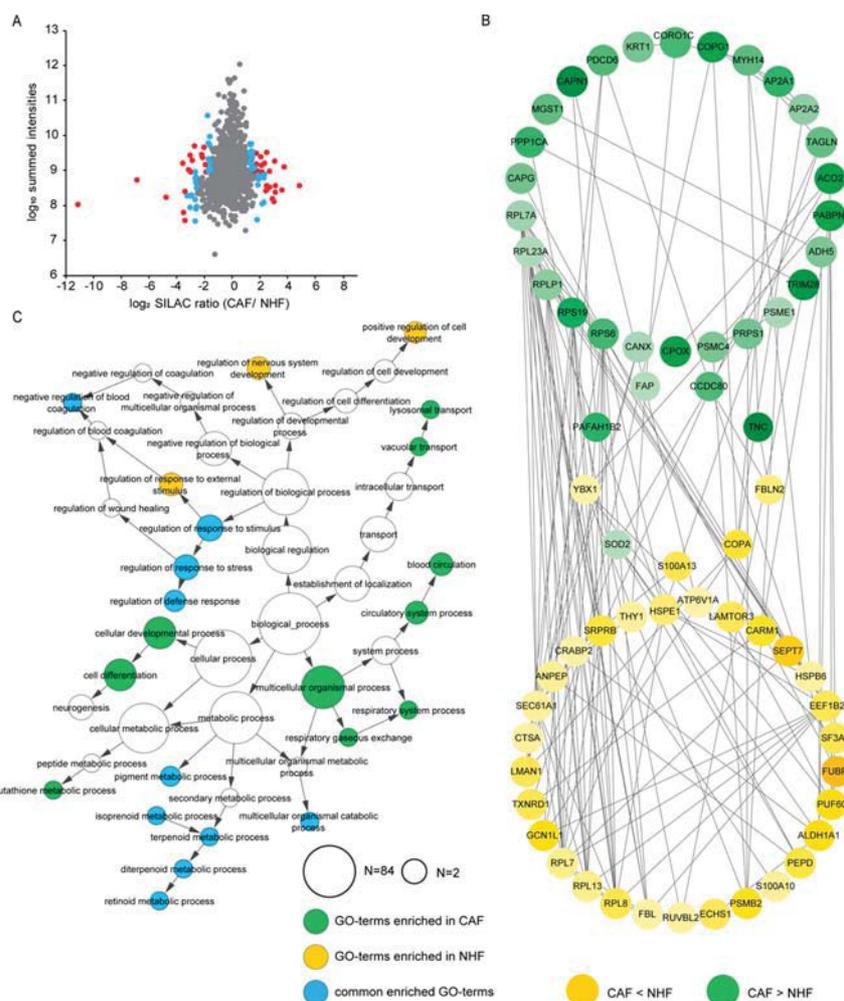


Figure 5. Comparison of proteomes of CAF and NHF grown in 3D. (A) Protein abundance plot comparing 3D-CAF and -NHF proteomes by a SILAC approach ($n = 2$). Significantly altered proteins were determined by performing outlier tests using Significance B values generated by MaxQuant²² and Perseus.²⁴ Regulated proteins are highlighted in blue ($p \leq 0.05$) and in red ($p \leq 0.01$), respectively. (B) STRING network analysis of significantly regulated proteins of CAF and NHF in 3D culture ($p < 0.05$). (C) GO-term enrichment ($p \leq 0.03$, colored circles) of significantly regulated proteins in 3D culture in CAF in comparison to NHF.

= 4.8×10^{-11}) and collagen fibril organization (FDR = 8.62×10^{-5}) irrespectively of the used cell type (Figure 4C). Among these ECM proteins, we identified several proteins that were previously shown to be involved in tumor progression. The proteoglycan biglycan (BGN) was found upregulated in CAF by increased TGF- β 1 and bFGF signaling³⁸ and was shown to promote melanoma invasion.³⁹ Also, the heparin-binding protein periostin (POSTN) was shown to be induced by bFGF signaling and to promote cancer cell survival.⁴⁰

Taken together, 3D culture conditions significantly altered the protein compositions of cells and led to an upregulation of cellular proteins critical for the establishment and maintenance of ECM–cell contacts. Critically, 3D culture conditions might reveal differentially regulated proteins important in disease, which are not as such detectable or regulated under 2D culture conditions. To characterize potential CAF-specific mechanisms critical for ECM contraction, we performed a differential analysis comparing NHF and CAF proteomes of cells grown in 3D.

3D Culture Conditions Induce CAF-Specific Changes That Are Not Observable in 2D

Using our 3D-SILAC approach, we directly compared NHF and CAF grown in 3D by normalizing them to a common super-SILAC mix as described in Figure 1A. We identified 2/238 proteins of which we could quantify 979 in two replicates each (Figure 5A, Supplementary Figure S5, Supplementary Table S4). In total, 94 proteins were significantly altered between NHF and CAF ($p \leq 0.05$), of which 64 potentially interact according to STRING DB. Importantly, the network contained a cluster of differentially regulated ECM proteins, proteins associated with extracellular space and regulation of extracellular stimuli (Figure 5B, center circle). GO analysis of significantly regulated proteins showed an enrichment for proteins involved in vacuolar and lysosomal transport ($p = 0.008$), regulation of response to stress ($p = 0.009$), multicellular organismal process ($p = 0.0047$), and cellular development and differentiation ($p = 0.02$; Figure 5C, Supplementary Figure S6). Especially the latter two terms nicely reflect the influence of 3D culture conditions. By comparing our data sets with a published *ex vivo* analysis of breast cancer biopsies, it became evident that the 3D data set

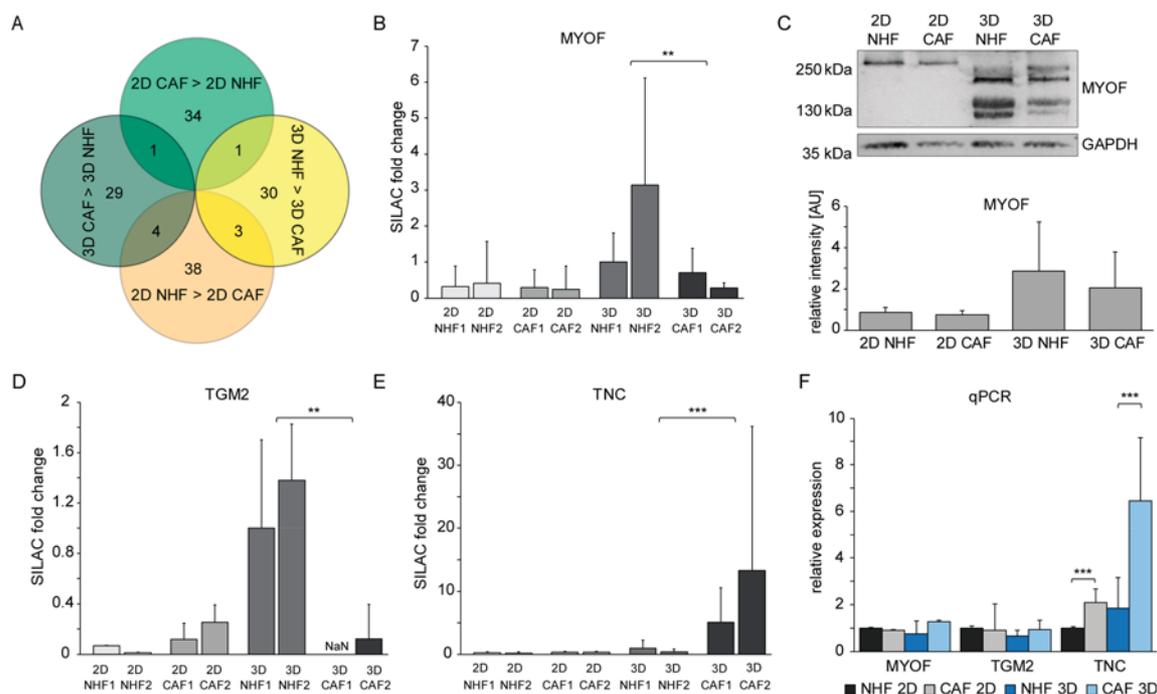


Figure 6. Differential abundances of proteins in 2D and 3D cultures. (A) Venn diagram of proteins that were identified as significantly regulated comparing proteomes of CAF and NHF in 2D or 3D (Significance B, $p < 0.05$). (B) Normalized fold change of SILAC ratios of MYOF of cells grown in 2D and 3D, normalized to 3D NHF1. Error bars indicate variability of respective peptide quantifications. Significance B was calculated with $p < 0.05$ for the \log_2 ratios 2D CAF/2D NHF and the sum of all intensities in 2D, and with the \log_2 ratios of 3D CAF/3D NHF and the sum of all intensities in 3D. (C) Western blot of MYOF in 2D and 3D NHF and CAF. Quantification of the Western blot is shown in the lower panel ($n = 2$). Normalized fold change of SILAC ratios of (D) TGM2 and (E) TNC of cells grown in 2D and 3D, normalized to 3D NHF1. Error bars indicate variability of respective peptide quantifications. Statistical analyses were performed as in panel (B). (F) Relative gene expression of MYOF, TGM2, and TNC under 2D and 3D culture conditions normalized to HPRT. Shown are ratios of biological replicates ($n = 2$ with three technical replicates each). $***p \leq 0.001$.

correlated slightly better compared to the 2D data set (Pearson coefficient of 0.38 versus 0.32 (Supplementary Figure S7)).⁴¹ Also, in 3D cultures, published CAF biomarkers better resembled *in vivo* observations.⁴² Out of 113 CAF marker proteins, we identified 16 in 3D and 17 in 2D, respectively. Critically, in 3D, 15 out of 16 proteins were regulated as published, whereas in 2D, only 7 out of 17 were regulated consistently (Supplementary Table S5). Thus, compared to 2D cultures, 3D culture systems appear to mimic closer observations made *in vivo*.

Interestingly, by comparing single proteins that were identified as significantly regulated in 3D or in 2D, it became evident that only few proteins overlapped (Figure 6A, Supplementary Table S6). More importantly, some proteins were oppositely regulated: four proteins were significantly upregulated in CAF in 3D, but in 2D they were upregulated in NHF. Among these proteins was TRIM28, a transcription factor known to be higher expressed in cancerous tissues⁴³ and transgelin (TAGLN), an actin cross-linking protein, which mediates cell contractility and promotes migration and invasion of cancer stem cells.⁴⁴ In 3D, caveolin-1 (CAV-1) was decreased in CAF in comparison to NHF, whereas in 2D, CAV-1 was higher expressed in CAF than in NHF. Decreased CAV-1 expression in CAF is known to promote cancer cell invasion and staining of breast cancer sections showed a clear decrease of CAV-1 in α -SMA positive cells.⁴⁵

Myoferlin (MYOF) is a protein that we found significantly upregulated in 3D NHF in comparison to CAF by SILAC-based MS ($p = 0.004$) as well as by Western blot, with no

significant regulation in 2D (Figure 6B,C). MYOF is a Ca^{2+} regulated vesicular protein known to regulate intracellular trafficking of growth factor receptors.^{46,47} It was shown to be overexpressed in human breast cancers regulating growth factor receptor activation. Our results indicate that cancer cells themselves and not the tumor stroma overexpress MYOF implicating that MYOF plays distinct roles in cancer and stromal cells. Interestingly, MYOF was shown to be proteolytically cleaved in breast cancer and cell lines leading to increased ERK1/2 phosphorylation.⁴⁸ We also observed different MYOF isoforms under 3D conditions by Western blot (Figure 6C). Their roles in fibroblasts and tumor stroma will have to be addressed in future studies.

Two proteins that are known to be important for CAF biology are tenascin (TNC) and transglutaminase 2 (TGM2) (Figure 6D,E). TNC, an ECM glycoprotein upregulated in wound healing and cancer which also influences gene expression,⁴⁹ was highly upregulated under 3D culture conditions in CAF ($p = 1.8 \times 10^{-8}$).^{50,51} In 2D conditions, this difference was not observed. Interestingly, upregulation of TNC appeared to be regulated on gene expression level as indicated by increased mRNA levels (Figure 6F). In contrast, abundance of transglutaminase 2 (TGM2) was significantly elevated in NHF in comparison to CAF in 3D ($p = 0.01$). In 2D, no significant differences in TGM2 abundance could be observed, but CAF showed tendencies of higher TGM2 levels than NHF. TGM2 is among others critical for cross-linking of ECM proteins and ECM stability.⁵² Its roles in cancer are controversially discussed as it might have pro- and

antiapoptotic properties.⁵³ TGM2 absence in the stroma is thought to be a favoring condition for the formation and development of metastases, while TGM2 in tumor cells might be required for the development of metastases.^{54,55} In contrast to *TNC*, *TGM2*, and *MYOF* gene expression analyses could not be used to predict protein abundance (Figure 6F). mRNA and protein abundance anticorrelated indicating extensive post-transcriptional/post-translational regulatory mechanism.

CONCLUSION

In the current publication, we introduce a 3D cell culture method based on a mixture of collagen I and matrigel that is amenable to SILAC labeling and that allows an accurate quantitative analysis of intracellular proteins and the cell microenvironment. In addition, SILAC labeling supports the discrimination of cell-intrinsic from exogenous matrix proteins. Because of increased sample complexity, however, SILAC labeling might negatively influence identification rates. To increase identification rates, data-dependent as well as data-independent label-free quantification approaches can be used in the future.

We highlight proteomic changes of cells, which are transferred from 2D to 3D and specifically address the response of CAF in 3D. Critically, 3D cell cultures highlight cell type-specific differences that are not observable in 2D and that closely mimic *in vivo* observations. Thus, our approach should alleviate the *in vitro* identification and characterization of *in vivo*-relevant biomarkers and new disease targets. Together with organoid cultures, (organotypic) 3D cell culture systems hold great promise for improved drug development, reducing the need for animal experiments and avoiding nonhuman species-specific effects.

ASSOCIATED CONTENT

Supporting Information

The Supporting Information is available free of charge on the ACS Publications website at DOI: [10.1021/acs.jproteome.8b00237](https://doi.org/10.1021/acs.jproteome.8b00237).

- Supplementary figures (PDF)
- SILAC ratios of NHF and CAF from 2D culture (XLSX)
- Collagen I (Corning) and Matrigel (growth factor reduced, Corning) (XLSX)
- SILAC ratios from 2D versus 3D culture conditions (XLSX)
- SILAC ratios of NHF and CAF from 3D culture (XLSX)
- Comparison of CAF consensus proteome to 2D versus 3D data (XLSX)
- Significantly regulated proteins in 2D and 3D normalized to the super-SILAC mix (XLSX)

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Notes

The authors declare no competing financial interest. MS proteomics data were deposited to the ProteomeXchange Consortium via the PRIDE²³ partner repository with the data set identifier PXD009424.

ACKNOWLEDGMENTS

The research leading to these results has received funding from the German Research Foundation (DFG) through CRC 850 project B8 and DE 1757/3-2, and from the Swiss National Science Foundation, Grant No. 31003A-166482/1.

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