Modelling TGF β R and Hh pathway regulation of prognostic matrisome molecules in ovarian cancer

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Conflicts of Interest

The authors have declared that no conflict of interest exists.

Author Contributions

RD-S: designing research studies, conducting experiments, acquiring data, analyzing data, writing the paper

SN: conducting experiments, acquiring data

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Abstract

In a multi-level ‘deconstruction’ of omental metastases, we previously identified a prognostic matrisome gene expression signature in high-grade serous ovarian cancer (HGSOC) and twelve other malignancies. Here, our aim was to understand how six of these extracellular matrix, ECM, molecules, COL11A1, COMP, FN1, VCAN, CTSB and COL1A1, are up-regulated in cancer. Using biopsies, we identified significant associations between TGF β R activity, Hedgehog signalling and these ECM molecules and then studied the associations in mono-, co- and tri-culture. Activated omental fibroblasts produced more matrix than malignant cells, directed by TGF β R and Hedgehog signalling crosstalk. We ‘reconstructed’ omental metastases in tri-culture of HGSOC cells, omental fibroblasts and adipocytes. This combination was sufficient to generate all six ECM proteins and the matrisome expression signature. TGF β R and Hedgehog inhibitor combinations attenuated fibroblast activation, gel remodelling and ECM remodelling in these models. The tri-culture model reproduces key features of omental metastases and allows study of diseased-associated ECM.

150 words

Key words: Ovarian cancer, ECM, 3D models, omentum, metastases, matrisome, TGF-beta, Hedgehog signalling

Introduction

Desmoplasia and extracellular matrix (ECM) remodelling are common features of human solid tumors and are driven by the continued presence of malignant cells. In high-grade serous ovarian cancer (HGSOC) there is increasing evidence that stromal components play a key role in tumor growth, promoting aggressive malignant cell phenotypes ^{1,2}.

Previously, we reported a tumor-associated matrisome gene signature, the Matrix Index (MI), which predicted poor prognosis in HGSOC patients and twelve other solid tumor types ³. Six of these genes, *COL11A1*, *COMP*, *FN1*, *VCAN*, *CTSB* and *COL1A1*, were significantly upregulated with disease and have all previously been associated with tumor progression, poor prognosis, and invasive malignant cell phenotypes in ovarian and/or other cancers e.g. ^{4-6 7 8}. A number of signalling pathways have been linked with some of these molecules including activation of FAK, TGF β -SMAD2/3 signalling, PDGF/PDGFR signalling, Wnt and Hh/GLI signalling ^{4,9-12}, however it is uncertain if there is a common regulatory mechanism that links them.

One of the key stromal cell types, the activated fibroblast, is a major producer of tumor ECM ¹³⁻¹⁶. These resident or infiltrating cells acquire a phenotype most often characterised by expression of vimentin, alpha smooth muscle actin (α SMA), fibroblast activation protein (FAP), fibroblast-specific protein (FSP), or yes-associated protein (YAP) ¹⁷⁻¹⁹. Previously we reported a strong positive correlation between the density of α SMA+ and FAP+ stromal cells, and the degree of disease in metastatic HGSOC ⁹. Signalling pathways associated with the activation of α SMA+ fibroblasts have included, most notably, TGF β as well as and Hh ^{18 16,20,21}.

The main goal of this study was to identify cells and signalling pathways regulating production of the six upregulated MI molecules and then build a human multi-cellular model replicating this disease process. We first characterised biopsies from human HGSOC omental metastases and used *in silico* analysis of HGSOC samples to generate hypotheses. We then isolated early passage and primary cell cultures from biopsies for validation and to build an informed novel 3D tri-culture HGSOC model. We report that TGF β R and Hedgehog (Hh) signalling are important regulators of the six upregulated MI molecules that are mainly produced by

α SMA+/FAP+ omental fibroblasts, and that cross-talk between these two pathways supports initiation and maintenance of this activated phenotype. Moreover, our novel human HGSOC model replicated some key features found in HGSOC omental biopsies and allowed us to understand clinically relevant regulation of diseased-associated matrisome molecules.

Results

Stromal and malignant cells diversely produce disease-associated matrix molecules

We analysed thirty-six omental biopsies with a spectrum of tissue remodelling and disease involvement, all from patients with Stage 3-4 HGSOc. Tissues were assigned a disease score based on area of tissue remodelled with disease-associated stroma and malignant cells (Fig. 1a) as previously described³. Density of PAX8+ cells, a marker of the malignant cells, correlated strongly ($r = 0.874$) with disease score, as expected (Fig. 1b, SFig. 1a). All omenta studied were from patients with confirmed metastases but malignant cells were only visible in 26/36 biopsies.

Matrisome protein density was measured by IHC in tissue sections and quantified with Definiens Tissue Suite® software. Density of all six upregulated-MI molecules increased significantly with disease progression (Fig. 1c-d, SFig. 1b). FN1 had the strongest correlation ($r = 0.969$) with disease score, the greatest average density and was primarily located throughout the stroma, but was also found in malignant cells in 50% (13/26) of biopsies. VCAN was largely confined to stroma with low malignant cell positivity (3/26 biopsies). COMP was present in both stroma and most malignant cells (21/26). CTSB was present in malignant cells of all samples with additional positivity in dense aligned stromal borders. COL11A1 was most common in stroma adjacent to malignant cells or with high cell alignment and there was malignant cell positivity in 16/26 biopsies. COL1A1 had the weakest correlation with disease score and was found heterogeneously throughout the stroma and malignant cells (18/26 biopsies). Figure 1d summarises the pattern of malignant cell positivity for the upregulated-MI molecules.

To further study origin of the upregulated-MI molecules, we conducted RNAscope *in situ* hybridisation on highly-diseased tissue sections (Fig. 1e). Consistent with IHC data, *FN1* and *COL1A1* were expressed in stroma adjacent to malignant cells and in some malignant cells. *VCAN* and *COMP* were expressed mostly in stromal cells with elongated morphology and bordering malignant cells. A minority of malignant cells had *VCAN* expression, however, in contrast to IHC, no *COMP* expression was observed in malignant cells. *CTSB* was expressed in all malignant cells and in stroma at some malignant cell:stromal borders. *COL11A1* was expressed

in stroma adjacent to malignant cells or where stromal cells appeared elongated and there was expression in some malignant cells.

In summary, these data support and extend our previous RNAseq and proteomic results in HGSOC confirming positive correlations of the upregulated-MI molecules with disease score and identifying spatial location and cellular origin.

The prognostic matrisome molecules associate with TGF β and Hh signalling

Our next aim was to identify common regulatory pathways for the upregulated MI molecules. We first integrated protein-protein interaction and signalling pathway data from public databases using PathwayLinker.org²². Figure 2a illustrates the interaction network of the upregulated MI molecules along with their first neighbour interactors. There was at least one direct or indirect interaction linking *FN1*, *VCAN*, *COMP*, *COL1A1* and *CTSB*. Based on the upregulated-MI molecules and their first neighbour interactors, TGF β (KEGG) signalling pathway was significantly overrepresented ($p = 2.2\text{e-}09$), along with ECM (KEGG), PDGF (Reactome), Actin (KEGG), and P53 (KEGG), (Supplementary Table 1).

We next interrogated the ICGC transcriptional dataset of HGSOC biopsies²³ looking at association between prognosis and mean expression levels of upregulated MI genes. We found that high average expression of upregulated MI genes associated with significantly worse survival in HGSOC (logrank $P = 5.2\text{e-}05$) (Fig. 2b). Differentially expressed genes in high expression group included periostin, several collagens, osteonectin, and activation markers *ACTA2* and *FAP* (Fig 2c). Gene set enrichment analysis (GSEA) highlighted over-expression of matrisome, ECM, collagen, focal adhesion and smooth muscle contraction pathways (Fig. 2d). Of particular interest was significant enrichment for TGF β (KEGG), WNT (KEGG), PDGF (Reactome) and Hh (KEGG) signalling (Fig. 2d, Supplementary Table 2). These results suggested that at least five of the upregulated-MI molecules might be co-regulated in HGSOC and that TGF β signalling is involved.

To investigate this further, we stained tissue sections for TGF β (Fig. 2e) and found a strong correlation between positive cell density and disease score (Fig. 2f), observing the strongest staining in malignant cells. We also stained tissues for GLI1 (Fig. 2e), a main downstream target of Hh signalling, which has been previously associated with collagen producing αSMA^+ phenotypes^{16,20} and also implicated in TGF β cross-talk promoting

fibrosis^{21,24}. Tissues with high disease score had significant GLI1 positivity in contrast to low disease score tissues that had relatively little. Malignant cells in all biopsies displayed cytoplasmic GLI1, but nuclear GLI1 varied; 16/26 biopsies had total nuclear positivity, 4/26 were totally nuclear negative, and 6/26 were mixed (Fig. 2g). GLI1+ stromal cells were identified in 22/26 of malignant cell biopsies displaying a mixture of cytoplasmic and nuclear positivity.

Malignant cells upregulate TGFβ3 and heterogeneously express matrisome molecules

Our next aim was to build 2D and 3D *in vitro* human cell models to allow us to validate and extend our findings. First, we investigated two HGSOC malignant cell lines for suitability in such models. G164 and AOCS1 were established in our lab from patients with omental metastases and kept at low passage number. The original tissue biopsies for both cell lines showed malignant cell PAX8 positivity and cell lines cultured *in vitro* maintained PAX8 nuclear positivity (Fig. 3a). We characterised these HGSOC cells by RNA-sequencing. Unsupervised clustering using principle component analysis (PCA) illustrated significant transcriptional differences between the two cell lines with the first principle component accounting for more than 89% of the difference (Fig. 3b). However, within the same cell line there was relatively little variation between monolayer and spheroid culture. GSEA highlighted significant canonical pathway differences between the two cell lines; notably, AOCS1 had enriched Hh-GLI signalling and G164 was enriched in transcriptional activity of SMAD2/3/4 and signalling by TGFβR complex (Fig. 3c). The differences in Hh signalling between AOCS1 and G164 were confirmed by analysing GLI1 expression using qRT-PCR (Fig. 3d) and IF (Fig. 3e). In addition, cell proliferation, which Hh is known to affect, was significantly reduced in AOCS1 with a GLI1/2 inhibitor, GANT61,²⁵ (SFig. 2a-c) but not in G164 (SFig. 2d). Use of a TGFβR inhibitor, SB431542,²⁶ on the G164 cell line attenuated cell contraction of gels and also cell migration (SFig.2e,f), both processes associated with activated TGFβR signalling, but did not affect viability (SFig.2g). RNA sequencing and qRT-PCR detected five of the six upregulated-MI molecules (mRNA for COMP was not present) in the cell lines but expression was heterogeneous (Fig. 3f and SFig. 2h). We stained biopsy sections for differentially expressed matrix molecules identifying malignant cell positivity for COL11A1 in AOCS1 and FN1 in G164 (Fig. 3g). IF on *in vitro* monocultures

displayed strong intracellular COL11A1 staining organised into fibrils in AOCs1 and significant deposition of FN1 by G164s (SFig. 2i) replicating tissue staining.

Expression of the three TGF β -isoforms was analysed in malignant cells and compared to a non-malignant cell control, wild-type immortalised FT318 fallopian tube surface epithelial cells (Fig. 3h). Malignant cells expressed all three TGF β isoforms with little difference between adherent and spheroid cultures, but TGF β 3 was the most highly expressed relative to FT318. TGF β 3 protein was also confirmed by IF in both cell lines (Fig. 3i). To test the influence of malignant cell-secreted TGF β on fibroblast activation, we co-cultured malignant cells with primary omental fibroblasts (OFs) in collagen gels. All co-culture gels had a significantly greater gel modulus (stiffness) compared with respective fibroblast controls (Fig. 3j), while malignant cells grown alone did not alter gel modulus (SFig. 2j). In co-cultures, α SMA, FAP and eosin staining were all increased in OFs, but expression was attenuated using the TGFBR inhibitor (Fig. 3k, SFig. 2k). Interestingly, we were unable to detect expression of any Hh ligands in either cell line.

These results highlight heterogeneity in cell-signalling and matrisome expression in HGSOc malignant cells but they also reveal a commonality in upregulation of TGF β , which activates OFs via TGF β R signalling.

TGF β 3 stimulates activation, GLI1 expression and diseased-matrix production in omental fibroblasts

Having identified TGF β as a stimulator of fibroblast activation, we next looked at associations between fibroblasts and malignant cells in HGSOc omental biopsies. Density of α SMA+ or FAP+ cells correlated with density of PAX8+ malignant cells ($r = 0.833$ and $r = 0.814$ respectively) (Fig. 4a) and staining was highest in stroma adjacent to malignant cells (SFig. 3a). We pseudo coloured and overlaid consecutive α SMA and FAP tissue images (Fig. 4b) identifying an α SMA+/FAP+ stromal phenotype located primarily at malignant cell borders where the densest matrix and GLI1 staining were previously seen.

When we isolated OFs from HGSOc omental biopsies we observed a range of activation states in culture, which we categorised before use in experiments as either low (L-OFs) or high (H-OFs), defined by cell morphology and level of expression of F-actin and α SMA stress fibres (SFig. 3b). Regardless of initial activation state, treating OFs with TGF β 3 increased *ACTA2* and *FAP* mRNA expression on average 4-fold and 2-fold respectively (Fig. 4c), increased IF staining for both proteins (Fig. 4d, SFig. 3c) as well as the proportion

of α SMA+/FAP+ cells (SFig. 3d). TGF β 3-treatment also promoted F-actin fibre formation, FSP and YAP nuclear expression (SFig 3e) in L-OFs, although differences in the latter two appeared small. In Figure 2e we identified GLI1 positive stromal cells in HGSOC tissue. Hh activation can promote collagen-producing myofibroblasts in some fibrotic diseases ²⁷ and recently α SMA+/GLI1+ mesenchymal cells have been identified ²⁸. TGF β 3-treated OFs had on average a 2.5-fold increase in GLI1 expression and a 2-fold decrease in GLI3 expression, typically considered a Hh pathway repressor ²⁹, while SB431542 reversed this trend (Fig. 4e). GLI1 IF showed weak cytoplasmic staining in L-OFs while TGF β 3-treated L-OFs had stronger cytoplasmic and positive nuclear staining (Fig. 4f).

Next we analysed expression of upregulated-MI molecules in L-OFs and found that TGF β 3 upregulated mRNA expression of *FN1*, *VCAN*, *COL1A1*, *COL11A1*, and *COMP* (Fig. 4g) and promoted matrix deposition and organisation (Fig. 4h). Initially, there was little VCAN or COMP in confluent untreated L-OFs but TGF β 3 induced widespread deposition of both proteins. Treated-cells contained denser FN1, COL1A1 and COL11A1 fibres with greater alignment. Of particular note, COL11A1 was organised into intracellular fibres similar in appearance to microtubules.

Tissue stiffening and contraction occurs during remodelling in fibrosis-associated diseases and is caused largely by myofibroblasts ^{26,30}. When we cultured L-OFs in 3D collagen gels for 7 days, TGF β 3-treatment caused ~ 4-fold increase in gel modulus compared with untreated gels (Fig. 4i). Gels seeded with H-OFs formed stiffer gels than L-OFs but modulus was significantly reduced when treated with SB431542 (SFig. 3f). Cells in TGF β 3-treated gels had denser α SMA, FAP, FN1 and COL11A1 staining compared with controls (Fig. 4j).

Collectively these experiments showed that TGF β 3 promotes an α SMA+/FAP+ contractile OF phenotype associated with an upregulation of GLI1 and increased deposition of five of the six upregulated-MI molecules.

TGF β R and GLI1/2 inhibitors downregulate α SMA, GLI1 and matrix molecules in OFs

We next asked if GLI1 played a downstream role in TGF β R pathway activation in H-OFs (Fig. 5) and TGF β 3-activated L-OFs (SFig. 4). Inhibitors of TGFBR1, SB431542 ²⁵ or Gli1/2, GANT61 ²⁶, both reduced α SMA stress fibres in H-OFs and induced a morphology shift from a relatively large spread cell to a smaller fusiform cell (Fig. 5a). Both inhibitors reduced *ACTA2* expression between 4-5 fold, but there was less effect on FAP (Fig.

5b, SFig. 4a). Combination treatment of the inhibitors caused a synergistic effect on *ACTA2* resulting in >10-fold down-regulation. Both inhibitors decreased the proportion of α SMA+/FAP+ cells with the greatest effect induced by the inhibitor combination (Fig. 5c, SFig. 4b). IF confirmed α SMA stress fibres decreased with inhibitor combination, while again there was less effect on FAP (Fig. 5d). Both inhibitors down-regulated GLI1 3-5 fold and upregulated GLI3 2-3 fold (Fig. 5e, SFig. 4c) while IF showed reduced cytoplasmic and nuclear GLI1 in H-OFs treated with the inhibitor combination (Fig. 5f).

SB431542 reduced *FN1*, *VCAN*, *COL1A1*, *COMP* and *COL11A1* mRNA while GANT61 reduced *COL1A1*, *COMP* and *COL11A1* (Fig. 5g, SFig. 4d), implying that FN1 and VCAN are not regulated by Hh. Overall the inhibitor combination was most effective at downregulating collagen matrix mRNA than each individual inhibitor. Figure 5h shows representative IF in 2D H-OF cultures for the five molecules down regulated at mRNA level molecules confirming that the effect of the inhibitor combination is replicated at protein level. There was almost complete absence of VCAN and COMP; fibres of FN1 and COL1A1 were less and disrupted; and COL11A1 had lost fibrous structure. When H-OFs were grown in 3D collagen gels the inhibitor combination reduced density of α SMA, FAP, FN1 and COL11A1 (Fig. 5i). In contrast to OFs, there was relatively little inhibitor effect on matrix expression or organisation in AOCS1 malignant cells (SFig 5a-b). However, in G164 malignant cells, there was a significant effect of the TGF β R inhibitor on FN1 mRNA and protein (SFig. 5c-d), following the trend seen in OFs, and this translated to 3D cultures whereby spheroid growth was also reduced (SFig. 5e). In addition, we observed a marked reduction in TGF β 2 and - β 3 expression in AOCS1 with Hh inhibitor GANT61 and a 10-fold reduction in TGF β 2 expression in G164 with TGFBR inhibitor SB431542 (SFig. 5f-g).

We next co-cultured malignant cells with OFs in 3D gels and measured inhibitor effect on gel modulus. Co-cultures treated with either inhibitor alone had decreased modulus and overall the combination was the most effective (Fig. 5j), also reducing the size of cell clusters in the gels (Fig. 5k). Viability of co-cultures was unaffected by inhibitors (SFig. 5h).

In summary, we found that TGF β stimulates GLI1 promoting an α SMA COL1A1/COL11A1/COMP rich matrix, however, Hh signalling appeared to have little involvement with VCAN or FN1 production. We also observed

a synergy with TGF β R and GLI1 inhibition resulting in the inhibitor combination being most effective in attenuating activation, contraction and matrix production. There were also regulatory differences in the two pathways between malignant cells and OFs.

A novel 3D tri-culture replicates some key features found in HGSOC biopsies

In order to conduct pre-clinical studies of therapies that could target the poor prognostic MI molecules we require human 3D models that recreate more of the complexity and interactions in the tumor microenvironment. Adipocytes are the major cell type in normal omentum and act as a source of energy for developing metastases³¹. We hypothesised that adipocytes could provide a relevant biological substrate for longer-term malignant cell and fibroblast co-culture allowing for the study of matrix molecule regulation and also that such tri-cultures would also more closely resemble the omental tumor microenvironment.

We isolated mature adipocytes from omental digests (Fig 6a) and confirmed there were viable unilocular cells. We seeded adipocytes into low-weight (0.1w%) COL1 gels in 96 well plates, enabling adipocytes to rise up forming a compact mm-sized layer (Fig 6b). Figure 6c shows H&E images of an adipocyte gel after 14 days of culture compared to normal human omentum. We assessed viability and perilipin-1, a marker of mature adipocytes, over 21 days. Although there appeared to be some decline in viability/live stain there was very little dead staining at day 21 (Fig 6d) and perilipin-A levels remained relatively constant (Fig 6e). IHC for MI molecules revealed low levels of MI molecules in the adipocyte cultures (SFig. 6a).

To establish tri-cultures, we inserted seven-day co-cultures (providing time for gel remodelling) directly into the middle of adipocyte gels and then incubated for a further 14 days in free-swelling conditions (Fig. 6f). This time period was sufficient for remodelling of the adipose tissue, and generation of cell markers and all upregulated MI molecules (Fig. 6g-h, SFig. 6b). PAX8 staining identified malignant cells, while FAP and α SMA staining identified activated fibroblasts located mainly at borders between malignant cells and remodelled adipose tissue (Fig. 6h) as we had observed in biopsies. Both malignant cells and stromal cells were proliferating at 21 days demonstrated by Ki67 staining (Fig. 6h). Malignant cells were positive for TGF β and GLI1 positivity was present in malignant and stromal cells. All six upregulated-MI molecules were found in the

stroma and some in malignant cells (Fig. 6h). We conclude that tri-cultures support malignant cell and fibroblast growth and replicate some of the key features that we have found in patient biopsies.

To further confirm that the tri-cultures were a valid model to study regulation of MI molecules and that the addition of adipocytes better replicated the human omental TME, we conducted RNAseq analysis of the adipocyte gels, G164-OF collagen gel co-cultures and the G164 tri-cultures (Fig 7 a-d). The tri-cultures had the most complex matrisome gene transcription signature (Fig. 7a) and showed a significant enhancement of ECM, adhesion, collagen fibril organisation and also cell migration signatures compared to the G164-OF co-cultures (Fig 7b, Supplementary Table 3). Twenty-one of the 22 MI molecules originally identified by us in HGSOc omental metastases ³ could be sufficiently detected by RNAseq allowing us to calculate the MI of adipocyte-only gels, G164-OF cultures and tri-cultures. Tri-cultures had an increased MI compared with adipocyte-only gels and co-cultures (Fig. 7c) with values similar to diseased omental metastases from HGSOc patients ³. The cluster dendrogram also shows a clear separation between adipocyte cultures, co-cultures and tri-cultures (Fig. 7d).

TGF β RI and GLI1/2 inhibitor combination reduces matrisome production in tri-cultures

Having shown that MI levels were comparable to the biopsies, and implicating TGF β R and Hh signalling in regulation of the upregulated-MI molecules, we tested their inhibitors in the tri-cultures. We used the inhibitor combination as we saw previously that it was most effective at reducing OF activation and matrisome molecules. The inhibitor combination did not affect total cell viability (SFig. 7a) but significantly reduced adipocyte gel contraction in all tri-cultures (Fig. 7e and SFig. 7b) and reduced remodelling or malignant cell invasion of adipocytes (SFig. 7c). Confocal microscopy showed a noticeable reduction in all six upregulated-MI molecules imaged in tri-cultures treated with the inhibitor combination (Fig. 7f and SFig 7d). In controls, G164 cells formed large colonies surrounded by activated fibroblasts but with the inhibitor combination, malignant colonies were significantly smaller and widely dispersed. In treated AOCs1 tri-cultures, matrix molecules and activation markers were also reduced compared with controls (Fig. 7f and SFig 7d).

We also conducted RNAseq on G164 tri-cultures with the inhibitor combination. Unsupervised clustering of the data showed that the inhibitor-treated cultures segregated separately from the control tri-cultures (SFig. 7e). Expression levels of fibroblast activation markers and the six upregulated-MI molecules, including *CTSB*, were significantly reduced by the inhibitor combination (Fig. 7g). GSEA showed significant downregulation of pathways associated with matrisome, ECM, collagens, as well as TGF β and Hh signalling (SFig. 7f,g, Fig. 7h, Supplementary Table 4). The overall MI was reduced to the level of the adipocyte gels or co-cultures (Fig. 7i). These experiments demonstrate that this novel tri-culture model replicates key features of the omental HGSOc tumor microenvironment, especially matrisome components from the Matrix Index signature. Moreover, we can use this model to investigate regulation of tumor-associated components.

Discussion

We recently published a multi-level analysis of developing HGSOC metastases³. One of the significant findings was a pattern of 22 matrisome genes we termed the Matrix Index (MI) that significantly changed with disease progression and was highly prognostic in ovarian and twelve other solid human cancers. Six of these molecules were significantly upregulated with disease progression and sixteen downregulated. In the present work, we have shown that expression levels of the six upregulated-MI molecules themselves predict poor prognosis in HGSOC and associate with an activated α SMA+/FAP+ fibroblast phenotype regulated by TGF β R activity and Hh signalling.

We used the knowledge gained from our previous analysis of HGSOC metastases, further studies on HGSOC biopsies, *in silico* analysis, and *in vitro* cultures to inform and build a relevant 3D multi-cellular model of the tumor microenvironment. We facilitated sustained production of key matrisome proteins in tri-cultures by cell types also found in patient biopsies and RNAseq analysis demonstrated that several important features of the diseased biopsies, especially related to ECM regulation, cell adhesion and migration, as well as the MI gene expression signature, were enhanced in the tri-cultures. Interestingly, compared to responses with monolayers on stiff plastic, FAP expression was significantly down regulated and CTSB expression was also down regulated with the inhibitor combination in tri-cultures. These differences implicate the importance of a physiologically relevant biomechanical environment and our results show that human 3D multi-cellular models can be useful for studying some aspects of cancer biology.

We demonstrated that TGF β signalling plays a powerful role in induction of an aggressive fibroblast phenotype, which is responsible for deposition of disease-associated matrix that predict poor prognosis. TGF β ligands play important roles in development, homeostasis and wound healing and all three known isoforms act through the same receptor signalling pathway³². The TGF β pathway is widely acknowledged as essential for tumor progression and can play pivotal roles as both a promoter and suppressor of cancer cells. Cancer cells can acquire loss-of-function mutations and lose responsiveness to TGF β thereby bypassing cell cycle arrest³³. TGF β plays an important role in recruitment and activation of cells of the innate immune system but also acts to suppress immune cell functions³⁴. Additionally, TGF β plays an essential role in regulation of the

adaptive immune system and its continued presence can suppress T-cell functions and promote pro-tumorigenic phenotypes^{35,36}.

More recently, TGF β has been recognised for its potential regulatory role in the stromal microenvironment, which in turn plays an important role in tumor progression. In our study we identified that malignant cell lines expressed all three TGF β isoforms and TGF β -2/3 ligands were upregulated compared to our non-malignant control with the greatest increase for TGF β 3. TGF β 3 has previously been associated with a set of poor outcome genes in serous ovarian cancer¹⁰. We showed that TGF β 3 induced α SMA, FAP and GLI1 expression in OFs and promoted production of five upregulated-MI molecules. Of particular interest is a recently published bioinformatics analysis of pan-cancer transcriptional-ECM regulation in cancer³⁷. Chakravarthy *et al* reported that their ECM signature was linked to TGF β signalling and was a biomarker of failure to respond to immune checkpoint blockade³⁷. Response to an anti-PDL1 agent in patients with metastatic bladder cancer was also associated with increased TGF β signalling in patient biopsies³⁸ and treatment of tumor bearing mice with inhibitors of TGF β or its receptor enhanced response to anti-PD1/PDL-1 therapies^{36,38}.

We have highlighted apparent cross-talk between TGF β R and Hh, both pathways promote α SMA in OFs such that TGF β R stimulates GLI1 signalling leading to increased α SMA expression. FN1 and VCAN were upregulated by TGF β , in agreement with previous studies, but Hh appeared to have little involvement. However, there was a strong indication that Hh enhances COL1A1, COL11A1 and COMP and that the GLI1/2 inhibitor created a synergistic inhibitory effect when used with the TGF β R inhibitor. Interestingly, the GLI1/2 inhibitor did not influence matrix molecule expression in malignant cells, even in AOCS1, which had enriched Hh-GLI pathway activity, implying that the signalling mechanisms either have a functional loss or are different between cell types. However, GLI1/2 inhibition did reduce proliferation in AOCS1. In addition, expression of Hh ligands was not detected in either HGSOV cell line indicating that GLI1 activation in OFs was not due to malignant cell-secreted Hh ligands. These two separate observations of inhibition synergy and GLI1 stimulation by TGF β signalling suggest that Hh is likely to be activated by more than one pathway and therefore inhibition of TGF β R activity does not silence all Hh activity. This demonstrates potential for use of GLI inhibitors in cancers that have poor prognostic Hh-stromal signatures and malignant cell Hh activity and there may be added benefit

from combination treatment with TGF β R inhibitors. Currently, the most clinically advanced group of Hh inhibitors target smoothened (SMO)³⁹, which is upstream of GLI1. However, there have been cases where malignant cells developed clinical resistance to SMO inhibitors via a number of different mechanisms³⁹ and therefore directly targeting GLI may offer more promise in bypassing SMO-resistant cells.

All six upregulated-MI molecules have previously been linked to tumor progression. In particular, COL11A1 expression is consistently linked with poor prognosis in solid metastatic carcinomas^{8,10,12}. While COL11A1 has been implicated as a specific biomarker of activated fibroblasts⁸, it can also be expressed in epithelial cells with high metastatic potential¹². Indeed, in this study we demonstrated that AOCs1 were highly positive for COL11A1, and there was malignant cell nuclear positivity in >50% of our biopsies. Interestingly, in our cells, COL11A1 was intracellular and highly expressed in cells with active Hh signalling. Use of the inhibitor combination on OFs caused a total breakdown of COL11A1 fibrous structure, in line with loss of α SMA stress-fibres, suggesting a role in forming a stable and contractile phenotype. We believe that this warrants further investigation.

In conclusion, the main drive for creating human models of the tumor microenvironment is to study processes governing disease progression in a more physiologically relevant setting and to aid pre-clinical testing. The multi-cellular model we describe here could be useful for screening compounds that could modify the malignant matrix that associates with poor prognosis in 13 common human cancers. The most promising candidates could then be tested in mouse models that most closely replicate the human TME, either patient-derived xenografts or models such as our recently published new syngeneic mouse HGSOc models that replicate many features of the human omental TME⁴⁰.

In our model, TGF β R and GLI inhibitors attenuated fibroblast activation and tumour-associated matrix production while preventing malignant cells from forming large spheroid growths. Therefore, inhibitors of these pathways may have clinical potential, alone or in combination. While we do not know if these processes have the potential to increase malignant cell dissemination due to removal of the physical matrix barrier, it is also possible that this may facilitate better access for cancer-treatments or immune cells. We believe that our

novel tri-culture model will be a useful first step in pre-clinical evaluation of therapies targeting dysregulated matrix in human solid cancers and their effect on immune cell access to malignant cells. Moreover, we believe that our work demonstrates the usefulness of using a combination of mono- co- and multi-cellular cultures to understand cell:cell interactions in the tumour microenvironment.

Methods

Ovarian Cancer Patient Samples and Study Approval

Patient samples were kindly donated by women with HGSOC undergoing surgery at Barts Health NHS Trust. Tissue deemed by a pathologist to be surplus to diagnostic and therapeutic requirement were collected together with associated clinical data under the terms of the Barts Gynae Tissue Bank (HTA license number 12199. REC no: 10/H0304/14). Each patient gave written informed consent and all tissue used for this study was approved by a UK national review board. Studies were conducted in accordance with the Declaration of Helsinki and International Ethical Guidelines for Biomedical Research Involving Human Subjects (CIOMS).

RNA *in situ* hybridization

Sections (4µm) of formalin-fixed paraffin embedded (FFPE) human omentum samples were deparaffinised, treated with hydrogen peroxide and boiled in the target retrieval reagent. Sections were dried in ethanol and left at room temperature (RT) overnight. Slides were incubated in protease reagent at 40°C in a HyBEZ Hybridization System (Advanced Cell Diagnostics Inc. USA) followed by incubation at 40°C with the gene-specific probe. The AMP 1-6 reagents were all subsequently hybridized as specified in the manufacturer's instructions. Labelled mRNAs were visualized using DAB reagent and counterstained using 50% Gill's haematoxylin. Counterstained slides were dehydrated using 70% and 95% ethanol and cleared in xylene before mounting coverslips using DPX. RNAscope® probes: FN1 (Hs-FN1 310311), COL1A1 (Hs-COL1A1 401891), VCAN (Hs-VCAN 430071), CTSB (Hs-CTSB 490251), COMP (Hs-COMP 457081), COL11A1 (Hs-COL11A1 400741), all from Advanced Cell Diagnostics.

Isolation and culture of primary cells from human omentum

Fresh tissue was washed in phosphate buffered saline (PBS) and approximately 10cm³ of omentum was submerged in 0.25% trypsin (Sigma-Aldrich) and incubated at 37°C for 20min to strip off any mesothelial cells. Trypsin was neutralised using DMEM:F12 1:1 medium (Gibco) with 10% heat-inactivated foetal bovine serum (FBS) (Hyclone). Tissue was washed with PBS, minced with dissection scissors into approximately 1-2mm pieces, suspended in DMEM (Sigma) with 5% FBS and 0.5 mg/ml collagenase type I (Gibco) and placed in a shaking incubator at 50rpm and 37°C for 75min. Tissue digest was passed through 250µM tissue strainers

(Thermo-Fisher) and the floating adipocyte layer was carefully collected by pipette and washed by centrifuging twice for 5min at 200g in DMEM with 5% FBS. Adipocytes were used immediately for experiments. The stromal vascular fraction (SVF) pellet from the first wash was resuspended in DMEM:F12 1:1 + 10% FBS (growth medium) and cultured at 37°C, 5% CO₂. After three days, any unattached cells were washed away and attached cells were checked for fibroblastic morphology, and henceforth referred to as omental fibroblasts (OFs). Media was changed every 2-3 days and cells were passaged upon reaching confluence and used for experiments between passages 2-4. Multiple fibroblast donors were used for each experiment and data was plotted for each individual donor with no pooling. In total, fibroblasts from 23 different donors including from tissue with little disease and tissues with confirmed disease.

HGSOC cell lines

The AOCs1 cell line was established in our laboratory from an omental HGSOC tumor collected during interval debulking surgery in 2011⁴¹. The G164 cell line was established in our laboratory from an omental HGSOC tumor collected during interval debulking surgery in 2015. G164 cells were TP53 and PAX8 positive. Malignant cells were cultured in DMEM:F12 (Gibco), 10% FCS, 1% penicillin and streptomycin in a 5% CO₂ humidified incubator at 37°C. The immortalised human FTSE cell line, wild type FT318, was kindly given by Professor Ronny Drapkin (Perelman School of Medicine, University of Pennsylvania) and grown in serum-free WIT-P medium (Cellaria) without antibiotics and 100ng/ml cholera toxin (Sigma-Aldrich). Quality control of all cell lines was carried out by frequent STR analysis (Eurofins MWG), mycoplasma testing (InvivoGen) and cell lines were used for 4 to 5 passages.

Experimental setups

Monocultures

For mRNA extraction and flow cytometry, OFs were seeded at 200k and malignant cells were seeded at 500k in T25 flasks and grown for 4 days. For IF, OFs were seeded at 30k and malignant cells at 60k in 12-wells and grown for 4 days for cell markers and 14 days for matrix molecules. The appropriate factors and inhibitors were added 24h after seeding and replenished every 48h; recombinant TGFβ3 10ng/ml (Peprotech); SB431542

hydrate 20 μ M (Sigma-Aldrich); GANT61 7.5 μ M (InSolution, Merck); L-ascorbic acid-2-phosphate (AA₂P) 50 μ g/ml (Sigma-Aldrich). AA₂P was only added for experiments involving matrix production.

Collagen-gel cultures

Collagen-gel solution (0.1w%) was made for 3D mono- and co-cultures mixing (per 100 μ l gel) 34 μ l of 3mg/ml rat-tail collagen I (Gibco), 4 μ l of 10x DMEM low-glucose (Sigma), 2 μ l of 1M NaOH and 60 μ l DMEM:F12 containing cells, prepared on ice. OF-only gels were seeded at 40k and grown for 7 days. Malignant cell-only gels were seeded at 80k and grown for 14 days. Co-cultures were seeded at a ratio of 1:1 (100k:100k) OFs to malignant cells and grown for 7 days. All gels were aliquoted at 100 μ l in 96-wells and incubated at 37°C, 5% CO₂ for 45min to set and then transferred to free-float in 24-wells with growth medium.

Flow-cytometry

For mono-layers, fibroblasts were detached using 0.5% trypsin-EDTA, centrifuged, washed in PBS and resuspended in FACS buffer containing Human Fibroblast Activation Protein alpha PE-conjugated Antibody (FAP-PE) (R&D systems FAB3715P, Clone # 427819) on ice in darkness for 30min. After centrifugation and washing in FACS buffer, cells were suspended in fixation/permeabilization solution (BD Biosciences) for 30 min on ice, washed in permeabilization/wash (PW) buffer, then incubated in 2% goat serum. Human alpha-Smooth Muscle Actin APC-conjugated Antibody (α SMA-APC) (R&D systems IC1420A, Clone #1A4) was added for 30 min before cells were washed in PW-buffer.

For gels containing cells, cultures were digested in 1mg/ml collagenase type I (Thermo-Fisher) in serum-free DMEM for 1hr with shaking at 110 rpm and 37°C. Gels were disaggregated with pipetting and 0.5% trypsin-EDTA (Sigma-Aldrich) was added at 37°C for 30min. DMEM with 10% FBS was added 1:1 to the cell suspension and centrifuged at 200g for 5min. For live-dead assay, cells were resuspended in FACS buffer (PBS with 2mM EDTA, 2.5% BSA) containing Fixable Viability Dye eFluor 450 (FVD-e450) (eBioscience 65-0863-18) for 30min on ice protected from light. After washes in FACS buffer, cells were fixed in neutral buffered formalin. Stained samples were analyzed using an LSRFortessa cell analyzer (BD Biosciences) and data were analyzed with FlowJo 9.4.6 (Treestar Inc.).

Mechanical characterization of gels

Compression was performed using an Instron ElectroPulse E1000 (Instron, UK) equipped with a 10N load cell (resolution = 0.1 mN). Gels were submerged in PBS throughout testing. Gels were compressed using a stainless steel plane-ended platen with diameter > 2x gel diameter connected directly to the load cell. Gel thickness was measured as the distance between the base of the test dish and top of the gel, each detected by applying a pre-load of 0.3-5 mN. Tests were performed in displacement control mode and gels were displaced to 30% thickness at a rate of $1\%s^{-1}$ with the resulting load recorded. Gel modulus, a measure of material stiffness independent of specimen geometry, was calculated by converting load-data to stress (kPa) (load ÷ gel area), plotting a stress-strain curve and then taking the slope of the curve between 15-20% strain.

RNA isolation and real-time quantitative PCR

Total RNA was extracted using Qiagen RNeasy Plus Micro kit according to the manufacturer's instructions. Monolayers were first scrapped in RLT Plus buffer (Qiagen) and RNA was quantified using a NanoDrop 2000c (Thermo-Fisher Scientific). Tri-cultures were placed directly into RLT buffer and rigorously vortexed. RNA quality was analyzed on Agilent bioanalyzer 2100 using RNA PicoChips according to manufacturer's instructions. RNA integrity numbers were between 8.1 and 9.9. Total and reverse-transcription was carried out on 1µg of RNA using a T100 Thermal Cycler (Bio-Rad) and a High-Capacity cDNA Reverse Transcription Kit (Applied Biosystems) according to manufacturer's instructions. The PCR reaction was run on a StepOnePlus Real-Time PCR System (Applied Biosystems) using iTag Universal Probes Supermix (Applied Biosystems), FAM-MGB labelled Taqman gene expression probes and 5ng sample cDNA. Taqman gene expression assay targets; ACTA2 (Hs00426835_g1), FAP (Hs00990791_m1), GLI1 (Hs00171790_m1), GLI2 (Hs01119974_m1), GLI3 (Hs00609233_m1), TGFβ1 (Hs00998133_m1), TGFβ2 (Hs00234244_m1), TGFβ3 (Hs01086000_m1), FN1 (Hs01549976_m1), COL1A1 (Hs00164004_m1), VCAN (Hs00171642_m1), CTSB (Hs00947433_m1), COMP (Hs00164359_m1), COL11A1 (Hs01097664_m1); GAPDH (Hs027866254_g1) and 18S (Hs03003631_g1), were both used as housekeeping genes (All from Thermo-Fisher Scientific, UK).

Preparation of adipocyte-collagen gels

Purified adipocytes (1ml) were combined with the following reagents to give 0.1w% collagen-adipocyte gels: 1ml of 3mg/ml rat-tail collagen I, 100µl of 10x DMEM low-glucose, 48µl of 1M NaOH and 852µl H₂O, prepared

on ice. Adipocyte-gel mixture was incubated at 37°C, 5% CO₂ for 45min in 100µl aliquots in a 96-well dish. Gels were gently transferred to 24-wells and cultured in 1ml Medium-199 with insulin-transferrin-selenium (Gibco). Adipocyte gels were used for experiments with other cell types within 7 days of isolation. For live/dead assays, gels were immersed in 1ml PBS containing 20µg fluorescein diacetate (Sigma-Aldrich) and 4µM ethidium homodimer (Sigma-Aldrich), incubated for 10min at 37°C, then placed on a glass slide with PBS to prevent drying. Gels were imaged using a Zeiss LSM510 confocal microscope.

Preparation of tri-cultures

3D co-cultures of fibroblasts and HGSOC cells were first cultured for 7 days to allow gel contraction and remodelling. Adipocyte gels were placed in dry 24-wells and then using a Pasteur pipette, a co-culture gel with a small volume of media was placed on top of the middle of an adipocyte gel. Co-cultures were embedded into the centre of adipocyte gels by carefully pressing down with the curved end of a sterile 1.5ml eppendorf. Wells were then filled with culture media and tri-cultures were allowed to free-float. After 24 hours, ascorbic acid (50µg/ml) was added to gels without or with inhibitors, SB431542 (20µM) and GANT61 (7.5µM). Gel images were acquired before adding factors and at the end of culture (14 days). Media and factors were replenished every 2-3 days and cultured for a further 13 days. At the end point (21 days total culture), tri-cultures were washed well with PBS and fixed in 10% formalin for 2h for IF, or for 24h for paraffin embedding. After fixation, gels were stored in PBS at 4°C until processed.

Immunohistochemistry

FFPE sections (4 µm) of omentum samples or gel-cultures were re-hydrated in ethanol solutions: 100%, 90%, 70%, and finally 50%. Sections were transferred to citric acid-based antigen unmasking solution (Vector Laboratories) and heated in a 2100 antigen-retriever (Aptum Biologics). Sections were treated with 3% H₂O₂ for 5min and blocked with 5% BSA for 1hr. Primary antibody was added in antibody diluent (Zytomed) for 1hr. Slides were washed and a biotinylated secondary antibody (Vector) was added. Subsequent steps were carried out according to the protocol included with the Vectastain Elite ABC HRP kit. Slides were incubated for 5min with DAB solution made using Sigmafast DAB tablets (Sigma-Aldrich). Finally, slides were counterstained in 50% Gill's haematoxylin I, and dehydrated in 50%, 70%, and 100% ethanol then twice in xylene. Coverslips

were affixed using DPX mountant (Sigma-Aldrich). All sections were scanned using a 3DHISTECH Panoramic 250 digital slide scanner (3DHISTECH), and the resulting scans were analyzed using Definiens software (Definiens AG). Disease scores were determined first by manually defining regions of interest in the tissue that represented tumor, stroma, fat (adipocytes), and then training the software to recognize these regions of interest. Disease score was expressed as a percentage of the whole tissue area that contained tumor and/or stroma (Fig. 1A).

Immunofluorescence

Gels were fixed overnight in 10% neutral buffered formalin, washed in PBS and permeabilized in Triton X-100 (0.5% in PBS) for 10min. Gels were incubated in blocking solution (5% BSA or goat serum), and then incubated with primary antibody overnight at 4°C. Gels were washed and incubated with fluorescent secondary antibody, for 1hr protected from light and then washed. Finally, gels were incubated with 0.4 µg/ml DAPI and then washed. Fluorescent images of tri-cultures were captured on an inverted Zeiss LSM 510 laser-scanning confocal microscope using a 10x or 20x air objective. Specimen images were acquired with a field of view equal to 238.1 x 238.1µm containing 1024x1024 pixels. All imaging conditions including laser settings and scan settings were kept constant for all gel groups for each fluorescent-labelled antibody. Images of monolayers were captured using an EVOS FLoid Cell Imaging Station. For F-actin, Alexa Fluor 568 Phalloidin (A12380, Thermo Fisher Scientific) was used.

Antibodies

The following antibodies were used for immunostaining: anti-actin, α-smooth muscle (clone 1A4, A2547), anti-VCAN (polyclonal, HPA004726), anti-COL11A1 (polyclonal, HPA052246), anti-COL1A1 (polyclonal, HPA011795), anti-FN1 (polyclonal, F3648) all from Sigma-Aldrich, UK; anti-Ki67 (clone MIB-1, M7240), from Dako, UK; anti-fibroblast activation protein, alpha (EPR 20021, ab207178), anti-COMP (ab11056), anti-CTSB (CA10, ab58802), anti-TGFβ all from Abcam; anti-PAX8 (NBP1-32440) from Novus; anti-EPCAM Alexa Fluor 488 conjugated (53-8326-41) from Thermo-Fisher; GLI-1 Antibody (C-1, sc-515751) from Santa Cruz Biotechnology.

Statistical and Bioinformatics Analysis

Statistical analyses and graphics were performed in GraphPad Prism or the programming language R (version 3.1.3). All correlations were calculated using Spearman's rank correlation. For pairwise comparisons a two-way paired t-test was used. For comparisons of >2 sample means, one-way ANOVA with Tukey's HSD test were used. Differential expression analysis was performed in Edge R using limma (PMID:25605792). Gene-set enrichment analysis (GSEA) was performed using the GSEA software ⁴² to identify the canonical pathways gene sets from the Molecular Signatures Database (MSigDB-C2-CP v6.2). See figure legends for significance levels and number of samples, n. For experiments involving OFs, n represents technical replicates and N represents number of donors. Data were considered statistically significant from $p < 0.05$.

ICGC analysis for six matrisome molecules

The ICGC_OV read counts across 93 primary tumors were extracted from the exp_seq.OV-AU.tsv.gz file in the ICGC data repository Release 20 (<http://dcc.icgc.org>). Only genes that achieved at least one read count in at least ten samples were selected, producing 18,010 filtered genes in total. Variance stabilizing transformation was then applied using the rlog function ⁴³. Overall survival (OS) was extracted from the donor.OV-AU.tsv.gz file. Mean expression for the six matrisome genes was calculated for each sample and high and low matrix groups were determined using the method described previously ⁴⁴. Survival modeling and Kaplan-Meier (KM) analysis was undertaken using R package survival. OS was defined as time from diagnosis to death, or to the last follow-up date for survivors. The significantly differentially expressed genes were selected using a false discovery rate (FDR) < 0.05.

RNA-seq and analysis

RNA-seq was performed by the Wellcome Trust Centre for Human Genetics (Oxford, UK) to approximately 30x mean depth for the HGSOC cell lines or 20x for the 3D cultures. The sequencing was carried out on the Illumina HiSeq4000 or on the NovaSeq6000 platform, strand-specific, generating 150bp paired-end reads. RNA-Seq reads were mapped to the human genome (hg19, Genome Reference Consortium GRCh37) in strand-specific mode as part of the Wellcome Trust Centre pipeline. Number of reads aligned to the exonic region of each gene were counted using htseq-count based on the Ensembl annotation. Only genes that achieved at least one read count per million reads (cpm) in at least twenty-five percent of the samples were kept. Conditional

quantile normalisation was performed counting for gene length and GC content and a $\log_2$ transformed RPKM expression matrix was generated. RNA-Seq data have been deposited in Gene Expression Omnibus (GEO) under the accession number GSE125109.

References

- 1 Tothill, R. W. *et al.* Novel molecular subtypes of serous and endometrioid ovarian cancer linked to clinical outcome. *Clin Cancer Res* **14**, 5198-5208 (2008).
- 2 Yeung, T. L. *et al.* Systematic Identification of Druggable Epithelial-Stromal Crosstalk Signaling Networks in Ovarian Cancer. *J Natl Cancer Inst*, doi:10.1093/jnci/djy097 (2018).
- 3 Pearce, O. M. T. *et al.* Deconstruction of a Metastatic Tumor Microenvironment Reveals a Common Matrix Response in Human Cancers. *Cancer Discov* **8**, 304-319, doi:10.1158/2159-8290.CD-17-0284 (2018).
- 4 Yeung, T. L. *et al.* TGF-beta modulates ovarian cancer invasion by upregulating CAF-derived versican in the tumor microenvironment. *Cancer Res* **73**, 5016-5028, doi:10.1158/0008-5472.CAN-13-0023 (2013).
- 5 Ruan, H., Hao, S., Young, P. & Zhang, H. Targeting Cathepsin B for Cancer Therapies. *Horiz Cancer Res* **56**, 23-40 (2015).
- 6 Englund, E. *et al.* Cartilage oligomeric matrix protein contributes to the development and metastasis of breast cancer. *Oncogene*, doi:10.1038/onc.2016.98 (2016).
- 7 Waalkes, S. *et al.* Fibronectin 1 mRNA expression correlates with advanced disease in renal cancer. *BMC Cancer* **10**, 503, doi:10.1186/1471-2407-10-503 (2010).
- 8 Jia, D. *et al.* A COL11A1-correlated pan-cancer gene signature of activated fibroblasts for the prioritization of therapeutic targets. *Cancer Lett* **382**, 203-214, doi:10.1016/j.canlet.2016.09.001 (2016).
- 9 Kenny, H. A. *et al.* Mesothelial cells promote early ovarian cancer metastasis through fibronectin secretion. *J Clin Invest* **124**, 4614-4628, doi:10.1172/JCI74778 (2014).
- 10 Cheon, D. J. *et al.* A collagen-remodeling gene signature regulated by TGF-beta signaling is associated with metastasis and poor survival in serous ovarian cancer. *Clin Cancer Res* **20**, 711-723, doi:10.1158/1078-0432.CCR-13-1256 (2014).
- 11 Erdogan, B. *et al.* Cancer-associated fibroblasts promote directional cancer cell migration by aligning fibronectin. *J Cell Biol* **216**, 3799-3816, doi:10.1083/jcb.201704053 (2017).
- 12 Vazquez-Villa, F. *et al.* COL11A1/(pro)collagen 11A1 expression is a remarkable biomarker of human invasive carcinoma-associated stromal cells and carcinoma progression. *Tumour Biol* **36**, 2213-2222, doi:10.1007/s13277-015-3295-4 (2015).
- 13 Laklai, H. *et al.* Genotype tunes pancreatic ductal adenocarcinoma tissue tension to induce matricellular fibrosis and tumor progression. *Nat Med*, doi:10.1038/nm.4082 (2016).
- 14 Bhowmick, N. A., Neilson, E. G. & Moses, H. L. Stromal fibroblasts in cancer initiation and progression. *Nature* **432**, 332-337, doi:10.1038/nature03096 (2004).
- 15 Klingberg, F., Hinz, B. & White, E. S. The myofibroblast matrix: implications for tissue repair and fibrosis. *J Pathol* **229**, 298-309, doi:10.1002/path.4104 (2013).
- 16 Sahai, E. *et al.* A framework for advancing our understanding of cancer-associated fibroblasts. *Nat Rev Cancer* **20**, 174-186, doi:10.1038/s41568-019-0238-1 (2020).
- 17 Hanley, C. J. *et al.* A subset of myofibroblastic cancer-associated fibroblasts regulate collagen fiber elongation, which is prognostic in multiple cancers. *Oncotarget* **7**, 6159-6174, doi:10.18632/oncotarget.6740 (2016).
- 18 Calvo, F. *et al.* Mechanotransduction and YAP-dependent matrix remodelling is required for the generation and maintenance of cancer-associated fibroblasts. *Nat Cell Biol* **15**, 637-646, doi:10.1038/ncb2756 (2013).
- 19 Shiga, K. *et al.* Cancer-Associated Fibroblasts: Their Characteristics and Their Roles in Tumor Growth. *Cancers (Basel)* **7**, 2443-2458, doi:10.3390/cancers7040902 (2015).
- 20 Tian, H. *et al.* Hedgehog signaling is restricted to the stromal compartment during pancreatic carcinogenesis. *Proc Natl Acad Sci U S A* **106**, 4254-4259, doi:10.1073/pnas.0813203106 (2009).

- 21 Didiasova, M. *et al.* Pirfenidone exerts antifibrotic effects through inhibition of GLI transcription factors. *Faseb J* **31**, 1916-1928, doi:10.1096/fj.201600892RR (2017).
- 22 Farkas, I. J., Szanto-Varnagy, A. & Korcsmaros, T. Linking proteins to signaling pathways for experiment design and evaluation. *PLoS One* **7**, e36202, doi:10.1371/journal.pone.0036202 (2012).
- 23 Patch, A. M. *et al.* Whole-genome characterization of chemoresistant ovarian cancer. *Nature* **521**, 489-494, doi:10.1038/nature14410 (2015).
- 24 Javelaud, D., Pierrat, M. J. & Mauviel, A. Crosstalk between TGF-beta and hedgehog signaling in cancer. *FEBS Lett* **586**, 2016-2025, doi:10.1016/j.febslet.2012.05.011 (2012).
- 25 Thompson, C. L. *et al.* Hedgehog signalling does not stimulate cartilage catabolism and is inhibited by Interleukin-1beta. *Arthritis Res Ther* **17**, 373, doi:10.1186/s13075-015-0891-z (2015).
- 26 Avgustinova, A. *et al.* Tumour cell-derived Wnt7a recruits and activates fibroblasts to promote tumour aggressiveness. *Nat Commun* **7**, 10305, doi:10.1038/ncomms10305 (2016).
- 27 Horn, A. *et al.* Hedgehog signaling controls fibroblast activation and tissue fibrosis in systemic sclerosis. *Arthritis Rheum* **64**, 2724-2733, doi:10.1002/art.34444 (2012).
- 28 Schneider, R. K. *et al.* Gli1(+) Mesenchymal Stromal Cells Are a Key Driver of Bone Marrow Fibrosis and an Important Cellular Therapeutic Target. *Cell Stem Cell* **23**, 308-309, doi:10.1016/j.stem.2018.07.006 (2018).
- 29 Wang, B., Fallon, J. F. & Beachy, P. A. Hedgehog-regulated processing of Gli3 produces an anterior/posterior repressor gradient in the developing vertebrate limb. *Cell* **100**, 423-434 (2000).
- 30 Desmouliere, A., Chaponnier, C. & Gabbiani, G. Tissue repair, contraction, and the myofibroblast. *Wound Repair Regen* **13**, 7-12, doi:10.1111/j.1067-1927.2005.130102.x (2005).
- 31 Nieman, K. M. *et al.* Adipocytes promote ovarian cancer metastasis and provide energy for rapid tumor growth. *Nature medicine* **17**, 1498-1503, doi:10.1038/nm.2492 (2011).
- 32 Kubiczкова, L., Sedlarikova, L., Hajek, R. & Sevcikova, S. TGF-beta - an excellent servant but a bad master. *J Transl Med* **10**, 183, doi:10.1186/1479-5876-10-183 (2012).
- 33 Zhang, Q. *et al.* LY2157299 Monohydrate, a TGF-betaR1 Inhibitor, Suppresses Tumor Growth and Ascites Development in Ovarian Cancer. *Cancers (Basel)* **10**, doi:10.3390/cancers10080260 (2018).
- 34 Yang, L., Pang, Y. & Moses, H. L. TGF-beta and immune cells: an important regulatory axis in the tumor microenvironment and progression. *Trends Immunol* **31**, 220-227, doi:10.1016/j.it.2010.04.002 (2010).
- 35 Caja, L. *et al.* TGF-beta and the Tissue Microenvironment: Relevance in Fibrosis and Cancer. *Int J Mol Sci* **19**, doi:10.3390/ijms19051294 (2018).
- 36 Tauriello, D. V. F. *et al.* TGFbeta drives immune evasion in genetically reconstituted colon cancer metastasis. *Nature* **554**, 538-543, doi:10.1038/nature25492 (2018).
- 37 Chakravarthy, A., Khan, L., Bensler, N. P., Bose, P. & De Carvalho, D. D. TGF-beta-associated extracellular matrix genes link cancer-associated fibroblasts to immune evasion and immunotherapy failure. *Nat Commun* **9**, 4692, doi:10.1038/s41467-018-06654-8 (2018).
- 38 Mariathasan, S. *et al.* TGFbeta attenuates tumour response to PD-L1 blockade by contributing to exclusion of T cells. *Nature* **554**, 544-548, doi:10.1038/nature25501 (2018).
- 39 Pak, E. & Segal, R. A. Hedgehog Signal Transduction: Key Players, Oncogenic Drivers, and Cancer Therapy. *Dev Cell* **38**, 333-344, doi:10.1016/j.devcel.2016.07.026 (2016).
- 40 Maniati, E. *et al.* Mouse Ovarian Cancer Models Recapitulate the Human Tumor Microenvironment and Patient Response to Treatment. *Cell reports* **30**, 525-540 e527, doi:10.1016/j.celrep.2019.12.034 (2020).
- 41 Milagre, C. S. *et al.* Adaptive Upregulation of EGFR Limits Attenuation of Tumor Growth by Neutralizing IL6 Antibodies, with Implications for Combined Therapy in Ovarian Cancer. *Cancer Res* **75**, 1255-1264, doi:10.1158/0008-5472.CAN-14-1801 (2015).
- 42 Mootha, V. K. *et al.* PGC-1 alpha-responsive genes involved in oxidative phosphorylation are coordinately downregulated in human diabetes. *Nat Genet* **34**, 267-273 (2003).

- 43 Love, M. I., Huber, W. & Anders, S. Moderated estimation of fold change and dispersion for RNA-seq data with DESeq2. *Genome biology* **15**, 550, doi:10.1186/s13059-014-0550-8 (2014).
- 44 Mihaly, Z. *et al.* A meta-analysis of gene expression-based biomarkers predicting outcome after tamoxifen treatment in breast cancer. *Breast cancer research and treatment* **140**, 219-232, doi:10.1007/s10549-013-2622-y (2013).

Figure 1: Tumour-matrix proteins are diversely produced by stromal and malignant cells. (a) Disease score vs. tissue area (log scale) for 36 stage 3-4 HGSOC patient omental samples correlated with (b) PAX8+ malignant cells stained via IHC. (c) IHC for FN1, COL1A1, VCAN, COMP, CTSB, COL11A1. All showed positive correlations with disease score and heterogeneous malignant cell staining. (d) Z-score heat map (top) of matrix area for all samples and a binary heat map (bottom) displays tumour positivity, red, or negativity, grey, for matrix molecules. (e) RNAscope *in situ* hybridisation for the six matrix molecules (brown). Spearman's rank correlation coefficient, r . In panels (c) and (e), S is stroma and T is tumour. Scale bars are (b) 1000µm, (c) 200µm and (e) (top row COL1A1 and FN1) 500µm, VCAN 200µm, the rest are 100µm.

Figure 2: The six upregulated matrix index molecules (FN1, COL1A1, VCAN, COMP, CTSB, COL11A1) associate with TGFβ and Hh signalling. (a) Interaction network diagram obtained on PathwayLinker.org for the six upregulated matrix index molecules. (b) Kaplan-Meier survival curve with overall survival from the ICGC ovarian dataset divided by high or low average gene expression of the six matrix index molecules. The x-axis is in the unit of months. (c) Volcano plot displays comparison of gene expression between high and low groups, highlighting significant upregulation of matrix molecules and stromal activation markers in high group. Red dots indicate adj.P.Value < 0.05. (d) Plot of normalised enrichment score (NES) obtained from GSEA highlights over-expressed pathways in high group compared with low group, including TGFβ and Hh signaling (false discovery rate, FDR < 0.05). (e) IHC for TGFβ and GLI1 was performed on biopsies. (f) TGFβ IHC was quantified as number of positive cells in stained tissue. (g) Samples with malignant cells were identified for populations with GLI1 positivity, negativity or a mixture of both in malignant cell cytoplasm and nuclei, as well as stromal cells. Scale bars are 200μm.

Figure 3: HGSOC malignant cells have heterogeneous signaling but all secrete TGFβ. (a) To identify malignant cells, HGSOC tissue sections and cells expanded *in vitro* were stained for PAX8 via IHC or IF respectively. (b) RNA sequencing was performed on AOCs1 and G164 malignant cell lines (N = 2) for adherent (Adh) and spheroid (Sph) cultures and transcriptomic expression was analysed using PCA. (c) GSEA was performed on transcriptomic data and normalised enrichment scores for AOCs1 (green) vs G164 (blue) are illustrated ($p < 0.1$). (d) qRTPCR was performed for GLI1 on AOCs1 and G164, barplot illustrates relative expression levels of GLI1 normalised to expression in normal fallopian tube cells, FT318-WT (red line) (e) GLI1 IF (f) RNASeq log2RPKM gene expression of matrix molecules in AOCs1 and G164 cultures (COMP not detected) and (g) IHC of human biopsy sections from patients AOCs1 and G164 for FN1, VCAN, and COL11A1. (h) TGFβ expression via qRTPCR for malignant cells *in vitro* (N = 3), normalised to FT318-WT expression and (i) IF images of TGFβ3. (j-k) OFs were cultured in 3D COL1 gels alone (control) or with (co-culture) AOCs1 or G164 cells for 7-14 days with or without TGFβR^{INH}, then (j) compressed to determine gel modulus (D7); each point represents mean of 2-4 gels (n=2-4) per OF donor (N = 8), $p < 0.001$ (two-way, paired t test) and (k) IHC (D14) performed on fixed sections of AOCs1 co-cultures for αSMA and FAP. Scale bars (a (bottom), e, i) are 50μm, (a (top) g, k) are 250μm.

Figure 4: TGF β 3 stimulates α SMA, FAP and GLI1 expression and tumour-matrix production in omental fibroblasts. (a) IHC identified FAP or α SMA positive cells; both correlated positively with PAX8+ cell density. (b) IHC images of FAP and α SMA were pseudo colored and overlaid using ImageJ to highlight double positive cells (yellow). (c) TGF β 3 treatment of L-OFs caused upregulation in ACTA2 and FAP mRNA, measured by qRT-PCR, across five donors (n=3, N=5) and (d) increased α SMA and FAP IF. (e) GLI1 mRNA expression was upregulated in TGF β 3-treated L-OFs (5 donors) and downregulated with SB431542 (TGF β R^{INH}) (4 donors). (f) IF GLI1 staining shows representative images of TGF β 3-treated and untreated L-OFs. (g) Five of the six matrix molecules were upregulated in TGF β 3-treated L-OFs at mRNA level. (h) Representative IF staining for the five upregulated molecules. (i-j) L-OFs were cultured in COL1 gels for seven days; TGF β 3-treatment increased (i) gel modulus (n=2-3, N=3, two-way t-test, $p < 0.001$) and (j) expression of α SMA, FAP, FN1 and COL11A1 visualised via IHC. Scale bars are (b) 200 μ m and (d, f, h) 50 μ m and (i) 500 μ m. Blue and red lines represent control (no TGF β 3 or no TGF β R^{INH} respectively) expression.

Figure 5: TGFβR and GLI1/2 inhibitors downregulate αSMA, GLI1 and tumour-matrix in OFs. (a) IF for αSMA and F-actin in L-OFs treated with TGFβ3 ± TGFβR^{INH} (SB431542) or ± GLI1/2 (GANT61) inhibitors. (b-k) OFs with high activation (H-OFs) were treated with TGFβR^{INH} or GLI1/2^{INH}, or combination; (b) gene expression was measured by qRT-PCR for ACTA2 and FAP (N = 4 donors). (c) Cells were analysed via flow cytometry for % cells αSMA+ and/or FAP+. (d) Activated OFs were visualised via IF for αSMA and FAP ± Inhibitor combination. (e) GLI1/2/3 mRNA expression analysed via qRT-PCR for OFs and (f) GLI1 visualised via IF in activated OFs or with combination. (g) mRNA expression of matrix molecules were analysed via qRT-PCR for treated or untreated OFs (n = 4 donors). (h) IF visualised FN1, VCAN, COL11A1, COMP and COL1A1, and αSMA in activated OFs with or without combination. (i) IHC of control and combination-treated OF-gels for αSMA, FAP, COL11A1 and FN1. (j-k) OF-only gels or AOCs1 co-cultures were grown for 7 days with or without inhibitors and (j) gel modulus was measured (mean of 3 gels per donor, N=2) and (k) fixed sections stained for H&E. Scale bars (a, d, f, h) are 50μm, (i, k) are 500. Red lines represent control (no TGFβR^{INH}) expression.

Figure 6. Omental adipocytes provide a physiological substrate for a HGSOC tri-culture model. (a) Fatty layer on top of omental digest supernatant contains viable adipocytes, assessed by IF LIVE/DEAD assay. (b) Adipocytes are mixed with collagen gel solution (0.1w%), seeded into 96-well plates, left 5min at RT allowing cells to float upwards, before incubating at 37°C for 45min, after which gels can be carefully handled (gels transferred to 24-well plates). (c) H&E gel sections have similar appearance to normal omentum. (d-e) Adipocyte gels tested for viability via IF LIVE/DEAD assay and sectioned and stained via IHC for Perilipin-1 (days 0, 7, 14 and 21); data are (d) mean of 3-5 images per donor (N = 3) and (e) median with interquartile range (N = 5). (f) Schematic shows constituents and cells used to assemble and grow tri-cultures. (g-h) AOCs1 tri-cultures grown for 21 days, then fixed, sectioned and stained for H&E and via IHC, coloured squares in (g) mark location of coloured borders for IHC (h). Scale bars (a, c, d) are 100µm, (e, h) are 200µm, (g) is 500µm.

Figure 7. TGF β R and GLI1/2 inhibitor combination reduces tumour matrix expression in HGSOc tri-cultures. RNAseq was performed on adipocyte-only gels (Adipo_only), control tri-cultures (G164Tri), G164+OF co-cultures and G164Tri treated with inhibitors combination (G164Tri+Combl). (a) Heatmap of all matrisome genes detected in Adipo_only, G164+OF and G164Tri. (b) GSEA was performed on differentially expressed genes in G164Tri vs G164+OF, barplot indicates normalized enrichment scores (NES) for the indicated Gene Ontologies ($p < 0.05$). (c) Matrix Index was calculated from the RNAseq data across the samples. (d) Hierarchical cluster analysis of transcriptomes for indicated samples. (e) After 21 days of culture, gel area of control and combination-treated tri-cultures were measured from images (inserts show 2 different experiments); data are mean of 2-4 gels per experiment ($N = 5$), $p < 0.05$ (two-way, paired t test). (f) IF on tri-cultures for EPCAM, α SMA, FN1, VCAN, COL1A1, COMP, COL11A1, and DAPI (blue), scale bars are 100 μ m. G164Tri were treated with inhibitor combination and subjected to RNAseq (g) Volcano plot used to visualise changes in expression between G164Tri treated with inhibitors (G164Tri+Combl) and control G164Tri. Red dots indicate adj.P.Value < 0.05 . (h) GSEA performed on the differentially expressed genes between G164Tri+Combl and G164Tri; Enrichment plot derived from GSEA of RNA sequencing data of G164 tri-cultures. (i) Matrix Index for G164Tri and G164Tri+Combl. For RNA sequencing, 2 gels were pooled per sample, Adipo_only ($n = 1$), G164Tri and G164Tri+Combl ($n = 2$). Scale bars are 100 μ m.