











Inverse agonists of retinoic acid receptor/retinoid X receptor signaling as lineage-specific antitumor agents against human adenoid cystic carcinoma

Sara Viragova , PhD,^{1,2,3,4} Luis Aparicio , PhD,^{5,6,†} Pierangela Palmerini , PhD,^{1,2,3,†} Junfei Zhao , PhD,^{5,6} Luis E. Valencia Salazar , BA,^{1,2,3} Alexandra Schurer , MS,^{1,2} Anika Dhuri,¹ Debashis Sahoo , PhD,^{7,8,9} Christopher A. Moskaluk , MD,¹⁰ Raul Rabadan , PhD,^{5,6} Piero Dalerba , MD^{1,2,3,11,12,*}

¹Department of Pathology and Cell Biology, Columbia University Medical Center, New York, NY, USA

²Herbert Irving Comprehensive Cancer Center, Columbia University Medical Center, New York, NY, USA

³Columbia Stem Cell Initiative, Columbia University Medical Center, New York, NY, USA

⁴Integrated Program in Cellular, Molecular and Biomedical Studies, Columbia University, New York, NY, USA

⁵Program for Mathematical Genomics, Department of Systems Biology, Columbia University, New York, NY, USA

⁶Department of Biomedical Informatics, Columbia University, New York, NY, USA

⁷Department of Pediatrics, University of California San Diego, San Diego, CA, USA

⁸Department of Computer Science and Engineering, University of California San Diego, San Diego, CA, USA

⁹Rebecca and John Moores Comprehensive Cancer Center, University of California San Diego, San Diego, CA, USA

¹⁰Department of Pathology, University of Virginia School of Medicine, Charlottesville, VA, USA

¹¹Department of Medicine, Columbia University Medical Center, New York, NY, USA

¹²Digestive and Liver Disease Research Center, Columbia University Medical Center, New York, NY, USA

*Correspondence to: Piero Dalerba, MD, Herbert Irving Comprehensive Cancer Center (HICCC), Columbia University, 1130 St. Nicholas Avenue, ICRC Room 924, New York, NY 10032, USA (e-mail: pdd2109@columbia.edu).

†These authors contributed equally to this work.

Abstract

Background: Adenoid cystic carcinoma (ACC) is a lethal malignancy of exocrine glands, characterized by the coexistence within tumor tissues of 2 distinct populations of cancer cells, phenotypically similar to the myoepithelial and ductal lineages of normal salivary epithelia. The developmental relationship linking these 2 cell types, and their differential vulnerability to antitumor treatments, remains unknown.

Methods: Using single-cell RNA sequencing, we identified cell-surface markers (CD49f, KIT) that enabled the differential purification of myoepithelial-like (CD49f^{high}/KIT^{neg}) and ductal-like (CD49f^{low}/KIT⁺) cells from patient-derived xenografts (PDXs) of human ACCs. Using prospective xenotransplantation experiments, we compared the tumor-initiating capacity of the 2 cell types and tested whether one could differentiate into the other. Finally, we searched for signaling pathways with differential activation between the 2 cell types and tested their role as lineage-specific therapeutic targets.

Results: Myoepithelial-like cells displayed higher tumorigenicity than ductal-like cells and acted as their progenitors. Myoepithelial-like and ductal-like cells displayed differential expression of genes encoding for suppressors and activators of retinoic acid signaling, respectively. Agonists of retinoic acid receptor (RAR) or retinoid X receptor (RXR) signaling (all-trans retinoic acid, bexarotene) promoted myoepithelial-to-ductal differentiation, whereas suppression of RAR/RXR signaling with a dominant-negative RAR construct abrogated it. Inverse agonists of RAR/RXR signaling (BMS493, AGN193109) displayed selective toxicity against ductal-like cells and in vivo antitumor activity against PDX models of human ACC.

Conclusions: In human ACCs, myoepithelial-like cells act as progenitors of ductal-like cells, and myoepithelial-to-ductal differentiation is promoted by RAR/RXR signaling. Suppression of RAR/RXR signaling is lethal to ductal-like cells and represents a new therapeutic approach against human ACCs.

Adenoid cystic carcinomas (ACCs) are malignant adenocarcinomas that originate in exocrine glands, most commonly the salivary glands (SGs) (1). ACCs display indolent growth, but their slow proliferation kinetics often belie an aggressive and relentless nature, characterized by perineural infiltration and early hematogenous spread (1–3). Current treatments for ACCs are limited to surgery and radiotherapy. Because ACCs usually arise within the craniofacial district, such treatments are often destructive and, in

approximately 60% of cases, unable to prevent metastatic relapse and patient death (2–5). ACCs are usually refractory to chemotherapy, immunotherapy, and various types of targeted therapies (6–9). ACCs often associate with t(6; 9) MYB-NFIB chromosomal translocations (10–13), but no actionable treatments are currently available to suppress the oncogenic signaling that results from them (14).

Histologically, ACCs are characterized by a distinctive feature: the coexistence of 2 populations of malignant cells, termed

ductal-like and myoepithelial-like, because of their phenotypic similarity to ductal and myoepithelial lineages of normal SG epithelia (15–21). The molecular causes of this feature are poorly understood and remain difficult to investigate because of the lack of experimental means to differentially isolate the 2 cell types. It remains unknown, for example, whether the 2 populations represent distinct genetic clones, arising from the divergent accumulation of distinct repertoires of somatic mutations, or distinct developmental lineages, arising from the retention by malignant tissues of normal differentiation programs (22–25). It also remains unclear how the 2 populations compare in terms of differential sensitivity to antitumor therapies.

In this study, we used single-cell RNA-sequencing (scRNA-seq) (26) to identify cell surface markers that enable, for the first time, the differential purification by fluorescence-activated cell sorting (FACS) of the 2 malignant cell types found in human ACCs. We then demonstrated that one can differentiate into the other and identified a signaling pathway that controls this process. Finally, we leveraged this knowledge to develop a new pharmacological approach for the treatment of human ACCs.

Methods

An expanded description of all materials and methods used in this study is provided in the [Supplementary Methods](#) (available online), together with relevant technical references.

Patient-derived xenograft (PDX) lines

PDX lines representative of human ACCs ([Supplementary Table 1](#), available online) were obtained from the Adenoid Cystic Carcinoma Registry at the University of Virginia (27) and propagated subcutaneously in female NOD.Cg-Prkdc^{scid} Il2rg^{tm1Wjl}/SzJ mice (Jackson Laboratory; stock #005557) (25).

Animal welfare

Animal experiments were approved by the institutional animal care and use committee (IACUC) of Columbia University (research protocols: AC-AAAL7751, AC-AAAW1466, AC-AABM9553).

Fluorescence-activated cell sorting

Solid tumors were dissociated into single-cell suspensions, and malignant cells isolated by FACS, following established protocols ([Supplementary Figure 1](#), available online) (23,25). Monoclonal antibodies used to visualize different subtypes of malignant cells included mouse anti-human EpCAM (clone: 9C4) conjugated to fluorescein isothiocyanate (FITC), rat anti-human-and-mouse CD49f (clone: GoH3) conjugated to allophycocyanin (APC), and mouse anti-human KIT (clone: 104D2) conjugated to phycoerythrin (PE). Mouse cells were excluded using mouse anti-mouse H-2K^d (clone: SF1.1) conjugated to biotin, rat anti-mouse Cd45 (clone: 30-F11) conjugated to PE/Cyanine5, and streptavidin conjugated to PE/Cyanine5 (BD Biosciences). Cell-cycle distribution of sorted cells was evaluated using 4',6-diamidino-2-phenylindole (DAPI), following permeabilization with BD Cytotfix/Cytoperm (BD Biosciences).

RNA-sequencing

scRNA-seq experiments were performed using Chromium Single Cell 3' Solution (10x Genomics) and NovaSeq-6000 (Illumina) platforms and analyzed using cellranger (v3.1.0) and Randomly (28). In conventional RNA-seq experiments, RNA was isolated using the

NucleoSpin RNA XS kit (Takara) and cDNA libraries prepared using the TruSeq Stranded mRNA kit (Illumina). Conventional RNA-seq reactions were run on either HiSeq-4000 or NovaSeq-6000 platforms (Illumina), and results analyzed using DESeq2 (29) and STAR-fusion (30). Differentially expressed genes were identified based on false-discovery rates (FDR), calculated using the Benjamini–Hochberg method. RNA-seq datasets were deposited in the database of Genotypes and Phenotypes (dbGAP; <https://www.ncbi.nlm.nih.gov/gap>), under accession number: phs002764.

Immunohistochemistry (IHC)

Formalin-fixed, paraffin-embedded tissue blocks were stained with the following antibodies: mouse anti-human TP63 (clone: 4A4), rabbit anti-human KIT (clone: YR145), rabbit anti-human MKI67 (clone: 30-9).

In vivo tumorigenicity

Autologous pairs of CD49^{high}/KIT^{neg} and CD49^{low}/KIT⁺ cells were double sorted by FACS, resuspended in high-concentration matrigel (Corning), and injected subcutaneously, side by side, into opposite flanks (left vs. right) of NOD.Cg-Prkdc^{scid} Il2rg^{tm1Wjl}/SzJ mice. The frequency of tumor-initiating cells was calculated by Extreme Limiting Dilution Analysis (ELDA; <http://bioinf.wehi.edu.au/software/elda>) (31).

In vitro tissue cultures

ACC cells were cultured either as 3-dimensional organoids (32–34) or 2-dimensional monolayers (35) and treated with all-trans retinoic acid (ATRA; 0.1–10 μ M), bexarotene (10 μ M), BMS493 (1–10 μ M), or AGN193109 (1–10 μ M). Lentivirus vectors (36) were based on the pLL3.7 backbone (Addgene; #11795), re-engineered to drive constitutive expression of a dominant negative version of human retinoic acid receptor alpha (DNhRAR α) (Addgene; #15153) (37) in tandem with the enhanced green fluorescent protein (EGFP), which was used as a fluorescent reporter. Cell viability was assessed using the alamarBlue HS Cell Viability Reagent (38).

In vivo therapeutic studies

Tumor-bearing animals were treated by intraperitoneal injection of BMS493 (1 mg x 3–4 days/week x 3 weeks) resuspended in 0.15 M hydroxypropyl- β -cyclodextrin (Cayman Chemicals).

Statistical analyses

A detailed explanation of all statistical tests used in this study is provided in the [Supplementary Methods](#) (available online).

Results

Identification of surface markers differentially expressed between myoepithelial-like and ductal-like cells

To identify surface markers differentially expressed between myoepithelial-like and ductal-like cells, we analyzed by scRNA-seq a bulk preparation of epithelial cancer cells (EpCAM⁺) purified by FACS from a PDX line representative of a human ACC with classic cribriform histology ([Figure 1, A and B](#); [Supplementary Figure 1](#), available online) (27). We used the Randomly (28) algorithm to remove stochastic contributions to the transcriptional variability observed between cells and then clustered cells based on systematic differences in transcriptional patterns, identifying an optimal clustering solution consisting of 3 subgroups ([Figure 1, C](#); [Supplementary Figure 2](#), available online). Of these 3 subgroups, the largest 2 displayed mutually

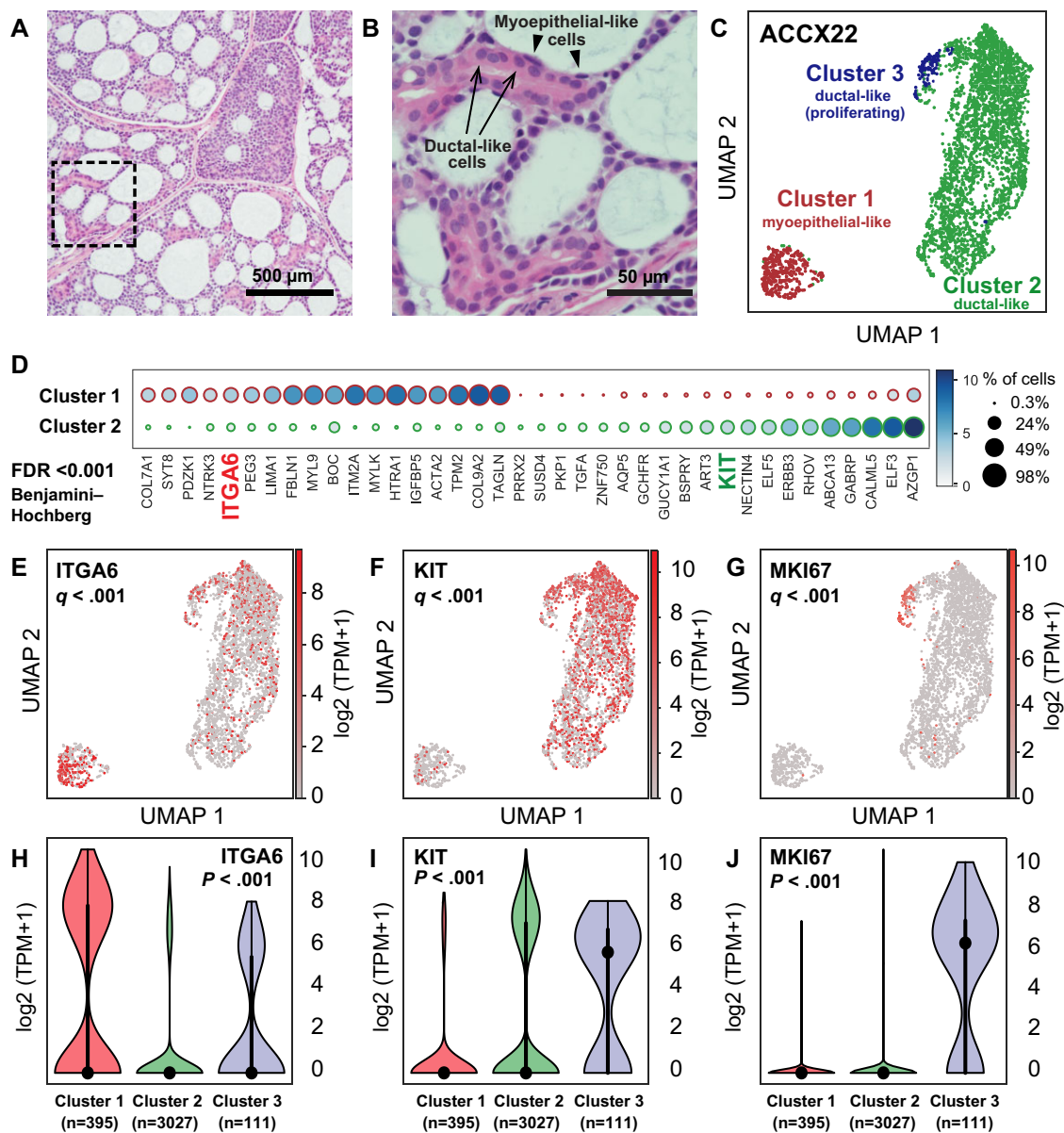


Figure 1. Identification of surface markers for the differential purification of myoepithelial-like and ductal-like cell populations in human ACCs. **A**) Histological analysis of the ACCX22 human PDX line, confirming retention of a cribriform histology with pseudocyst formation, characteristic of well-differentiated (grade 1) ACCs. **B**) Magnification of the tissue area outlined in (A) (dashed box), demonstrating the presence of 1) ductal-like cells, characterized by abundant eosinophilic cytoplasm and arranged in ringlike structures (arrows); and 2) myoepithelial-like cells (arrowheads), characterized by spindle-shaped morphology and arranged to line pseudocysts. **C**) Visualization by Uniform Manifold Approximation and Projection (UMAP) of scRNA-seq data obtained from a purified preparation of human malignant cells (EpCAM⁺) sorted by FACS from the ACCX22 human PDX line. In the UMAP scatter plot, the 3 cell clusters identified as representing the most robust clustering solution (ie, as displaying the highest mean silhouette score following clustering based on the Leiden algorithm) were labeled with different colors and displayed clear visual separation. Based on differentially expressed genes (Supplementary Figure 3, available online), the 3 clusters were annotated as follows: cluster 1 = myoepithelial-like cells; cluster 2 = ductal-like cells; cluster 3 = proliferating ductal-like cells. **D**) List of genes identified as displaying a statistically significant difference in mean expression levels between cluster 1 (myoepithelial-like) and cluster 2 (ductal-like), based on a Student's t test (2-tailed) adjusted for multiple comparisons (FDR < 0.001; Benjamini-Hochberg method). Among the differentially expressed genes are those encoding for 2 surface markers: *ITGA6* (CD49f) and *KIT* (CD117). **E-G**) UMAP plots displaying gene-expression levels for *ITGA6* (E), *KIT* (F), and the proliferation marker *MKI67* (G); q values are based on a Student's t test (2-tailed), corrected for multiple comparisons (Benjamini-Hochberg method), as described in Supplementary Figure 3 (available online). **H-J**) Violin plots displaying the distribution of gene-expression levels for *ITGA6* (H), *KIT* (I), and *MKI67* (J) across the 3 cell clusters identified by scRNA-seq; P values are based on a Kruskal-Wallis H test. ACC = adenoid cystic carcinoma; FACS = fluorescence-activated cell sorting; FDR = false discovery rate; PDX = patient-derived xenograft; scRNA-seq = single-cell RNA sequencing; TPM = transcripts per million.

exclusive expression of known myoepithelial (*ACTA2*, *CNN1*, *TP63*) and ductal (*KRT7*, *KRT18*, *ELF5*) cell markers (Supplementary Figure 3, available online), and a third appeared to represent a highly proliferating (*MKI67*^{high}) subset of ductal-

like cells (Figure 1, G and J; Supplementary Figure 3, C, available online). Among the differentially expressed genes, we identified those encoding for cell-surface markers CD49f (*ITGA6*) and *KIT*, also known as CD117 (*KIT*), which associated with myoepithelial-

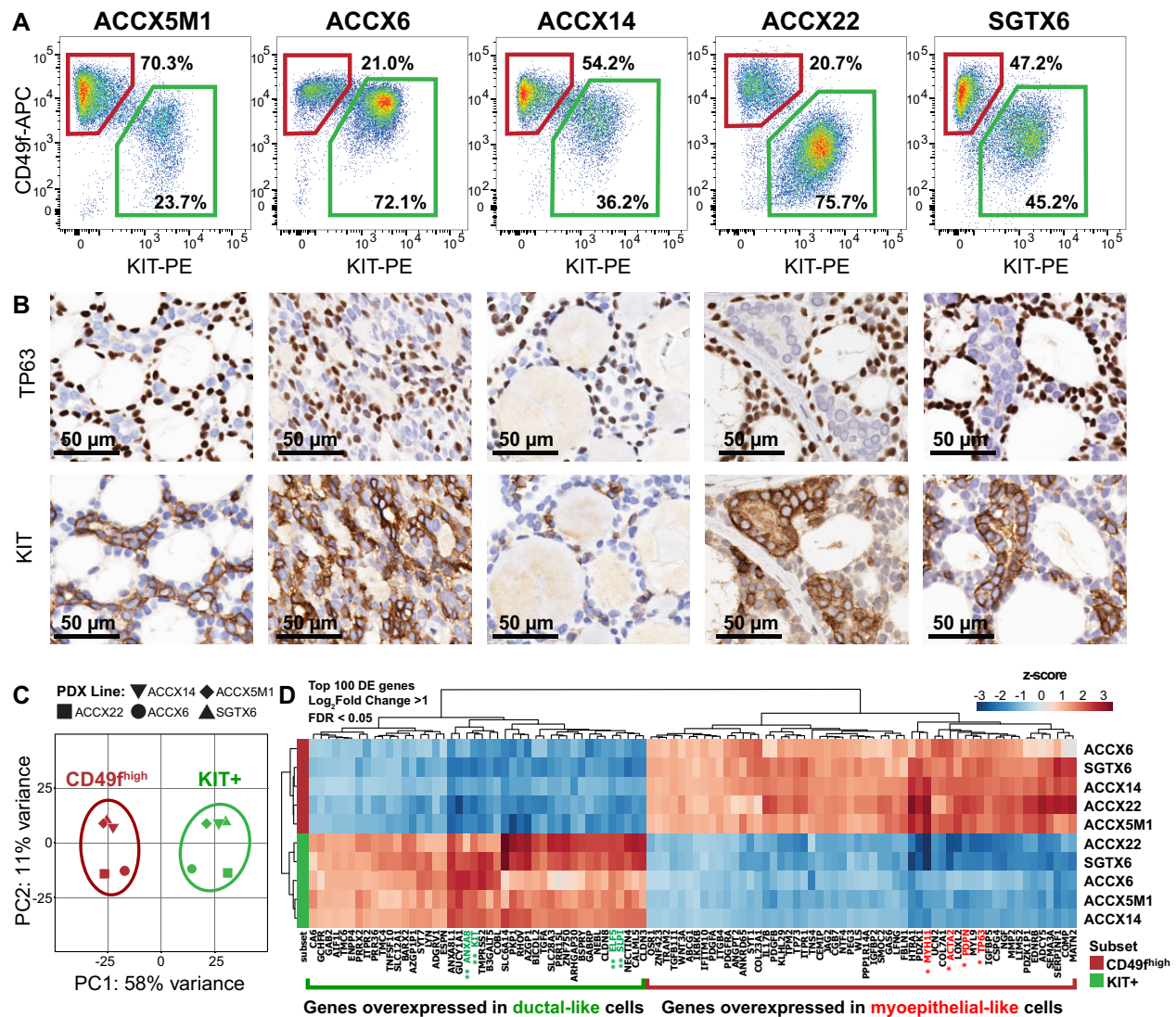


Figure 2. Differential purification by flow cytometry of myoepithelial-like (CD49f^{high}/KIT^{neg}) and ductal-like (CD49f^{low}/KIT⁺) cells. **A**) Analysis by flow cytometry of CD49f and KIT surface expression in 5 human PDX lines representative of biphenotypic ACCs, enabling visual discrimination of 2 distinct populations of human malignant cells: CD49f^{high}/KIT^{neg} (top-left gates) and CD49f^{low}/KIT⁺ (bottom-right gates). **B**) Analysis by immunohistochemistry (IHC) of corresponding tumors, confirming mutually exclusive expression of TP63 (a myoepithelial marker) and KIT (a ductal marker). Scale bar: 50 μ m. **C**) Principal component analysis (PCA) of RNA-seq data obtained from 5 autologous pairs of CD49f^{high}/KIT^{neg} (CD49f^{high}) and CD49f^{low}/KIT⁺ (KIT⁺) cells, purified in parallel from 5 biphenotypic PDX lines of human ACCs (ACCX5M1, ACCX6, ACCX14, ACCX22, SGTX6). PCA was performed using the top 500 genes displaying the highest level of variance across the full 10-sample dataset. The 10 samples segregated into 2 distinct clusters, corresponding to their surface marker phenotype (CD49f^{high}/KIT^{neg} vs CD49f^{low}/KIT⁺) and separating along the first principal component (PC1). **(D)** Heatmap of the top 100 genes identified as differentially expressed (DE) between CD49f^{high}/KIT^{neg} and CD49f^{low}/KIT⁺ cells, after mean centering of gene-expression levels and hierarchical clustering of both genes and samples. Differentially expressed genes were defined as those with a more than twofold difference in mean expression levels between the 2 populations (\log_2 fold-change >1) that was considered to be statistically robust based on a Wald test corrected for multiple comparisons (FDR < 0.05; Benjamini–Hochberg method). Differentially expressed genes were ranked based on the P value from the Wald test. Asterisk labels indicate genes encoding for previously validated myoepithelial (*) and ductal (**) markers. ACC = adenoid cystic carcinoma; APC = allophycocyanin; DE = differentially expressed; FDR = false discovery rate; PC1 = first principal component; PC2 = second principal component; PDX = patient-derived xenograft; PE = phycoerythrin; RNA-seq = RNA sequencing.

like and ductal-like cell types, respectively (Figure 1, D-I). We then tested whether CD49f and KIT could be leveraged to visualize myoepithelial-like and ductal-like cells by FACS. Indeed, staining with fluorophore-conjugated antibodies directed against the 2 markers enabled clear discrimination of 2 cell populations, cells expressing high levels of CD49f and no measurable levels of KIT (CD49f^{high}/KIT^{neg}) and cells expressing low levels of CD49f and measurable levels of KIT (CD49f^{low}/KIT⁺), across 5 independent PDX lines representative of biphenotypic ACCs (Figure 2, A). Analysis of the same tumors by IHC also confirmed that KIT

expression was restricted to ductal-like cells, and mutually exclusive to expression of TP63, a myoepithelial marker (Figure 2, B), in agreement with previous IHC studies (39).

Transcriptional profiling of CD49f^{high}/KIT^{neg} and CD49f^{low}/KIT⁺ cells

To understand whether CD49f^{high}/KIT^{neg} and CD49f^{low}/KIT⁺ cells isolated from different patients displayed similar gene-expression patterns, we sorted autologous pairs of the 2 cell types from 5 biphenotypic PDX lines and analyzed them by

conventional RNA-seq. When plotted based on a principal component analysis (PCA) of their transcriptional profiles, the 10 samples segregated into 2 equal clusters (5 samples per cluster) that matched the original phenotypes of sorted cells (CD49^{high}/KIT^{neg} vs. CD49^{low}/KIT⁺). The 2 clusters separated along the first principal component (PC1), which accounted for a dominant fraction (58%) of the variability within the dataset (Figure 2, C). This observation revealed that the 2 cell types were defined by systematic differences in transcriptional profiles, strongly conserved across different tumors irrespective of patient-specific variables (eg, site of origin, sex, repertoire of genetic alterations) (Supplementary Table 1, available online) (27). We then used DESeq2 (29) to identify genes differentially expressed between the 2 cell types (Supplementary Table 2, available online) and observed that CD49^{high}/KIT^{neg} cells expressed markers of myoepithelial cells (eg, ACTA2, MYH11, PDPN, TP63) (15-20), and CD49^{low}/KIT⁺ cells expressed markers of the ductal and/or luminal lineages of exocrine glands (eg, ELF5, KIT, SLPI, ANXA8) (40-43) (Figure 2, D), thus confirming their myoepithelial-like and ductal-like identities. Finally, we used STAR-Fusion (30) to test whether CD49^{high}/KIT^{neg} and CD49^{low}/KIT⁺ cells, which are both known to carry t(6; 9) MYB-NFIB translocations (44), differed in expression of MYB-NFIB chimeric transcripts. Our analysis revealed that, in ACCs that harbored such translocations, both cell types expressed MYB-NFIB chimeric transcripts, without evidence of meaningful differences in terms of absolute levels or alternative splicing (Supplementary Figure 4, available online).

Developmental relationship of CD49^{high}/KIT^{neg} and CD49^{low}/KIT⁺ cells

We next wanted to test whether the 2 cell populations represented different genetic clones that coexisted within the same tissue (Figure 3, A), or whether they were linked by a developmental relationship, whereby one population could differentiate into the other, in a process akin to those sustaining the normal morphogenesis of epithelial tissues (Figure 3, B). To explore this concept, we decided to perform prospective xenotransplantation studies with purified preparations of the 2 cell populations, to evaluate their tumor-initiating and multilineage differentiation capacity. Autologous pairs of CD49^{high}/KIT^{neg} and CD49^{low}/KIT⁺ cells were double sorted by FACS from 2 biphenotypic PDX lines (ACCX5M1, SGTX6) and injected, side by side, at progressively decreasing doses (10000-250 cells per injection) in immune-deficient animals (Figure 3, C) (31). We observed that the frequency of tumor-initiating cells was higher in CD49^{high}/KIT^{neg} as compared with CD49^{low}/KIT⁺ cells (Figure 3, D and E; Supplementary Figure 5, A and B, available online), resulting in larger and faster-growing tumors (Supplementary Figure 5, C-F, available online) despite CD49^{high}/KIT^{neg} cells having a smaller fraction of actively proliferating cells (Supplementary Figure 5, G and H, available online). These results revealed that myoepithelial-like cells represent a biologically aggressive component of human ACCs, despite having a more quiescent phenotype. We then proceeded to analyze the cell composition of tumors originated from transplantation of sorted cells. Our results showed that tumors originated from sorted CD49^{high}/KIT^{neg} cells contained both cell types, at frequencies comparable with those observed in parent lines, irrespectively of the number of injected cells (Figure 3, F-H, L-N). This observation showed that CD49^{high}/KIT^{neg} cells can differentiate into CD49^{low}/KIT⁺ cells, thus excluding the clonal hypothesis. When we analyzed the few

tumors originated from CD49^{low}/KIT⁺ cells, we also found them indistinguishable from parent lines (Figure 3, I-K, O-Q). In this specific case, however, given the high number of CD49^{low}/KIT⁺ cells required for tumor initiation, we could not exclude the possibility that such tumors arose from cross-contaminations of CD49^{high}/KIT^{neg} cells, despite the high purity achieved by double sorting.

Differential expression of mechanistic regulators of retinoic acid (RA) signaling

To elucidate the molecular mechanisms that control the differentiation of CD49^{high}/KIT^{neg} cells into CD49^{low}/KIT⁺ cells, we searched for signaling pathways with differential activation in the 2 cell types. We tested whether CD49^{high}/KIT^{neg} and CD49^{low}/KIT⁺ cells differed in the expression of genes encoding for mechanistic regulators of RA signaling, such as enzymes involved in RA biosynthesis (45-47), RA binding proteins (48-50), retinoic acid receptors (RARs) and retinoid x receptors (RXRs) (51) (Figure 4, A), given that RA signaling plays a key role in the differentiation of SG epithelia (52-54) and antagonizes MYB signaling in human ACCs (55,56). We found that activators of RA signaling were overexpressed in CD49^{low}/KIT⁺ cells, whereas suppressors of RA signaling were overexpressed in CD49^{high}/KIT^{neg} cells, in a coordinated fashion (Figure 4, B and C).

In vitro effects of RAR/RXR activation and inhibition

To elucidate the role played by RA signaling in regulating cell differentiation, we leveraged a 3-dimensional in vitro organoid tissue-culture system (32-34) that recapitulated the biphenotypic composition of primary tissues (Figure 4, D-G), as well as key elements of their histological architecture (Supplementary Figure 6, available online). We observed that stimulation of organoid cultures with agonists of RARs (ATRA) or RXRs (bexarotene) caused an increase in the percentage of CD49^{low}/KIT⁺ cells, whereas suppression of the signaling mediated by RAR and RXR heterodimers (RAR/RXR) with inverse RAR agonists (BMS493, AGN193109) resulted in selective loss of CD49^{low}/KIT⁺ cells (Figure 4, H and I). These effects were observed at concentrations (0.1-10 μM) that spanned the drugs' known median effective dose (ED₅₀) (Figure 4, J-M) and were reproduced across 3 biphenotypic PDX lines (ACCX5M1, SGTX6, ACCX6) (Figure 5, A-F). To clarify the mechanism causing such changes in cell composition, we first tested whether ATRA or BMS493 induced preferential proliferation of one cell type. Analysis by IHC and FACS showed no increases in the frequency of MKI67⁺ cells (Figure 5, G-R; Supplementary Figure 8, A-O, available online) or of cells in either the G2 or M phases of the cell cycle (Supplementary Figure 8, P-S) in either cell type. The IHC analysis also confirmed that cells with a ductal-like phenotype, as defined by expression of KIT and lack of expression of TP63 (KIT⁺/TP63^{neg}) became more abundant following treatment with ATRA, and were undetectable after treatment with BMS493 (Figure 5, G-R; Supplementary Figure 8, A-O, available online). Remarkably, organoids treated with BMS493 displayed a striking change in morphology, with areas occupied by KIT⁺ cells undergoing nuclear fragmentation, suggesting selective cytotoxicity toward ductal-like cells (Figure 5, O-R; Supplementary Figure 8, L, available online). We thus hypothesized that agonism and suppression of RAR/RXR signaling might have lineage-specific effects on the 2 cell populations (Figure 5,

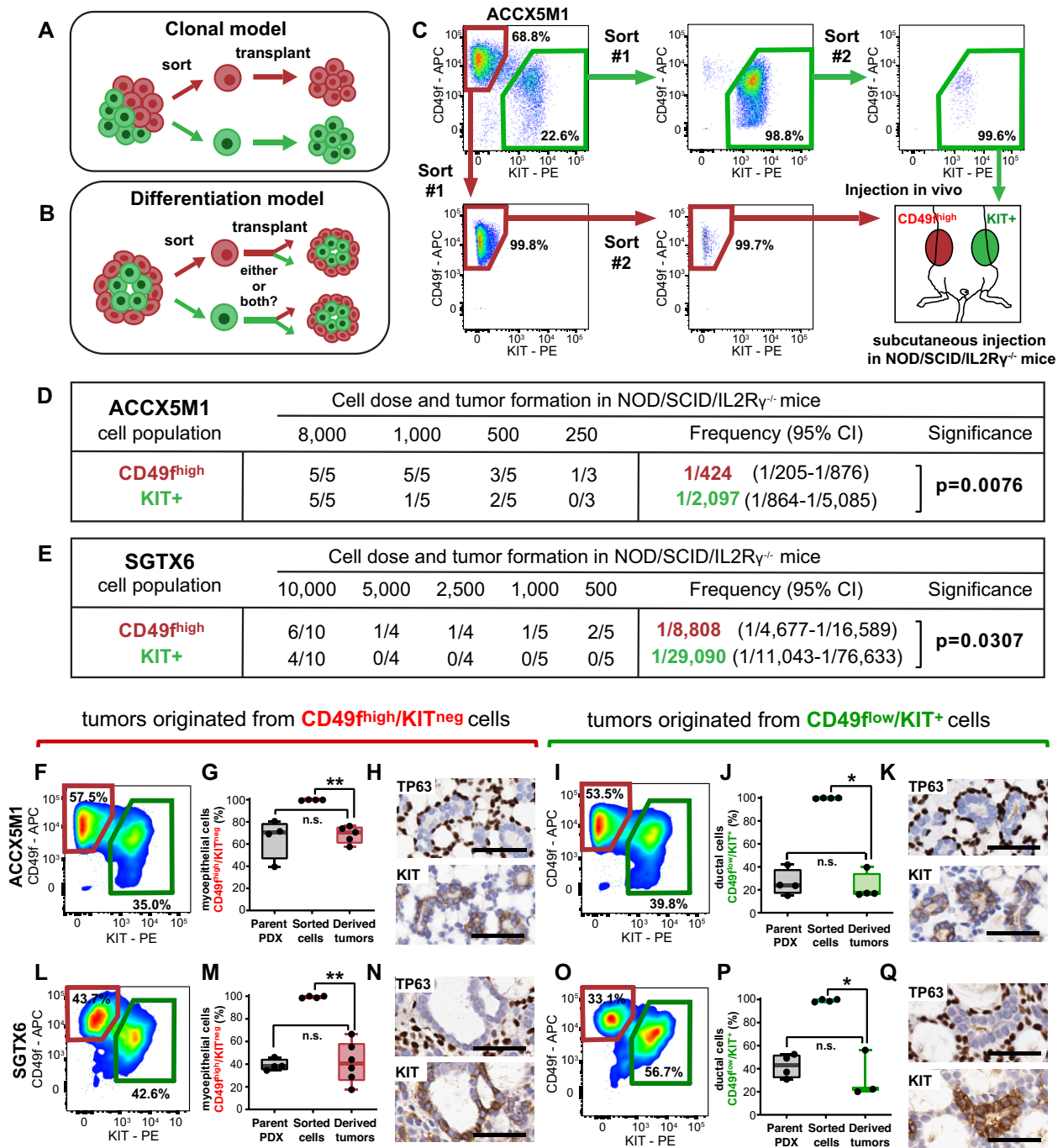


Figure 3. Tumorigenic properties of myoepithelial-like (CD49^{high}/KIT^{neg}) and ductal-like (CD49^{low}/KIT⁺) cells. **A**) Predicted outcomes of cell transplantation experiments under a clonal model, whereby different cell types give rise to distinct progenies, each retaining the phenotypic properties of the parent cells. **B**) Predicted outcomes of cell transplantation experiments under a differentiation model, whereby 1 or more cell types can serve as a progenitor of others, in a plastic and dynamic fashion. **C**) Experimental workflow of prospective xenotransplantation experiments aimed at comparing the tumor-initiating capacity of CD49^{high}/KIT^{neg} and CD49^{low}/KIT⁺ cells. The 2 populations were purified in parallel by FACS, starting from the same tumor lesion, double sorted to achieve high purity (>95%) and injected subcutaneously, side by side, into the opposite flanks of the same animal. **D-E**) Extreme limiting dilution analysis (ELDA) of xenotransplantation experiments using paired sets of CD49^{high}/KIT^{neg} and CD49^{low}/KIT⁺ cells sorted from ACCX5M1 (**D**) and SGTX6 (**E**) PDX lines. In both models, the frequency of tumor-initiating cells was higher in CD49^{high}/KIT^{neg} as compared with CD49^{low}/KIT⁺ cells. **F-Q**) Analysis by FACS and IHC of the cell composition of tumors originated from the xenotransplantation of purified preparations of either CD49^{high}/KIT^{neg} or CD49^{low}/KIT⁺ cells, sorted from either ACCX5M1 (**F-K**) or SGTX6 (**L-Q**) PDX lines. Analysis by FACS (**F-G, I-J, L-M, O-P**) showed that tumors originated from sorted cells contained both CD49^{high}/KIT^{neg} and CD49^{low}/KIT⁺ populations, irrespective of the original phenotype of sorted cells. In tumors originated from CD49^{high}/KIT^{neg} cells, the percentage of CD49^{high}/KIT^{neg} cells did not appear increased as compared with that observed in parent tumors but was lower than that observed in the purified preparations (**G, M**), indicating spontaneous in vivo differentiation (n.s. = not statistically significant; *P < .05; Mann-Whitney U test, 1-tailed). A symmetric scenario was observed in tumors originated from CD49^{low}/KIT⁺ cells (**J, P**). Analysis by IHC of tumors originated from sorted cells (**H, K, N, Q**) confirmed the reconstitution of a cribriform histology and of a biphenotypic cell composition, defined by the coexistence of 2 distinct subsets of cancer cells with mutually exclusive expression of myoepithelial-specific (TP63) and ductal-specific (KIT) biomarkers. Scale bars: 50 μ m. APC = allophycocyanin; CI = confidence interval; FACS = fluorescence-activated cell sorting; IHC = immunohistochemistry; PDX = patient-derived xenograft; PE = phycoerythrin.

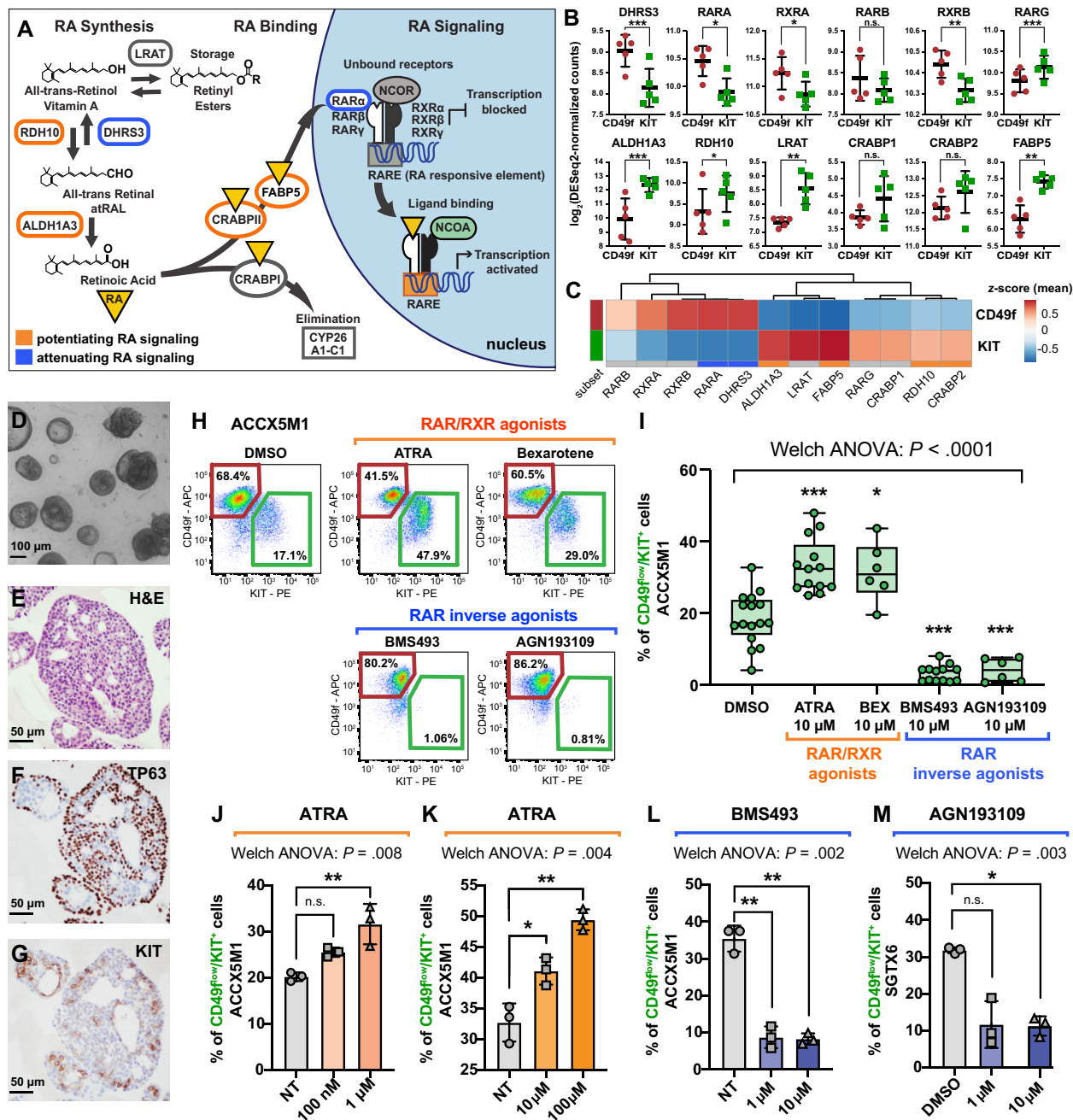


Figure 4. The role of retinoic acid (RA) signaling in controlling the cell composition of human ACC organoids. **A**) Schematic modeling of the RA signaling pathway. **B**) Comparison of the gene-expression levels for known mediators of RA signaling in CD49f^{high}/KIT^{neg} (CD49f) and CD49f^{low}/KIT⁺ (KIT) cells, as measured by RNA-seq on autologous pairs from biphenotypic ACCs. Genes identified as attenuators of RA signaling displayed preferential expression in CD49f^{high}/KIT^{neg} cells (CD49f), whereas genes identified as potentiators of RA signaling displayed preferential expression in CD49f^{low}/KIT⁺ cells (KIT). Error bars: mean \pm standard deviation (n.s. = not significant; * $P < .10$; ** $P < .05$; *** $P < .01$; Student's *t* test, paired samples). **C**) Heatmap displaying mean-centered z scores for the average expression levels of modulators of RA signaling in CD49f^{high}/KIT^{neg} (CD49f) and CD49f^{low}/KIT⁺ (KIT) cells. **D-G**) Analysis by microscopy and IHC of 3D organoids established from human ACCs. Organoids consisted in large adenoid structures (**D-E**) that recapitulated key elements of the histological architecture of primary tumors, such as the coexistence of 2 cell types with mutually exclusive expression of TP63 (**F**) and KIT (**G**). **H-I**) Analysis by flow cytometry of ACCX5M1 organoids treated for 1 week with either agonists (ATRA, 10 μ M; bexarotene, 10 μ M) or inhibitors (BMS493, 10 μ M; AGN193109, 10 μ M) of RAR/RXR signaling. Treatment with agonists induced an increase in the percentage of CD49f^{low}/KIT⁺ cells, whereas treatment with inhibitors resulted in their reduction. **J-M**) Dose-response studies of the effects of agonists and inhibitors of RAR/RXR signaling on the cell composition of human ACC organoids. Treatment with increasing concentrations of ATRA (0.1–100 μ M) resulted in a progressive increase of the percentage of CD49f^{low}/KIT⁺ cells (ACCX5M1 [**J-K**]). The effects of ATRA were already detectable at low concentrations (0.1–1 μ M; ACCX5M1 [**J**]). Treatment with inhibitors of RAR/RXR signaling (BMS493, AGN193109) resulted in a profound reduction of the percentage of CD49f^{low}/KIT⁺ cells, even at low pharmacological doses (1 μ M; ACCX5M1 [**L**]; SGTx6 [**M**]). Changes in the percentage of CD49f^{low}/KIT⁺ cells were evaluated by FACS and tested for statistical significance using Welch's 1-way ANOVA followed by Dunnett's T3 test (n.s. = not significant; * $P < .05$; ** $P < .01$; *** $P < .001$) assuming a normal distribution (Supplementary Figure 7, available online). 3D = 3-dimensional; ACC = adenoid cystic carcinoma; ANOVA = analysis of variance; APC = allophycocyanin; ATRA = all-trans retinoic acid; DMSO = dimethyl-sulfoxide; FACS = fluorescence-activated cell sorting; H&E = hematoxylin and eosin stain; IHC = immunohistochemistry; NT = untreated; PE = phycoerythrin; RA = retinoic acid; RAR = retinoic acid receptor; RNA-seq = RNA sequencing; RXR = retinoid X receptor.

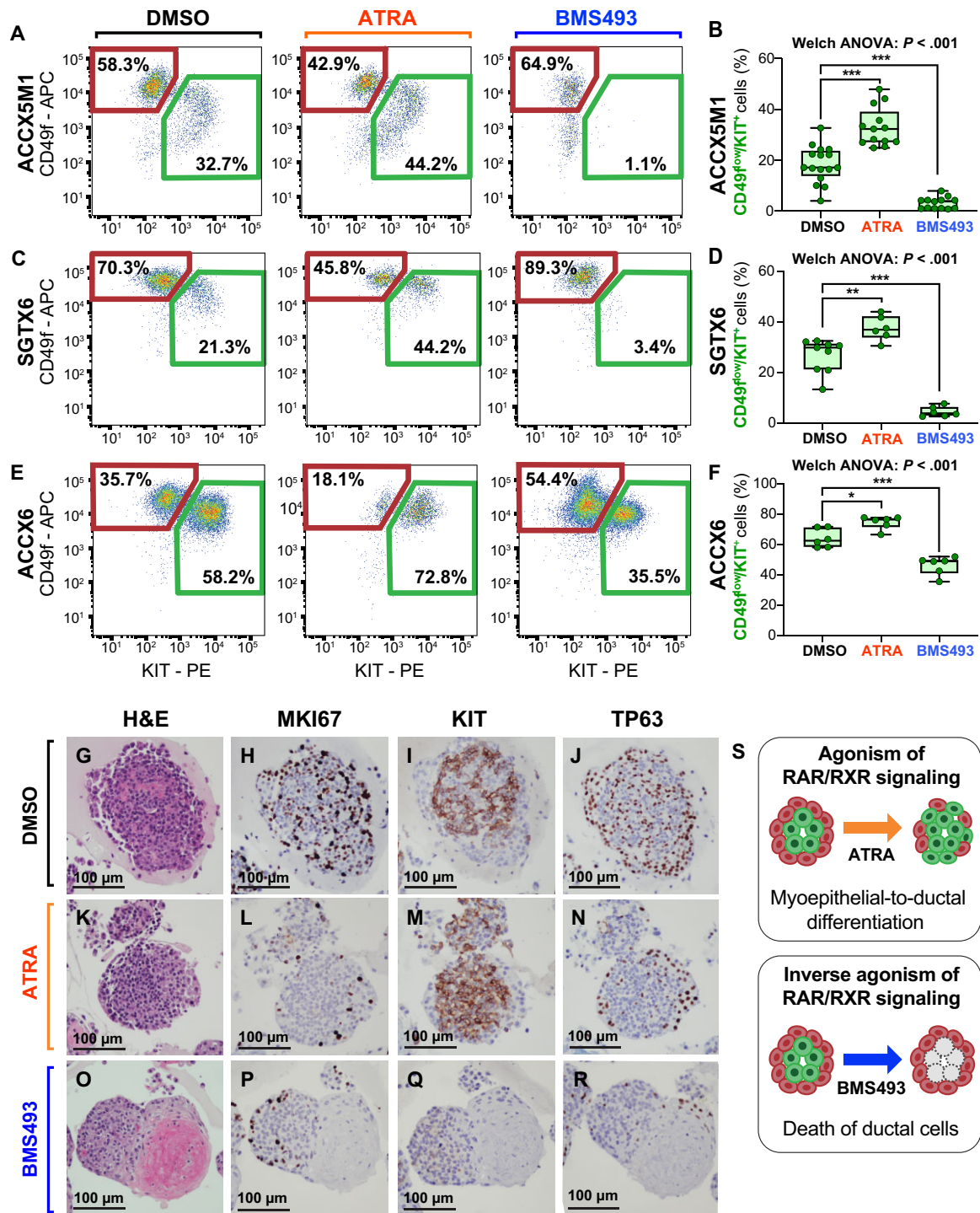


Figure 5. Pharmacological perturbation of RAR/RXR signaling across different PDX models and analysis of its effects. **A-F**) Analysis and quantification by flow cytometry of the relative percentage of CD49f^{low}/KIT⁺ cells in ACC organoids established from 3 independent PDX lines (ACCX5M1, SGTX6, ACCX6), following 1 week of treatment with either ATRA (10 μ M) or BMS493 (10 μ M). Treatment with ATRA was associated with an increase in the percentage of CD49f^{low}/KIT⁺ cells, whereas treatment with BMS493 was associated with its reduction, as compared with control organoids treated only with DMSO, the solvent used to resuspend the 2 drugs. Differences in the mean percentage of CD49f^{low}/KIT⁺ cells were tested for statistical significance using Welch's 1-way ANOVA followed by Dunnett's T3 test ($*P < .05$; $**P < .01$; $***P < .001$) assuming a normal distribution (Supplementary Figure 7, available online). Box plots report the results of at least 2 independent experiments (with a minimum of 3 replicates for each condition). **G-R**) Analysis by IHC of 3D organoids established from the ACCX6 PDX line and treated with DMSO, ATRA (10 μ M), or BMS493 (10 μ M). Treatment with ATRA resulted in a visual expansion of KIT⁺ cells (**M**) as compared with treatment with DMSO alone (**I**), whereas treatment with BMS493 resulted in a complete loss of KIT expression (**Q**) and was associated with a dramatic change in the organoids' morphology, characterized by the appearance of amorphous, eosin-rich deposits at their center (**O**). Neither ATRA nor BMS493 appeared to upregulate MKI67 expression in either cell population (**H**, **L**, **P**). Scale bars: 100 μ m. **S**) Schematic modeling of the effects produced by agonism and inhibition of RAR/RXR signaling on the cell composition of human ACCs, as hypothesized based on the observations conducted on whole 3D organoids: stimulation of RAR/RXR signaling induces the differentiation of myoepithelial-like cells into ductal-like cells, whereas inhibition of RAR/RXR causes selective death of ductal-like cells. 3D = 3-dimensional; ACC = adenoid cystic carcinoma; ANOVA = analysis of variance; APC = allophycocyanin; ATRA = all-trans retinoic acid; DMSO = dimethyl-sulfoxide; H&E = hematoxylin and eosin stain; IHC = immunohistochemistry; PDX = patient-derived xenograft; PE = phycoerythrin; RAR = retinoic acid receptor; RXR = retinoid X receptor.

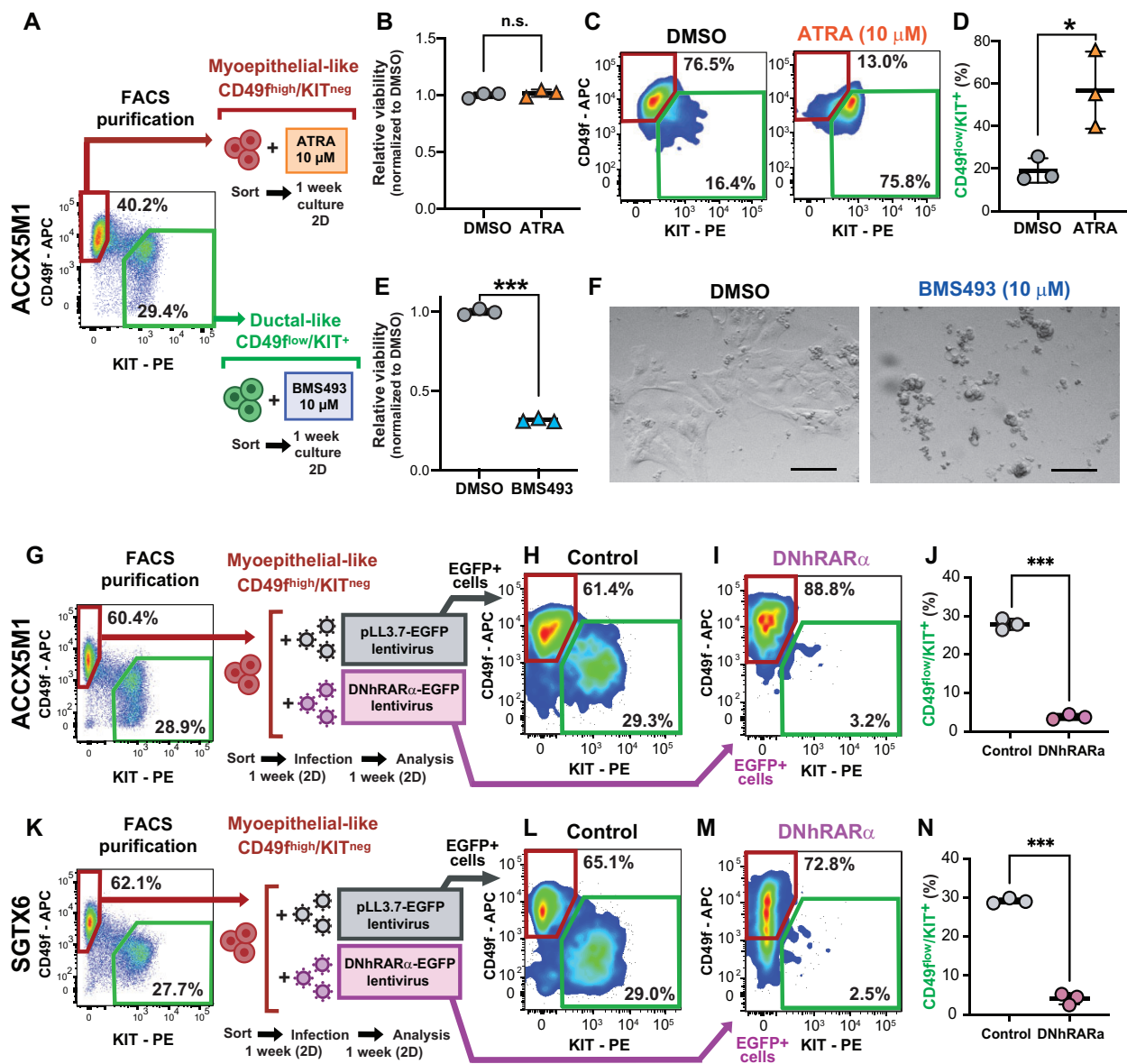


Figure 6. Effects of RAR/RXR signaling on the differentiation of myoepithelial-like cells into ductal-like cells and the survival of ductal-like cells. **A)** Schematic workflow of experiments aimed at elucidating the population-specific effects of pharmacological manipulations of RAR/RXR signaling. Paired sets of CD49^{high}/KIT^{neg} and CD49^{low}/KIT⁺ cells were sorted in parallel from the same tumor (ACCX5M1) and cultured for 1 week as 2D monolayers, in the presence of either ATRA (10 μ M) or BMS493 (10 μ M), respectively. **B-D)** Evaluation of the effects of ATRA on sorted CD49^{high}/KIT^{neg} cells. Treatment with ATRA did not affect the viability of CD49^{high}/KIT^{neg} cells (**B**) alamarBlue assay) but caused CD49^{high}/KIT^{neg} cells to change phenotype and become CD49^{low}/KIT⁺ (**C-D**) FACS). **E-F)** Evaluation of the effects of BMS493 on sorted CD49^{low}/KIT⁺ cells. Treatment with BMS493 caused the death of the majority CD49^{low}/KIT⁺ cells (**E**) alamarBlue assay). On visual inspection by conventional microscopy, CD49^{low}/KIT⁺ cells treated with BMS493 appeared fragmented as compared with control cells treated with DMSO alone (**F**). Scale bar: 100 μ m. **G)** Schematic workflow of the experiment aimed at testing the effects of a DNhRAR α construct on the capacity of CD49^{high}/KIT^{neg} cells to undergo myoepithelial-to-ductal differentiation. CD49^{high}/KIT^{neg} cells were sorted from ACCX5M1 tumors, cultured for 6 days as 2D monolayers, and infected with lentivirus vectors encoding for either a DNhRAR α -EGFP construct or a control EGFP reporter. Infected cells were then cultured for 1 additional week and analyzed by FACS for CD49f and KIT expression, restricting the analysis to infected (EGFP⁺) cells. **H-J)** Analysis by FACS of CD49^{high}/KIT^{neg} cells purified from ACCX5M1 tumors and infected with lentivirus vectors encoding for either a DNhRAR α -EGFP construct or a control EGFP reporter. Forced DNhRAR α expression completely abrogated the capacity of CD49^{high}/KIT^{neg} cells to produce a CD49^{low}/KIT⁺ progeny, whereas forced expression of EGFP alone did not. **K-N)** Evaluation of the role of DNhRAR α as a suppressor of myoepithelial-to-ductal differentiation in a second, independent PDX model (SGTX6). Error bars: mean \pm standard deviation; P values: Student's t test, 2-tailed (n.s. = not significant; *P < .05; ***P < .001). 2D = 2-dimensional; APC = allophycocyanin; ATRA = all-trans retinoic acid; DMSO = dimethyl-sulfoxide; DNhRAR α = dominant negative human retinoic acid receptor alpha; EGFP = enhanced green fluorescent protein; FACS = fluorescence-activated cell sorting; PDX = patient-derived xenograft; PE = phycoerythrin; RAR = retinoic acid receptor; RXR = retinoid X receptor.

S). To formally test this hypothesis, we purified CD49^{high}/KIT^{neg} and CD49^{low}/KIT⁺ cells and treated them individually with ATRA (10 μ M) or BMS493 (10 μ M) using 2-dimensional monolayer cultures (35) (Figure 6, A-F). The experiment revealed that stimulation with ATRA did not impact the viability of CD49^{high}/KIT^{neg} cells (Figure 6, B) but changed their phenotype, with a majority of

cells becoming CD49^{low}/KIT⁺ (Figure 6, C-D), suggesting myoepithelial-to-ductal differentiation. Conversely, treatment of purified CD49^{low}/KIT⁺ cells with BMS493 resulted in a substantial decrease in cell viability, indicating selective toxicity against ductal-like cells (Figure 6, E and F). To provide orthogonal evidence in support of RAR/RXR signaling as a key mediator of

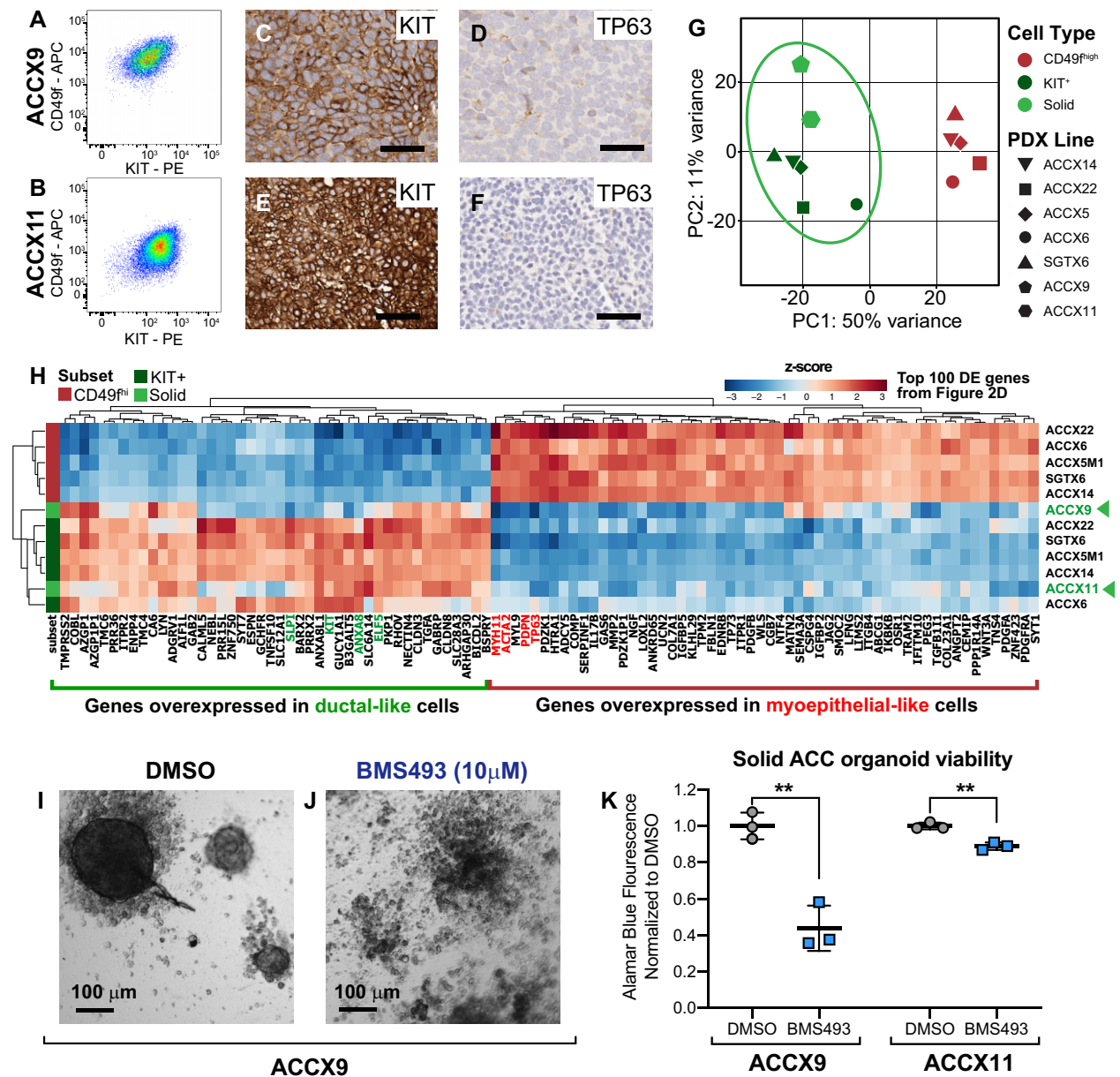


Figure 7. Transcriptional profile and drug sensitivity of ACCs with solid histology. **A–B**) Analysis by flow cytometry of 2 PDX lines representative of human ACCs with solid histology (**A**) ACCX9; (**B**) ACCX11) revealing a monophenotypic, ductal-like (CD49f^{low}/KIT⁺) cell composition. **C–F**) Analysis by IHC of KIT and TP63 expression in ACCX9 and ACCX11 tumors, showing ubiquitous expression of the ductal-specific marker KIT (**C, E**) and complete loss of the myoepithelial-specific marker TP63 (**D, F**). Scale bars: 50 μm. **G**) Principal component analysis (PCA) of RNA-seq data from human ACCs, in which data from the 2 PDX lines with solid histology (ACCX9, ACCX11) are combined with those from the 5 autologous pairs of CD49f^{high}/KIT^{neg} and CD49f^{low}/KIT⁺ cells isolated from biphenotypic PDX lines (ACCX5M1, ACCX6, ACCX14, ACCX22, SGTX6). PCA was performed using the top 500 genes that displayed the highest level of variance across the full 12-sample dataset. **H**) Hierarchical clustering of RNA-seq data from human ACCs, based on the expression levels of the same list of 100 genes identified as differentially expressed (DE) between CD49f^{high}/KIT^{neg} and CD49f^{low}/KIT⁺ cells and reported in Figure 2, D. Solid ACCs clustered with CD49f^{low}/KIT⁺ cells from biphenotypic tumors, irrespective of the method used to analyze their transcriptional profile. **I–J**) On visual inspection by conventional microscopy, ACCX9 organoids cultured for 1 week in the presence of BMS493 (10 μM) displayed widespread cell fragmentation, in contrast to organoids cultured with DMSO alone. **K**) Quantification of organoid viability using the alamarBlue assay, confirming the cytotoxic activity of BMS493 (10 μM) against PDX lines with solid histology (ACCX9, ACCX11). Error bars: mean ± standard deviation; P values: Student's t test (2-tailed; **P < .01). ACC = adenoid cystic carcinoma; APC = allophycocyanin; DMSO = dimethyl-sulfoxide; IHC = immunohistochemistry; PC1 = first principal component; PC2 = second principal component; PDX = patient-derived xenograft; PE = phycoerythrin; RNA-seq = RNA sequencing.

myoepithelial-to-ductal differentiation, we decided to test whether the effects of RAR/RXR inhibitors could be phenocopied by overexpression of a dominant-negative version of human RARα (DNhRARα), known to suppress the transcriptional activity of all 3 members of the human RAR family (RARα, RARβ, RARγ) (37). Indeed, infection of CD49f^{high}/KIT^{neg} cells with a lentivirus driving constitutive expression of the DNhRARα construct

resulted in complete abrogation of their spontaneous differentiation into CD49f^{low}/KIT⁺ cells (Figure 6, G–N).

In vivo antitumor activity of BMS493

We next aimed to elucidate whether the selective toxicity displayed by BMS493 against ductal-like cells in vitro could be leveraged for the in vivo therapy of ACCs. We hypothesized that,

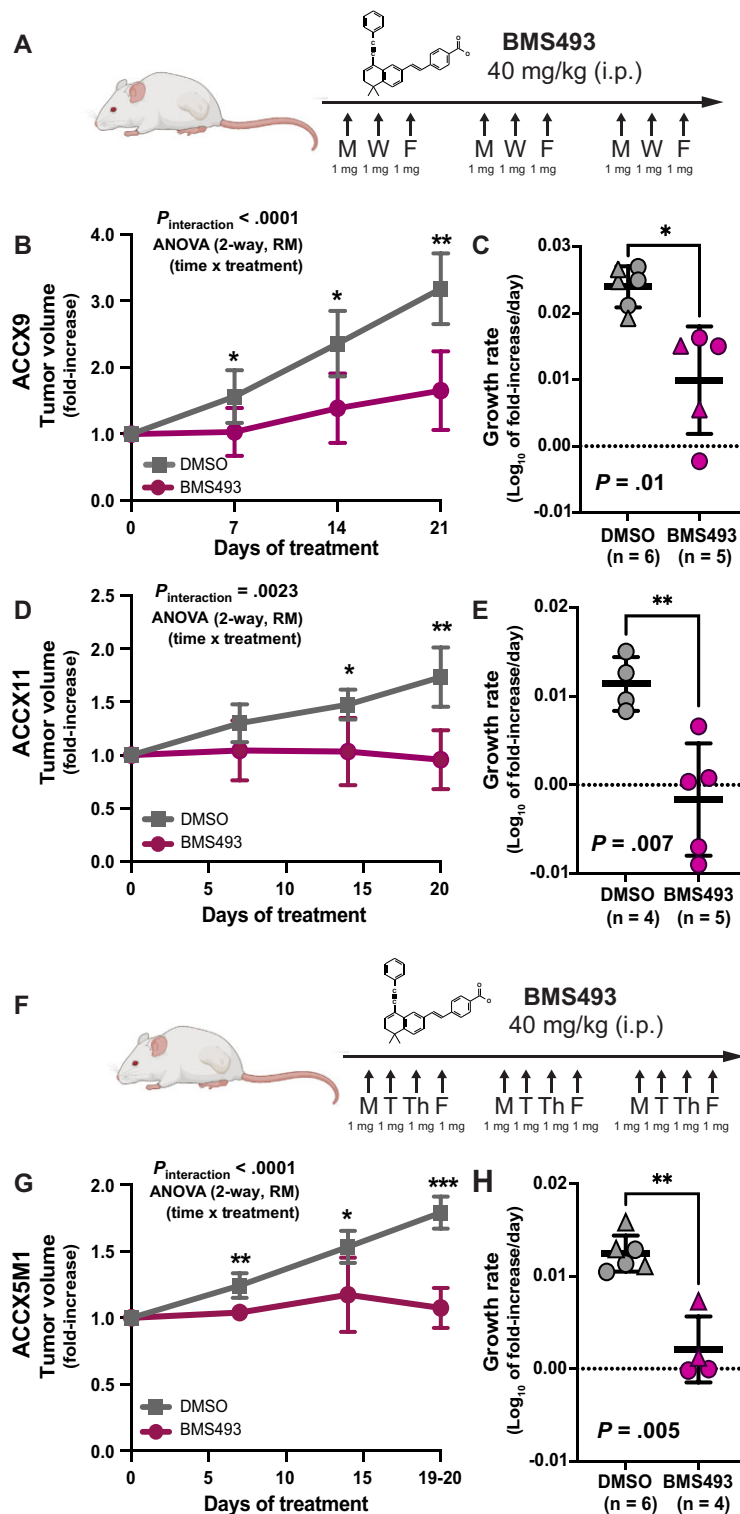


Figure 8. In vivo antitumor activity of BMS493. **A**) Schematic description of the BMS493 dosing regimen used for the in vivo treatment of solid ACC models (40 mg/kg doses, intraperitoneal, 3 times/week x 3 weeks). **B-E**) Comparison of tumor growth kinetics between mice treated with BMS493 and mice treated with the drug's vehicle alone (DMSO), following subcutaneous engraftment of 2 solid ACC models (ACCX9 [**B-C**]; ACCX11 [**D-E**]). **F**) Schematic of the BMS493 dosing regimen used for the in vivo treatment of the biphenotypic ACC model (40 mg/kg doses, intraperitoneal, 4 times/week x 3 weeks). **G-H**) Comparison of tumor growth kinetics between mice treated with BMS493 and mice treated with the drug's vehicle alone (DMSO), following subcutaneous engraftment of a biphenotypic ACC model (ACCX5M1). Differences in tumor growth kinetics were quantified by comparing either mean fold increases in tumor volume (**B, D, G**) or mean growth rates (**C, E, H**). Differences in mean fold increases in tumor volume (**B, D, G**) were tested for statistical significance using 2 approaches: 1) at each time point, using a 2-tailed Student's *t* test (* $P < .05$; ** $P < .01$; *** $P < .001$); and 2) across the full experimental dataset, using a 2-way ANOVA for repeated measures (RM), where measurements performed on the same mouse at different time points were treated as repeated measures ($P_{\text{interaction}} = \text{time} \times \text{treatment}$). Growth rates were calculated assuming exponential kinetics. Differences between mean growth rates (**C, E, H**) were tested for statistical significance using a 2-tailed Welch's *t* test. Error bars: mean \pm standard deviation. Schematic descriptions of dosing regimens were created using BioRender.com. ACC = adenoid cystic carcinoma; ANOVA = analysis of variance; DMSO = dimethyl-sulfoxide.

among ACCs, those enriched in ductal-like cells would represent the most susceptible targets. Although most ACCs display biphenotypic histology, over the course of the disease, a subgroup progresses to a solid histological pattern, consisting predominantly of KIT⁺ cells (20). Progression to solid histology associates with NOTCH1-activating mutations, increased proliferation kinetics, and worse clinical outcomes (57-63). To understand whether ACCs with solid histology represented monophenotypic expansions of ductal-like cells, we analyzed 2 PDX models representative of this specific subtype (ACCX9, ACCX11) (20) and confirmed that they consisted of a single KIT⁺/TP63^{neg} population (Figure 7, A-F). We then performed RNA-seq on KIT⁺ cells purified by FACS from these 2 models and repeated the principal component analysis (PCA), combining the new data with those from purified pairs of myoepithelial-like and ductal-like cells from biphenotypic ACCs. Indeed, KIT⁺ cells from solid ACCs clustered with CD49f^{ow}/KIT⁺ cells from biphenotypic ACCs (Figure 7, G), indicating retention of a ductal-like transcriptional profile (Figure 7, H). Furthermore, when treated with BMS493 (10 μM), organoids established from solid PDX lines displayed loss of structural integrity and decreased viability, indicating retention of sensitivity to suppression of RAR/RXR signaling (Figure 7, I-K). As a final step, we tested whether in vivo administration of BMS493 (40 mg/kg, intraperitoneal) could be leveraged for the treatment of PDX lines with either solid (ACCX9, ACCX11) or cribriform (ACCX5M1) histology (Figure 8). We used a more intense regimen for the cribriform model (4 times/week x 3 weeks; Figure 8, F) as compared with the solid models (3 times/week x 3 weeks; Figure 8, A), assuming lower sensitivity of the former. Treatment with BMS493 was associated with side effects reminiscent of vitamin A deficiency in mice (eg, encrusted eyelids, rough coat, scaling of skin) (64). Of 18 tumor-bearing animals treated with BMS493, 33% (6 of 18) experienced tumor shrinkage (Supplementary Figure 9, available online). Four (22%) animals were prematurely euthanized because of abrupt deterioration of general health conditions. In 3 of these animals, health deterioration occurred immediately following tumor shrinkage, suggesting acute toxicity due to tumor lysis (Supplementary Figure 9, available online). Overall, treatment with BMS493 led to a statistically significant reduction in tumor growth across all 3 models, even after removal of animals that underwent premature euthanasia (Figure 8, B-E, G-H; Supplementary Figure 9, available online).

Discussion

In this study, we identified 2 cell-surface markers (CD49f, KIT) that, for the first time, enabled the differential purification and comparative study of the 2 subtypes of malignant cells (myoepithelial-like and ductal-like) that are known to coexist in human ACCs. Our data reveal that the 2 cell types do not represent distinct genetic clones but rather distinct developmental lineages (ie, distinct cell types that originate as a result of multilineage differentiation processes, akin to those that enable stem-cell populations to sustain the homeostatic turnover of normal tissues). Our data also reveal that myoepithelial-like cells are highly tumorigenic upon xenotransplantation in immune-deficient animals, despite their low proliferation rates. In tumors originated from exocrine glands (eg, breast cancer), myoepithelial-like cells are often considered tumor suppressive (65,66). Our findings caution against this interpretation in ACCs and indicate that, to be curative, treatment strategies will need to eradicate myoepithelial-like components. Furthermore, our data show that, in ACCs, myoepithelial-like cells act as progenitors of

ductal-like cells and that myoepithelial-to-ductal differentiation is promoted by RAR/RXR signaling. These findings provide a mechanistic explanation for the conflicting results that have been recently obtained in studies that tested ATRA's antitumor activity in human ACCs. ATRA displayed marked antiproliferative activity against PDX models (55,56) but appeared to provide limited benefit when administered to patients (67). We hypothesize that, in ACC patients, the therapeutic benefit of ATRA might be short lived because of the cytostatic nature of its effect, which consists in a transient perturbation of the tumor tissues' cell composition.

Perhaps more importantly, our data also revealed that suppression of RAR/RXR signaling induces selective death of ductal-like cells. This finding provides an opportunity for the selective pharmacological targeting of ACCs, especially of cases with solid histology, which are characterized by monophenotypic expansions of ductal-like cells. These tumors often originate during the natural progression of ACCs, following the acquisition of NOTCH1-activating mutations, in a scenario that is reminiscent of the "blast crisis" observed in chronic myelogenous leukemias, whereby a population of more differentiated, yet highly proliferative cells becomes dominant, because of mutations that aberrantly activate self-renewal (22,68,69). Our data indicate that, in solid ACCs, treatment with an inverse agonist of RAR/RXR signaling (BMS493) can have robust antitumor activity. Agonists of RAR/RXR signaling have been extensively explored as antitumor agents in humans (70-74), whereas inverse agonists, to the best of our knowledge, have not. Our findings advocate in support of the clinical development of inverse agonists of RAR/RXR signaling as antitumor agents, to assess their efficacy and toxicity in the treatment of selected subtypes of epithelial cancer, especially those characterized by ductal and/or luminal phenotypes.

Finally, our study demonstrates that, by "hacking" the signaling pathways that control multilineage differentiation in epithelial tissues, it is possible to discover novel pharmacological manipulations with selective toxicity on specific cellular lineages. Because multilineage differentiation programs are retained in many forms of cancer (22-24), this study could provide a methodological template to guide the discovery of novel antitumor drugs against a large and diverse repertoire of human malignancies.

Data availability

All software used in this study is either publicly or commercially available, including Randomly (<https://github.com/RabadanLab/randomly>). The RNA-seq data generated as part of this study are available in the database of Genotypes and Phenotypes (dbGAP; <https://www.ncbi.nlm.nih.gov/gap>), using the following accession number: phs002764.

Author contributions

Sara Viragova, PhD (Conceptualization; Data curation; Formal analysis; Investigation; Methodology; Validation; Visualization; Writing—original draft; Writing—review & editing), Luis Aparicio, PhD (Conceptualization; Data curation; Formal analysis; Investigation; Methodology; Software; Visualization; Writing—review & editing), Pierangela Palmerini, PhD (Conceptualization; Data curation; Formal analysis; Investigation; Methodology; Visualization; Writing—review & editing), Junfei Zhao, PhD (Data curation; Formal analysis; Software; Visualization), Luis E. Valencia Salazar, BA (Investigation; Validation), Alexandra

Schurer, MS (Investigation; Validation) Anika Dhuri (Investigation; Validation), Debashis Sahoo, PhD (Data curation; Formal analysis; Software), Christopher A Moskaluk, MD, PhD (Methodology; Resources), Raul Rabadan, PhD (Funding acquisition; Resources; Supervision) and, Piero Dalerba, MD (Conceptualization; Funding acquisition; Investigation; Methodology; Project administration; Resources; Supervision; Validation; Visualization; Writing—original draft; Writing—review & editing).

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Conflicts of interest

Sara Viragova and Piero Dalerba are acknowledged as co-inventors on a patent application (US-20220031644-A1), describing the use of inverse agonists of retinoic acid receptors as antitumor agents for the treatment of ACCs. Piero Dalerba received royalties from Oncomed Pharmaceuticals, QuanticeL Pharmaceuticals and Forty Seven Inc, as a results of his acknowledgment as a co-inventor on patents granted to the University of Michigan (US-07723112) and Stanford University (US-09329170, US-09850483, US-10344094, US-11130813) and related to 1) the discovery of surface markers for the differential purification of cancer stem cell populations from human malignancies; 2) the use of single-cell genomics technologies for the identification of pharmacological targets expressed in cancer stem cell populations; 3) the combination of anti-CD47 and anti-EGFR monoclonal antibodies for the treatment of human colon cancer. Piero Dalerba recently owned stock of Eli Lilly and Company. Raul Rabadan is a founder of Genotwin, a consultant for Arquimea Research and a member of the scientific advisory board of AimedBio, in activities unrelated to the current study. Piero Dalerba’s spouse is employed by Regeneron and owns (or recently owned) stock of the following pharmaceutical companies: AbbVie, Amgen, AstraZeneca, Eli Lilly and Company, GlaxoSmithKline, Johnson & Johnson, Merck & Co, Novartis, Organon, Pfizer, Teva Pharmaceutical Industries Ltd and Viatrix. All other authors have no competing interests to disclose.

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Part of the data reported in this manuscript has been previously presented during research conferences and invited seminars at academic institutions, such as: 1) the Keystone Symposium on Organoids as Tools for Fundamental Discovery and Translation (April 3-6, 2022); 2) the Rare Cancers: Unmet Medical Needs conference (April 26, 2022) organized by the Jed Ian Taxel Foundation; 3) the Gordon Research Conference on Epithelial Stem Cells and Niches (June 5-10, 2022); and 4) a research seminar held at the Department of Pathology of the University of Virginia (April 19, 2022). Part of the data reported in this manuscript has been included in a preprint that was uploaded onto the bioRxiv repository (January 21, 2022): <https://www.biorxiv.org/content/10.1101/2022.01.19.476843v1>.

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