

Original Article

Using PDX animal models to identify and stratify adenoid cystic carcinoma patients presenting an enhanced response to HDAC inhibitors

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Abstract: Adenoid cystic carcinoma (ACC) patients face a highly infiltrative and metastatic disease characterized by poor survival rates and suboptimal response to available therapies. We have previously shown that sensitization of ACC tumors to chemotherapy using histone deacetylase inhibitors (HDACi) constitutes a promising therapeutic strategy to manage tumor growth. Here, we used patient-derived xenografts (PDX) from ACC tumors to evaluate the effects of in vivo administration of the HDAC inhibitor Entinostat combined with Cisplatin over tumor growth. RNA from PDX tumor samples receiving the proposed therapy were analyzed using NanoString technology to identify molecular signatures capable of predicting ACC response to the therapy. We also used an RNAseq dataset from 68 ACC patients to validate the molecular signature identified by the NanoString platform. We found that the administration of Entinostat combined with Cisplatin resulted in a potent tumor growth inhibition (TGI) ranging from 38% to 106% of the original tumor mass. Enhanced response to therapy is consistent with the reactivation of tumor suppressor genes, including SFRP1, and the downregulation of oncogenes like FGF8 and CCR7. Nanostring data from PDX tumors identified a genetic signature capable of predicting tumor response to therapy. We further stratified 68 ACC patients containing RNAseq data accordingly to the activity levels of the identified genetic signature. We found that 23% of all patients exhibit a genetic signature consistent with a high ACC tumor response rate to Entinostat and Cisplatin. Our study provides compelling preclinical data supporting the deployment of a powerful systemic anticancer therapy crafted and explicitly tested for ACC tumors.

Keywords: Precision medicine, tumor genome landscape, histone, senescence, acetylation

Introduction

Adenoid cystic carcinoma (ACC) from the salivary glands is a rare malignancy characterized by a slow-growing, highly invasive, and metastatic potential. The high infiltrative and metastatic potential of the ACC from the salivary gland results in a long-term poor survival rate [1, 2]. The rarity of the ACC imposes a barrier to research efforts, halting our understanding of the biology of this disease. As a result, there is no consensus on the standard therapies used to manage ACC. Patients diagnosed with ACC

may undergo extensive surgical resection, radiotherapy, chemotherapy, or a combination of these therapies. Radiotherapy has little effect on ACC, resulting in poor overall survival rates compared with surgery alone. Several drugs, including Cisplatin, have been used as a single chemotherapeutic agent, but the overall response rate is still low [3].

Emerging studies have shed light on the genetic landscape of ACC, showing a modest number of genetic alterations in primary tumors, while metastatic lesions present a complex genetic

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landscape [1, 4-9]. ACC tumors often present gene fusion of *MYB-NFIB* and *MYBL1-NFIB* and mutations in the *NOTCH1* gene. Interestingly, the genetic landscape of ACC also shows important mutations of genes involved in the epigenetic control of cellular functions [10]. Among several epigenetic mechanisms, histone acetyltransferase (HAT) and histone deacetylase (HDAC) play a critical role in chromatin remodeling. Dysregulation of HDAC is found in many malignancies, including neuroblastomas, medulloblastomas, lung adenocarcinomas, and breast and prostate cancers, among others [11]. We have previously shown that the HDAC inhibitor Vorinostat combined with Cisplatin halted the viability of ACC primary tumor cells *in vitro* [12].

Here, we decided to investigate the use of low doses of Entinostat, a selective HDAC inhibitor targeting class I HDAC, as an ACC sensitizer agent to Cisplatin in the PDX animal model. We found that the combination of Entinostat and Cisplatin resulted in a potent tumor growth inhibitory effect (TGI) of ACC tumors ranging from 38% to 106% compared with controls. Furthermore, we identified the molecular changes involved in the tumor response to the combination therapy using a Pan-Cancer Pathways Panel from the NanoString platform. We found that ACC tumors presenting a greater response to Entinostat and Cisplatin therapy exhibited a unique activity level of the Cell Cycle/Apoptosis and the PI3K signaling pathways. We further decided to validate our findings by stratifying a cohort of 68 ACC tumor patients containing RNAseq data using our newly established genetic signature.

Altogether, our data indicated that the combination of Entinostat and Cisplatin constitutes a promising therapeutic strategy for managing patients with ACC. We also identified the cell cycle/apoptosis and PI3K pathways as a genetic signature capable of stratifying ACC patients, presenting an enhanced response to the proposed therapy.

Material and methods

Patient-derived xenograft (PDX) and drug dilution

Patient-derived xenograft (PDX) models were housed at the South Texas Accelerated Re-

search Therapeutics (START, San Antonio, TX) and performed under protocols approved by the START IACUC. Briefly, human tumor fragments from 3 patients (ACCX9; ACCX5M1; ACCX6) were transplanted subcutaneously into the dorsal region of male severe combined immunodeficient (SCID) mice as previously reported [13]. ACCX9 advent from a grade 3 primary tumor of the parotid gland; ACCX5M1 and ACCX6 are metastatic grade 2 tumors isolated from the lungs and primarily originated from the oral cavity and the parotid gland, respectively. ACCX9 and ACCX5M1 present *NFIB* translocation to the *MYB* locus, while ACCX6 does not present *NFIB* translocation. Mice receiving the human tumor fragments from ACCX5M1, ACCX6, and ACCX9 were randomized into 4 groups per tumor. They received either vehicle, Entinostat (5 mg/kg), Cisplatin (3 mg/kg), or the combination of Entinostat (5 mg/kg) and Cisplatin (3 mg/kg) for 3 weeks (**Figure 1A**). For the combined administration of Entinostat and Cisplatin, tumors were sensitized with Entinostat 6 days prior to the administration of Cisplatin. PDX mice received daily oral administration of vehicle or Entinostat and a weekly administration of intraperitoneal Cisplatin for 2 weeks. Entinostat was diluted in 0.5% methylcellulose solution in saline under sonication. Cisplatin was diluted in 0.5% HCL solution. Tumor growth was monitored and measured every 3 days. Tumor growth inhibition (TGI) was calculated by comparing the tumor volume of each therapeutic arm with the vehicle group.

RNA extraction, NanoString nCounter assay, and data analysis

Tumor samples from all ACC PDX mice and conditions were embedded in OCT and stored at -80°C. Frozen samples from the PDX tumors and therapeutic conditions were sectioned in 7 µm thickness and processed for RNA extraction using the Quick-RNA MicroPrep Kit (Zymo Research, USA). The total amount of RNA was quantified using a Qubit fluorometer (Nanodrop, USA) and Nanodrop (Thermo Scientific, USA). RNA from all samples was diluted to a final concentration of 100 ng/5 µL. RNA samples were multiplexed using a nCounter Pan-Cancer Pathway Panel (NanoString, USA) containing 770 genes distributed in 13 cancer-related signaling pathways (i.e., MAPK, STAT,

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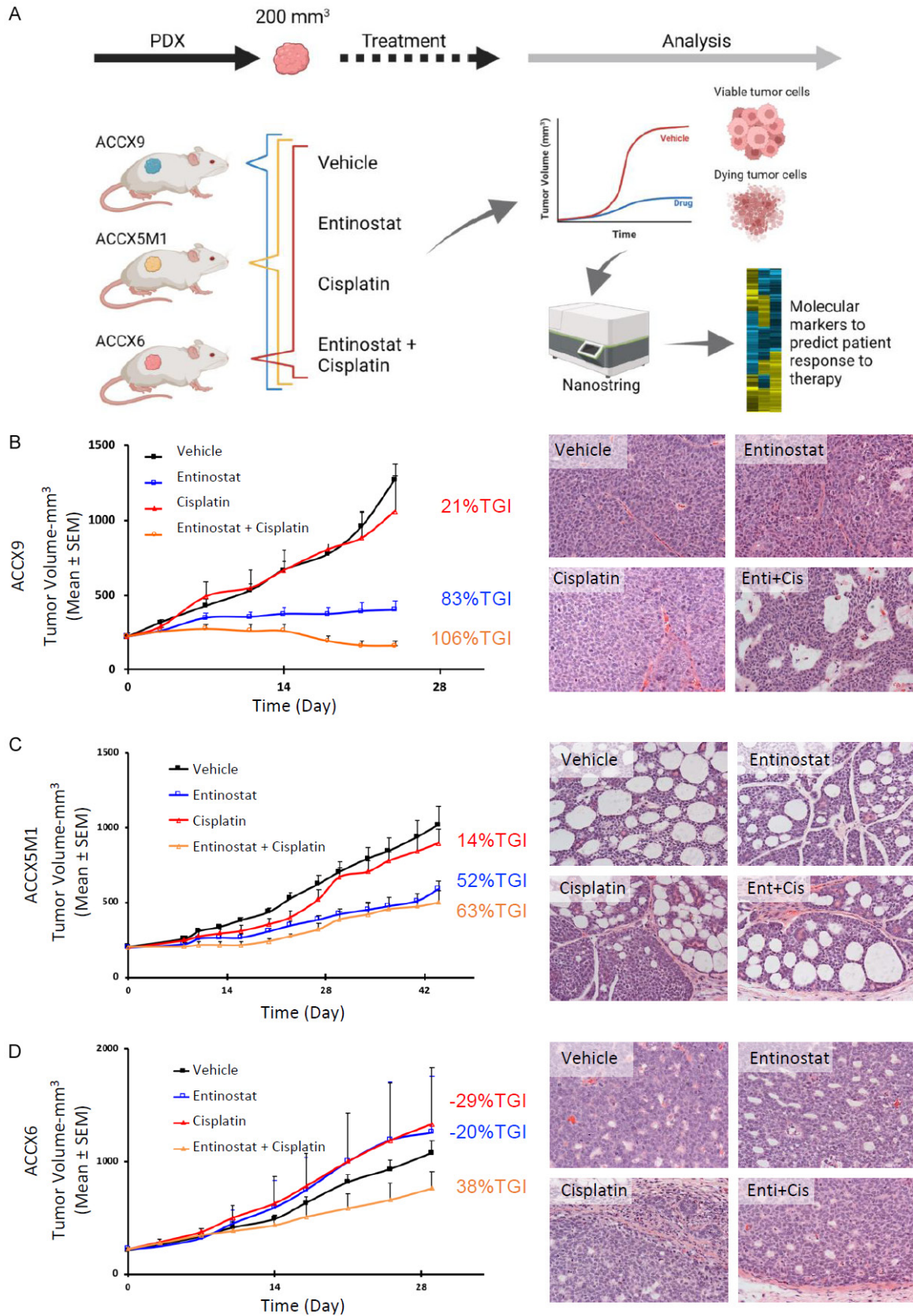


Figure 1. Therapeutic efficacy of Entinostat/Cisplatin in ACC PDX models. (A) Graphical representation of study design. Briefly, patient-derived ACC tumors (ACCX6, ACCX5M1, ACCX9) were transplanted subcutaneously into the

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dorsal region of severe combined immunodeficient mice (SCID mice). After reaching 200 mm³, each ACC patient-derived xenograft (PDX) was treated with vehicle (control) and the 3 therapeutic arms (i.e., Cisplatin alone, Entinostat alone, or Entinostat/Cisplatin combination therapy). Tumor growth was monitored and measured every 3 days. Tumor growth inhibition (TGI) was calculated by comparing the tumor volume of each therapeutic arm with the vehicle group. Tumor samples were processed for histology and assessment of gene and protein expressions. (B-D) Graphs depict the volume of PDX tumors generated with human ACCX6 (B), ACCX5M1 (C), and ACCX9 (D) treated with each of the 3 therapeutic arms and vehicle (control). TGI is shown next to the therapeutic arm line. Note that the combination therapy displayed the most effective TGI. Data represent mean values (\pm SEM) of 8 PDX and experimental conditions. Morphological changes of ACC tumors upon each therapeutic arm are depicted H&E. Note changes in the tumor morphology upon administration of Entinostat/Cisplatin for ACCX9.

PI3K, RAS, TGF- β , cell cycle, apoptosis, Hedgehog, Wnt, DNA damage control, transcriptional regulation, and chromatin modification). Data output (raw data) was analyzed using nSOLVER Analysis Software containing the Advanced Analysis 2.0 plugin (NanoString, USA). Quality control of raw data was performed by combining Imaging QC, reporter probe density (Binding Density QC), measurement of internal positive control, and limit of detection. Normalization was carried out automatically by using the geometrical mean of positive controls and the normalization genes from the CodeSet content. Fold change, or ratio, was calculated using vehicle-treated tumors and compared with all treatment groups. Volcano plot, direct global significance pathway analysis, and pathway scores were calculated using the Advanced Analysis 2.0 plugin (NanoString, USA) in a Windows operating system and R environment (The R Foundation). Direct global significance pathway analysis and pathway scores were calculated using the Advanced Analysis 2.0 plugin (NanoString, USA) in a Windows operating system and R environment (The R Foundation). Normalized data from nSOLVER (Log₂) was imported into Cluster 3.0 and centered for genes (Center Genes). Hierarchical clustering (uncentered) was performed for Genes and Arrays followed by average linkage. Data output from Cluster 3.0 was uploaded into Java TreeView software to visualize and extract gene lists following clustering patterns.

Immunohistochemistry and immunofluorescence staining

Histological sections cut at 4 μ m thickness from each PDX sample and treatment condition were processed for immunohistochemistry. Briefly, histological sections were deparaffinized in xylene substitute solution and hydrated in descending grades of ethanol, followed by incubation with 3% (w/v) bovine serum albumin

(BSA) and 0.5% (v/v) Triton X-100 in PBS. Primary antibody anti-p16 (1:50, BD Biosciences #550834, San Jose, CA, USA) was incubated overnight, followed by the secondary anti-mouse antibody (Vector Laboratories, Burlingame, CA, USA) at room temperature (RT) 60 min. DAB detection system (3,3'-Diaminobenzidine) was used, followed by hematoxylin Counterstain. Immunofluorescence staining was carried out after histological sections were deparaffinized, hydrated, and incubated in 3% BSA and 0.5% Triton X100 in PBS. Tissue samples were incubated overnight using the primary antibodies anti-Ki67 (AFFN-Ki67-3EG, DSHB, Iowa, USA), γ -H2AX (EMD Millipore, Burlington, USA), Acetyl-Histone H4 (Lys5), Acetyl-Histone H4 (Lys8) (Thermo Scientific, Waltham, MA), Acetyl-Histone H4 (Lys12), Acetyl-Histone H3 (Lys9) Acetyl-Histone H4 (Lys16), and Caspase 3 (Cell Signaling Technology, Danvers, MA, USA). Next, slides were incubated for 60 min at RT with Alexa 488 or Alexa 568 anti-rabbit and counterstained with Hoechst 33342 (Invitrogen, Carlsbad, CA, USA). Images were taken using a QImaging ExiAqua monochrome digital camera attached to a Nikon Eclipse 80i microscope (Nikon, Melville, NY) and visualized on the Nikon NIS Elements software and captured at 200 \times final magnification.

Cohort of 68 ACC patients, Nanostring-RNAseq analysis

RNAseq data set was graciously provided by Dr. Scott A. Ness from the University of New Mexico. Briefly, the dataset was constituted of 68 samples from 30 female and 38 male patients with a mean age of 50.1 years at surgery [14]. The University of Michigan Bioinformatics Core performed two distinct analyses using the RNAseq data. The analysis compared the genes expression of the RNAseq dataset from 68 patients with the Nanostring gene set that composes the two most discrimi-

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native pathways for the PDX Nanostring data ('Cell Cycle + Apoptosis' and 'PI3K') and determined patient sample stratifications based on the pathway summaries. Briefly, all analysis and graphics were generated in R (v 3.6.1). Count table containing a total of 68 samples was annotated with meta-data downloaded from the NCBI's SRA Run Selector for NCBI BioProject ID: PRJNA287156. The count table was then filtered to retain only genes with at least 250 counts across all samples and normalized using the DESeq2 package (v 1.26.0) and by specifically applying the "vst" function for FFPE data analysis [15, 16]. The normalized and raw count tables were further processed to subset to genes annotated by Nanostring to be part of one or more of three specific pathways of interest: Cell Cycle-Apoptosis, and PI3K. Pathway gene member expression in each sample, statistics for the vst normalized gene counts were generated for each sample with the pastecs package using the 'stat.desc' function (v 1.3.21). The vst normalized count table described above was further processed to subset to genes annotated by Nanostring to be part of one or more of three specific pathways of interest: 'Cell Cycle-Apoptosis' and 'PI3K'. Individual samples were labeled either based on top/bottom expression in the pathway or after stratification above/below the mean expressions of each pathway, where ACCX9-like samples were classified as samples that had both average expression for the Cell Cycle pathway above the mean and average expression for the PI3K pathway below the mean with samples classified as ACCX5M1-like had the opposite expression pattern.

Veen graphics, oncogene database, TSGene database, RNA seq data, and statistical analysis

Veen graphics were created using the online tool Venny 2.0 (Oliveros, J.C., 2007-2015, Venny. An interactive tool for comparing lists with Venn's diagrams. Publicly available at <http://bioinfogp.cnb.csic.es/tools/venny/index.html>). The list of 803 known oncogenes and 1217 human tumor suppressor genes were from the Oncogenm (<http://ongene.bioinfo-minzhao.org/index.html>) [17] and TSGene databases <https://bioinfo.uth.edu/TSGene/download.cgi?csrt=7154395379350750750> [18], respectively.

Statistical analysis was performed using GraphPad Prism (GraphPad Software, San Diego, CA, version 8). Immunofluorescence quantification of the total number of positive cells was performed using one-way ANOVA followed by Tukey's multiple comparison tests. Asterisks denote statistical significance (* $P \leq 0.05$; ** $P \leq 0.01$; *** $P \leq 0.001$; **** $P \leq 0.0001$) and ns ($P \geq 0.05$). Heatmap of Directed Global Significance Score (**Figure 3D**) displaying each sample's global significance scores and directed global significance scores. The global significance score was calculated as the square root of the mean squared t-statistic for the genes in a gene set, with t-statistics coming from the linear regression underlying our differential expression analysis.

Results

Sensitization therapy using the HDAC inhibitor Entinostat prior to Cisplatin results in tumor growth inhibition in PDX tumor models

Patient-derived xenograft (PDX) models constitute the best preclinical models for emerging therapies as they best recapitulate the human tumor response to therapy [19]. PDX models contain both human tumor cells and their microenvironment. ACC PDX models (ACCX6, ACCX9, and ACCX5M1) received the single agents' Entinostat, Cisplatin, or vehicle, as well as the Entinostat and Cisplatin combination therapy (**Figure 1A**). We also started administration of Entinostat 6 days prior to the administration of Cisplatin to elicit sensitization of tumors. The ACC PDX models had an improved response to the combined therapy with enhanced TGI than any single-agent therapies (Entinostat or Cisplatin alone) (**Figure 1B-D**). ACCX9 tumor response to combined therapy was excellent, with an overall TGI of 106% over the original implanted tumor size (150-300 mm³). Histologically, ACCX9 presented a solid growth pattern that is found altered upon the administration of the combined therapy of Entinostat and Cisplatin (**Figure 1B_H&E**). ACCX5M1 and ACCX6 tumors responded to the combination therapy with an overall TGI of 63% (**Figure 1C_H&E**) and 38% (**Figure 1D_H&E**), respectively. Upon therapy, there was no change in the histological pattern of either ACCX5M1 or ACCX6. Administration of Entinostat as a single agent was the second most

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successful therapy for ACCX9 and ACCX5M1, with an 83% and a 52% TGI, respectively. However, Entinostat alone failed to induce any TGI in ACCX6 tumors. Administration of Cisplatin alone was the least effective therapy for ACC. While ACCX9 tumors showed a 21% TGI with Cisplatin, ACCX5M1 presented a 14% TGI, and ACCX6 tumors completely failed to respond to Cisplatin (**Figure 1B-D**).

From a biological perspective, the sensitization of ACC tumors with Entinostat followed by the administration of Cisplatin resulted in an overall reduction of ACCX9 and ACCX5M1 proliferative potential (**Figures 2A, S1A**, $*P < 0.05$, $****P < 0.0001$). ACCX6 tumor did not present a reduction in its proliferative potential compared to the control ($ns P > 0.05$). Tumor apoptosis was assessed using the caspase 3 marker (**Figures 2B, S1B**). Interestingly, ACCX9 tumors had an overall higher count of apoptotic cells in all therapeutic arms than ACCX5M1 and ACCX6 ($****P < 0.0001$). Interestingly, the administration of Entinostat as a single agent was the best therapeutic modality to induce apoptosis in all ACC tumors ($**P < 0.01$, $****P < 0.0001$).

DNA double-strand breaks (DSB) are responsible for triggering the DNA repair machinery while preventing the accumulation of misrepaired DSB. However, actively repairing DNA in cancer cells can allow cancer to survive chemotherapy [20, 21]. Here, we assessed the effect of the therapies on DSB repair machinery using γ -H2AX. The accumulation of γ -H2AX is a strong indication of active DNA DSB. We observed that either the HDAC inhibitor Entinostat administered alone or in combination with Cisplatin could reduce the DSB load on ACCX9 ($**P < 0.01$) and ACCX5M1 ($*P < 0.05$; $**P < 0.01$) (**Figures 2C, S1C**) tumors. ACCX6 tumors showed a similar trend with the combined administration of Entinostat in combination with Cisplatin, although not statistically significant (**Figures 2C, S1C**, $ns P > 0.05$).

Identification of molecular markers associated with tumor response to Entinostat and Cisplatin combination therapy

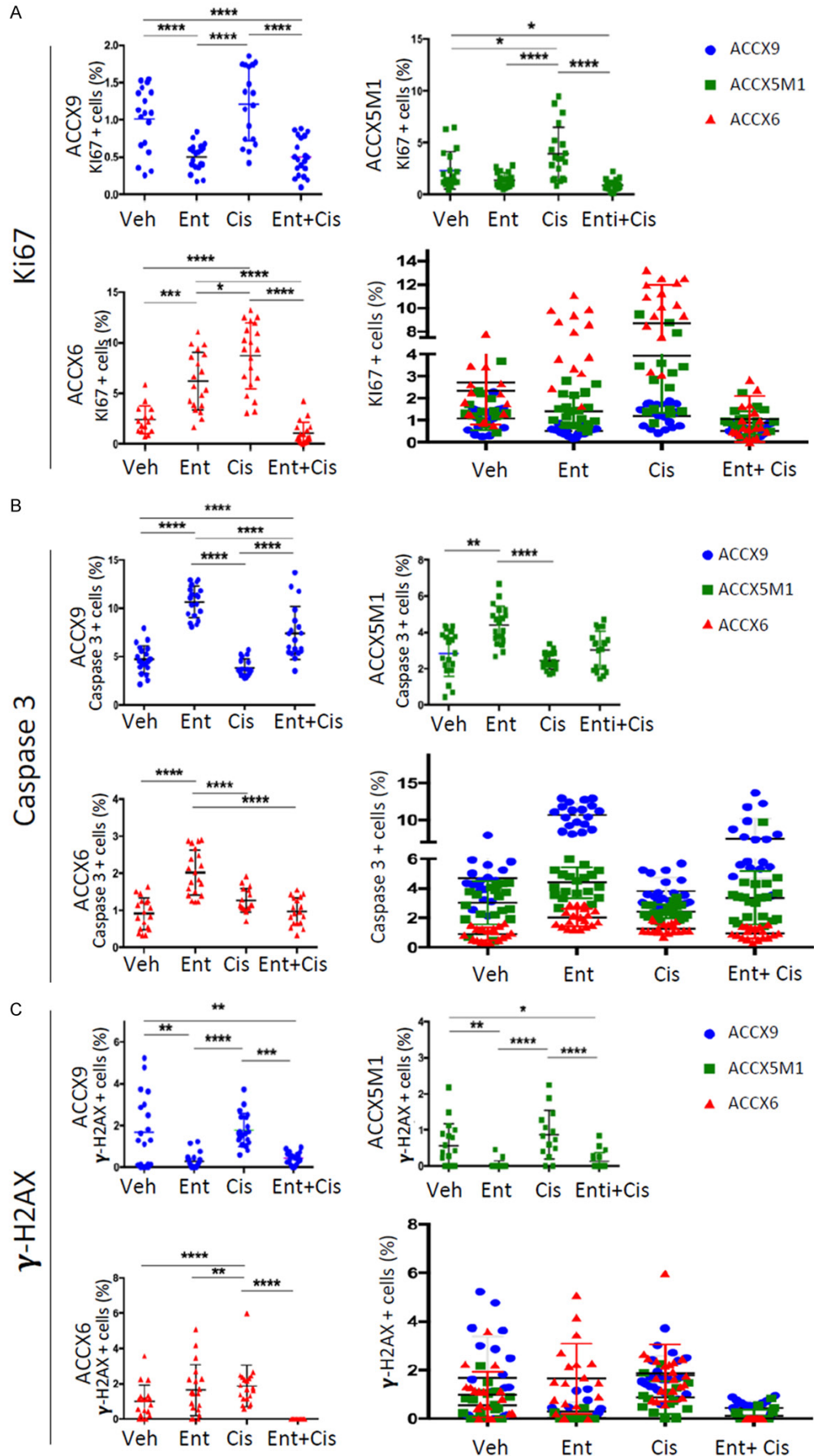
In order to identify clinically relevant genes with biomarker potential for clinical stratification of patients, we performed gene clustering analysis and identified 2 clusters of interest: Cluster

1 is characterized by the downregulation of genes in all 3 PDX models, while cluster 2 presents genes upregulated (**Figure 3A**). From the 130 genes found downregulated and 127 genes found upregulated in all PDX models (ACCX9, ACCX6, and ACCX5M1) upon administration of Entinostat and Cisplatin, we focused on the identification of known oncogenes and tumor suppressor genes as potential biomarkers. Specifically, we are interested in oncogenes that have their expression directly impacted by our combined therapy and tumor suppressor genes that became activated upon therapy. Our initial analysis focused on cluster 1, comparing 130 downregulated genes with a database of 803 known human oncogenes (ONGene Database) [17]. We identified 26 oncogenes presenting 2-fold downregulation upon administration of Entinostat in combination with Cisplatin (**Figure S2**). Among all oncogenes presenting 2-fold downregulation in each PDX model, we found that FGF8 was the only oncogene commonly downregulated in all 3 PDX models (**Figures 3B, S2**). FGF8 is a known oncogene that can transform NIH3T3 cells leading to tumor growth in vivo, and it cooperates with WNT1 signaling during mammary tumorigenesis [22, 23].

Looking into cluster 2, Entinostat combined with Cisplatin triggered the upregulation of several tumor suppressor genes in each PDX model ($n = 127$) (**Figure 3A**). Genes identified in cluster 2 were matched against a Tumor Suppressor Gene (TSG) database (TSGene Database) [18]. We identified 31 TSG presenting upregulated upon administration of Entinostat and Cisplatin (**Figure S3**). Nine of the TSG were upregulated over 2-folds on ACC tumors, including CDH1/E-Cadherin, CDKN1C, CEBPA, MAPK9/JNK2, NFKB1, NUPR1, PRKAA2/AMPK, and SFRP1. SFRP1 was found upregulated in all PDX models (**Figures 3C, S3**). Secreted frizzled-related protein 1 (SFRP1) regulates the WNT pathway by competing with Frizzled receptors for WNT binding [24, 25]. SFRP1 is deregulated in several tumors, including invasive breast carcinomas, hepatocellular carcinoma, clear cell renal cell carcinoma, and non-small-cell lung cancer [26-29].

Although all ACC tumors responded well to the combination therapy, it is evident that the ACCX9 tumor responded significantly better,

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Figure 2. The effect of the therapeutic arms on tumor proliferation, apoptosis, and DNA repair. (A) Cellular proliferation was assessed using Ki67 staining, (B) while the levels of cellular apoptosis from all PDX models were assessed using Caspase 3, and (C) content of DNA damage was assessed using γ -H2AX markers. Quantification of each marker is depicted as positive cells per field for each tumor, or as a combination of all tumors (* $P < 0.05$; ** $P < 0.01$; *** $P < 0.001$; **** $P < 0.0001$).

presenting a TGI of 106% (**Figure 1B**) and a distinct genetic signature. With that, we focused on identifying genes differentially regulated in ACCX9 compared to ACCX5M1 and ACCX6 tumors (**Figure 3D**). Cluster 3 are genes found upregulated in ACCX9 and downregulated in ACCX5M1 and ACCX6 (**Figures 3E_TSG; S4A** cluster 3). The activation (2-fold expression) of the tumor suppressor genes PPARG, WT1, MAP3K8, and WNT5A were present within cluster 3 (**Figure 3E**). In cluster 4, we identified genes downregulated in ACCX9 and upregulated in ACCX5M1 and ACCX6 (**Figures 3F; S4B** cluster 4). These identified genes were oncogenes presenting over 2-fold downregulation, like PDGFRA, TGFB1, PDGFB, and FZD2.

Identifying the efficacy of Entinostat and Cisplatin on inducing histone acetylation on adenoid cystic carcinomas

The effect of Entinostat on ACC tumors and gene transcription can be accessed by its ability to acetylate histones. Histones H3 and H4 are part of the core histones presenting multiple acetylation sites, and the post-translation modification of histone acetylation is well-known to induce transcription activation [30, 31]. It is important to note that the baseline acetylation levels of all PDX tumors vary greatly (**Figures 4A-E, S5** and **S6_Vehicle**). Here we asked if the differences in the tumor responses to Entinostat/Cisplatin correlate with the degree of histone acetylation found in ACC samples after treatment. Overall ACCX9 tumors (TGI: 106%) showed greater acetylation levels of histones than ACCX6 (TGI: 38%), while ACCX5M1 (TGI: 63%) stayed in the middle of the pack. Considering the baseline expression levels of each PDX model, ACCX9 tumors were acetylated upon administration of Entinostat/Cisplatin for histones H3K9, H4K5, and H4K8. ACCX5M1, on the other hand, presented enhanced histone acetylation for H3K9, H4K12, and H4K16. Interestingly, however, ACCX6 PDX presenting the lowest TGI failed to respond to any therapy resulting in low histone acetylation levels compared with vehicle levels (**Figures 4A-E, S5** and **S6**).

In a side-by-side comparison, it became clear that histones from ACCX6 tumors are completely unresponsive to the histone deacetylase inhibitors Entinostat (**Figures 4F-J, S7**).

Senescent tumor cells accumulate in PDX models presenting reduced TGI response

We have previously shown that in vitro administration of HDAC to ACC primary cells results in the activation of cellular senescence [12]. Here we sought to understand if the accumulation of senescent cells observed in ACC tumors is associated with tumor resistance to therapy. Using the cellular senescence marker p16^{ink4}, we observed that administration of Entinostat/Cisplatin resulted in the accumulation of senescent cells exclusively in ACCX6 tumors (**Figure 5A, 5B**, **** $P < 0.0001$). ACCX9 and ACCX5M1 responded to therapy by reducing the number of cells undergoing senescence (**Figure 5A, 5B**, *** $P < 0.001$, **** $P < 0.0001$).

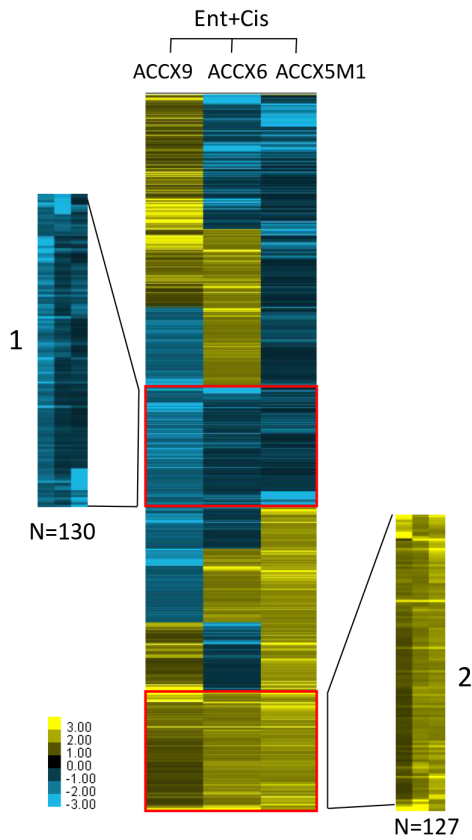
Identification of signaling pathways capable of predicting enhanced tumor response to the proposed therapy

After we learned that the three therapeutic arms (i.e., Cisplatin, Entinostat, and the combination of both drugs) differentially impact tumor growth (**Figure 1B-D**) and that the ACCX9 PDX model responds remarkably well to the combined therapy, we sought to identify biomarkers capable of stratifying patients with favorable clinical outcome.

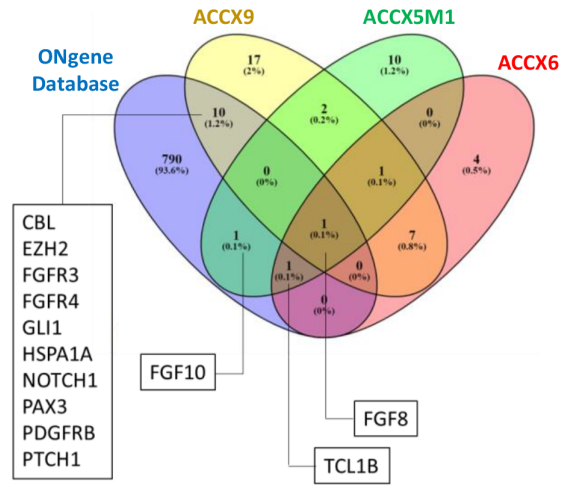
Using a pathway score function from nSOLVER Analysis Software, we observed 2 distinct patterns associated with the activity levels of all major signaling pathways (**Figure 6A**). One pattern was associated with ACCX9 PDX tumors presenting a better response to therapy (TGI: 106%), containing an enhanced global expression of genes associated with cell cycle/apoptosis and DNA damage repair pathways. The second pattern was associated with tumors presenting a reduced response to therapy (TGI: 63% and 38%) and enhanced activity levels associated with other 10 cancer-related pathways (i.e., Hedgehog, JAK-STAT, MAPK, Notch,

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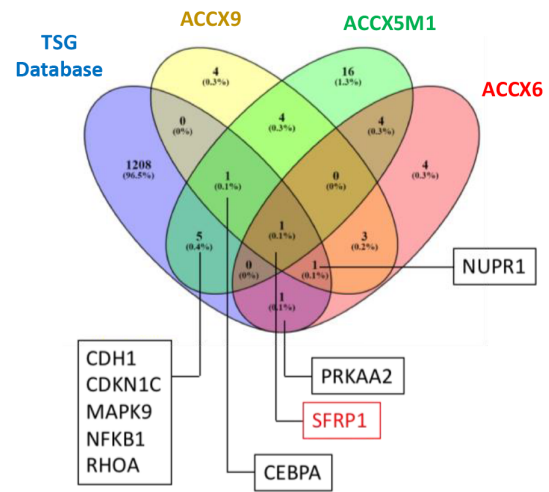
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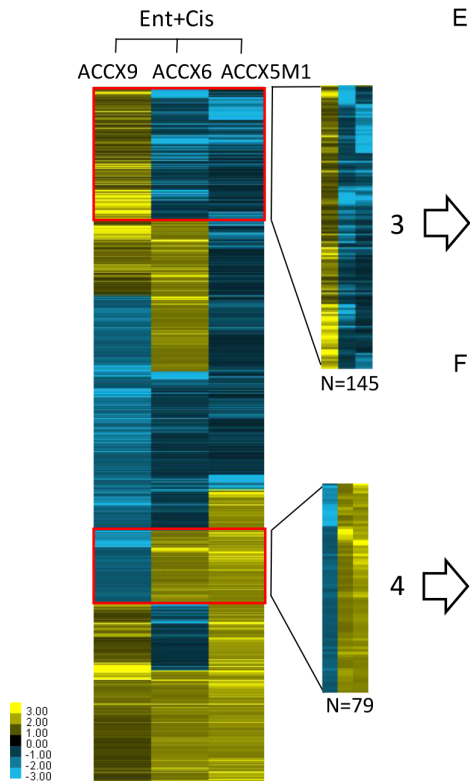
B



C



D



E

ACCX9 upregulated TSG (over 2-fold)

| Probe Name | ACCX9 | ACCX6 | ACCX5M1 |
|------------|----------|----------|----------|
| PPARG | 2.861234 | -1.36134 | -0.91997 |
| WT1 | 2.861234 | -1.03134 | -1.09997 |
| MAP3K8 | 2.651234 | -1.92134 | -1.01997 |
| WNT5A | 2.551234 | -0.94134 | -0.86997 |

F

ACCX9 downregulated oncogenes (under 2-fold)

| Probe Name | ACCX9 | ACCX6 | ACCX5M1 |
|------------|----------|----------|----------|
| PDGFRA | -3.85877 | 1.758662 | 2.020026 |
| TGFB1 | -2.82877 | 1.338662 | 1.630026 |
| PDGFB | -2.35877 | 1.838662 | 1.760026 |
| FZD2 | -2.07877 | 1.408662 | 1.720026 |

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Figure 3. Tree view analysis of ACC tumors receiving combination therapy. A. Gene clustering of ACCX9, ACCX5M1, and ACCX6 receiving Entinostat combined with Cisplatin according to gene expression (baseline) from the vehicle group. The blue color denotes genes downregulated in all ACC tumors (cluster 1), and the yellow color denotes genes upregulated in all ACC tumors following. B. Genes found downregulated (2-fold) in cluster 1. Note that all depicted genes are classified as oncogenes. C. List of genes upregulated in all ACC tumors (cluster 2). Note that depicted genes denote tumor suppressor genes. D. Clusters 3 and 4 represent genes found upregulated (n = 145) and downregulated (n = 79), respectively, in the ACCX9 PDX model characterized by a tumor growth inhibition of 106% upon administration of Entinostat/Cisplatin. E. Table derived from cluster 3 depicts tumor suppressor genes (TSG) presenting 2-fold upregulation on ACCX9 compared with ACCX6 and ACCX5M1 tumors upon administration of Entinostat/Cisplatin. F. Table derived from cluster 4 depicts oncogenes presenting a 2-fold downregulation on ACCX9 compared with ACCX6 and ACCX5M1 tumors upon administration of Entinostat/Cisplatin.

PI3K, Ras, TGF-beta, Transcription Misregulation, Wnt, and Driver genes) (**Figure 6A**).

Interestingly the group of genes that comprises the chromatin modification pathway show enhanced global levels for ACCX9 and ACCX5M1, both models presenting TGI superior of 63% (**Figure 6A**_light blue line), and thereby excluding PDX tumors presenting lower TGI (ACCX6).

Furthermore, we have identified TNFRSF10C and PPP2R2C as two potential biomarkers (members of the cell cycle & apoptosis pathway) highly expressed in ACCX9 (TGI: 106%) and downregulated in ACCX5M1 (TGI: 63%) and ACCX6 (TGI: 38%) tumors (**Figure 6B**). Using a similar approach, we identified 15 relevant genes found downregulated in the ACCX9 tumor (2-fold decrease) and upregulated in ACCX5M1 and ACCX6 tumors. From all 15 genes, NGF, PDGFA, and FGF1 were found to be commonly expressed in the PI3K, RAS, and MAPK signaling pathways (**Figure 6C**).

Perhaps the most exciting findings from this study are not only the identification of unique biomarkers with potential clinical relevance but rather the understanding that activity levels of signaling pathways constitute a robust predictor of tumor response to therapy (**Figure 6A**). Indeed, the expression of each signaling pathway is not significantly influenced by different treatments. With that in mind, we decided to validate our findings using RNAseq data from 68 ACC patients. We decided to stratify all ACC patients using the collection of genes from the NanoString platform that constitutes the cell cycle/apoptosis and the PI3K pathways. We successfully stratified ACC patients presenting high activity levels of the cell cycle-apoptosis pathway and low activity of the PI3K signaling suggesting similar molecular signatures from ACCX9 PDX tumors (**Figure 6D**_blue dots). Similarly, we successfully stratified patients

expressing high activity levels of the PI3K pathway and low cell cycle-apoptosis levels, similar to the ACCX5M1 PDX tumors (**Figure 6D**_red dots). Overall, we found that 23% of the 68 ACC patients containing RNA seqdata fit the genetic profile of PDX tumors, presenting an enhanced response to therapy (ACCX9 profile: TGI of 106%) (**Figure 6E**). Also, 15% of all patients fit the PDX genetic profile of ACCX5M1 presenting a TGI of 63% (**Figure 6E**). The remaining 62% of all ACC patients do not fit either genetic profile.

Discussion

Recent efforts in understanding the genetic landscape of ACC of the salivary gland unveiled the high incidence of *MYB-NFIB* translocations and the somatic mutations in *MYB*-associated genes [5, 8, 9]. Although several mutations have been identified, ACC tumors are mainly characterized by the low presence of mutations, particularly when compared with other solid tumors [9]. These findings suggest that the carcinogenesis process of ACC is likely associated with fewer driver oncogenes like *MYB* instead of high genomic instability [32, 33]. Along with the activation of *MYB*, there is strong evidence of the deregulation of the epigenetic machinery. Indeed, close to 35% of ACC tumors present mutations in chromatin remodeling genes [9]. Here we explored the potential effects of the HDAC inhibitor Entinostat on an ACC preclinical model. Similar to what we observed in ACC primary tumor cells in culture [12], induction of histone modifications before the administration of Cisplatin resulted in superior tumor growth inhibition compared with the administration of Entinostat or Cisplatin as single agents.

Using NanoString technology, we quantified the native RNA content of each tumor model and characterized the impact of the treatment arms

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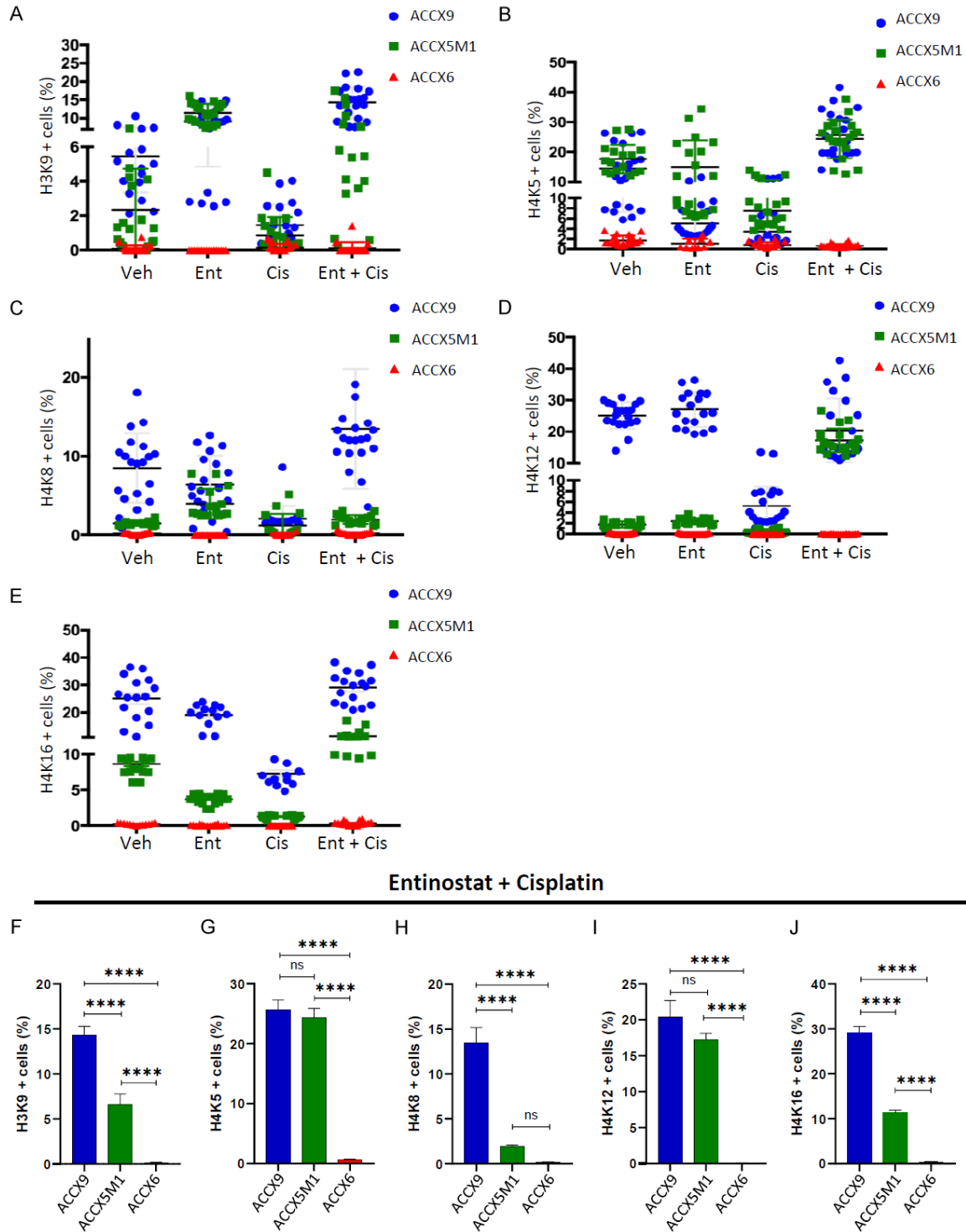


Figure 4. Pharmacological effect of combination therapy on global tumor histone acetylation. Quantification of immunofluorescence staining for histone H3 and H4 at multiple acetylation sites, including histone H3 Lysine 9 (A), histone H4 lysine 5 (B), histone H4 lysine 8 (C), histone H4 lysine 12 (D), histone H4 lysine 16 (E) in tumor samples receiving Entinostat, Cisplatin, and the combination therapy of Entinostat/Cisplatin. (F-J) Comparison between all 3 PDX tumor model responses to Entinostat/Cisplatin. Note the reduced effect of combination therapy over ACCX6 when compared with high acetylation levels observed in ACCX9 and, to some extent, ACCX5M1 (* $P < 0.05$; ** $P < 0.01$; *** $P < 0.001$; **** $P < 0.0001$).

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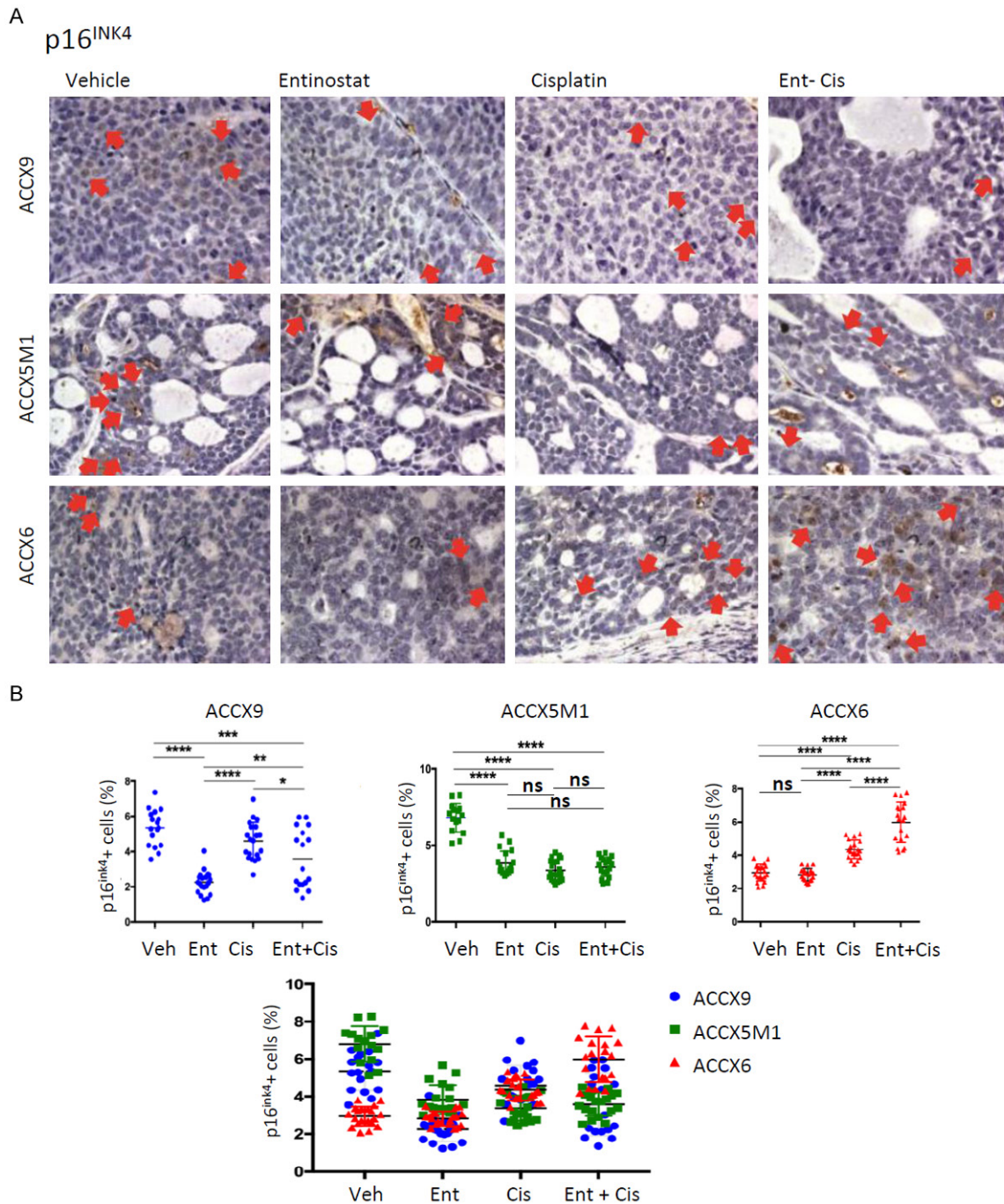


Figure 5. Activation of Cellular Senescence in ACC PDX tumors. A. Immunohistochemical staining of PDX tumors for cellular senescence using p16^{INK4}. Red arrows indicate positive cells for staining. B. Quantification of immunohistochemical staining of PDX tumors for the cellular senescence marker p16^{INK4}. Quantification depicts the percentage of positive cells per field of each PDX model or as a combination of all tumors upon administration of Cisplatin, Entinostat, Entinostat/Cisplatin, or vehicle as control (*P<0.05; **P<0.01; ***P<0.001; ****P<0.0001).

on the activation of key cancer-related molecular pathways. We observed that the combination therapy of Entinostat and Cisplatin was the most efficient treatment, and showed signifi-

cant downregulation of several oncogenic signaling pathways compared with Cisplatin, currently the most used chemotherapy agent for ACC. When looking into the entire set of PDX

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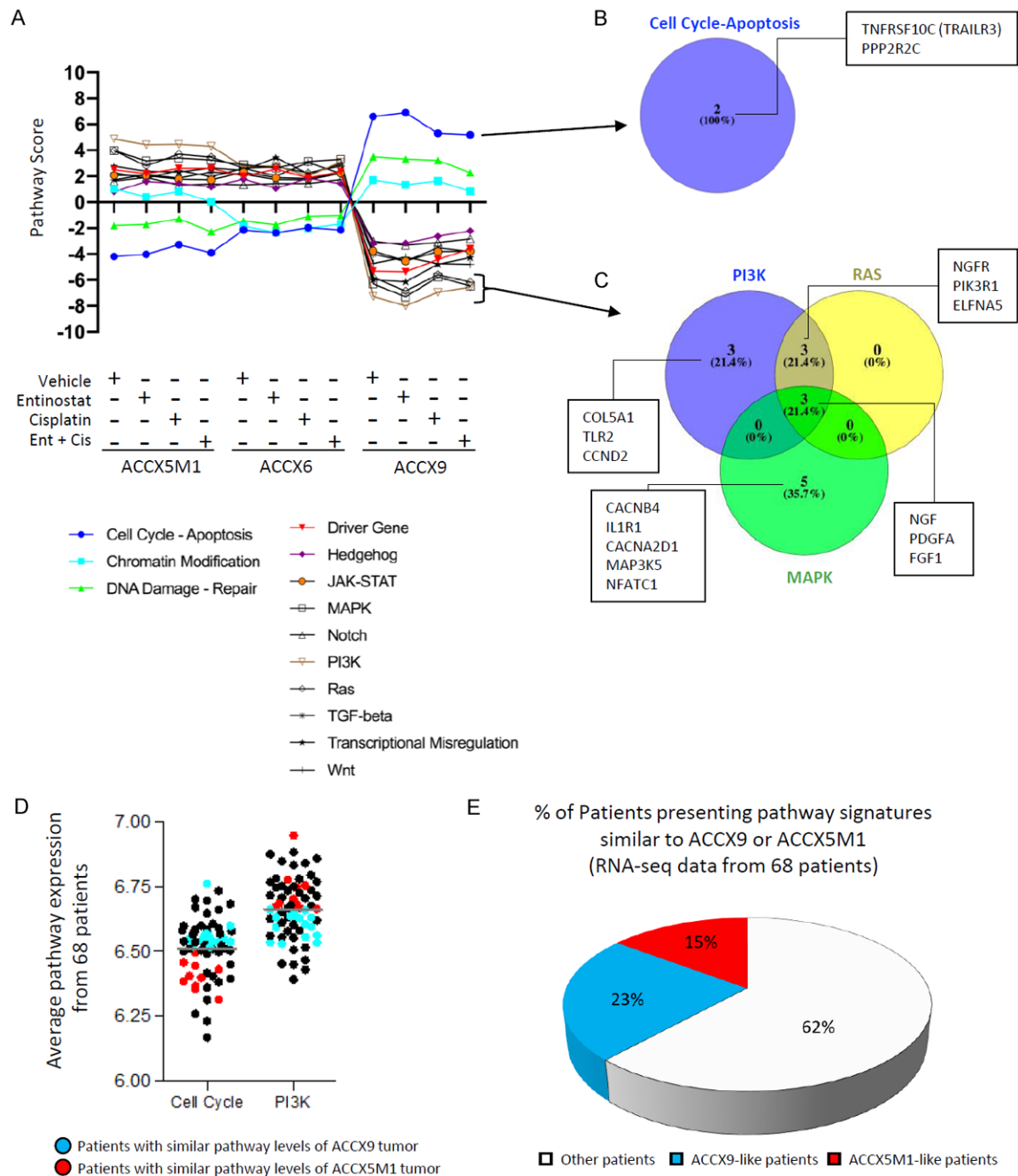


Figure 6. Identifying signaling pathways as genetic signatures for treatment success and validation of findings using a cohort of ACC patients RNAseq database. Nanostring PanCancer Pathway Panel was used to evaluate global genetic modifications advent from all treatment arms. A. Pathway scores from 13 pathways represented in the Nanostring PanCancer Pathway Panel were calculated using the Advanced Analysis 2.0 plugin (NanoString, USA) in a Windows operating system and R environment (The R Foundation) for each PDX tumor and treatment. Note that ACCX9 tumors present a different overall activation status of the 13 pathways represented in the Nanostring PanCancer Pathway Panel compared with ACCX5M1 and ACCX6 tumors. B. Diagram depicts two genes of interest from the Cell Cycle-Apoptosis signaling pathway from the Nanostring panel showing high expression rates on ACCX9 PDX model. C. Venn diagram depicts 3 genes commonly downregulated in the ACCX9 PDX model. D. Data from RNAseq set from 68 samples from 30 female and 38 male patients were extracted and compared with the Nanostring gene set that composes the two most discriminative pathways found in the PDX data ('Cell Cycle + Apoptosis' and 'PI3K'). Patient stratification was established using ACCX9 and ACCX5M1 expression benchmarks. E. Pie chart containing RNAseq data shows 23% of all 68 ACC patients with similar signaling pathway signature of ACCX9 and 15% with similar signature of ACCX5M1 PDX model.

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models, we found that the administration of Entinostat/Cisplatin resulted in the downregulation of genes associated with the DNA damage signaling pathway. In contrast, single-agent administration of Entinostat or Cisplatin failed to downregulate DNA damage-related genes. This is particularly exciting as the DNA damage pathway was highly mutated in a whole-genome sequence study of 60 ACC tumors [9].

Perhaps one of the most exciting findings of our analyses was identifying a collection of biomarkers distributed among several pathways capable of identifying ACC patients with greater potential to respond to Entinostat/Cisplatin therapy. These findings are clinically relevant as ACCX9 tumors responded particularly well to the combination therapy presenting a TGI of 106%. This finding centers on the activation of chromatin modification, DNA damage repair, and cell cycle-apoptotic pathways in tumors responsive to therapy. All the tumor models have translocations that involve the MYB gene. ACCX9 and ACCX5M1 tumors present the classical MYB-NFIB translocation, and ACCX6 has an MYB-TGFBR3. ACCX9 also presents NOTCH1 mutations, while ACCX5M1 tumors show mutations in MAML2 that are involved in the activation of the Notch signaling. ACCX6 has a different set of mutations involved in epigenetic modifications, such as BRD2, which binds to histone H4K12, chromatin remodeling, and CREBBP, which has histone acetyltransferase activity (<https://www.accrf.org>). The observed mutations on epigenetic modifiers observed in ACCX6 tumors may point towards the inability of Entinostat to induce histone acetylation in any of the 5 acetylation sites found in histones H3 and H4, as we showed here.

Our findings further show that interfering with tumor histones by inducing acetylation leads to the reactivation of several TSGs. In fact, the administration of Entinostat in combination with Cisplatin results in the activation of 31 TSG. From the highly activated TSG presenting a 2-fold expression, we identified SFRP1 as being upregulated in all ACC PDX models used in our study. SFRP1, or Secreted Frizzled Related Protein 1, encodes a soluble protein that controls the Wnt signaling pathway. It binds directly to soluble Wnt proteins and Frizzled receptors [34]. We have also identified 5 addi-

tional Wnt-related TSGs upregulated in all ACC tumors, including the GSK3B, MAPK10, MAPK9, RHOA, and TP53. Similar to the activation of TSG, the administration of Entinostat/Cisplatin resulted in the downregulation of several genes, including oncogenes.

Several FGF family members have been reported mutated in ACC tumors [9], which denotes that inactivation mutations in these families are important to this tumor. ACCX6 only presents mutation in FGFR1 and no mutations in the FGF8 gene (<https://www.accrf.org>). It was exciting to find our combined therapy-induced over 2-fold downregulation of FGF8 oncogene in all 3 PDX models used in this study. Other members of the FGF family, including FGF10, FGFR1, FGFR3, and FGFR4, were significantly downregulated in all 3 PDX models following the combination therapy compared to vehicle levels.

All PDX models presented a better response to the combined administration of Entinostat and Cisplatin when compared to single-agent therapy. The use of HDAC inhibitors as single agents has shown limited results in solid tumors [35]. We have previously demonstrated that HDAC inhibitors can sensitize solid tumors to chemotherapy [12, 36-38]. Estrogen-dependent breast cancer has also benefited from HDAC inhibitors. The use of Entinostat in breast cancer has led to the re-sensitization of tumors to hormonal therapy reversing tumor-resistance phenotype [39, 40]. As estrogen-dependent breast cancer responds better to HDAC sensitization therapy, we have shown that ACCX9 tumors are distinct from ACCX5M1 and ACCX6 tumors with respect to the response to Entinostat and Cisplatin combination therapy. Indeed, the administration of Entinostat and Cisplatin to ACCX5M1 tumors marginally improved TGI by 11% compared to the administration of Entinostat alone. Meanwhile, ACCX6 tumors failed to respond to single administration of Entinostat. It is difficult to assess the causes for such discrepancy in ACC response to combined therapy. One of the potential explanations is the polyclonal nature of solid tumors, which directly impacts tumor response to therapy and tumor recurrence. Our findings support the need to develop personalized therapies for ACC tumors taking into consideration their traits and the potential stratification of

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tumors accordingly to their genetic makeup. With that in mind, we strive to identify potential molecular markers capable of stratifying ACC tumors with greater potential to respond to Entinostat/Cisplatin. Using the NanoString data from the ACC PDX tumors, we identified a group of 145 genes overexpressed in ACCX9 and downregulated in all other PDX models. From the list of upregulated genes, we identified 4 TSG (PPARG, WT1, MAP3K8, WNT5A) presenting a 2-fold activation in ACCX9 over ACCX5M1 and ACCX6 tumors, therefore of potential use as a molecular marker to predict improved response to Entinostat/Cisplatin. Of note, none of the identified TSG from cluster 3 are mutated in the PDX models (above 2-fold expression). PPARG (Peroxisome Proliferator-Activated Receptor Gamma) regulates gene transcription by interacting with the RXRs, or retinoid X receptors [41]. Together, the dimmer is involved in cellular differentiation, while PPARG is also reported to inhibit cellular proliferation and induce apoptosis [42, 43]. WT1 gene is found mutated in Wilms' tumor. In its wild form, WT1 is considered a TSG and a powerful transcription regulator of several receptors as the androgen [44], epidermal growth factor [45, 46], and insulin [47] receptors, among others. MAP3K8 gene is often reported as an oncogene but presents several functions related to a TSG. MAP3K8 is found within the list of TSGs used in this work [18]. MAP3K8, also known as TPL2 kinase, plays a TSG function in lung and skin carcinogenesis [48, 49], and its loss resulted in increased intestinal tumorigenesis in *Apc^{min}* mice [50]. The last TSG triggered by the administration of Entinostat/Cisplatin is WNT5A. In colon cancer, the presence of WNT5A represses EMT and the canonical Wnt pathway [51]. Activation of Wnt5a further disrupts tumor migration, proliferation, and invasion, all hallmarks of aggressive tumor behavior. In fact, the presence of Wnt5a impaired tumor growth in nude mice.

Cellular senescence is a biological event that is often overlooked in cancer biology. Senescent cells are unable to divide and undergo major changes in chromatin organization. Chromatin modifications result in changes in the secretion pattern of senescent cells that can drive tumor resistance to therapy [52, 53]. Using tissues from our PDX models receiving Entinostat and/or Cisplatin, we explored the cellular senescence burden in each of our models and therapies. We observed that two of our tumor mod-

els (ACCX9 and ACCX5M1) did not experience an accumulation of senescent cells upon therapy. However, we observed that ACCX6 tumors did accumulate senescent cells during the administration of Cisplatin alone or in combination with Entinostat. Interesting to note that ACCX6 tumors showed the lowest tumor growth response to Entinostat/Cisplatin administration from all PDX models used in this study while being the only tumor model with tumor growth above control levels for single-drug therapy (Entinostat, TGI = -20%; Cisplatin TGI = -29%).

Historically, science has pursued the identification of molecular markers capable of detecting incipient tumors and predicting behavior, progression, and the presence of metastasis. Molecular markers have also been used to stratify patients presenting a greater response to therapy. Such effort in identifying molecular markers has proven valuable for certain tumors like prostate cancer. The identification of high levels of PSA in the bloodstream of patients is particularly of great value in identifying early prostate cancer. Similarly, identifying p53, Bcl-2, p16INK4A, p27Kip1, and other markers has also proved to have significant prognostic value for prostate cancer [54]. Identifying markers for other common tumors also trails the advances seen in prostate cancer. Nonetheless, patients suffering from rare malignancies like ACC are less fortunate, as limited resources are available to better understand the biology of such tumors. Here we have identified a series of biomarkers capable of predicting better tumor response to the administration of Entinostat in combination with Cisplatin. However, we unveiled something unexpected using data from our targeted gene screening focusing on signaling pathways. We found that signaling pathways, rather than individual molecular markers, can predict tumor response to Entinostat/Cisplatin. Therefore, we have shown here that ACC tumors present unique genetic signatures with great prognostic value. In fact, after validation of our genetic signature in 68 ACC patients presenting RNAseq data, we found that close to a quarter of all ACC patients are likely to respond well to therapy.

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Disclosure of conflict of interest

None.

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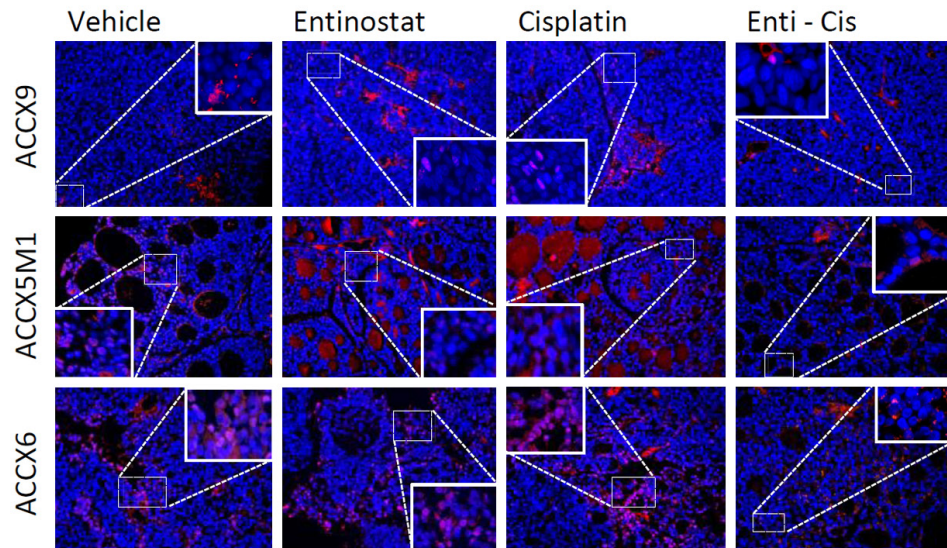
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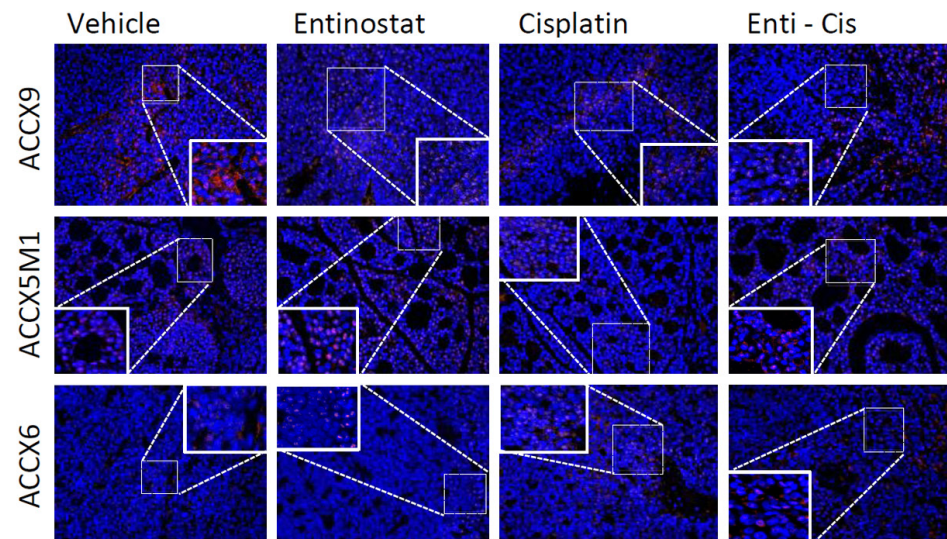
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Stratifying adenoid cystic carcinomas using pathways-based genomics

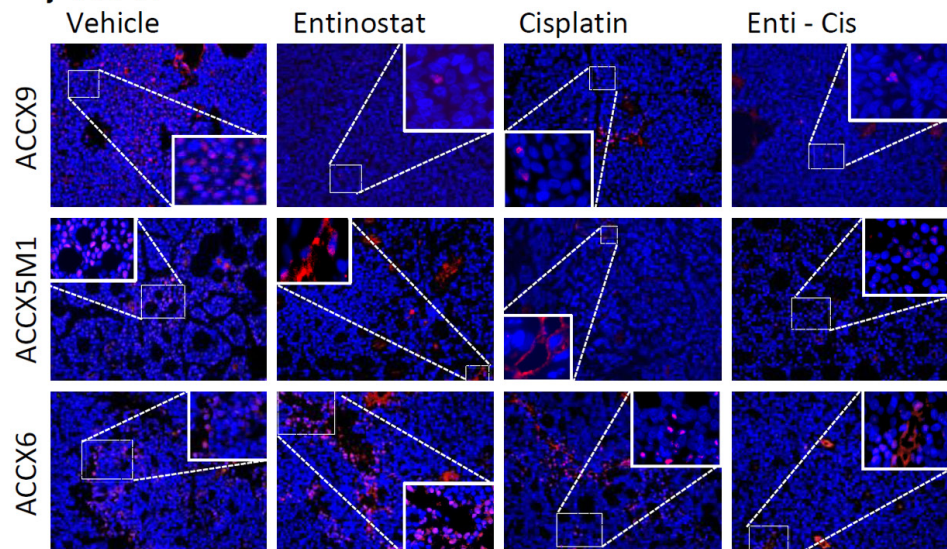
A KI67



B Caspase 3



C γ -H2AX



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Figure S1. Representative immunofluorescence images of tumor samples from ACCX6, ACCX5M1, and ACCX9 PDX models receiving Entinostat, Cisplatin, or a combination of both drugs and stained for Ki67 (A), Caspase 3 (B), and γ -H2AX (C) conjugated with Alexa 568 (red) and counterstained for DNA content using Hoechst 3342. Inserts depict the magnification of specific areas within the tumor mass.

Oncogenes identified in Cluster 1 Downregulated (Oncogene Database)

| Oncogene | ACCX9 | ACCX6 | ACCX5M1 |
|----------|-------|-------|---------|
| CBL | ↓ | ↓ | ↓ |
| CCNE1 | ↓ | ↓ | ↓ |
| CDK6 | ↓ | ↓ | ↓ |
| ETS2 | ↓ | ↓ | ↓ |
| EZH2 | ↓ | ↓ | ↓ |
| FGF10 | ↓ | ↓ | ↓ |
| FGF8 | ↓ | ↓ | ↓ |
| FGFR1 | ↓ | ↓ | ↓ |
| FGFR3 | ↓ | ↓ | ↓ |
| FGFR4 | ↓ | ↓ | ↓ |
| GLI1 | ↓ | ↓ | ↓ |
| HSPA1A | ↓ | ↓ | ↓ |
| HSPB1 | ↓ | ↓ | ↓ |
| JAK2 | ↓ | ↓ | ↓ |
| NOTCH1 | ↓ | ↓ | ↓ |
| NSD1 | ↓ | ↓ | ↓ |
| PAX3 | ↓ | ↓ | ↓ |
| PDGFRB | ↓ | ↓ | ↓ |
| PIK3R1 | ↓ | ↓ | ↓ |
| PTCH1 | ↓ | ↓ | ↓ |
| PTTG2 | ↓ | ↓ | ↓ |
| SETBP1 | ↓ | ↓ | ↓ |
| SPRY2 | ↓ | ↓ | ↓ |
| TCL1B | ↓ | ↓ | ↓ |
| WHSC1 | ↓ | ↓ | ↓ |
| WHSC1L1 | ↓ | ↓ | ↓ |

n=26 Oncogenes

↓ 2-fold downregulated over vehicle

↓ Statistical significant downregulation over vehicle

Figure S2. Table of 26 oncogenes out of the list of 130 downregulated genes identified in cluster 1 (Figure 3A) after administration of Entinostat + Cisplatin. Arrows in red represent 2-fold downregulation of oncogenes over vehicle, and green arrows represent statistically significant gene downregulation ($P < 0.05$) in PDX tumors receiving Entinostat + Cisplatin compared with vehicle.

Tumor Suppressor Genes identified in Cluster 2
Overexpression (TSGene Database)

| TSG Genes | ACCX9 | ACCX6 | ACCX5M1 |
|-----------|-------|-------|---------|
| CDH1 | ↑ | ↑ | ↑ |
| CDKN1B | ↑ | ↑ | ↑ |
| CDKN1C | ↑ | ↑ | ↑ |
| CDKN2A | ↑ | ↑ | ↑ |
| CEBPA | ↑ | ↑ | ↑ |
| GAS1 | ↑ | ↑ | ↑ |
| GSK3B | ↑ | ↑ | ↑ |
| HDAC1 | ↑ | ↑ | ↑ |
| HDAC3 | ↑ | ↑ | ↑ |
| HPGD | ↑ | ↑ | ↑ |
| ITGA7 | ↑ | ↑ | ↑ |
| KLF4 | ↑ | ↑ | ↑ |
| MAPK10 | ↑ | ↑ | ↑ |
| MAPK9 | ↑ | ↑ | ↑ |
| MSH2 | ↑ | ↑ | ↑ |
| NBN | ↑ | ↑ | ↑ |
| NFKB1 | ↑ | ↑ | ↑ |
| NOL7 | ↑ | ↑ | ↑ |
| NUPR1 | ↑ | ↑ | ↑ |
| PHF6 | ↑ | ↑ | ↑ |
| PLD1 | ↑ | ↑ | ↑ |
| PPP2CB | ↑ | ↑ | ↑ |
| PRKAA2 | ↑ | ↑ | ↑ |
| PTPN11 | ↑ | ↑ | ↑ |
| RHOA | ↑ | ↑ | ↑ |
| SFRP1 | ↑ | ↑ | ↑ |
| STAT1 | ↑ | ↑ | ↑ |
| TET2 | ↑ | ↑ | ↑ |
| TGFBR2 | ↑ | ↑ | ↑ |
| TP53 | ↑ | ↑ | ↑ |
| TSLP | ↑ | ↑ | ↑ |

N=31 TSG

↑ 2-fold upregulated over vehicle

↑ Statistical significant upregulated over vehicle

Figure S3. List of 31 tumor suppressor genes (TSG) out of a list of 127 upregulated genes identified in cluster 2 (Figure 3A) after administration of Entinostat + Cisplatin. Arrows in red represent 2-fold upregulation of TSG over vehicle, and green arrows represent statistical significant gene upregulation (P<0.05) in PDX tumors receiving Entinostat + Cisplatin compared with vehicle.

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| A Cluster 3 | | | | B Cluster 4 | | | |
|--|----------|----------|----------|--|----------|----------|----------|
| ACCX9 Unique Upregulated Genes (over 2-fold) | | | | ACCX9 unique Downregulated Genes (under 2-fold) | | | |
| Probe Name | ACCX9 | ACCX6 | ACCX5M1 | Probe Name | ACCX9 | ACCX6 | ACCX5M1 |
| MYCN | 5.181234 | -2.79134 | -1.66997 | COL2A1 | -6.56877 | 1.488662 | 1.670026 |
| ITGA8 | 4.461234 | -4.52134 | -0.65997 | LAMA1 | -5.46877 | 1.628662 | 1.740026 |
| SHC3 | 4.461234 | -1.33134 | -0.73997 | COL3A1 | -4.21877 | 1.878662 | 1.830026 |
| PIK3R5 | 4.461234 | -1.33134 | -2.55997 | PDGFRA | -3.85877 | 1.758662 | 2.020026 |
| BIRC3 | 3.931234 | -2.52134 | -2.49997 | CACNA2D2 | -3.45877 | 1.698662 | 1.630026 |
| FGF14 | 3.931234 | -2.12134 | -0.85997 | RELN | -3.14877 | 1.348662 | 1.590026 |
| CALML3 | 3.661234 | -1.33134 | -1.49997 | COL1A1 | -2.86877 | 1.348662 | 2.340026 |
| PRMT8 | 3.501234 | -1.17134 | -0.59997 | TGFB1 | -2.82877 | 1.338662 | 1.630026 |
| MMP9 | 3.261234 | -3.07134 | -0.99997 | TCF7L1 | -2.80877 | 1.568662 | 2.020026 |
| CSF3 | 2.861234 | -6.91134 | 1.590026 | FGF7 | -2.80877 | 2.068662 | 1.430026 |
| HOXA11 | 2.861234 | -6.11134 | -1.61997 | CREB3L1 | -2.37877 | 1.318662 | 2.380026 |
| GATA3 | 2.861234 | -6.91134 | -0.93997 | COL11A1 | -2.36877 | 1.428662 | 1.830026 |
| SSX1 | 2.861234 | -1.92134 | -6.38997 | PDGFB | -2.35877 | 1.838662 | 1.760026 |
| BIRC7 | 2.861234 | -2.12134 | -1.27997 | ARNT2 | -2.22877 | 1.538662 | 1.610026 |
| TGFB3 | 2.861234 | -2.50134 | -1.13997 | COL5A1 | -2.19877 | 1.308662 | 1.980026 |
| PCK1 | 2.861234 | -1.64134 | -0.70997 | FZD2 | -2.07877 | 1.408662 | 1.720026 |
| PPARG | 2.861234 | -1.36134 | -0.91997 | | | | |
| WT1 | 2.861234 | -1.03134 | -1.09997 | | | | |
| FASLG | 2.691234 | -3.45134 | -0.96997 | | | | |
| BAIAP3 | 2.661234 | -1.01134 | -1.06997 | | | | |
| MAP3K8 | 2.651234 | -1.92134 | -1.01997 | | | | |
| ZIC2 | 2.601234 | -1.17134 | -2.12997 | | | | |
| WNT5A | 2.551234 | -0.94134 | -0.86997 | | | | |
| WNT2 | 2.431234 | -0.77134 | -0.96997 | | | | |
| CAMK2B | 2.371234 | -2.32134 | -3.70997 | | | | |
| HMGA2 | 2.281234 | -2.35134 | -1.80997 | | | | |
| IL1R1 | 2.281234 | -0.91134 | -0.66997 | | | | |
| IL11 | 2.271234 | -0.93134 | -2.41997 | | | | |
| GRIA3 | 2.231234 | -1.25134 | -0.67997 | | | | |
| PLA2G4C | 2.191234 | -0.85134 | -1.27997 | | | | |
| DUSP8 | 2.151234 | -0.91134 | -0.82997 | | | | |
| UTY | 2.081234 | -3.72134 | -1.49997 | | | | |
| WNT16 | 2.071234 | -6.91134 | -0.93997 | | | | |
| IL7 | 2.071234 | -2.92134 | -2.72997 | | | | |
| GZMB | 2.071234 | -4.78134 | -1.84997 | | | | |
| SOX17 | 2.071234 | -2.12134 | -1.27997 | | | | |
| SGK2 | 2.071234 | -2.92134 | -1.14997 | | | | |
| FGF1 | 2.071234 | -0.85134 | -0.58997 | | | | |
| ZBTB32 | 2.071234 | -1.01134 | -1.84997 | | | | |
| ITGB4 | 2.001234 | -1.09134 | -0.62997 | | | | |

Figure S4. A. List of genes derived from cluster 3 (Figure 3D) presenting a 2-fold increase in gene expression on ACCX9 PDX compared with ACCX6 and ACCX5M1 upon receiving Entinostat + Cisplatin combination therapy. B. List of genes from cluster 4 (Figure 3D) presenting downregulation of gene expression on ACCX9 PDX compared with ACCX6 and ACCX5M1 upon receiving Entinostat + Cisplatin combination therapy.

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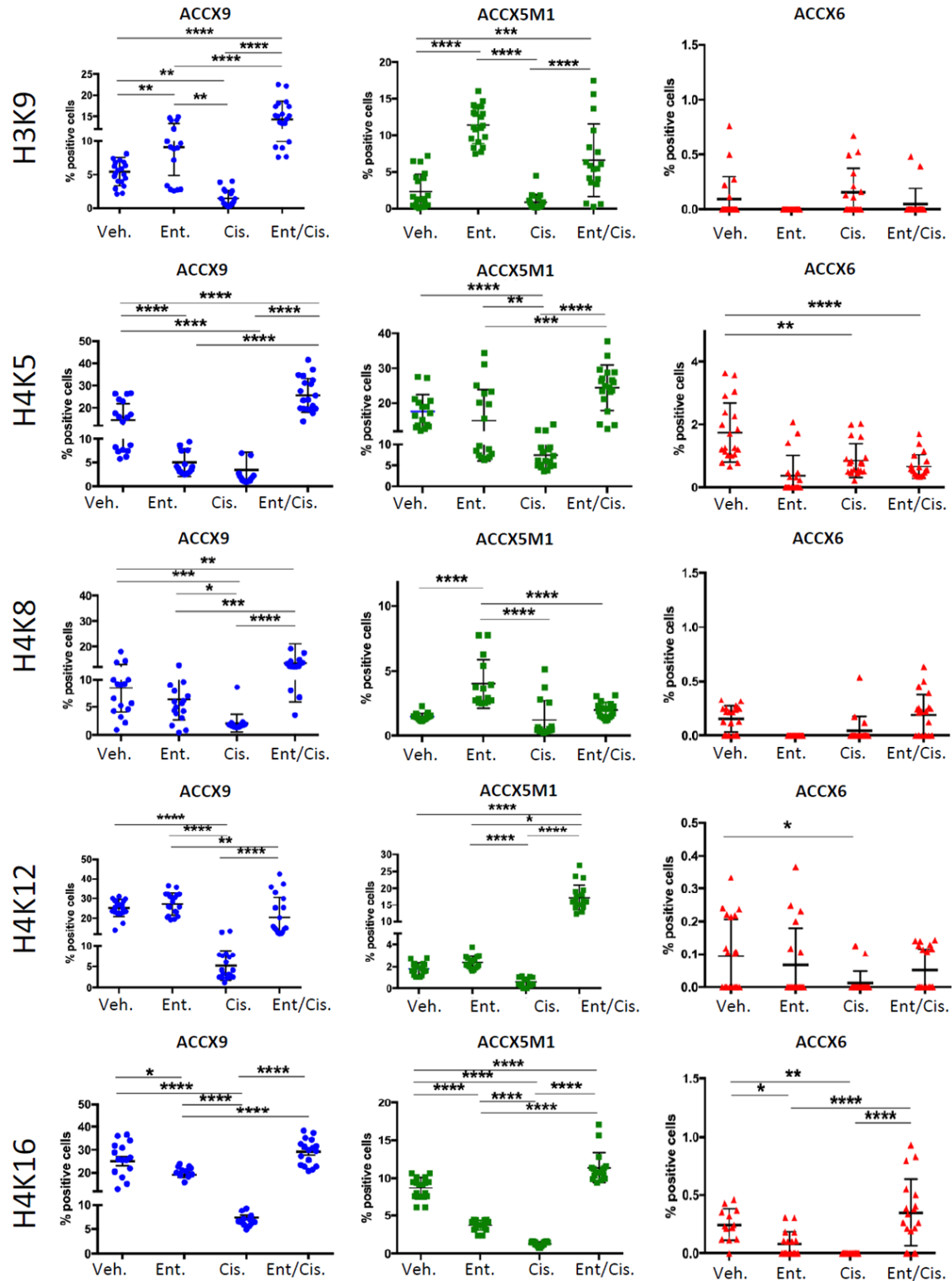


Figure S5. Tumor-specific histone acetylation levels of histones H3 lysine 9, H4 lysine 5, H4 lysine 8, H4 lysine 12, and H4 lysine 16 distributed by treatment arms (* $P < 0.05$; ** $P < 0.01$; *** $P < 0.001$; **** $P < 0.0001$).

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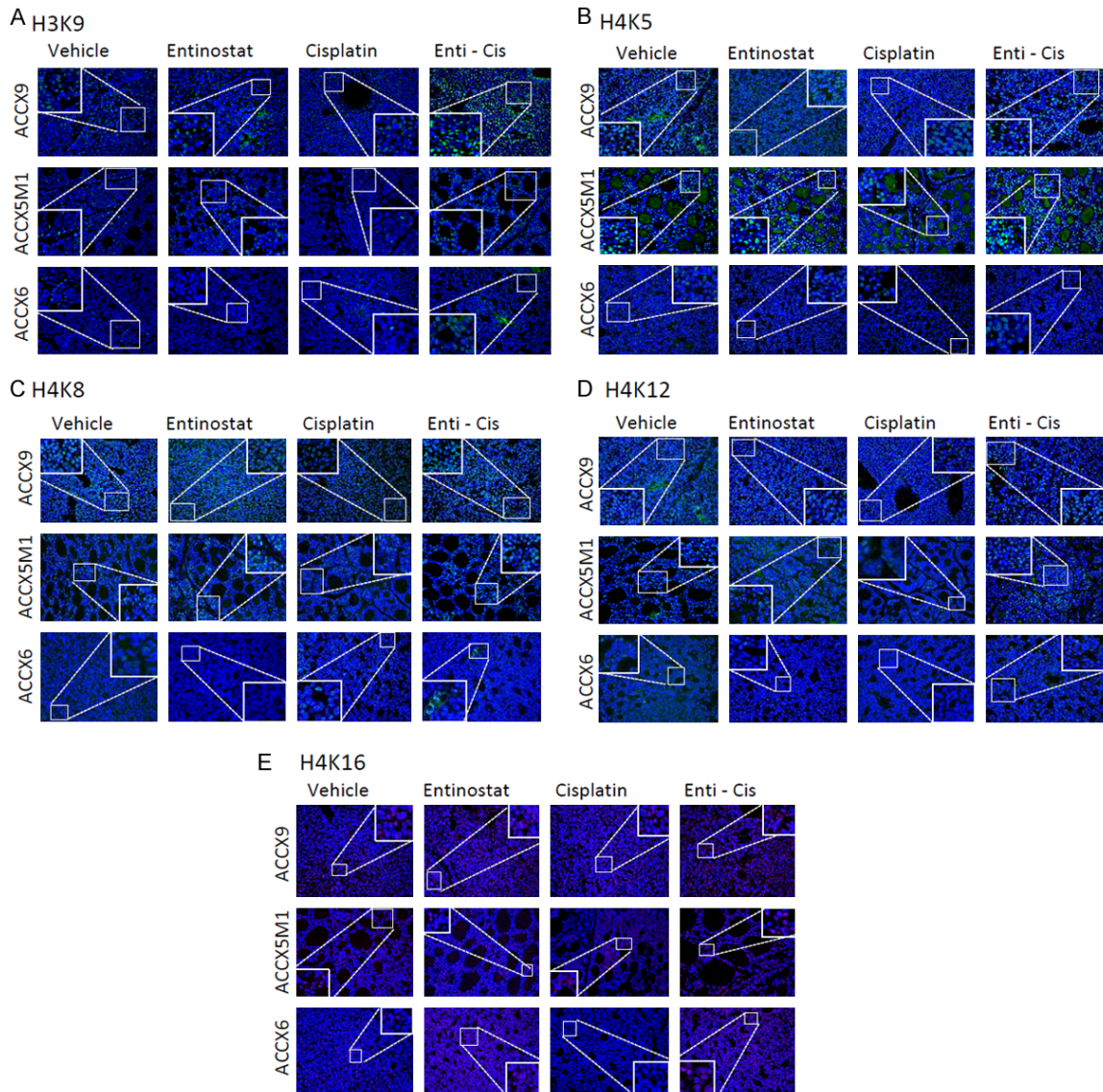


Figure S6. Immunofluorescence images of the PDX tumors ACCX6, ACCX5M1, and ACCX9 receiving Entinostat, Cisplatin, or the combination of both drugs stained for histone H3 and H4 acetylation at specific lysines (Alexa 488_green). DNA content is identified by Hoechst 3342 staining, and inserts depict the magnification of specific areas within the tumor mass.

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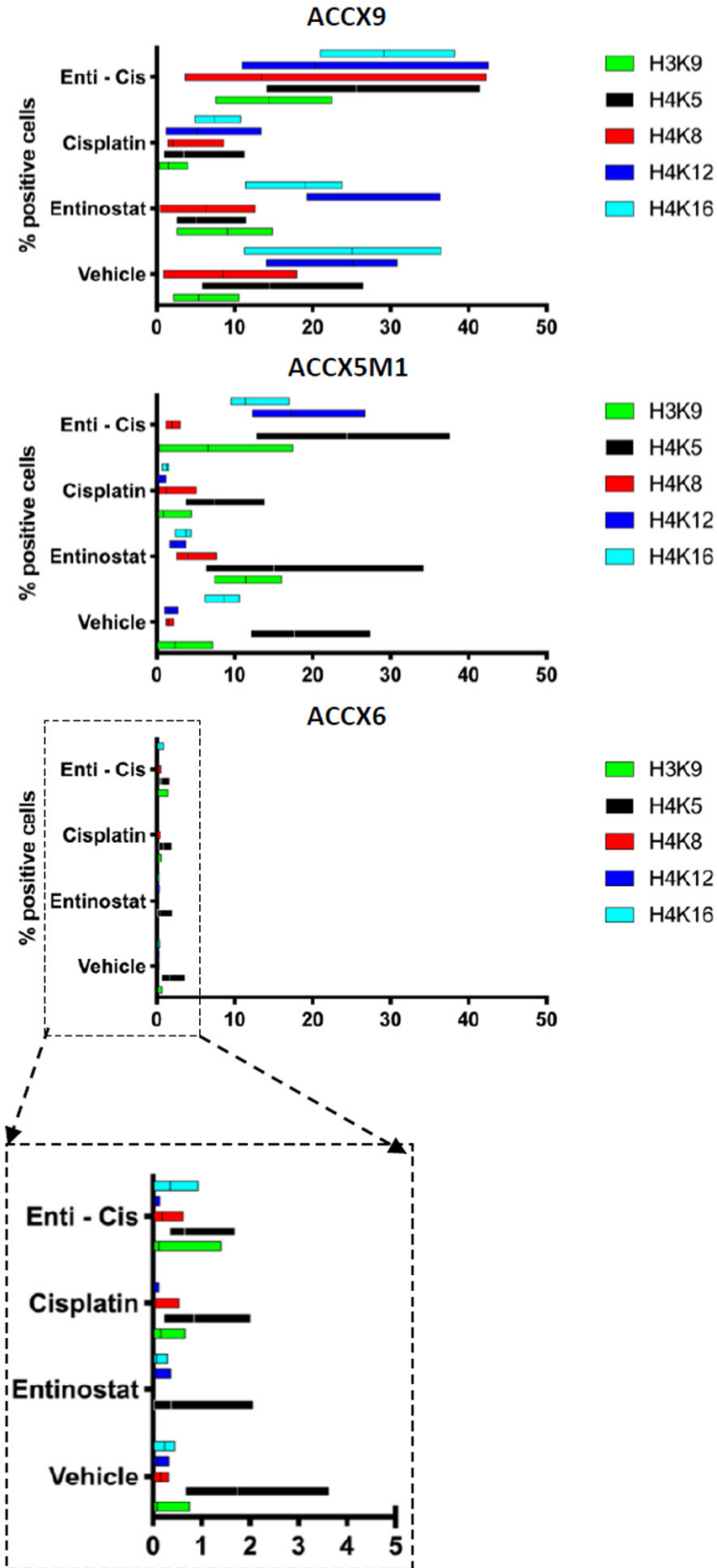


Figure S7. Bar graphic depicting the percentage of positive cells distributed by each therapeutic arm for all 3 PDX models of ACC tumors and stained for H3 lysine 9, H4 lysine 5, H4 lysine 8, H4 lysine 12, and H4 lysine 16. Note that all therapy arms failed to induce robust histone acetylation on ACCX6 compared with ACCX9 and ACCX5M1.