# PGC1 $\alpha/\beta$ Expression Predicts Therapeutic Response to Oxidative Phosphorylation Inhibition in Ovarian Cancer



Carmen Ghilardi<sup>1</sup>, Catarina Moreira-Barbosa<sup>1,2</sup>, Laura Brunelli<sup>3</sup>, Paola Ostano<sup>4</sup>, Nicolò Panini<sup>5</sup>, Monica Lupi<sup>5</sup>, Alessia Anastasia<sup>1</sup>, Fabio Fiordaliso<sup>6</sup>, Monica Salio<sup>6</sup>, Laura Formenti<sup>1,7</sup>, Massimo Russo<sup>1</sup>, Edoardo Arrigoni<sup>7</sup>, Ferdinando Chiaradonna<sup>7</sup>, Giovanna Chiorino<sup>4</sup>, Giulio Draetta<sup>8,9,10</sup>, Joseph R. Marszalek<sup>9</sup>, Christopher P. Vellano<sup>9</sup>, Roberta Pastorelli<sup>3</sup>, MariaRosa Bani<sup>1</sup>, Alessandra Decio<sup>1</sup>, and Raffaella Giavazzi<sup>1</sup>

# ABSTRACT

Ovarian cancer is the deadliest gynecologic cancer, and novel therapeutic options are crucial to improve overall survival. Here we provide evidence that impairment of oxidative phosphorylation (OXPHOS) can help control ovarian cancer progression, and this benefit correlates with expression of the two mitochondrial master regulators PGC1 $\alpha$  and PGC1 $\beta$ . In orthotopic patientderived ovarian cancer xenografts (OC-PDX), concomitant high expression of PGC1 $\alpha$  and PGC1 $\beta$  (PGC1 $\alpha/\beta$ ) fostered a unique transcriptional signature, leading to increased mitochondrial abundance, enhanced tricarboxylic acid cycling, and elevated cellular respiration that ultimately conferred vulnerability to OXPHOS inhibition. Treatment with the respiratory chain complex I inhibitor IACS-010759 caused mitochondrial swelling and ATP depletion that consequently delayed malignant progression and prolonged the lifespan of high PGC1 $\alpha/\beta$ -expressing OC-PDX-bearing mice.

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Conversely, low PGC1 $\alpha/\beta$  OC-PDXs were not affected by IACS-010759, thus pinpointing a selective antitumor effect of OXPHOS inhibition. The clinical relevance of these findings was substantiated by analysis of ovarian cancer patient datasets, which showed that 25% of all cases displayed high PGC1 $\alpha/\beta$  expression along with an activated mitochondrial gene program. This study endorses the use of OXPHOS inhibitors to manage ovarian cancer and identifies the high expression of both PGC1 $\alpha$  and  $\beta$  as biomarkers to refine the selection of patients likely to benefit most from this therapy.

Significance: OXPHOS inhibition in ovarian cancer can exploit the metabolic vulnerabilities conferred by high PGC1 $\alpha/\beta$  expression and offers an effective approach to manage patients on the basis of PGC1 $\alpha/\beta$  expression.

# Introduction

Metabolic adaptation has emerged as a hallmark of cancer (1) and confers growth advantages to tumors. Cancer cells present a mixed energy phenotype. Although aerobic glycolysis is often found, oxidative phosphorylation (OXPHOS) contributes to energy production, with a major role in some tumors (2). OXPHOS occurs in mitochondria and fuels cancer cells, using a variety of substrates. By oxidizing pyruvate, fatty acid, and amino acids through the tricarboxylic acid (TCA) cycle, mitochondria generate the reducing equivalent (NADH, FADH2) for fueling the electron transport chain (ETC) and producing ATP and biosynthetic molecules that support tumor cell proliferation.

The importance of OXPHOS in ovarian cancer has been recently highlighted. Mitochondrial DNA content strongly correlated with the expression of genes involved in the ETC and TCA cycle (3) and was significantly higher in ovarian carcinoma cells than in normal ovary (4). Using The Cancer Genome Atlas database, Yang and colleagues reported that the poor survival of ovarian cancer patients significantly correlated with high expression levels of genes involved in glutaminolysis or the TCA cycle and low expression of glycolysis-related genes (5). High expression of a "Mito-signature," including transcripts of OXPHOS complexes, significantly predicted tumor recurrence, progression, and reduced overall survival of ovarian cancer patients (6). Highly invasive ovarian cancer cells preferentially use glutamine rather than glucose to replenish the TCA cycle, dramatically raising the oxygen consumption rate. Interfering with OXPHOS metabolism by mitochondrial respiratory complex I inhibition (e.g., rotenone) reduces both the TCA cycle activity and ovarian cancer cell invasiveness (5). OXPHOS also appears to play a key role in the insurgence of chemoresistance (7-10), which has a heavy impact on patient survival,

<sup>&</sup>lt;sup>1</sup>Laboratory of Cancer Metastasis Therapeutics, Istituto di Ricerche Farmacologiche Mario Negri IRCCS, Milan, Italy. <sup>2</sup>Institute of Biomedical Sciences Abel Salazar (ICBAS), University of Porto, Porto, Portugal. <sup>3</sup>Laboratory of Mass Spectrometry, Istituto di Ricerche Farmacologiche Mario Negri IRCCS, Milan, Italy. <sup>4</sup>Cancer Genomics Laboratory, Fondazione Edo ed Elvo Tempia Valenta, Biella, Italy. <sup>5</sup>Laboratory of Anticancer Pharmacology, Istituto di Ricerche Farmacologiche Mario Negri IRCCS, Milan, Italy. <sup>6</sup>Laboratory of Cardiovascular Clinical Pharmacology, Istituto di Ricerche Farmacologiche Mario Negri IRCCS, Milan, Italy. <sup>7</sup>Department of Biotechnology and Biosciences, University of Milano-Bicocca, Milan, Italy. <sup>8</sup>Institute for Applied Cancer Science, Therapeutics Discovery Division, The University of Texas MD Anderson Cancer Center, Houston, Texas. <sup>9</sup>TRACTION Platform, Therapeutics Discovery Division, The University of Texas MD Anderson Cancer Center, Houston, Texas. <sup>10</sup>Department of Genomic Medicine, The University of Texas MD Anderson Cancer Center, Houston, Texas.

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C. Ghilardi and C. Moreira-Barbosa contributed equally to this article.

M. Bani, A. Decio, and , R. Giavazzi contributed equally to this article.

**Corresponding Author:** Carmen Ghilardi, Department of Oncology, Laboratory of Cancer Metastasis Therapeutics; Istituto di Ricerche Farmacologiche Mario Negri IRCCS, Via Mario Negri 2, 20156 Milan, Italy. Phone: 39-02-39014226; Fax: 39-02-39014734; E-mail: carmen.ghilardi@marionegri.it

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and in the maintenance of ovarian cancer stem cells (CSC). These cells, with high metastatic and tumorigenic potential, are more reliant on OXPHOS to support stemness and their high energy-consuming functions, such as proliferation, growth, migration, and invasion. Ovarian CSCs show increased expression of genes involved in glucose uptake, OXPHOS metabolism, and fatty acid beta-oxidation (11). All these pieces of evidences suggest that targeting OXPHOS could be a promising therapeutic avenue to delay ovarian cancer progression and, possibly, to eliminate residual disease.

Searching for reliable markers to define the dependence on OXPHOS, we focused on the peroxisome proliferator-activated receptor gamma coactivator 1-alpha and beta (PGC1 $\alpha$  and PGC1 $\beta$ ; ref. 12). PGC1 $\alpha$  has emerged as a master regulator of mitochondrial biogenesis and energy expenditure and is important in the adaptive metabolic response. PGC1 $\beta$  is responsible for basal mitochondrial functions (13). PGC1 $\alpha$  and PGC1 $\beta$  both have functions that favor carcinogenesis and progression in some cancer types (14) and promote metastasis (15). However, their role in tumor development is tissue-dependent and still debated (14, 16).

Here we investigated the expression of PGC1 $\alpha$  and PGC1 $\beta$  in ovarian cancer patients and patient-derived xenografts (OC-PDX) and found it closely correlated with OXPHOS activity and the mitochondrial metabolism of cancer cells. In a subset of OC-PDXs, we also demonstrated that their high expression strongly correlates with the therapeutic response to IACS-010759, an OXPHOS inhibitor that targets complex I of the ETC (17).

# **Materials and Methods**

# Animals

Six- to eight-week-old female athymic Nude-Foxn1<sup>nu</sup> mice were obtained from Envigo Laboratories. Mice were maintained under specific-pathogen-free conditions, housed in isolated vented cages, and handled using aseptic procedures. Animal studies were approved by the Mario Negri Institute Animal Care and Use Committee and the Italian Ministry of Health. Procedures involving animals and their care were conducted in conformity with the laws, regulations, and policies governing the care and use of laboratory animals-Italian Governing Law (D.lgs 26/2014, authorization number 19/2008-A issued March 6, 2008, by the Ministry of Health); providing internal authorization for people conducting animal experiments (Quality Management System Certificate-UNI EN ISO9001: 2008-registration number 6121); the NIH Guide for the Care and Use of Laboratory Animals (2011 edition); and EU directives and guidelines (EEC Council Directive 2010/63/UE)and were in line with guidelines for the welfare and use of animals in cancer research (18).

# Orthotopic xenograft tumor models

Seven OC-PDX (Y-HOC8, HOC10, HOC22, HOC76, HOC78, HOC79, and HOC84) were molecularly, biologically, and pharmacologically characterized, and previously described (19, 20). OC-PDXs were propagated by collection of malignant ascites and intraperitoneal (i.p.) transplantation in nude mice as a tumor suspension of  $10 \times 10^6$  cells. Tumor growth was evaluated on the basis of abdominal distension and palpable tumor masses in the peritoneal cavity (19).

# Pharmacologic treatment

OC-PDX-bearing mice were randomized (simple randomization; 10–15 per group) on the day specified in the figure legends, and groups were arbitrarily assigned to receive either IACS-010759 or vehicle.

IACS-010759 (provided by MD Anderson Cancer Center Institute for Applied Cancer Science) was dissolved in 0.5% methylcellulose (Sigma-Aldrich) and administered by gavage 5 days on/2 off at 2.5 mg/kg, in a maintenance regimen (unless otherwise specified). Vehicle was given with the same schedule as the active drug. Mice were monitored daily and were euthanized when they presented signs of distress due to disease progression (visible abdominal swelling, hemorrhagic ascites, and palpable abdominal tumor masses). The time-todisease progression (day of sacrifice) was recorded as survival time (ST) to generate Kaplan–Meier curves. The increment of lifespan (ILS) was calculated as  $100 \times [(median survival day_{treated group} - median survival$  $day_{control group}].$ 

At necropsy, malignant ascites were harvested, and the volume of cells was recorded to evaluate the abdominal tumor burden.

# In vivo oxygen consumption and lactate release

OC-PDX ascites were harvested and centrifuged at 1,200 rpm for 10 minutes. Cell pellets were resuspended in HBSS medium (Thermo Fisher Scientific) and immediately transferred to the Clark oxygen electrode chamber (Hansatech). The oxygen consumption rate (OCR) was measured over a time course, and the values were normalized to the total protein content. Cell-free supernatants were analyzed for lactate concentration with the Vi-CELL MetaFLEX ANALYZER (Beckman Coulter). Each sample was analyzed in triplicate.

# In vivo <sup>13</sup>C6-glucose tracing

OC-PDX-bearing mice were injected intraperitoneally with 1 g/ kg  $^{13}\mathrm{C}_{6}$ -glucose (Cambridge Isotopes Laboratories), and after 30 minutes, cells from ascites were collected, rinsed, and their metabolism quenched with liquid nitrogen. Metabolites were extracted and analyzed by liquid chromatography high resolution–mass spectrometry as described (21). Details are reported in Supplementary Methods.

#### Mitochondrial ultrastructure, number, and volume assessment

Cells from malignant ascites were centrifuged, washed with phosphate buffer (0.12M), and prepared for transmission electron microscopy (TEM), as previously described (22). Details are reported in Supplementary Methods.

# **ATP measurement**

Total proteins were extracted with passive lysis buffer (Promega) and quantified using the Bio-Rad Bradford protein assay. Intracellular ATP levels were measured with the ATP determination kit (Molecular Probes). The luminescent signal was measured in a GloMax Discover Microplate Reader (Promega). Each sample was analyzed in triplicate.

# Gene expression data analysis

MeV version 4.9.0 was used for unsupervised hierarchical clustering on the gene expression profiling from ovarian cancer patients and OC-PDX. Pearson/Cosine distance was used as similarity metric and average linkage as the linkage method. Overrepresented biological processes of Gene Ontology (GO) were investigated with the functional annotation tool available in DAVID 6.8 (https://david. ncifcrf.gov/, RRID:SCR\_001881). Correlation analysis was done with the cor and cor.test functions, available in the R statistical environment, using Pearson correlation. Genes with Pearson r > 0and P < 0.01 were considered positively correlated to both PGC1 $\alpha$ and PGC1 $\beta$ .

# RT-qPCR

TotRNA was isolated using a miRNEasy mini kit (QIAGEN) and retrotranscribed (1  $\mu$ g) using the High-Capacity cDNA Reverse Transcription Kit (Applied Biosystems). The gene expression levels were measured by qPCR using TaqMan Universal PCR Master Mix (Applied Biosystems) and specific TaqMan Gene Expression Assays (IDT). Expression levels were normalized to  $\beta$ -actin and presented as relative expression (2<sup>(-DDCt)</sup>). The samples were run in triplicate.

# Western blot

Nuclear proteins were extracted using NE-PER nuclear and cytoplasmic extraction reagents (Thermo Fisher Scientific) with protease inhibitors (Roche). Ten µg of proteins was separated onto precast 4% to 12% polyacrylamide gels (Sigma-Aldrich) and transferred to 0.2-µm PVDF membranes using a trans-blot turbo system (Bio-Rad). Blots were blocked at room temperature for 2 hours in blocking buffer [5% nonfat dry milk or 5% BSA in TBS/0.1% Tween 20 (Sigma-Aldrich)], then incubated overnight at 4°C with the appropriate primary antibody: PGC1α (1:1,000, Novus Biologicals; cat. #NBP1-04676, RRID: AB 1522118), PGC1B (1:10,000, Abcam; cat. #ab176328, RRID: AB\_2893194), Histone H3 (1:2,000, Abcam; cat. #ab1791, RRID: AB\_302613). Antibody binding was detected using anti-rabbit IgG-HRP (1:5,000, Sigma-Aldrich; cat. #A6154, RRID:AB\_258284) for 1 hour at room temperature. The signals were revealed with ECL (Thermo Fisher Scientific) and acquired with an Odyssey Fc Imaging System. Histone H3 was used for normalization.

#### **Cell culture**

OVCAR3 (NCI-DTP; cat. #OVCAR3, RRID:CVCL\_0465) and IGROV1 (NCI-DTP; cat. #IGR-OV1, RRID:CVCL\_1304) human ovarian adenocarcinoma cells were obtained from the NCI (Fredrick, MD) and were routinely cultured in RPMI-1640 medium (Microgem) supplemented with 10% FBS (Microgem) and 2 mmol/L L-glutamine (GIBCO). Stocks of cell lines, authenticated by short-tandem repeat profiling (AmpFISTR Identifiler Plus PCR Amplification Kit; Applied Biosystems), were stored frozen in liquid nitrogen and used within 4 weeks after thawing. Cells were routinely tested for *Mycoplasma* contamination by PCR.

### Generation of PGC1 $\!\alpha$ and PGC1 $\!\beta$ knockout cells

To generate syngeneic PGC1 $\alpha$  and PGC1 $\beta$  knockout (KO) cells, 2 µg of gene-specific CRISPR/Cas9 KO plasmid was cotransfected with 2 µg of the corresponding HDR plasmid into 1 × 10<sup>6</sup> OVCAR3 cells by way of Amaxa Nucleofector Technology (Nucleofector kit V, Program T-016). The following plasmids, purchased from SantaCruz Biotechnology, were used: PGC1 $\alpha$  CRISPR/Cas9 KO (sc-400070), PGC1 $\alpha$ HDR (sc-400070-HDR), PGC1 $\beta$  KO CRISPR/Cas9 (sc-417930), and PGC1 $\beta$  HDR (sc-417930-HDR). Selection of transfected cells was performed 72 hours later with 5 µg/mL puromycin. Individual clones were then isolated by mechanical detachment of single colonies and further expanded for characterization. Gene silencing was verified evaluating the protein levels by western blot. Cells transfected with the same plasmids, in which PGC1 $\alpha$  and PGC1 $\beta$  were not successfully silenced, were used as control cells (ctr-KO OVCAR3).

# Cellular reactive oxygen species and MitoTracker staining

Cells were stained with 5  $\mu$ mol/L CellROX Deep Red reagent (Invitrogen) for 30 minutes at 37°C for reactive oxygen species (ROS) quantification or with 25 nmol/L MitoTracker Deep Red (Invitrogen) for 45 minutes at 37°C for the determination of mitochondrial content. Data were acquired on a Gallios flow cytometer (Beckman Coulter)

and analyzed using Kaluza software (GalliosTM Kaluza, RRID: SCR\_016700).

# Seahorse analysis

50,000 cells/well were seeded in XFe96 Cell Culture Microplates (Agilent Technologies) in culture medium and incubated for 24 hours at 37°C in 5% CO<sub>2</sub>. Before the experiment, the culture medium had been replaced with serum-free unbuffered Seahorse XF RPMI Medium pH 7.4 supplemented with 10 mmol/L glucose, 2 mmol/L glutamine, and 1 mmol/L sodium pyruvate, and then the microplate was incubated at 37°C in a non-CO<sub>2</sub> incubator for 1 hour. The MitoStress Test was performed. The concentrations of oligomycin, FCCP, and rote-none/antimycin A used in the assay were, respectively, 1, 0.25, and 1  $\mu$ mol/L. The OCR was evaluated over a time course before and after injection of the drugs. OCR data (pmol/min/prot/mitochondrial mass) were normalized by mitochondrial mass (MitoTracker Green FM staining) and by protein amount.

# Cell treatment and viability assay

 $4 \times 10^3$  cells/well were seeded in 96-well plates in RPMI-1640 with 2.5% FBS and 2 mmol/L glutamine. After 48 hours, the cells were treated with IACS-010759 at the concentrations indicated and cell proliferation measured after 96 hours with CellTiter 96 AQueous One Solution Cell Proliferation Assay (Promega) or crystal violet staining. Proliferation was calculated as a percentage, comparing IACS-010759-treated to vehicle-treated cells. To compare the different clones,  $7.5 \times 10^3$  cells/well were plated in 24-well plates and treated with 1,000 nmol/L IACS-010759. After 96 hours, proliferation was quantified by cell count using the Coulter Counter (Beckman Coulter).

# **Apoptosis evaluation**

OVCAR3 and IGROV1 were treated with 1,000 nmol/L IACS-010759 and collected after 24, 48, and 72 hours. Apoptosis was evaluated using the eBioscience Annexin V-FITC Apoptosis Detection Kit.

### Statistical analysis

Statistical analyses were done with GraphPad Prism 7.0 software (GraphPad Software Inc., RRID:SCR\_002798). The tests used are indicated in the figure legends.

# Data availability statement

The data generated in this study are available within the article and its supplementary data files. Expression profile data analyzed in this study were obtained from Gene Expression Omnibus at GSE49997 and GSE56920.

# Results

# $\text{PGC1}\alpha$ and $\text{PGC1}\beta$ expression stratifies ovarian cancer subsets and distinguishes tumors with OXPHOS signature

PGC1 $\alpha$  and PGC1 $\beta$  expression was investigated in 204 ovarian cancer patient samples for which transcriptomic profiles were publicly available (GSE49997; ref. 23). The expression of PGC1 $\alpha$  and PGC1 $\beta$ (encoded by *PPARGC1A* and *PPARGC1B*, respectively) distinguished four equally distributed subsets (**Fig. 1A**; Supplementary Table S1): high or low levels of both transcripts, high PGC1 $\alpha$  but low PGC1 $\beta$ , and high PGC1 $\beta$  but low PGC1 $\alpha$ . These results were reproduced in three other independent datasets comprising an additional 775 ovarian cancer cases (Supplementary Table S1), confirming that they are representative of the clinical situation. PGC1 $\alpha$  and PGC1 $\beta$  expression



# Figure 1.

PGC1 $\alpha$  and PGC1 $\beta$  identify ovarian cancer with OXPHOS signature. **A**, Heatmap of PGC1 $\alpha$  and PGC1 $\beta$  expression in ovarian cancer patients (n = 204) from the GSE49997 dataset. **B**, Heatmap of genes positively correlated with PGC1 $\alpha$  and PGC1 $\beta$  expression in patients. Each column is one patient sample, and each row is the expression of each gene, expressed as Z-score, ranging from low (-1.5) to high (1.5). **C**, The biological processes enriched in patients with high PGC1 $\alpha$  and PGC1 $\beta$  expression. Pathway enrichment was defined from GO, and the Benjamini-Hochberg test was used to account for multiple testing. **D**, Heatmap of PGC1 $\alpha$  and PGC1 $\beta$  expression in our OC-PDX cohort (GSE56920 dataset; ref. 20) comprising 29 OC-PDX (62 samples). The samples included biological replicates from different mice and different anatomical locations: OC-PDX growing subcutaneously (s.c.) or intraperitoneally (i.p.) as malignant ascites (pea) or abdominal metastasis (mc). Each column is a xenograft sample, and each row is expression of each gene expressed as Z-score ranging from low (-1.5) to high (1.5). The focus reports PGC1 $\alpha$  and PGC1 $\beta$  expression in tumors growing ectopically or orthotopically (e.g., HOC84, s.c. vs. i.p.) or as cell suspension of solid masses (e.g., HOC78, pea vs. mc). **E**, Heatmap of genes positively correlated with PGC1 $\alpha$  and PGC1 $\beta$  expression in xenografts. **F**, The biological processes enriched in OC-PDX models expression high levels of PGC1 $\alpha$  and PGC1 $\beta$ .

did not correlate with any of the clinical features, tumor histotype (serous or not), grade (1, 2, or 3) or residual tumor (**Fig. 1A**), or with progression-free or overall survival.

The concomitant high expression of PGC1 $\alpha$  and PGC1 $\beta$  positively correlated with the high expression of a number of genes (**Fig. 1B**; Supplementary Table S2A) belonging to biological processes related to

ETC and ATP synthesis (*NDUFAB1*, *NDUFS1*, *CYCS*, *COX6A1*, *COX7C*, *ATP5L*, *ATP5H*, *ATP5I*, and *ATP5O*), the TCA cycle (*PDHA1*, *SDHC*, *OGDHL*, and *FH*), mitochondrion organization (*IMMT* and *CHCHD3*), and mitochondrial transmembrane transport system (*TIMM17A*, *TIMMB8*, and *TOMM40*, *PNPT1*, and *VDAC1*; **Fig. 1C**; Supplementary Table S2B).

Likewise, PGC1 $\alpha$  and PGC1 $\beta$  expression levels classified our ovarian cancer patient-derived xenografts (OC-PDX) in four groups. PGC1 $\alpha$  and PGC1 $\beta$  were simultaneously highly expressed in 10 of 29 OC-PDXs, but were detected at low levels in 12; four OC-PDXs expressed high PGC1 $\alpha$  but low PGC1 $\beta$ , and 3 expressed high PGC1 $\beta$ and low PGC1 $\alpha$  (**Fig. 1D**). PGC1 $\alpha$  and PGC1 $\beta$  expression was an intrinsic characteristic of each OC-PDX and did not change whether the tumors were growing in an ectopic or orthotopic site (e.g., OC-PDX HOC84; focus in **Fig. 1D**), or as malignant ascites or abdominal metastasis (e.g., OC-PDX HOC78; focus in **Fig. 1D**).

As demonstrated for the patients' tumors, the concomitant high expression of PGC1 $\alpha$  and PGC1 $\beta$  correlated with the enhanced expression of several genes involved in OXPHOS and mitochondrial metabolism (**Fig. 1E**; Supplementary Table S3). The overrepresented biological processes (**Fig. 1F**; Supplementary Table S4) paralleled those characterizing the clinical samples, comprising the respiratory chain (*NDUFA3*, *NDUFA5*, and *NDUFB11*; *CYC1*, *COX7b*, and *COX411*), ATP synthesis (*ATP5J2* and *ATP51*), and mitochondrion organization (*CHCHD3*, *ECS1T*, *RPL28*, *MRPL21*, and *SLC25A33*). PGC1 $\alpha/\beta$  expression also correlated with genes involved in glutamate biosynthesis (*GLS2* and *ALDH4A1*) and in the redox balance (*PARK7*).

These results suggest that the high expression of both PGC1 $\alpha$  and PGC1 $\beta$  identifies an overactivated mitochondrial gene program characterizing approximately 25% of the tumors from ovarian cancer patients, in accordance with the findings from a cohort of OC-PDX.

# High PGC1 $\alpha/\beta$ expression identifies ovarian cancers with oxidative metabolism

The metabolic phenotypes associated with the simultaneous high or low expression of PGC1 $\alpha$  and PGC1 $\beta$  (hereafter termed PGC1 $\alpha/\beta$ ) were investigated in selected OC-PDXs: HOC22, Y-HOC8, and HOC78 expressing high levels of PGC1 $\alpha/\beta$  and HOC10, HOC76, HOC79, and HOC84 expressing low levels (**Fig. 2A**; Supplementary Fig. S1A).

Expression of glycolysis-related genes (e.g., GLUT1, HK, and *LDHA*) was comparable between high and low PGC1 $\alpha/\beta$  expressing OC-PDXs (Fig. 2B), with similar amounts of lactate released in the ascites (Fig. 2C). Conversely, high PGC1 $\alpha/\beta$  xenografts overexpressed pyruvate dehydrogenase PDHA, which converts pyruvate to acetyl-CoA and initiates the TCA cycle, as well as components of the respiratory chain complexes [complex I NDUFA3, complex II succinate dehydrogenase complex subunit C (SDHC), complex III cytochrome C1 (*CYC1*), and ATP synthase *ATP5I*]. High PGC1 $\alpha/\beta$  levels were also associated with increased expression of the antioxidant superoxide dismutase 1 (SOD1), responsible for destroying free superoxide radicals, by-products of mitochondrial respiration, and of glutaminase (GLS), involved in the synthesis of glutathione (Fig. 2B). These results suggest that the genes involved in OXPHOS and detoxification of its by-products might be transcriptionally regulated by PGC1 $\alpha/\beta$ .

Further, PGC1 $\alpha/\beta$  expression also correlated with higher levels of genes involved in mitochondrial biogenesis (e.g., *NRF1* and *TFAM*; **Fig. 2B**). In accordance, TEM indicated that mitochondria were smaller but 75% more abundant in high PGC1 $\alpha/\beta$ -expressing OC-PDXs than the low PGC1 $\alpha/\beta$  OC-PDXs (**Fig. 2D**; Supplementary Fig. S1B). This was confirmed by MitoTracker staining and FACS analysis (Supplementary Fig. S1C). Consistent with these results, high PGC1 $\alpha/\beta$  OC-PDXs had higher OCR than low-expressing OC-PDXs (**Fig. 2E**).

To investigate to what extent these features were related to functional alterations of the central cellular metabolism, we tracked the intracellular fate of glucose, one of the main carbon sources for cell metabolism. Mice bearing HOC22, Y-HOC8 (high PGC1 $\alpha/\beta$ ), and HOC10, HOC84 (low PGC1 $\alpha/\beta$ ) were injected i.p. with <sup>13</sup>C-glucose and the isotopologs' distribution of 13-carbon incorporation in the downstream metabolites was assessed. M + 3 pyruvate levels were significantly lower in the high PGC1 $\alpha/\beta$  cells (Fig. 3A). High and low PGC1 $\alpha/\beta$  OC-PDXs showed no major differences in M + 3 lactate and alanine production, indicating that pyruvate was diverted not to lactate fermentation or alanine transamination, but to fuel mitochondrial oxidative metabolism (Fig. 3B). Glucose-derived isotopolog distribution of all TCA intermediates (citrate, succinate, fumarate, and malate) showed significantly higher levels in the high PGC1 $\alpha/\beta$  OC-PDXs (Fig. 3C). The elevated TCA cycling characterizing the high PGC1 $\alpha/\beta$ OC-PDXs was reflected in significant increases in all the isotopolog fractions (M + 2, M + 3, and M + 4) of intermediates as well as of metabolites derived from the former part of the TCA cycle, such as glutamate, and glutamine, compared with the low PGC1α/β OC-PDXs (Fig. 3D). There were no differences in aspartate generated from the latter part of the TCA cycle (Fig. 3D) between high and low PGC1 $\alpha/\beta$ OC-PDXs. The TCA biosynthetic flow was directed to the generation of glutamine and glutathione (GSH) whose levels were significantly higher in the high PGC1 $\alpha/\beta$  OC-PDXs than in the low PGC1 $\alpha/\beta$  OC-PDXs (Fig. 3E).

These results demonstrate that high expression of  $PGC1\alpha/\beta$  distinguishes OC-PDXs bearing a distinct metabolic profile with higher mitochondrial oxidative activity.

# PGC1 $\alpha$ and PGC1 $\beta$ regulate OXPHOS in ovarian cancer cells

The cause–effect relationship between PGC1 $\alpha/\beta$  expression and OXPHOS phenotype was investigated *in vitro*. OVCAR3 and IGROV1 cell lines were selected as representative of high or low PGC1 $\alpha/\beta$  expression. OVCAR3 expressed significantly higher levels of both transcripts and proteins than IGROV1 (**Fig. 4A**), and presented features of high oxidative metabolism, as demonstrated for the OC-PDXs. OVCAR3 cells expressed higher levels of genes encoding the ETC complexes, such as *NDUFA3*, *COX7B*, *CYCS*, *SDHC*, and *ATP51*, as well as of isocitrate dehydrogenase (*IDH1*), glutamine synthase (*GLUL*), and the glutamine transporter *SLC1A5* (**Fig. 4B**). OVCAR3 contained more mitochondria and produced more ROS than IGROV1 (**Fig. 4C**). Functionally, OVCAR3 had a higher OCR, as well as greater maximal and spare respiratory capacity than IGROV1 (**Fig. 4D**), confirming higher OXPHOS activity in high PGC1 $\alpha/\beta$  cells.

To prove the cause-to-effect linking PGC1 $\alpha/\beta$  expression to elevated OXPHOS metabolism, we generated isogenic PGC1 $\alpha$ and PGC1 $\beta$  KO OVCAR3 cells (PGC1 $\alpha$ -KO OVCAR3 and PGC1 $\beta$ -KO OVCAR3). Although complete KO was not obtained, at least 50% silencing was reached (**Fig. 4E**). PGC1 $\alpha$  and PGC1 $\beta$ silencing caused downregulation of OXPHOS-related genes, particularly those involved in the ETC (*CYCS*, *CYC1*, and *COXB7* and *ATP5I*; **Fig. 4F**). Seahorse analysis showed that basal OCR, maximal, and spare respiration were significantly reduced as a consequence of PGC1 $\alpha$  and PGC1 $\beta$  depletion compared with parental and ctr-KO OVCAR3 cells (**Fig. 4G**). This result implies that PGC1 $\alpha$  and PGC1 $\beta$  functionally regulate OXPHOS activity of OC.

# High PGC1 $\alpha/\beta$ expression correlates with better responsiveness to OXPHOS inhibition

We next investigated whether  $PGC1\alpha/\beta$  expression levels influenced the susceptibility of ovarian cancer cells to OXPHOS



# Figure 2.

PGC1 $\alpha$  and PGC1 $\beta$  expression is associated with an OXPHOS phenotype. **A**, PGC1 $\alpha$  and PGC1 $\beta$  transcript expression in cell aggregates from malignant ascites from OC-PDXs (mean  $\pm$  SD). **B**, Expression of glycolysis, mitochondrial biogenesis, and OXPHOS-related genes in cell aggregates from malignant ascites of high or low PGC1 $\alpha/\beta$  expressing OC-PDXs (median with range). **C**, Lactate concentration in the supernatant of malignant ascites (mean  $\pm$  SD). **D**, Mitochondrial content and mitochondrial volume in high PGC1 $\alpha/\beta$  HOC22 or low-expressing HOC10, measured by TEM. **E**, Oxygen consumption (mean  $\pm$  SD) in the high PGC1 $\alpha/\beta$  Y-HOC8 vs. the low-expressing HOC10. \*, P < 0.05; \*\*\*, P < 0.001; \*\*\*\*, P < 0.001, unpaired *t* test. At least three biological replicates were examined for each OC-PDX.

inhibition. To affect OXPHOS we used IACS-010759 (17), a recently developed, potent and selective small-molecule inhibitor of complex I of the mitochondrial ETC. IACS-010759 binds and inhibits the ubiquinone channel, blocking the activity of the complex I and thus OXPHOS. Preclinical studies showed that IACS-010759 is effective on acute myeloid leukemia and brain tumors addicted to OXPHOS (17).

IACS-010759 significantly impaired the proliferation of high PGC1 $\alpha/\beta$  OVCAR3 cells in a dose-dependent manner, starting from the 1 nmol/L dose. IGROV1 cell growth was not significantly affected

up to 10  $\mu$ mol/L IACS-010759 (**Fig. 4H** and **I**). Annexin V staining showed that OXPHOS inhibition by IACS-010759 induced apoptosis in OVCAR3, but not IGROV1 cells (Supplementary Fig. S2). Further proving the functional relationship between PGC1 $\alpha$  and PGC1 $\beta$  and sensitivity to OXPHOS inhibition, IACS-010759 poorly affected the proliferation of PGC1 $\alpha$ -KO and PGC1 $\beta$ -KO cells, similarly to low PGC1 $\alpha/\beta$  IGROV1 cells and contrarily to ctr-KO and parental OVCAR3 (**Fig. 4J** and **K**). These results indicate that PGC1 $\alpha$  and PGC1 $\beta$  are functionally implicated in the response to OXPHOS



## Figure 3.

Mitochondrial functionality is increased in high PGC1 $\alpha/\beta$ -expressing OC-PDX models. The scheme illustrates the fate of glucose <sup>13</sup>C atoms in glycolysis, TCA cycle intermediates and TCA-derived metabolites. Two high (Y-HOC8 and HOC22) and two low (HOC10 and HOC84) PGC1 $\alpha/\beta$ -expressing xenografts were injected i.p. with <sup>13</sup>C-glucose. **A** and **B**, Isotopolog distribution of pyruvate (M + 3), lactate (M + 3), and alanine (M + 3). **C**, Isotopolog distribution of intracellular intermediates of TCA: citrate, succinate, fumarate, and malate (M + 2, M + 3, M + 4). **D**, Isotopolog distribution of TCA-derived metabolites: aspartate, glutamine (M + 2, M + 3, M + 4). **E**, Total intracellular glutamine and glutathione levels. Bar plots represent mean ± SD for each isotopolog fraction. Significant differences (*P* < 0.05) between high (Y-HOC8 and HOC22) and low (HOC10 and HOC84) PGC1 $\alpha/\beta$ -expressing xenografts were analyzed by two-way ANOVA and Tukey multiple test and are marked as \*, #, \$, and & for M + 2, M + 3, M + 4 and total isotopolog fractions, respectively (three mouse replicates per model). C, carbon.

inhibition, and their high expression characterizes ovarian cancer more sensitive to OXPHOS inhibition.

# IACS-010759 inhibits ovarian cancer progression, prolonging the lifespan of mice bearing high PGC1 $\alpha/\beta$ -expressing xenografts

We studied the impact of PGC1 $\alpha/\beta$  stratification on the response to OXPHOS inhibition *in vivo* on three high PGC1 $\alpha/\beta$  expressing OC-PDXs (HOC22, Y-HOC8, and HOC78) and three low PGC1 $\alpha/\beta$  expressing OC-PDXs (HOC76, HOC79, and HOC10). OC-PDXs, growing orthotopically (i.p.), recapitulated the patient's disease, producing ascites and disseminating to the peritoneal organs, thus reproducing the clinical behavior (20, 24). Biological and malignant features (time to progression, production of malignant ascites, or degree of metastasis) did not significantly differ between high and low PGC1 $\alpha/\beta$  expressing OC-PDX (Supplementary Fig. S3).

OC-PDX-bearing mice were treated with 2.5 mg/kg IACS-010759 or vehicle in a maintenance regimen (Fig. 5), and the tumor progression and mice survival were evaluated. IACS-010759 was well tolerated, with no toxic effects (Supplementary Fig. S4). The pharmacological inhibition of OXPHOS significantly delayed the progression of the high PGC1 $\alpha/\beta$  expressing OC-PDXs. The necropsy of vehicle-treated mice at terminal sacrifice revealed a significantly high tumor burden, a sign of evident progression of the disease since randomization. In contrast, the abdominal tumor burden of mice undergoing IACS-010759 treatment, recorded at the corresponding median survival times of vehicle-treated mice (days 21, 40, and 34, respectively, for HOC22, Y-HOC8, and HOC78), was significantly lower and did not increase once the treatment started, a sign of disease stabilization (Fig. 5A, left). As a consequence, the life of high PGC1 $\alpha/\beta$  OC-PDX-bearing mice was significantly prolonged by 214%, 178%, and 163%, respectively, for HOC22, Y-HOC8, and HOC78 (Fig. 5A, right). At autopsy (days 66, 111, and 89.5 median survival times, respectively, for HOC22, Y-HOC8, and HOC78) mice had malignant ascites and abdominal tumor dissemination.



# Figure 4.

PGCI $\alpha/\beta$  regulate OXPHOS metabolism and responsiveness to the OXPHOS inhibitor IACS-010759. **A**, PGCI $\alpha$  and PGCI $\beta$  transcript expression and proteins in OVCAR3 and IGROV1 cells. **B**, Heatmap of OXPHOS-related gene expression in OVCAR3 compared with IGROV1. **C**, Mean fluorescence intensity of MitoTracker DeepRed and CellROX DeepRed dye (mean ± SD; 3 replicates/cell line). **D**, Basal, maximal OCR (at 0.25 µmol/L FCCP), and spare respiration capacity of OVCAR3 and IGROV1 (mean ± SD). **E**, PGCI $\alpha$  and PGCI $\beta$  protein levels and representative Western blot in OVCAR3, PGCI $\alpha$ -KO, and PGCI $\beta$ -KO OVCAR3. **F**, Relative expression of OXPHOS-related genes in OVCAR3 compared with PGCI $\alpha$ -KO OVCAR3 (4 independent clones) and PGCI $\beta$ -KO OVCAR3 (3 independent clones). **G**, Basal, maximal OCR (at 0.25 µmol/L FCCP) and spare respiration capacity of OVCAR3 (4 independent clones) and PGCI $\beta$ -KO OVCAR3 (3 independent clones). **G**, Basal, maximal OCR (at 0.25 µmol/L FCCP) and spare respiration capacity of OVCAR3 (4 independent clones) and PGCI $\beta$ -KO OVCAR3 (3 independent clones). **G**, Basal, maximal OCR (at 0.25 µmol/L FCCP) and spare respiration capacity of OVCAR3 (5 independent clones). **G**, Basal, maximal OCR (at 0.25 µmol/L FCCP) and spare respiration capacity of OVCAR3 (4 independent clones) and PGCI $\beta$ -KO OVCAR3 (3 independent clones). **G**, Basal, maximal OCR (at 0.25 µmol/L FCCP) and spare respiration capacity of OVCAR3 (4 independent clones) and PGCI $\beta$ -KO OVCAR3 (3 independent clones). **G**, Basal, maximal OCR (at 0.25 µmol/L FCCP) and spare respiration capacity of OVCAR3 (5 independent clones) and PGCI $\beta$ -KO OVCAR3 (5 independent clones). **G**, Basal, maximal OCR (at 0.25 µmol/L FCCP) and spare respiration capacity of OVCAR3 (5 independent clones) and PGCI $\beta$ -KO OVCAR3 (the mean line is indicated). **H** and **J**, Dose-response curves to IACS-010759 of OVCAR3 vs. IGROV1 (concentration range, 0.1 nmol/L-10 µmol/L; **H**) and of OVCAR3 vs. ctr-KO, PGCI $\alpha$ -KO, and PGCI $\beta$ -KO OVCAR3 vs. IGROV1 (1) or OVCAR3 vs. ctr-KO OVCAR3 and

Therapeutic benefit on advanced disease was also observed. In the HOC78-bearing mice, IACS-010759 started when the tumor burden was five times higher than in the previous experiment (i.e., 1.8 mL vs. 0.37 mL malignant ascites; Supplementary Fig. S5A and **Fig. 5A**), causing disease stabilization, as observed throughout the third week of treatment (day 46), delaying progression. Thus, the lifespan was increased from 37 days (vehicle-treated mice) to 67 days (IACS-010759-treated mice; Supplementary Fig. S5A).

Conversely, pharmacologic inhibition of OXPHOS did not affect the low PGC1 $\alpha/\beta$  OC-PDXs. IACS-010759 did not inhibit tumor progression of HOC79, HOC76-, and HOC10-bearing mice, and the gain of lifespan was negligible (19% for HOC79 and HOC76 and 7% for HOC10; **Fig. 5B**). IACS-010759 did not give any therapeutic benefit even at the dose of 7.5 mg/kg in HOC79-bearing mice (Supplementary Fig. S5B; a dose three times higher than that in **Fig. 5B**).

Altogether, the *in vitro* and *in vivo* results (Figs. 4 and 5) showed that high PGC1 $\alpha/\beta$  levels characterize tumors more addicted to OXPHOS metabolism and more susceptible to OXPHOS inhibition.

# IACS-010759 causes mitochondrial swelling and energy crisis in high PGC1 $\alpha/\beta$ OC-PDX

In line with the different response to the drug, IACS-010759 affected mitochondrial structure and energy production in different ways in high and low PGC1 $\alpha/\beta$  OC-PDXs. In the vehicle groups, mitochondria had a normal shape with numerous well-organized intact cristae (**Fig. 6A** and **B**). In the high PGC1 $\alpha/\beta$  HOC22, IACS-010759 significantly reduced the number of mitochondria (2.32  $\pm$  0.17 IACS-010759 vs. 3.35  $\pm$  0.23 vehicle, P < 0.01), which suffered severe damage, with partial or total cristolysis and massive swelling, resulting in a 30% increase in mitochondrial volume (0.087  $\pm$  0.006 IACS-010759 vs.



# Figure 5.

OXPHOS inhibition affects tumor growth and improves survival of high PGC1 $\alpha/\beta$  OC-PDX-bearing mice. OC-PDXs were transplanted i.p., and mice were randomized at different times after transplant, in relation to their growth: day 7 for HOC22, day 12 for Y-HOC8, day 14 for HOC78, day 6 for HOC79, and day 33 for HOC76 and HOC10. Mice were assigned to receive vehicle or IACS-010759 (2.5 mg/kg) in the maintenance regimen until sacrifice (5–10 mice per group). **A** and **B**, The effect on tumor burden and lifespan of high (**A**) and low (**B**) PGC1 $\alpha/\beta$ -expressing OC-PDX-bearing mice is shown. Left, tumor burden expressed as the volume of cell aggregates in ascites at the start of treatment, at terminal sacrifice and, for responding OC-PDXs, at an interim point corresponding to the median survival time of vehicle-treated mice (mean ± SD; one-way ANOVA multiple comparison). Right, Kaplan-Meier curves showing the effect of IACS-010759 on mice survival. The percentage increment of lifespan (%ILS) is indicated. Log-rank test. ns, not significant; \*, *P* < 0.05; \*\*, *P* < 0.01; \*\*\*, *P* < 0.001;

 $0.067 \pm 0.006$  vehicle, P < 0.05; Fig. 6A). In contrast, in the low PGC1\alpha/\beta HOC10, despite a reduction in mitochondrial abundance (1.38  $\pm$  0.10 IACS-010759 vs. 1.91  $\pm$  0.15 vehicle, P < 0.01), mitochondria were not damaged, and their structure was largely unaltered, as well as their volume (1.124  $\pm$  0.0127 IACS-010759 vs. 1.102  $\pm$  0.006, ns; Fig. 6B). As a consequence of the mitochondrial alterations in high PGC1\alpha/\beta expressing OC-PDXs, IACS-010759 led to a significant drop in ATP levels, while ATP production was not significantly affected in the low PGC1\alpha/\beta OC-PDXs (Fig. 6C). These results suggest that high PGC1\alpha/\beta OC-PDXs depend on OXPHOS as the primary way to produce energy. Therefore, affecting OXPHOS and mitochondria caused an energy crisis, which could not be overcome in the high-OXPHOS OC-PDXs.

# Discussion

Deregulated metabolism is a well-documented hallmark of cancer cells (1, 25). Mitochondrial OXPHOS exerts a key role in ensuring the ability to survive and grow in stressful conditions and in microenvironments depleted of nutrients (26). There is evidence suggesting that its targeting could be a promising therapeutic avenue (5, 7–11). However, the potential of this approach has not been investigated in ovarian cancer.

In the present work, we found that OXPHOS inhibition could be effective to manage ovarian cancer progression, and we identified PGC1 $\alpha$  and PGC1 $\beta$  as potentially reliable biomarkers predictive of the response.

In orthotopically growing OC-PDX preclinical models, pharmacologic inhibition of OXPHOS significantly constrained malignant progression and prolonged the lifespan of mice bearing tumors with high expression of both PGC1 $\alpha$  and PGC1 $\beta$  (PGC1 $\alpha/\beta$ ), indicating strong selective antitumor activity. The benefit was also retained in advanced disease, when the drug was given to mice with a heavy tumor burden. These findings may have a valuable impact in patient care considering that we found 25% of ovarian cancer patients' tumors express high levels of PGC1 $\alpha/\beta$  and that patients are frequently diagnosed at advanced stages when the disease has already spread through the peritoneum. The use of PGC1 $\alpha$  and PGC1 $\beta$  as biomarkers might permit the selection of patients likely to benefit most from OXPHOS inhibitors. These results are particularly attractive as OXPHOS inhibition is one of the new avenues for cancer treatment with the compendium of inhibitors rapidly expanding (27, 28).



#### Figure 6.

IACS-010759 affects mitochondria function only in high-expressing PGC1 $\alpha/\beta$  OC-PDX. High PGC1 $\alpha/\beta$  HOC22 and Y-HOC8 and low PGC1 $\alpha/\beta$  HOC10-bearing mice received two doses of vehicle or IACS-010759 (7.5 mg/kg orally) and were euthanized after 3 hours. **A** and **B**, Representative TEM mitochondrial pictures and quantification of mitochondria number and volume from high PGC1 $\alpha/\beta$  HOC22 (**A**) and low PGC1 $\alpha/\beta$  HOC10 (**B**) cell aggregates. Scale bar, 1 µm. **C**, ATP levels in cell aggregates from HOC22, Y-HOC8, and HOC10 ascites. Each point represents one mouse. Unpaired *t* test; \*, *P* < 0.05; \*\*, *P* < 0.01.

Notably, OXPHOS inhibition was effective on high  $PGC1\alpha/\beta$  OC-PDX independently from their sensitivity to platinum-based therapy (Supplementary Fig. S6A).

PGC1 $\alpha$  and PGC1 $\beta$  are transcriptional coactivators that regulate mitochondrial biogenesis and function in a variety of tissues (12). Their role in cancer is not univocal, but depends closely on tissueand context-specific determinants (14, 16). We demonstrated that PGC1 $\alpha/\beta$  expression is an inherent trait of each OC-PDX and does not correlate with malignant features, such as tumor burden or metastatic potential. However, their expression distinguishes the tumors with an overactivated OXPHOS gene program, mostly depending on mitochondrial metabolism as primary energy source. PGC1 $\alpha/\beta$  raise the mitochondrial content and functions-respiration and TCA cyclingand enhance antioxidant defense. Most importantly, we showed that high PGC1 $\alpha/\beta$  levels could generate metabolic vulnerabilities, boosting the sensitivity of tumors to OXPHOS inhibitors. IACS-010759 affected the *in vitro* proliferation of high PGC1 $\alpha/\beta$  OVCAR3 but not of PGC1 $\alpha$ - and PGC1 $\beta$ -silenced OVCAR3 cells, as well as low PGC1 $\alpha/\beta$ IGROV1. In vivo, we confirmed that IACS-010759 selectively induced mitochondrial damage in high PGC1 $\alpha/\beta$  OC-PDX, which were then unable to overcome the energy crisis and ATP depletion, impairing the tumor progression. We demonstrate that mitochondria of high and low PGC1 $\alpha/\beta$  tumors present basal structural differences and different expression of proteins involved in cristae organization and the mitochondrial transport system (Supplementary Tables S2 and S3), which can contribute to the enhanced susceptibility to OXPHOS inhibitors owing to higher or lower target access in the respiratory chain. High and low PGC1 $\alpha/\beta$  OC-PDXs shared metabolic features and drug sensitivity with the high- and low-OXPHOS ovarian cancer cell subsets, recently described in Gentric at al., where high-OXPHOS cells showed higher mitochondrial activity and enhanced sensitivity to the OXPHOS inhibitor metformin (29).

Analyzing public gene expression data (GSE64497 dataset; ref. 30), we found that SK-MEL-5 melanoma cells—highly responsive to IACS-010759 (31)—had higher PGC1 $\alpha/\beta$  expression than the low responsive A375 cells. Accordingly, high expression characterized a subset of melanoma cells with greater mitochondrial capacity (32), indicating that high expression of PGC1 $\alpha/\beta$  might be useful to define OXPHOS dependency and predict the responsiveness to OXPHOS inhibitors also in tumor types other than ovarian cancer.

It has also been demonstrated that BRAF inhibitors induce OXPHOS dependence in melanoma, through PGC1a upregulation (33). Inhibition of OXPHOS with phenformin synergizes with BRAF inhibitors and induces tumor regression (34). This suggests that it is worth exploiting OXPHOS inhibitors for the treatment of high PGC1 $\alpha/\beta$  tumors in combination therapies. When tested in combination with platinum (DDP) in a sequential schedule, IACS-010759 further prolonged mouse lifespan compared with the monotherapy, giving a survival advantage (Supplementary Fig. S6B). Thus, the combination between standard chemotherapy and OXPHOS inhibitors offer a suitable therapeutic option and call for more investigation. Recently, ovarian cancer therapy has been implemented by the introduction of PARP inhibitors, highly effective in homologous recombination-deficient (HRD) tumors (35). A recent study postulated an association between HRD and increased oxidative metabolism (36), that we also noticed in our OC-PDX cohort, where 78% BRCAdeficient OC-PDXs had high PGC1\alpha/\beta against only 7% BRCAproficient OC-PDX (Fig. 1D). The link between HRD and OXPHOS opens a new window for exploring the role of metabolism in the response to PARP inhibitors and lays the grounds for combinations with PARP and OXPHOS inhibitors.

Appropriate selection of patients is a major challenge in translating preclinically effective drugs to clinical trials. This may be particularly relevant for OXPHOS inhibitors since mitochondria-targeting agents can cause substantial side effects. To date, most of the available OXPHOS inhibitors target the complex I of ETC, but their use is limited by the elevated toxicity due to their off-target effects or poor biodistribution (37). Many efforts are ongoing to design more specific inhibitors (including IACS-010759 used in the present work) that can overcome these problems. Another limit for drugging mitochondrial OXPHOS is the incomplete understanding of the tumor contexts where OXPHOS is essential and the lack of tools to identify tumor metabolic vulnerability. Our work shows that PGC1/ $\beta$  expression might be exploited to predict the responsiveness to OXPHOS inhibitors, permitting patient stratification. We found that, analogous

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to OC-PDXs, high PGC1 $\alpha/\beta$  expression in patients' specimens did not correlate with the clinical features, progression-free or overall survival, but was significantly associated with an OXPHOS gene program and could therefore distinguish tumors mostly relying on mitochondrial metabolism. Our results point to these tumors as potential clinical responders for treatments targeting OXPHOS and endorse the use of PGC1 $\alpha$  and PGC1 $\beta$  as biomarkers, although further studies are needed for their validation and for designing appropriate screening tests.

## **Authors' Disclosures**

F. Chiaradonna reports grants from government agency outside the submitted work. G.F. Draetta reports personal fees from Frontier Medicines and Metabomed outside the submitted work. J.R. Marszalek reports a patent for WO 2014/031928 A2 issued to UT MD Anderson, and IACS-010759 development was supported in part by the MD Anderson Moon Shot program and through a collaboration between the IACS and TRACTION platforms. No disclosures were reported by the other authors.

#### **Authors' Contributions**

C. Ghilardi: Conceptualization, investigation, writing-original draft.
C. Moreira-Barbosa: Investigation. L. Brunelli: Investigation, methodology.
P. Ostano: Data curation, formal analysis. N. Panini: Investigation. M. Lupi:

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Investigation. A. Anastasia: Investigation. F. Fiordaliso: Investigation. M. Salio: Investigation. L. Formenti: Investigation. M. Russo: Investigation. E. Arrigoni: Investigation. F. Chiaradonna: Investigation. G. Chiorino: Data curation, formal analysis. G.Draetta: Resources, writing-review and editing. J.R. Marszalek: Resources, writing-review and editing. C.P. Vellano: Resources, writing-review and editing. R. Pastorelli: Supervision, writing-review and editing. M. Bani: Supervision, writing-review and editing. A. Decio: Funding acquisition, investigation, project administration. R. Giavazzi: Supervision, funding acquisition, writing-review and editing.

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