Bcl-xL enforces a slow-cycling state necessary for survival in the nutrient-deprived microenvironment of pancreatic cancer

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Running title: Dependencies of slow-cycling pancreatic tumor cells

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Abstract

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43 Solid tumors possess heterogeneous metabolic microenvironments where oxygen and

44 nutrient availability are plentiful ('fertile regions') or scarce ('arid regions'). While cancer

45 cells residing in fertile regions proliferate rapidly, most cancer cells in vivo reside in arid

46 regions and exhibit a slow-cycling state that renders them chemoresistant. Here, we

47 developed an in vitro system enabling systematic comparison between these

48 populations via transcriptome analysis, metabolomic profiling, and whole-genome

49 CRISPR screening. Metabolic deprivation led to pronounced transcriptional and

50 metabolic reprogramming, resulting in decreased anabolic activities and distinct

51 vulnerabilities. Reductions in anabolic, energy-consuming activities, particularly cell

52 proliferation, were not simply byproducts of the metabolic challenge but rather essential

53 adaptations. Mechanistically, Bcl-xL played a central role in the adaptation to nutrient

54 and oxygen deprivation. In this setting, Bcl-xL protected quiescent cells from the lethal

55 effects of cell cycle entry in the absence of adequate nutrients. Moreover, inhibition of

56 Bcl-xL combined with traditional chemotherapy had a synergistic anti-tumor effect that

57 targeted cycling cells. Bcl-xL expression was strongly associated with poor patient

58 survival despite being confined to the slow-cycling fraction of human pancreatic cancer

59 cells. These findings provide a rationale for combining traditional cancer therapies that

60 target rapidly cycling cells with those that target quiescent, chemoresistant cells

61 associated with nutrient and oxygen deprivation.

62

63 **Statement of Significance**

64 The majority of pancreatic cancer cells inhabit nutrient- and oxygen-poor tumor regions

65 and require Bcl-xL for their survival, providing a compelling anti-tumor metabolic

66 strategy.

67

Introduction

Uncontrolled proliferation is a hallmark of cancer, and thus most existing therapeutic strategies have been designed to target rapidly cycling cancer cells. However, the majority of cancer cells in solid tumors do not proliferate at any given time (1,2). The biology of these slow-cycling cancer cells is poorly characterized and rarely modeled despite the strong correlation between quiescence and therapy resistance (3,4). Filling this knowledge gap is critical, as a better understanding of the slow-cycling population of cancer cells could reveal new therapeutic opportunities, including drugs that could complement existing treatments.

The spatial distribution of rapidly and slowly cycling cells in solid tumors is not uniform. Rather, cancer cells exist in a continuum of metabolic microenvironments based on their proximity to patent blood vessels and nutrient access: a proximal (well-perfused) zone enriched for rapidly cycling tumor cells, an intermediate (poorly-perfused) zone dominated by viable slow-cycling cells, and a distal (non-perfused) zone with high levels of necrosis (5–7). Such metabolic zonation, characterized by varying levels of blood-borne nutrients and growth factors, likely dictate the proliferative and biosynthetic state of cancer cells (2,8,9).

Existing models of nutrient deprivation use cell culture conditions with a reduced abundance of specific nutrients including glucose, amino acids, growth factors, and oxygen (10,11), enabling the application of genetic screening (12–16). Whereas these studies have identified dependencies resulting from the absence of single or paired nutrients, cancer cells in poorly perfused regions of a tumor most likely suffer from the simultaneous deprivation of many nutrients and oxygen. This distinction is important

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91 because tumor cells deprived of one nutrient can possibly survive through the utilization

92 of other compensating metabolic pathways. Moreover, cells grown under most

93 previously reported conditions continued to proliferate and thus do not fully model the

94 slow-cycling and chemoresistant population.

95   Here, we established an *in vitro* experimental system to model the nutrient- and

96 oxygen-deprived metabolic microenvironments of pancreatic tumors to understand how

97 cancer cells adapt to comprehensive metabolic deficits. Through unbiased genetic

98 screening, molecular profiling, and functional validation, we have identified

99 vulnerabilities specific to metabolically deprived slow-cycling cancer cells and

100 associated therapeutic opportunities.

101

Materials and Methods:

Cell culture

Human pancreatic and colorectal cancer cell lines were obtained from Anil Rustgi

(University of Pennsylvania). MDA-MB-231 breast cancer cells were obtained from

Andy Minn (University of Pennsylvania). Mouse MH6620c1 were previously isolated

from late-stage primary tumors in C57BL/6 KPCY mice and generated by limiting

dilution as described (17) and tested by the Research Animal Diagnostic Laboratory

(RADIL) at the University of Missouri, using the Infectious Microbe PCR Amplification

Test (IMPACT) II. Cultures were regularly tested using the MycoAlert Mycoplasma

Detection Kit (Lonza,). Tumor cells were cultured under "fertile" or "arid" conditions

using the following formulas:

Fertile conditions: Dulbecco's modified Eagle's medium (DMEM) (high glucose without

sodium pyruvate) with 10% fetal bovine serum (FBS) (Gibco), glutamine (2 mM) and

penicillin/streptomycin (1%) in 20% oxygen. Cells were passaged when 70-80%

confluent.

Arid conditions: Basal media was prepared by dissolving 11g of DMEM without amino

acids/glucose/pyruvic acid (D9800-26, US biological) into 1L of Distilled water (WFI

grade) pH adjusted to 7.0-7.1. Basal media was mixed with DMEM containing amino

acids without glucose/sodium pyruvate (Gibco) at a 1:4 ratio (to 20%) to which was

added 0.5% fetal bovine serum (Gibco) 2.5mM glucose, 25mM HEPES (Gibco) 1%

penicillin/streptomycin (Gibco), 0.2% Non-essential amino acids (Gibco), and 0.4 mM

glutamine (Gibco). Cells were plated at 37,500 cells/cm^2 in all arid experiments and

7

125 cultured under 1% oxygen (Heracell 150i Thermo) with daily media replacement and

126 without passaging.

127

128 **Flow cytometry**

129 <u>Assessment of viability</u>

130 For assessment of viability, media was collected from culture before harvest and

131 combined with the pellet of the cells dissociated by trypsin. Cells were washed with PBS

132 and Annexin staining buffer, stained with Annexin-V-APC (eBioscience) for 15 minutes,

133 washed and incubated with propidium Iodide (PI) or DAPI as specified in each

134 experiment.

135 <u>EdU and OPP labeling *in vitro*</u>

136 Tumor cells were pulsed with 10 μM EdU 24hrs before endpoint or 50 μM OPP 1hr

137 before endpoint, followed by trypsinization, staining with Live/Dead Fixable Aqua stain

138 kit (Thermo) and fixation with the FoxP3 transcription factor staining buffer set

139 (eBioscience). Cells were then stained using the Click-iT reaction solution (100 mmol/L

140 Tris-HCl pH 8.5, 4 mmol/L $CuSO_4$, 100 mmol/L ascorbic acid) for 30' at room

141 temperature and analyzed by flow cytometry.

142 <u>PKH proliferation kinetics assay</u>

143 Tumor cells were trypsinized and stained with PKH26 (Sigma) or PKH67 (Sigma)

144 according to the manufacturer's protocol. Briefly, cells were stained with dye for 3

145 minutes, washed with serum and seeded under fertile conditions. Tumor cells were

146 sampled 24hrs later (t0) and cells were then cultured under fertile or arid conditions for

8

147　14-21 days depending on the experiment. Tumor cells were stained with DAPI and

148　analyzed by flow cytometry at various timepoints to derive population doubling times.

149　Competition assays

150　Competition assays were performed by mixing EV cells and genetically modified cells at

151　1:1 ratio. Cells were sampled at day 0 by FACS to account for initial distributions and all

152　subsequent measurements were normalized to day 0. For competition assays starting

153　under arid conditions, PANC-1 cells expressing spCAS9 were transduced with sgBcl-

154　xL-mCherry or non-targeting-mCherry vectors at a pre-calculated titer such that ~50% of

155　the cells were transduced as determined by mCherry expression at day 4 post

156　transduction by flow cytometry.

157

158　**Pharmacological studies *in vitro***

159　For drug sensitivity assays, cells in the fertile culture were seeded on 12-well dishes at

160　18,000 cells/cm^2 and treated with selected drugs 24hrs later. The arid group was

161　cultured for 0 (acute arid) or 14 (chronic arid) days under arid conditions prior to drug

162　treatment. Cells supplemented daily for 4-5 days with fresh media supplemented with

163　various drugs including: Gemcitabine (Pfizer), PHA-767491 (Cayman chemical),

164　Silvestrol (Biovision), CPI-613 (Cayman chemical), UK 5099 (Cayman chemical) or A-

165　1155463 (Cayman chemical) or vehicle (0.2% DMSO). Tumor cells were fixed at day 0

166　or endpoint (day 4-5) with paraformaldehyde 4% stained with 3 μM Hoecsht 33342

167　(Thermo) for 30' at 37C and quantified using a fluorescence plate reader (Molecular

168　devices) to assess cell numbers. Cell density was normalized for day 0 of each group.

9

169   For pharmacological inhibition of biosynthesis under serum repletion, treatment initiated

170   with switch to arid conditions (acute arid) and cells were treated for 72hrs before

171   readouts. Drugs used in that study include: Abemacicilib (MedChem Express),

172   Rapamycin (ApexBio), Torin1 (MedChem Express) and Cycloheximide (Sigma).

173

174   **CRISPR-Cas9 screen**

175   Cas9 was introduced to the PANC-1 cell line by transduction of the lentiCas9-Puro

176   construct (Addgene plasmid #52962), and selected with 10µg/mL blasticidin. 320 million

177   Cas9 expressing cells were transduced with the Brunello sgRNA library (18) at a MOI of 0.3

178   such that ~30% of cells were puromycin resistant yielding 300x coverage of the sgRNA

179   library. T0 samples were collected by FACS 3 days post-transduction. Cells were selected

180   under fertile conditions in the presence of puromycin 2µg/ml for additional 5 days to

181   achieve complete puromycin selection and cultures were separated for culture under fertile

182   or arid conditions as described above (See results section). Genomic DNA from half of the

183   cell pellets representing 150x coverage was processed for library generation. DNA was

184   extracted by incubation with NK lysis Buffer (50 mM Tris, 50 mM EDTA, 1% SDS, pH 8)

185   and 20 mg/ml Proteinase K (Qiagen 19131) at 55 °C overnight, followed by incubation with

186   10 mg/ml RNAse A (Qiagen 19101) at 37 °C for 30 minutes and protein precipitation using

187   7.5M ammonium acetate (Sigma A1542). Precipitate was vortexed and then centrifuged

188   at ≥ 4,000 x g for 10 minutes, washed with 100% isopropanol, and 70% ethanol and the

189   pellet was air dried and resuspended in 1x TE buffer (Sigma T9285).Libraries were

190   constructed according to previously described protocols (19). Briefly, sgRNAs were

191   amplified over 24 cycles with Herculase II fusion DNA polymerase (Agilent) per

192   manufacturer specifications with PCR#1 forward and reverse primers. Each reaction

193   included 5µg of genomic DNA, and multiple PCR reactions were run in parallel such that all

194   extracted genomic DNA was used to maintain library coverage. PCR reactions were then

195   pooled for each sample, and 5 µl of each pooled PCR#1 sample was used as a template

196   for PCR#2, which added Illumina P5/P7 adapters, barcodes, and staggers for nucleotide

197   complexity. For PCR#2, template was amplified over 7 cycles with PCR#2 forward and

198   reverse primers, and the resulting reactants were column purified with the QIAquick PCR

199   purification kit (Qiagen) and gel extracted with the QIAquick gel extraction kit (Qiagen). The

200   barcoded libraries were then pooled at an equal molar ratio and sequenced on a

201   NextSeq500/550 sequencer (Illumina, 150 cycles High Output kit v2.0) to generate 150 bp

202   single end reads. MAGeCK software was used for analysis. Briefly, the resulted

203   sequencing data were de-barcoded, merged, and the 20 bp sgRNA sequence was aligned

204   to the reference sgRNA library without allowing for any mismatches. The read counts were

205   calculated for each sgRNA with normalization to the non-targeting sgRNAs. Differential

206   analysis of sgRNA and targeted genes was done following the MAGeCK pipeline with

207   standard parameters. Pathway analysis of identified genes were done using EnrichR

208   (https://maayanlab.cloud/Enrichr/). Detailed Scripts and parameters used for each step of

209   analysis could be provided by request to the authors.

210   Primers used for library preparation:

211

| PCR #1 forward | AATGGACTATCATATGCTTACCGTAACTTGAAAGTATTTCG |
| PCR #1 reverse | CTTTAGTTTGTATGTCTGTTGCTATTATGTCTACTATTCTTTCC |

212

213   Note: italicized = stagger sequence; bold = barcode sequence

| Sample | PCR #2 forward primer sequence |
| d0 | AATGATACGGCGACCACCGAGATCTACACTCTTTCCCTACACGACGCTCTT |

11

	CCGATCT*ACGATCGAT***TCCTTGGT**TCTTGTGGAAAGGACGAAACACCG
d9 fertile	AATGATACGGCGACCACCGAGATCTACACTCTTTCCCTACACGACGCTCTT CCGATCT**TACAGGTAT**TCTTGTGGAAAGGACGAAACACCG
d30 arid	AATGATACGGCGACCACCGAGATCTACACTCTTTCCCTACACGACGCTCTT CCGATCT*AT***CTAACTCG**TCTTGTGGAAAGGACGAAACACCG
d30 fertile	AATGATACGGCGACCACCGAGATCTACACTCTTTCCCTACACGACGCTCTT CCGATCT*GAT***AACAATGG**TCTTGTGGAAAGGACGAAACACCG
d32 fertile	AATGATACGGCGACCACCGAGATCTACACTCTTTCCCTACACGACGCTCTT CCGATCT*CGAT***ACTGTATC**TCTTGTGGAAAGGACGAAACACCG
d53 arid	AATGATACGGCGACCACCGAGATCTACACTCTTTCCCTACACGACGCTCTT CCGATCT*TCGAT***AGGTCGCA**TCTTGTGGAAAGGACGAAACACCG
d53 fertile	AATGATACGGCGACCACCGAGATCTACACTCTTTCCCTACACGACGCTCTT CCGATCT*CGATCGAT***CCAACATT**TCTTGTGGAAAGGACGAAACACCG

214

PCR #2 reverse primer sequence
CAAGCAGAAGACGGCATACGAGATGTGACTGGAGTTCAGACGTGTGCTCTTCCGATCT TCTACTATTCTTTCCCCTGCACTGT

215

216   Processed read counts from the CRISPR screen are presented in Table S1.

217

218   **RNA-seq analysis**

219   RNA samples were extracted using the Qiagen RNeasy Kit, following manufacturer's

220   instructions. RNA samples were sent for library preparation and next generation

221   sequencing by Novogene (California, USA). Raw counts of gene transcripts were derived

222   from fastq files using an alignment-independent quantification tool, Salmon

223   (https://combine-lab.github.io/salmon/), with standard settings. The raw count matrix was

224   then imported into R-studio and utilized as input for DESeq2 analysis for normalization,

225   differential gene expression analysis, and principal component analysis. The output of

226   DESeq2 was used as the input for pre-ranked based GSEA for enrichment of functional

227   pathways and gene signatures (https://www.gsea-msigdb.org/gsea/index.jsp). Detailed

228   Scripts and parameters used for each step of analysis can be provided by the authors upon

229   request.

230

Expression analysis and overall survival analysis in human samples

Analysis of the expression of *BCL2L1* across different types of cancer and normal tissues, and correlation with overall survival, was done using an online tool, Gene Expression Profiling Interactive Analysis (GEPIA) (http://gepia.cancer-pku.cn/). Analysis of the expression of *BCL2L1* in proliferating and quiescent cancer cells using published single cell RNA-seq datasets of human pancreatic cancer samples was done using Seurat (https://satijalab.org/seurat/). The output of Seurat-based differential gene expression analysis was used as the input for pre-ranked based GSEA for enrichment of functional pathways and gene signatures (https://www.gsea-msigdb.org/gsea/index.jsp). Detailed Scripts and parameters used for each step of analysis can be provided by the authors upon request.

Metabolomics

Metabolomic Extraction

Metabolomic extraction from cells was done as described (20) et al. 1 mL of cold 80% MeOH from -80˚C, 40 µL of Metabolomics ISTD mix were added to each plate (Table S2). Cells were scraped and transferred to microcentrifuge tubes in ice. Samples were pulse-sonicated in ice with a sonic dismembranator (Fisher Scientific, Waltham, MA) for 30 sec, incubated on ice for 10 min, and then pulsed again for 30 sec. Samples were pelleted by centrifugation at 6000 x *g* for 5 min at room temperature. 500 µL of supernatant was moved to a clean microcentrifuge tube, dried under nitrogen, and

13

252 resuspended in 50 μL of 5% (w/v) SSA in water. 3 μL injections were used for LC-

253 HRMS analysis.

254 <u>Metabolomic LC-HRMS</u>

255 Metabolites were separated using a XSelect HSS C18 column (2.1 mm x 150 mm, 3.5

256 μm particle size) (Waters, Milford, MA) in an UltiMate 3000 quaternary UHPLC (Thermo

257 Scientific, Waltham, MA) equipped with a refrigerated autosampler (5°C) and column

258 heater (50°C). Solvent A consisted of water with 5 mM DIPEA and 200 mM HFIP and

259 Solvent B consisted of MeOH with 5 mM DIPEA and 200 mM HFIP. Flow gradient

260 conditions were as follows: 0% B for 6 min at 0.18 mL min^{-1}, increased to 1% B for 2

261 min at 0.2 mL min^{-1}, increased to 2% B for 4 min, increased to 14% B for 2 min,

262 increased to 70% B for 2 min, increased to 99% B for 1 min, increased flow rate to 0.3

263 mL min^{-1} for 0.5 min, increased flow rate to 0.4 mL min^{-1} for 4 min, then washed by

264 decreasing to 0% B for 2.3 min at 0.3 mL min^{-1}, decreased to 0.2 mL min^{-1} for 0.2 min,

265 and ending with flow of 0.18 mL min^{-1}. Samples were analyzed using a Q Exactive HF

266 (QE-HF) (Thermo Scientific, Waltham, MA) equipped with a heated electro-spray

267 ionization (HESI) source operated in the negative ion mode as described by Frederick

268 et al. Column effluent was diverted to the QE-HF from 0.5 to 19 min and then to waste

269 for the remaining time of the run.

270

271 **Timelapse microscopy**

272 PANC-1 WT and Bcl-xL KO cells tagged with the FUCCI-PIP reporter (Addgene

273 #138715, (21) were seeded on 12-well plates (Falcon), cultured under arid conditions

274 for 48hrs and imaged for additional 48hrs hours via EVOS Auto FL2 microscope

14

275 (ThermoFisher) under 1% or 20% oxygen and images acquired hourly. Time-lapse

276 movies were constructed via ImageJ and quantification of cell cycle transitions and cell

277 death was done manually.

278

279 **ATP measurements**

280 For ATP measurements, 10,000 tumor cells were seeded in parallel on standard (for

281 cell numbers) or opaque (for ATP) 96 well plates and cultured under fertile or arid

282 condition for 3 or 14 days. ATP was then assessed using CellTiter-Glo (Promega) and

283 cell numbers were quantified by Hoechst 33342 staining as described above to derive

284 ATP/cell ratios.

285

286 **Western blots**

287 Cells were washed with ice-cold phosphate-buffered saline (PBS) and lysed in RIPA

288 buffer (Cell signaling technology). Equal amounts of protein were run in reducing

289 conditions on 4–20% Mini-PROTEAN gels (Bio-Rad) and transferred to Immun-Blot

290 PVDF Membrane (Bio-Rad). Blocking was performed in 5% non-fat dry milk for 1 hour

291 at room temperature. After blocking, membranes were incubated in primary antibody

292 diluted in 5% non-fat dry milk overnight at 4°C. After PBS-T washes, membranes were

293 incubated with secondary antibody diluted in 5% non-fat dry milk at room temperature

294 for 1 hour. Following PBS-T washes, membranes were soaked in ECL or ECL plus

295 (Pierce) kits depending on the target and imaged with Chemi-doc imaging system (Bio-

296 Rad). Antibodies used: Monoclonal mouse S6 1:1000 (Cell signaling technology,

297 2317S), Polyclonal Rabbit Phospho S6 Ribosomal Protein (Ser235/236) 1:1000 (Cell

298   signaling technology 2211S), Monoclonal mouse α-tubulin 1:5000 (Cell signaling

299   technology 3873S, c-myc, Rabbit polyclonal Bcl-xL 1:1000 (Proteintech 10783-1-AP),

300   Rabbit polyclonal 1:1000 Mcl-1 (Proteintech 16225-1-AP).

301

302   **Immunofluorescence and microscopy**

303   <u>Tissue processing and Immunohistochemistry</u>

304   Tumors were fixed by 4% paraformaldehyde for 24hrs, followed by incubation in 30%

305   sucrose for 24hrs, embedding in OCT and freezing on dry ice. Frozen sections (7μm)

306   were obtained using a cryostat (Leica) and stored at -80C. For staining, sections were

307   thawed, blocked in 0.3% triton-X with 5% normal donkey serum for 1hr, incubated

308   overnight with rat monoclonal Ki-67 (ebiosciences,1:100), rabbit polyclonal cleaved

309   caspase 3 antibody (Cell signaling technology,1:200), rabbit G0S (Proteintech 1:100),

310   rabbit FABPS (Proteintech 1:100)or rabbit UPAR (Proteintech 1:400)   in 5% donkey

311   serum in PBST 0.1%. Sections were then washed, incubated with secondary antibodies

312   and DAPI for 1hr and mounted. For EdU staining, samples were permeabilized with

313   0.5% Triton-X for 20 minutes, washed and incubated with buffer containing 100 mmol/L

314   Tris-HCl pH 8.5, 8 mmol/L $CuSO_4$, and 100 mmol/L ascorbic acid for 30' at room

315   temperature followed by immunostaining as described. Whole-tumor sections were

316   visualized using a LSM710 equipped with a X20 objective and robotic stage. Images

317   were quantified using ImageJ. To calculate distance from perfused blood vessels,

318   dextran pixels were thresholded to create a 32-bit EDM map. For each analysis, pixels

319   of choice (e.g GFP+, mCherry+, GFP+CC+ pixels etc.) were thresholded and overlaid

320   on EDM maps to derive spatial histograms of each type of pixel. Percentages of Ki-67+

16

321 and CC3+ pixels in tumor cells was defined as the ratio of co-localizing pixels (Ki-67 or

322 CC3)/total tumor pixels derived from spatial histograms.

323 Immunocytochemistry

324 Tumor cells were fixed with 4% paraformaldehyde for 15', blocked with 5% donkey

325 serum for 1hr and stained overnight at 4C with Ki-67 (eBioscience, 1:100) or rabbit

326 polyclonal phospho-S6 (Cell Signaling Technology 1:400) in 5% donkey serum in PBST

327 0.1%, stained with secondary antibody and DAPI and imaged by EVOS Auto FL2

328 microscope (ThermoFisher)

329

330 **Lentivirus transduction of tumor cells for CRISPR-mediated ablation**

331 Cell lines were first transduced with Lentspicas9-puro (Addgene plasmid #108100; (22))

332 or Lenti-v2-cas9-GFP (Addgene plasmid #82416; (23)). sgRNAs were cloned into

333 LRGFP (Addgene plasmid #65656; (24)) or LRmcherry (a gift from Shi Junwei). Tumor

334 cells modified to expressed spCas9 were transduced with sgRNAs derived from the

335 following primer sequences:

Target gene	Forward primer	Reverse primer
Human TSC2-1	caccgCAGCATCTCATACACACGCG	aaacCGCGTGTGTATGAGATGCTGc
Human TSC2-2	caccgCCTCTACAGGAACTTTGCCG	aaacCGGCAAAGTTCCTGTAGAGGc
Human Bcl-xL1	caccgCAGGCGACGAGTTTGAACTG	aaacCAGTTCAAACTCGTCGCCTGc
Human Bcl-xL2	caccgGACCCCAGTTTACCCCATCC	aaacGGATGGGGTAAACTGGGGTCc
Mouse Bcl-xL	caccgAGTAAACTGGGGTCGCATCG	aaacCACATGTGTGCTAGGATCAGc
Non-targeting	caccgGCTTGAGCACATACGCGAAT	aaacATTCGCGTATGTGCTCAAGCc

336

337 All lentiviral and retroviral vectors were transfected into 293T cells using 1mg/ml PEI,

338 and virus was harvested 48hrs and 72hrs later. Viral particles were transduced into cells

339 using 4ug/ml polybrene.

17

340

Autophagy

PANC-1 cells were transduced with a pBABE-puro mCherry-EGFP-L3CB (Addgene

plasmid #22418; (25)). At day 14, tumor cells were analyzed by flow cytometry and the

ratio of mCherry/GFP fluorescence was measured.

345

Macropinocytosis.

PANC-1 cells were seeded onto glass coverslips and grown under fertile conditions for

24hours or arid conditions for 14 days. Media was then switched to arid media

containing 1mg/ml TMR-dextran (D1818, Invitrogen) for 30 minutes at 37°C. At the end

of the incubation period, cells were rinsed five times in cold PBS and immediately fixed

in 3.7% formaldehyde. Cells were DAPI-treated to stain nuclei and coverslips mounted

onto slides using Aquamount (Thermo). Images (x63 oil lense,0.7μm optical-sections)

were captured by confocal microscopy using a LSM880 (Zeiss) and analyzed using the

'Analyze Particles' feature in ImageJ (NIH). 3 fields were analyzed for each

experimental group in each experiment.

356

Animal studies

Kras$^{LSL-G12D}$; p53$^{L/+}$; Pdx1-cre; Rosa26$^{YFP/YFP}$ (KPCY) mice have been described

previously. 6- to 8-week-old C57BL/6J (male) or NOD.SCID (male and female) mice

were purchased from The Jackson Laboratories and Charles River Laboratories,

respectively, for tumor cell injection experiments. All vertebrate animal experiments

were conducted in compliance with the National Institutes of Health guidelines for

18

363   animal research and approved by the University of Pennsylvania Institutional Animal

364   Care and Use Committee (IACUC).

365   <u>Evaluation of proliferation in differentially perfused regions</u>

366   To estimate proliferation and cell death in differentially perfused regions, mice bearing

367   KPCY tumors (~10mm in diameter) were injected 4 times with 10mg/kg EdU over a

368   period of 48 hours in 12-hour intervals. Mice were injected with 70 kDa TMR-dextran

369   (Invitrogen) 30 minutes prior to sacrifice and 2 different sections per mouse, 5 well-

370   perfused and 5 poorly perfused regions were evaluated for proliferation and apoptotic

371   markers by manual counting of YFP+ cells.

372   <u>Establishment and evaluation of tumor xenografts</u>

373   Cells containing EV-GFP and Bcl-xL KO-mCherry clones $8x10^6$ cells in DMEM were

374   inoculated into the flanks of NOD.SCID mice (males and females) and tumor size was

375   measured by calipers starting 6 weeks post implantation. Proliferation and cell death

376   were measured in 2 separate sections per mouse.

377   <u>Competition assay in vivo</u>

378   EV-GFP and Bcl-xL KO-mCherry cells (non-clonal) were mixed at a 1:1 ratio 24hr

379   before implantation and proportions were confirmed by flow cytometry. A mixture

380   containing $8x10^6$ cells in DMEM was inoculated into the flanks of NOD.SCID mice

381   (males and females) and harvested when tumors reached 7-9mm in diameter. TMR-

382   dextran 70 kDa was injected retro-orbitally 30 minutes prior to sacrifice. For each

383   mouse, 2 sections representing different regions of the tumor were analyzed for relative

384   thresholded area and spatial distribution (relative to dextran signal) of EV-GFP and Bcl-

385   xL KO-mCherry cells.

386 <u>Intra-tumoral injections</u>

387 PANC-1-GFP xenografts were established by injection of 8×10^6 cells in DMEM into the

388 flanks of male or female NOD.SCID mice. Tumors were allowed to grow to 7-9mm in

389 diameter and then injected intratumorally using a 27g needle with 50µl with either PBS,

390 A-1155463 (Cayman chemical, 1.25mg/ml) in buffer containing 10% DMSO, 40%

391 PEG300, 5%I T80, 45% Saline, Buffer alone Gemcitabine (Pfizer, 1mg/ml) + albumin-

392 conjugated paclitaxel (Abraxis, 0.6mg/ml) at a rate of ~50µl/minute. 24 hours post

393 injection, Texas red-dextran 70 kDa was injected retro-orbitally 30 minutes prior to

394 sacrifice. 4-6 sections per mouse (from different regions) were evaluated for apoptosis

395 rates in GFP+ cells.

396 <u>Long term drug treatment</u>

397 MH6620c1 subcutaneous tumors were established by inoculation of 3×10^5 cells in

398 DMEM to the flanks of C57BL/6J male mice and allowed to grow to 6-9mm. Mice were

399 then randomly assigned to one of four groups receiving the following treatments:

400 120mg/kg Gemcitabine (Pfizer) + 120mg/kg Nab-Paclitaxel (Abraxis) twice-weekly

401 intraperitoneally, 10mg/kg of A-1331852 ChemieTek) in buffer containing 10% ETOH,

402 27.5% PEG400 and 60% Phosal 50G by oral gavage, Combined chemotherapy+ A-

403 1331852, A-1331852 buffer alone by gavage+PBS injection. Tumor size was measured

404 by calipers.

405

406 **Statistical analysis**

407 Comparisons between two groups were performed using Students' unpaired t test. One

408 way ANOVA with Dunnett, Holm Sidak, corrections for multiple testing was applied as

20

409   described for each analysis. All statistical analyses were performed with Graphpad

410   Prism 9 (GraphPad). Error bars show standard error of the mean (SEM) unless

411   otherwise indicated., and $p<0.05$ was considered statistically significant. * indicates

412     $p<0.05$, ** $p<0.01$, *** $p<0.001$, and **** $p<0.0001$. ns denotes not significant. For

413   sequencing experiments, DESeq2 (26)) was used to generate adjusted p-values

414   (FDR). For TCGA survival analysis, KM plotter (27) was used to generate logrank P-

415   values.

416

417   **Data Availability Statement**

418   The data generated in this study are publicly available in Gene Expression Omnibus

419   (GEO) under the accession number GSE176076 or are available within the article and

420   its supplementary data files.

421

Results

Modeling metabolic heterogeneity in pancreatic cancer

Pancreatic ductal adenocarcinoma (PDAC) is a highly nutrient-depleted and hypoxic tumor type due to its dense stroma and low vascularity (28–31). As a result, most PDAC cancer cells cycle slowly *in vivo* (32–35). The altered metabolic milieu within tumors (36) stands in contrast to standard culture conditions, where PDAC cancer cells have access to supraphysiological quantities of amino acids, sugars, lipids, oxygen, and growth factors and exhibit a high proliferative index. We therefore hypothesized that the low proliferation rate of cancer cells *in vivo* reflects a reduced availability of blood-borne oxygen and nutrients. To test this, we introduced 70 kDa Texas Red-conjugated dextran into autochthonous pancreatic tumor-bearing KPCY animals (32) by intravenous (IV) injection and measured red fluorescence as a surrogate for perfusion (Fig. S1A). We then identified regions that were dextran-high ("well perfused") or dextran-low ("poorly perfused") (see Methods) and compared rates of tumor cell proliferation by measuring 5-ethynyl-2'-deoxyuridine (EdU) incorporation and Ki-67+ staining in YFP+ cancer cells. As expected, cancer cells in well-perfused areas exhibited a significantly higher rate of proliferation (Fig. 1A, B and Fig. S1B). By contrast, rates of apoptosis, as measured by staining for cleaved caspase-3 (CC3), were not different between well-perfused and poorly perfused regions (Fig. 1A, B). These results are consistent with the notion that pancreatic tumors are metabolically heterogeneous (37), and that cancer cells in poorly perfused regions acquire a slow-cycling, viable state.

      To establish an *in vitro* experimental system that recapitulates the quiescent state associated with nutrient poor, hypoxic conditions *in vivo*, we varied media

22

445 composition and oxygen concentrations to identify conditions that resulted in a

446 significant reduction in cell proliferation without loss of cell viability (Fig. S1C,D). Using

447 PANC-1 cells, we found that DMEM supplemented with 2.5 mM glucose, 0.5% fetal

448 bovine serum (FBS), and 20% of standard amino acid concentration fulfilled this goal

449 when cells were grown at an oxygen concentration of 1% (Fig. 1C), noting that this does

450 not necessarily mimic *in vivo* conditions. Under these "arid" conditions, cells had

451 reduced DNA synthesis (Fig. 1D) but no increase in cell death (Fig. 1E) as compared to

452 cells grown under standard "fertile" conditions (DMEM with 25 mM glucose, 10% fetal

453 bovine serum, 100% amino acids, 20% oxygen). Cell labeling with PKH26, a fluorescent

454 dye that is diluted with each round of cell division, indicated a dramatic change in

455 doubling time associated with the transition to arid conditions, increasing nearly 5-fold

456 after 7d and nearly 18-fold after 21d (Fig. 1F and Fig. S1E). Importantly, slow-cycling

457 cancer cells resumed normal proliferation after a return to fertile conditions, indicating

458 that they had not entered an irreversible growth arrested state (Fig. 1F). Similar results

459 were obtained with a KPCY-derived mouse cell line, MH6620c1 (17) (Fig. S1F-H).

460   Next, we assessed the effect of arid conditions on other metabolic phenotypes.

461 Consistent with prior studies (38–40), nutrient and oxygen deprivation prompted a

462 significant decrease in protein synthesis measured by O-propargyl-Puromycin (OPP)

463 incorporation (Fig. 1G) as well as a significant increase in metabolic scavenging

464 pathways, including autophagy and macropinocytosis (Fig. 1H-I). These changes were

465 associated with a decrease in cell size (Fig. S1I). As expected, steady-state

466 metabolomics of cells grown for 7-14 days under arid condition revealed a depletion of

467 TCA cycle intermediates and most acyl-CoAs as well as a reduction in intracellular

23

468   amino acid pools (Fig. S2A-B and Table S1). These changes in metabolite levels were

469   associated with a ~50% reduction in intracellular ATP (Fig. 1J). These results indicate

470   that combined nutrient and oxygen deprivation results in a severe depletion of

471   intracellular biofuels and a hypo-energetic state.

472   Cells grown under arid conditions for 2 days exhibited dramatic changes in gene

473   expression, with 3196 genes upregulated and 2687 genes downregulated ($p_{adj} < 0.05$)

474   compared to cells grown under fertile conditions (Fig. S3A). Functional annotation by

475   gene set enrichment analysis (GSEA) revealed the hypoxia-HIF response to be the

476   most highly induced gene set, with related stress responses including glycolysis,

477   autophagy, NFκB, and cell cycle inhibitory pathways also exhibiting upregulation (Fig.

478   S3B). Oxidative phosphorylation and pathways associated with proliferation, such as

479   targets of MYC and E2F, dominated the transcriptional profile of genes downregulated

480   under arid conditions (Fig. S3C). Components of the TCA cycle and the electron

481   transport chain were also down regulated (Fig. S3D), as were genes involved in nucleic

482   acid and protein synthesis (Fig. S3E). These results indicate that adaptation to arid

483   conditions is associated with widespread transcriptional reprogramming, resulting in the

484   induction of glycolytic and autophagic pathways and repression of TCA cycle and

485   biosynthetic pathways. To confirm that the gene expression changes associated with

486   arid adaptation *in vitro* is consistent with regulatory events occurring *in vivo*, we stained

487   tumors for three proteins whose mRNA levels decreased under arid conditions (Fig.

488   S4A). All three exhibited the expected expression pattern *in vivo* – high in perfusion-

489   proximal regions and low in perfusion-distal regions (Fig. S4B) – suggesting that arid

490 conditions model at least some of the adaptations experienced by cells in poorly

491 perfused regions of the tumor.

492   Finally, to determine whether the slow-cycling state impacts sensitivity to

493 chemotherapy, we examined the dose-response of PANC-1 cells to Gemcitabine. Under

494 fertile conditions, cells were sensitive at an IC_{50} of 16.63 μM, similar to previous findings

495 (41) (Fig. 1K). By contrast, cells grown under arid conditions were fully resistant to

496 Gemcitabine, even at a dose of 1 mM (Fig. 1K) as expected based on Gemcitabine's

497 activity as an inhibitor of DNA synthesis. These results suggest that metabolically

498 deprived slow-cycling tumor cells represent a chemoresistant subpopulation, a result we

499 later confirmed *in vivo* (see below).

500

501 **CRISPR screening identifies genes that are either essential for, or detrimental to,**

502 **adaptation to arid conditions**

503   We hypothesized that cellular adaptations to metabolic deprivation might be

504 associated with selective (and exploitable) gene dependencies. To identify such

505 dependencies, we performed a genome-wide CRISPR screen utilizing Cas9-expressing

506 PANC-1 cells and the Brunello sgRNA library, which targets over 19,000 genes (18).

507 Cancer cells were first allowed to grow in fertile medium to allow short- or long-term

508 depletion of sgRNAs targeting genes required for cell viability under standard culture

509 conditions. At day 9 and day 32 after transduction (denoted as early and late fertile

510 references points), transduced cells were sub-cultured and propagated under arid

511 conditions or fertile conditions for an additional 21 days. Genomic DNA was extracted 3

512 days after transduction to account for library representation (T_0), at early and late

25

513 reference points (d9 fertile, d32 fertile), and at both 21-day endpoints (d30 arid, d30

514 fertile; d53 arid, and d53 fertile) (Fig. 2A).

515   We first sought to determine which genes and pathways are essential under

516 fertile conditions but not arid conditions. As expected, such genes were predominantly

517 associated with cell growth programs including cell cycle progression and biosynthesis

518 (Fig. S5A and Table S2-S3). For example, sgRNAs targeting genes regulating cell

519 proliferation (e.g., MYC, DBF4, and CCNB1) or translation (e.g., EIF4A1, RPL12, and

520 RPL5) were depleted prior to the early reference point and further depleted following an

521 additional 21 days of culture under fertile conditions (Fig. 2B, compare d9 fertile to d30

522 fertile). By contrast, there was little selection against these genes following transfer to

523 arid conditions (Fig. 2B, compare d9 fertile to d30 arid). These results confirm that this

524 screening approach identifies differential genetic dependencies of cells grown under

525 fertile vs. arid conditions.

526   We next performed the reciprocal analysis to identify genes and pathways

527 necessary under arid conditions but not fertile conditions. This was achieved by

528 identifying sgRNAs that are depleted in both early (d30) and late (d53) arid conditions

529 but not under any fertile conditions. Unfiltered functional annotation of genes targeted

530 by these sgRNAs revealed an association with components of the electron transport

531 chain and the TCA cycle (Fig. 2C). For example, sgRNAs targeting components of

532 mitochondrial complex I (e.g. NDUFB10, NDUFC1, and UQCC1) or the TCA cycle (e.g.

533 MDH2, MPC1, and SUCLG1) were among the top hits depleted under arid conditions,

534 whereas there was little selection under fertile conditions (Fig. 2D, compare d32

535 reference to d53 arid vs. fertile; Fig S4C,D; Tables S2-3). As arid conditions induce a

26

536 slow-cycling state, the observed dependencies likely reflect a requirement for cell

537 survival rather than a requirement for cell growth and proliferation.

538   To confirm the vulnerabilities identified in our CRISPR screen, we measured the

539 sensitivity of cells grown under arid or fertile conditions to a panel of small molecule

540 inhibitors. In agreement with our observations from gemcitabine treatment (Fig. 1F),

541 inhibitors targeting the cell cycle regulator DBF4 (PHA767491, (42)) or the translation

542 initiation factor EIF4A1 (Silvestrol, (43)) caused a dose-dependent growth arrest of

543 PANC-1 cells under fertile conditions but had little effect under arid conditions (Fig.

544 S5B). Conversely, cells grown under arid conditions were highly sensitive to inhibitors

545 targeting the TCA cycle such as devimistat (CPI-613) (44) or the mitochondrial pyruvate

546 carrier MPC1 such as 2-cyano-3-(1-phenyl-1H-indol-3-yl)-2-propenoic acid (UK-5099)

547 (45), whereas these drugs had no effect on the survival of cells grown under fertile

548 conditions, even at high micromolar concentrations (Fig. 2E). Similar drug response

549 profiles were observed in AsPC-1 and HPAC cells (Fig. S5C,D).

550   Because arid conditions prompted a reduction in DNA and protein synthesis (Fig.

551 1D, Fig. 1G, and Fig. S3), we hypothesized that anabolic processes might be

552 detrimental to cell survival during nutrient and oxygen deprivation. To this end, we re-

553 examined our CRISPR data for sgRNAs that were enriched, rather than depleted, under

554 arid but not fertile conditions. Functional annotation indicated an enrichment for target

555 genes involved in cell cycle progression and biosynthesis as well as targets of the

556 PRC2 complex (Fig. 2F). Conversely, sgRNA targeting several genes that suppress

557 biosynthesis were depleted under arid conditions (Tables S2-S3) including tuberous

558 sclerosis 2 (TSC2). TSC2 is a negative regulator of the mammalian target of rapamycin

559 (mTOR), a master regulator of cell growth (46), and thus its loss would be expected to

560 trigger inappropriate growth and proliferation under metabolically adverse conditions. To

561 test this hypothesis, we generated PANC-1 cell lines lacking TSC2 and confirmed that

562 this resulted in an acute increase in DNA and protein synthesis (Fig. 2G-H) and mTOR

563 activity as measured by S6 phosphorylation (Fig. 2I). We then performed a competition

564 experiment in which we mixed wild-type (WT) cells (GFP+) with TSC2-deficient cells

565 (mCherry+) at a 1:1 ratio and cultured them under fertile or arid conditions for 7, 14, or

566 21 days. As shown in Fig. 2J, TSC2 wild-type cells out-competed TSC2-deficient cells

567 under arid conditions, while there was minimal difference under fertile conditions. This

568 decrease in TSC2-deficient cell fitness was attributable to a loss of viability under arid

569 but not fertile conditions (Fig. S5E,F). Thus, loss of the TSC2 tumor suppressor leads to

570 a paradoxical reduction in the fitness of metabolically deprived cells, in line with its

571 protective role against hypoxia-induced energy stress (46).

572 Taken together, these results indicate that certain pathways sustain cell survival

573 under arid conditions while other pathways hinder survival. The first category consists of

574 genes involved in the TCA cycle and OXPHOS, which may reflect a heightened

575 dependency on ATP production or other metabolites generated by these pathways. The

576 second category consists of genes involved in negative control of growth and

577 proliferation, suggesting that enforced biosynthesis in the absence of adequate nutrient

578 and oxygen availability is detrimental for cell survival. Hence, the reduction in anabolic

579 activity following nutrient and oxygen deprivation is not merely a consequence of

580 changing metabolic conditions but instead is an essential adaptation.

581

Arid conditions create a selective and non-redundant dependency on Bcl-xL

582

583   Inhibitors of the TCA cycle and OXPHOS, including the TCA cycle inhibitor CPI-

584 613, have demonstrated efficacy in PDAC pre-clinical models (47–49) but limited

585 success in PDAC clinical trials (https://www.healio.com/news/hematology-

586 oncology/20211028/devimistat-regimen-fails-to-extend-os-in-metastatic-pancreatic-

587 cancer) (50). Therefore, we re-examined our CRISPR data to identify other tractable

588 vulnerabilities specific to metabolically deprived slow-cycling cells. Among genes

589 exclusively depleted under both early and late arid conditions, but not under fertile

590 conditions, the BCL-2 family member *Bcl2l1*, encoding Bcl-xL, stood out as one of the

591 most strongly selected genes (Fig. 3A) and its expression increased under arid

592 conditions (Fig. 3B). Bcl-xL is best known for its ability to inhibit apoptosis (51,52), but it

593 also regulates mitochondrial function (52) and cell cycle progression (53,54). Given that

594 these three cellular activities are features of the metabolic adaptation in our

595 experimental system, we hypothesized that arid conditions create a selective

596 dependency on Bcl-xL that is not shared by pancreatic cancer cells under fertile

597 conditions. No other canonical BCL2-family members were enriched or depleted under

598 either fertile or arid conditions (Fig. 3A), suggesting that Bcl-xL may have a unique

599 function in slow-cycling metabolically deprived cancer cells.

600   We first confirmed the dependency for Bcl-xL by knocking out the *BCL2L1* gene

601 with two independent sgRNAs (Fig. S6A). In line with our CRISPR screen results, Bcl-

602 xL-deficient cells exhibited reduced fitness in a competition assay under arid but not

603 fertile conditions (Fig. 3C) and were eliminated even if cells were already adapted to

604 arid conditions (Fig. S6B). This requirement for Bcl-xL was validated in 2 additional

605 human PDAC cell lines (AsPC-1 and HPAC), a murine PDAC cell line (MH6620c1), and

606 5 other non-PDAC cancer cell lines (Fig. 3D and Fig. S6C,D). Interestingly, BxPC3

607 cells, which lack a KRAS mutation, did not show differential dependence. Cell viability

608 was high and comparable between empty vector (EV) and Bcl-xL-deficient cells under

609 fertile conditions (Fig. S6E). By contrast, Bcl-xL-deficient cells exhibited decreased

610 viability within 1 day of culture under arid conditions (Fig. 3E). Therefore, Bcl-xL protects

611 pancreatic cancer cells from cell death following nutrient and oxygen deprivation but is

612 dispensable under nutrient replete conditions.

613   To further confirm this Bcl-xL dependency, we employed a potent and highly

614 selective Bcl-xL inhibitor, A-1155463, which is based on the 2-

615 (fluorophenoxy)propyl)thiazole-4-carboxylic acid structure (55). Exposure of either

616 PANC-1, MH6620c1, AsPC-1, or HPAC cells to A-1155463 *in vitro* resulted in a

617 significant dose-dependent loss of viability under arid conditions, whereas the drug had

618 no effect on cells under fertile conditions, even at doses over 10 μM (Fig. 3F and Fig.

619 S6F-H). A1155463-mediated cell death was inhibited by the pan-caspase inhibitor Z-

620 VAD-FMK (Fig. S6I), indicating that apoptotic cell death contributed at least partially to

621 the reduced fitness of Bcl-xL-deficient cells grown under arid conditions.

622   Because the arid medium composition was determined empirically, we sought to

623 determine whether the dependency on Bcl-xL extended to physiologically-defined

624 metabolic conditions. To this end, we exploited tumor interstitial fluid medium (TIFM) –

625 media defined by direct measurement of metabolite concentrations in the interstitial

626 space of murine pancreatic tumors (36). Consistent with our results using arid medium,

627 PANC1 cells grown in TIFM medium (1% O_2) were also dependent on Bcl-xL for

628   survival (Fig. S7A-B). Moreover, cells grown in arid or TIFM medium showed similar

629   sensitivity to the Bcl-xL inhibitor A-1155463 (Fig. S7C). Hence, Bcl-xL function is

630   required for cell survival under diverse conditions of metabolic deprivation.

631   Bcl-xL exerts protective effects under a variety of stress conditions (52). To

632   determine what triggers Bcl-xL dependency under arid conditions, we conducted "add-

633   back" experiments in which we re-introduced various nutrients – either alone or in

634   combination and under hypoxic or normoxic conditions – and then assessed the

635   proportions of two Bcl-xL-deficient tumor cell clones in competition with empty vector

636   (EV) cells. No single nutrient, or normoxia, was able to rescue either Bcl-xL-deficient

637   clone under hypoxic conditions (Fig. 3G and Fig. S7D). Paradoxically, re-introducing

638   10% FBS exacerbated depletion of Bcl-xL-deficient cells, while co-addition of FBS and

639   glucose together rescued the phenotype (Fig. 3G), suggesting that Bcl-xL may be

640   particularly important under conditions where 'biosynthetic pressure' is high, but carbon

641   fuel is low (see Fig. S1C). Taken together, these results suggest that metabolic

642   deprivation creates a selective and non-redundant dependency on Bcl-xL.

643

644   **Bcl-xL promotes the survival of cancer cells in poorly perfused tumor regions**

645   To test whether Bcl-xL is essential for pancreatic cancer cells *in vivo*, we

646   inoculated empty vector (GFP+) or Bcl-xL-deficient (mCherry+) PANC-1 cells into the

647   flanks of NOD.SCID mice. Consistent with their reduced viability under arid conditions *in*

648   *vitro* (Fig. 3E), Bcl-xL-deficient cells gave rise to a decreased tumor burden (Fig. 4A-B

649   and Fig. S8) that was associated with a 4-5-fold increase in apoptosis (Fig. 4C). Next,

650   we performed a competition experiment in which we subcutaneously implanted control

651   EV-GFP and Bcl-xL-deficient-mCherry tumor cells at a 1:1 ratio, injected TMR-dextran

652   (IV) prior to sacrifice, and examined the resulting tumors. In line with our *in vitro* results,

653   Bcl-xL-deficient tumor cells were consistently depleted but not eradicated in the mixed

654   tumors (Fig. 4D-E). Analysis of spatial distributions revealed that Bcl-xL-deficient cells

655   were less abundant as the distance from perfused blood vessels increased (Fig. 4F),

656   indicating a selective requirement for Bcl-xL in poorly perfused regions.

657   Next, we sought to determine whether A-1155463 results in a similar perfusion-

658   dependent cell lethality *in vivo*. PANC-1-GFP xenografts were allowed to grow to 6-9

659   mm and then treated with an intratumoral injection of A-1155463 or vehicle for 24 hours,

660   followed by an injection of TMR-dextran prior to sacrifice. Tumors were then sectioned

661   and stained with antibodies against CC3 to quantify apoptosis as a function of distance

662   from perfused blood vessels. GFP+ tumor cells within 200 μm of perfused blood vessels

663   exhibited similar rates of CC3+ staining between A-1155463 and vehicle-treated groups

664   (Fig. 4G). By contrast, GFP+ tumor cells >400 μm from perfused blood vessels

665   exhibited a 2-4-fold increase in CC3+ staining in the A-1155463 treatment group (Fig.

666   4G), indicating that sensitivity to Bcl-xL inhibition is positively correlated with distance

667   from perfused blood vessels. We then treated a separate cohort of mice with a

668   combination of Gemcitabine and Nab-paclitaxel (Gem/nP), which is standard-of-care

669   chemotherapy for PDAC (56), or vehicle control. In contrast to our findings with A-

670   1155463, sensitivity to Gem/nP was limited to GFP+ cells located within 200 μm of

671   perfused blood vessels (Fig. 4H). These results complement our *in vitro* studies and

672   suggest that cancer cells residing in well perfused tumor compartments are more

673 sensitive to cytotoxic chemotherapy while cancer cells residing in poorly perfused tumor

674 compartments are more sensitive to Bcl-xL inhibition.

675 These findings raised the possibility that simultaneous targeting of proliferating

676 and slow-cycling tumor cells might provide a more potent anti-tumor effect than either

677 therapy alone. To this end, we established subcutaneous tumors (6-9 mm in diameter)

678 using the murine PDAC clone MH6620c1 and treated tumor-bearing mice with either (i)

679 vehicle, (ii) A-1331852 (an orally available form of A-1155463 (57)), (iii) Gem/nP, or (iv)

680 the combination of A-1331852 and Gem/nP (Fig. 4I). While either regimen alone had

681 modest effects on tumor volume, the combination of A-1331852 and Gem/nP led to a

682 clear inhibition of tumor growth, including several tumor regressions (Fig. 4I). These

683 results provide proof-of-concept that an approach which targets both the rapid- and

684 slow-cycling compartments of a tumor may provide synergistic therapeutic benefit.

685

686 **Bcl-xL expression is restricted to slow-cycling cancer cells in human PDAC**

687 We next examined the expression of Bcl-xL (*BCL2L1*) in human PDAC. An

688 analysis of the TCGA dataset revealed *BCL2L1* to be expressed in pancreatic tumors

689 (PAAD) at a higher level compared to most other tumor types (Fig. 5A). *BCL2L1*

690 transcripts were significantly more abundant in tumors compared to adjacent normal

691 pancreatic tissue (Fig. 5B), consistent with the hypovascular and hypoxic nature of most

692 pancreatic tumors (28,58). Moreover, *BCL2L1* expression was highly correlated with the

693 overall survival of PDAC patients compared to patients with other types of cancer (Fig.

694 5C-D), a prognostic correlation shared by its closest relative (*BCL2L2*) but no other

695 BCL-2 family members (Fig. S9A).

696   To determine whether the expression of *BCL2L1* is linked to slow-cycling state in

697   human cancer, we analyzed three published single cell RNA-seq (scRNA-seq) datasets

698   (59–61) and annotated cancer cells as either proliferating or quiescent (Fig. 5E). In

699   agreement with previous observations (32), only a minority of cancer cells exhibited a

700   proliferative gene signature, while most cancer cells exhibited a slow-cycling gene

701   signature characterized by the expression of *CDKN2A* and *CDKN2B* (Fig. 5E and Fig.

702   S9B). Consistent with our predictions, expression of *BCL2L1* was markedly higher in the

703   slow-cycling population compared to the proliferating population (Fig. 5E).

704   Next, we examined the functional annotations of genes that were differentially

705   expressed between rapidly and slowly cycling cancer cells in human PDAC. This

706   revealed that the gene programs which distinguished these two populations in human

707   PDAC tumors bore a striking similarity to those that were up-regulated or down-

708   regulated in PANC-1 grown in fertile vs. arid conditions *in vitro* (Fig. 5F and Fig. S9C).

709   Most notably, hypoxia, NFkB and cell cycle inhibitory pathways were enriched in slow-

710   cycling cells from both human tumors and arid-cultured cells, while oxidative

711   phosphorylation and targets of E2F and MYC were enriched in rapidly cycling cancer

712   cells from both human tumors and fertile-cultured cells (Fig. 5F and Fig. S9C). Taken

713   together, these results suggest that the genes and pathways found to be dysregulated

714   in our *in vitro* experimental system – including Bcl-xL (BCL2L1) – recapitulate the gene

715   expression features that distinguish the rapidly and slowly cycling compartments of

716   human PDAC tumors.

717

718   **Bcl-xL protects cells from "inappropriate" biosynthesis**

34

719   We next investigated the mechanism by which Bcl-xL promotes cell survival

720   under arid conditions. We first performed RNA sequencing of Bcl-xL-deficient and EV-

721   GFP cells grown under arid conditions. Pathways involved in cell cycle regulation,

722   including targets of MYC and E2F, were the most highly enriched programs in Bcl-xL

723   KO cells (Fig. 6A and Fig. S10A). Immunoblotting and immunostaining of PDAC cells

724   (PANC-1, AsPC-1, HPAC, and BxPC-3) revealed that control cells downregulate MYC

725   protein levels, as well as S6 phosphorylation, under arid conditions, an effect that was

726   blunted in the absence of Bcl-xL (Fig. 6B and Fig. S10B,C). These results suggest that

727   Bcl-xL constrains the biosynthetic and pro-proliferative activities that normally

728   accompany metabolic deprivation.

729   Bcl-xL has been shown to act as a tumor suppressor by restricting the

730   proliferation of cancer cells in certain contexts (53,54,62). In line with these anti-

731   proliferative properties, Bcl-xL-deficient cells exhibited a 3-4-fold increase in EdU

732   incorporation under arid conditions (Fig. 6C), resulting in over 50% of cancer cells

733   staining positively for Ki-67 (Fig. 6D). By contrast, Bcl-xL-deficiency had no effect on

734   EdU incorporation or Ki-67 positivity under fertile conditions, where proliferation rates

735   were already high (Fig. S10D-E). Similar results were obtained following Bcl-xL ablation

736   in additional pancreatic cancer cell lines under arid conditions (Fig. S10F). Given that

737   Bcl-xL deficient cells exhibit increased rates of cell death when cultured under arid

738   conditions (Fig. 3C), these results are consistent with Bcl-xL acting to suppress a "lethal

739   proliferation." Bcl-xL-deficient cells co-cultured with control (EV-GFP) cells similarly

740   exhibited increased Ki-67 staining (Fig. S10G), indicating that Bcl-xL's proliferation-

741   constraining activity is cell autonomous.

742   To better understand the relationship between cell cycle progression and cell

743   death in Bcl-xL-deficient cells, we used a PCNA-interacting protein-fluorescent

744   ubiquitination-based cell cycle indicator (PIP-FUCCI) reporter, which accurately reports

745   cells in different phases of the cell cycle (21) (Fig. 6E). Using time-lapse fluorescent

746   microscopy, we followed the fate of over 800 control (EV) cells or Bcl-xL-deficient cells

747   by direct visualization under either fertile or arid conditions. Using this fate-mapping

748   approach, we observed a ~3-4-fold increase in G1/S transitions in Bcl-xL-deficient cells

749   compared to control cells (Fig. 6F) but no significant differences in transitions through

750   other phases of the cell cycle (Fig. S10H, and Movies S1-S2) or mitosis (Fig. 6G). As

751   expected, the fraction of cells transitioning from G1 phase to S phase (comparing EV

752   and Bcl-xL-deficient cells) did not increase under fertile conditions (Fig. S10I and

753   Movies S3-4). This suggests that the increased S phase entry caused by Bcl-xL loss

754   does not translate into an increase in cellular progeny.

755   We next examined our time-lapse microscopy data to determine whether certain

756   phases of the cell cycle were associated with increased cell death in the absence of Bcl-

757   xL. Under arid conditions, control (EV) cells exhibited low rates of cell death in the G1

758   (2%) and S (0%) phases of the cell cycle, while 8% of control cells died during the G2/M

759   phase (Fig. 6H). By contrast, Bcl-xL-deficiency was associated with increased cell death

760   at all stages of the cell cycle, particularly during S phase (20%) and G2/M (19%) (Fig.

761   6H). To determine whether the cell death induced by Bcl-xL knockout was related to this

762   increase in proliferation, we treated cells with the CDK4/6 inhibitor abemaciclib, a potent

763   cell cycle inhibitor (Fig. S10J, Movie S5). Abemaciclib treatment rescued cell viability in

36

764 all stages of the cell cycle (Fig. 6H), suggesting that cell cycle transit is responsible for

765 the increased lethality caused by Bcl-xL loss under arid conditions (53,62).

766   Finally, we examined whether Bcl-xL deficiency has similar effects on cell

767 proliferation in PDAC tumors *in vivo*. Tumors derived from control (EV) and Bcl-xL-

768 deficient cancer cells were stained for Ki-67 as a function of distance from a TMR-

769 dextran perfused blood vessel. Control tumors exhibited a typical gradient of Ki-67

770 staining (higher near blood vessels and lower further away) (Fig. 6I, left). In contrast, Ki-

771 67+ cells were distributed throughout the axis of perfusion in Bcl-xL-deficient tumors

772 (Fig. 6I, right, and Fig. S10K), giving further support to the notion that Bcl-xL represses

773 proliferation in nutrient deprived regions of tumors.

774

775 **Biosynthetic pressure is lethal to metabolically deprived PDAC cells**

776   The results from our CRISPR screen and metabolic "add-back" experiments

777 suggested that biosynthesis and/or proliferation are lethal to metabolically deprived

778 cells, which may lack sufficient resources to meet the demands of cell division. To

779 further explore this hypothesis, we extended our add-back studies, focusing on the

780 addition of serum, which reduced fitness, and glucose, which increased fitness (Fig.

781 3G). Consistent with our previous findings, addition of 10% FBS to cells grown under

782 arid conditions prompted an increase in the fraction of EdU+ cells (Fig. 7A) and a

783 concomitant increase in cell death that could be rescued with glucose (Fig. 7B). These

784 results suggest that auxiliary fuel sources can overcome the lethal proliferation

785 associated with extreme metabolic deprivation.

786   To directly determine whether biosynthetic activity is responsible for cell lethality

787   under arid conditions, we exposed control- and serum-treated cancer cells to several

788   small molecule inhibitors of biosynthesis, including a CDK4/6 inhibitor (Abemaciclib),

789   mTOR inhibitors (Rapamycin and Torin1), and a protein synthesis inhibitor

790   (Cycloheximide). We observed that these inhibitors reduced both proliferation (Fig. 7C)

791   and cell death (Fig. 7D). Together, these results suggest that biosynthesis and

792   proliferation in the absence of adequate resources reduces the viability of metabolically

793   deprived cancer cells.

794

Discussion

Metabolic vulnerabilities of hypoxic, nutrient-deprived pancreatic cancer cells

It is well-established that the tumor microenvironment differs proximal and distal to blood vessels, with hypoxia being increased distally and associated with poorly perfused, slowly cycling cells. While studies of interstitial tumor fluid metabolites and other media formulations approximating physiological conditions have been instructive (36,63,64), these studies are unable to resolve differences between well perfused versus hypoxic, poorly perfused tumor regions. It is increasingly recognized that standard cell culture conditions, which have been optimized to promote cell proliferation at 20% oxygen, differ considerably from the hypoxic and nutrient deprived tumor microenvironments that dominate most solid tumors *in vivo* (10). Previous investigations have deprived cancer cells of single or pairs of nutrients (13,14,16,65,66) conditions that are unlikely to mimic nutrient availability in poorly-perfused tumor regions. Central to our efforts to recapitulate the poorly perfused, hypoxic microenvironment, we have identified a cell culture system that deprives cancer cells of multiple nutrients, resulting in slow cycling cells. The findings with our cell culture system were corroborated by studies using tumor interstitial fluid medium (TIFM) (36).

The "arid condition" used in this study was able to induce and maintain a stable and persistent slow-cycling state by depriving cells of the full spectrum of metabolites and oxygen, mimicking the poorly perfused tumor microenvironment. Using this experimental system, we found that two broadly-delineated cellular states in solid tumors – a rapidly cycling state characterized by metabolic sufficiency and a slow-

39

818 cycling, scavenger-like state driven by nutrient and oxygen deprivation – manifest

819 markedly different dependencies. Rapidly cycling cells are sensitive to Gemcitabine, as

820 expected, while slow-cycling cells are chemoresistant. As such, uncovering the

821 metabolic vulnerabilities of these slow-cycling cells using an unbiased gRNA

822 CRISPR/Cas 9 screening would be foundational for novel therapeutic strategies.

823 Cancer cells cultured in the arid condition experienced extensive transcriptional

824 rewiring, conferring resistance to treatments targeting biosynthesis or proliferation and,

825 at the same time, generating dependencies on pathways that are not as important in

826 rapidly cycling, glycolytic cells. Intriguingly, we found that slow-cycling cancer cells

827 following nutrient and oxygen deprivation exhibited an unforeseen dependency on

828 OXPHOS, surprising given prior evidence suggesting that cancer cells can have a

829 reduced dependency on OXPHOS in low-glucose conditions (13) or hypoxia (16,65).

830 These observations highlight the value of an experimental system in which multiple

831 nutrients are withdrawn simultaneously. Importantly, the pre-clinical success of agents

832 that target OXPHOS might reflect the increased sensitivity of tumors, like PDAC, that

833 are metabolically deprived *in vivo* (47–49,67).

834 Adaptation to nutrient-deprived conditions engages various mechanisms for

835 acquiring or repurposing metabolic resources to support survival, including autophagy,

836 macropinocytosis, and anaplerosis (68). Meanwhile, cells reduce energy expenditure to

837 avoid exhaustion (46,69) or loss of homeostasis (70,71). Consistent with this

838 hypothesis, we found that promoting biosynthesis and proliferation under metabolically

839 deprived conditions, by depletion of cell growth inhibitors, such as loss of TSC2, or

840 repletion of serum, resulted in loss of fitness and cell death. Taken together, these

40

841   observations reinforce the conclusion that reactivating cell growth programs hinders the

842   survival of slow-cycling cells in nutrient deprived, hypoxic microenvironments.

843

844   **Bcl-xL promotes the survival of slow-cycling tumor cells following nutrient**

845   **deprivation**

846   The observation that gRNAs directed at Bcl-xL were among the top ones selectively

847   depleted in arid conditions was not unexpected given its role as an inhibitor of apoptosis

848   (52). However, Bcl-xL was not redundant with other Bcl-2 family members following

849   nutrient deprivation (72–74). Notably, Bcl-xL suppresses cell cycle progression, a

850   property that correlates with its pro-survival effects (53). Efforts to decouple the cell

851   cycle and survival function have yielded conflicting results (53,75,76). In this study, we

852   found that depletion of Bcl-xL promotes both cell cycle progression and cell death within

853   the same cancer cell population under arid conditions. Furthermore, pharmacological

854   inhibition of CDK4/6, mTOR, or protein synthesis relieved the dependency on Bcl-xL

855   under arid conditions. This suggests that at least under our arid conditions, Bcl-xL is

856   causally related to its quiescent function under nutrient deprived conditions.

857   While Bcl-xL has been extensively studied *in vitro,* less is known about its

858   function *in vivo* and it is mainly studied for its anti-apoptotic function (77). Here, we

859   provide evidence that Bcl-xL functions in poorly perfused regions and maintains tumor

860   cell quiescence that may be essential for preserving this chemoresistant population.

861   Concordantly, Bcl-xL KO PDAC tumors grow slower, despite the increased drive for

862   biosynthesis (phospo-S6) and proliferation (Ki67/EdU), a result that is in agreement with

863   the paradoxical response observed in PDAC tumors treated with rapamycin (68). The

864   finding that Bcl-xL expression is enriched in slow-cycling cancer cells in human PDAC

865   suggests that the relationships between metabolic microenvironments and survival

866   programs reported here are conserved in human tumors.

867   The Bcl-2 family of apoptosis inhibitors has been the focus of considerable

868   attention over the years as potential targets for cancer therapy, but the majority of pre-

869   clinical studies and clinical trials testing Bcl-2 family inhibitors as monotherapy have

870   shown limited efficacy in solid tumors (78). Consistent with these findings,

871   pharmacological inhibition of Bcl-xL with the inhibitor A-1331852 had only a modest

872   effect on tumor growth *in vivo*. In contrast, we found that this drug markedly enhanced

873   the activity of standard-of-care Gemcitabine/Nab-paclitaxel, a synergy likely due to

874   complementary effects on chemoresistant cells in poorly perfused tumor regions and

875   chemo-sensitive cells in well perfused tumor regions although we cannot exclude

876   enhancements of gemcitabine killing in well-perfused regions due to loss of control of

877   apoptosis as an additional factor. These observations establish the potential of

878   combining treatments that target both the rapidly and slowly cycling subsets of cancer

879   cells, as treatments eliminating either subset alone are insufficient (2).

880

Acknowledgements

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1131 **Figure Legends**

1132

1133 **Figure 1. An *in vitro* system recapitulates phenotypes associated with hypo-**

1134 **perfused regions of pancreatic tumors**

1135 (**A**) Representative confocal images indicating the frequency of proliferating (EdU+,

1136 magenta) and apoptotic (CC3+, gray) cells in well perfused and poorly perfused regions

1137 in KPCY tumors (Texas-red dextran, red) detected by co-immunofluorescence. Arrows

1138 indicate CC3+ apoptotic tumor cells. Scale Bar = 25 μm.

1139 (**B**) Dextran staining was used to distinguish well perfused and poorly perfused regions

1140 of the KPCY mice in (**A**) (see Methods). Quantification of the fraction of GFP+ tumor

1141 cells that were EdU+ or CC3+ in either region is shown (data pooled from n=3 tumors, 3

1142 sections per tumor and 5 regions per section).

1143 (**C**) 'Fertile' (green) and 'Arid' (orange) culture conditions employed *in vitro*.

1144 (**D**) Representative flow cytometry dot plot and quantification of EdU+ PANC-1 cells

1145 following a 24h pulse under fertile conditions or after 7, 14 or 21 days of arid conditions

1146 (data pooled from n=3 experiments, 2-3 replicates per experiment).

1147 (**E**) Flow-cytometry based Annexin/PI measurements of PANC-1 cells maintained under

1148 fertile and arid conditions (data pooled from n=3 experiments, 2-3 replicates per

1149 experiment).

1150 (**F**) Representative histograms and quantification of proliferation kinetics based on

1151 PKH26 dilution. The table shows population doubling (PD) times calculated for the

1152 various conditions. Data in table represents the mean ± S.E.M. of n=3 experiments, 3

1153 replicates per experiment.

55

(**G**) Measurement of protein synthesis in PANC-1 tumor cells pulsed with OPP for 1 hour (data pooled from n=3 experiments, 2 replicates per experiment).

(**H**) Measurement of autophagy by quantification of mCherry+/GFP+ ratios of PANC-1 cells expressing the autophagy reporter GFP-mCherry-LC3B (data pooled from n=3 experiments, 2 replicates per experiment).

(**I**) Measurement of macropinocytosis by quantification of intracellular puncta following exposure of PANC-1 cells to TMR-dextran (red) for 30' (data pooled from n=3 experiments, 2 replicates per experiment).

(**J**) Measurement of intracellular ATP levels (per cell) in PANC-1 cells determined by CellTiter-Glo luminescence, normalized to microscopy-based nuclear count (data pooled from n=2 experiments, 4 replicates per experiment).

(**K**) Chemosensitivity analysis of PANC-1 cells treated with the indicated doses of gemcitabine (5d). Viability was determined by comparing nuclear counts at treatment endpoint compared to onset (data pooled from n=2 experiments, 2 replicates per experiment).

In (B,G-I) statistical differences were calculated using unpaired t test and in (D) statistical differences were calculated using One-way ANOVA and Dunnett test (comparing to fertile). $P < 0.05$ was considered statistically significant; *, $P < 0.05$; ***, $P < 0.001$ n.s. not significant.

Figure 2. Genome-wide CRISPR screening reveals contrasting dependencies for cells under fertile vs. arid conditions

(**A**) Schematic showing the screening strategy (see text for details).

(**B**) Normalized abundance counts for sgRNAs reflecting essential genes under fertile conditions (depleted in fertile d9 vs. T0 and d30 fertile vs. d9 fertile but not d30 arid vs. d9 fertile).

(**C**) Unfiltered functional annotation by Reactome ($p<0.05$) of sgRNAs depleted in both early (d30 arid vs. d9 fertile) and late exposures (d53 arid vs. d32 fertile) to arid conditions but not fertile conditions (d9 fertile vs. T0, d30 fertile vs. d9 fertile, or d53 fertile vs. d32 fertile).

(**D**) Normalized abundance counts for sgRNAs reflecting essential genes under arid conditions (depleted in d53 arid but not d53 fertile compared to d32 fertile).

(**E**) Drug response curves for CPI-613 and UK-5099 targeting the TCA cycle and MPC1, respectively. Normalized cell counts for cells grown under arid conditions (left vertical axes) vs. fertile conditions (right vertical axes) are different given the slow cycling nature of the former and the rapidly proliferating status of the latter (datapoints are the means of n=2 experiments).

(**F**) Unfiltered functional annotation by Biocarta (FC>1.33, $p<0.05$) of sgRNAs enriched under arid conditions (d30 arid vs. d9 fertile and but not d30 fertile vs. d9 fertile).

(**G-H**) Quantification of DNA synthesis by EdU incorporation (**G**) and protein synthesis by OPP incorporation (**H**) after 7 days of arid conditions, comparing sgTSC2 to control (EV). EdU data pooled from n=3 experiments, 2 replicates; OPP data pooled from n=2 experiments, 2 replicates each.

57

1197 (**I**) Immunoblot of total S6 and phospho-S6 levels in control PANC-1 cells (EV) or cells

1198 lacking TSC2 (sgTSC2) following 3 days under arid conditions.

1199 (**J**) Results of competition between EV-GFP cells and mcherry-sgTSC2 cells, with

1200 samples collected at the indicated timepoints (data pooled from n=3 experiments, 2

1201 replicates per experiment).

1202 In (G) statistical differences were calculated using *t* test. In (J), statistical differences

1203 were calculated using multiple *t* tests. $P < 0.05$ was considered statistically significant;

1204 *, $P < 0.05$; **, $P < 0.01$.

1205

1206 **Figure 3. Bcl-xL is essential and non-redundant under arid conditions.**

1207 (**A**) Dot plot showing log-fold change in sgRNA abundance (each dot represents the

1208 pool of sgRNAs targeting a single gene) of cells maintained in fertile conditions (X-axis)

1209 or switched to arid conditions (Y-axis) at early (left panel) and late (right panel)

1210 timepoints of the CRISPR screen. The adjusted p-values for Bcl-xL (BCL2L1, red) are

1211 $1.81\char`^10^{-6}$ and $1.17\char`^10^{-5}$ respectively. Other Bcl-2 family members did not show a

1212 significant change and are highlighted (blue).

1213 (**B**) Western blots showing the expression of Bcl-xL and Mcl-1 under fertile and arid

1214 conditions.

1215 (**C**) Results of competition between EV-GFP and Bcl-xL KO-mCherry PANC-1 clones

1216 grown under fertile or arid conditions for the indicated times (data pooled from n=3

1217 experiments, 2-3 replicates per experiment).

1218 (**D**) Results of competition in a panel of human and mouse cell lines lacking Bcl-xL

1219 under fertile and arid conditions (data pooled from n=2 experiments, 1-2 replicates per

1220 experiment). Cells were sampled at different timepoints according to their survival

1221 capacity under arid conditions. AsPC-1 (3d), HPAC (7d), BxPC3 (7d) and MH6620c1

1222 (14d).

1223 (**E**) Quantification of non-viable cells in EV and Bcl-xL KO PANC-1 clones following

1224 transfer to arid conditions, determined by flow cytometry for Annexin V and DAPI (data

1225 pooled from n=3 experiments, 2-3 replicates per experiment).

1226 (**F**) Dose response of PANC-1 cells treated with Bcl-xL inhibitor A-1155463 for 4 days.

1227 Cells were grown in either fertile conditions throughout ("Fertile"), transferred to arid

1228 conditions at the onset of treatment ("Acute") or pre-acclimated to arid conditions for 14

1229 days before treatment began ("Chronic"). Cell numbers are plotted relative to cell

1230 number at the beginning of treatment and are the means of n=2 experiments.

1231 (**G**) Results of competition between EV and Bcl-xL KO-mCherry PANC-1 clones

1232 following addback of various nutrients in the presence of 1% O_2 (data pooled from n=3

1233 experiments, 2 replicates per experiment).

1234 In (C,E,G) statistical differences were calculated using One-way ANOVA and Dunnett

1235 test (Comparing to d0 (C), EV (E) and baseline arid (G). In (D), statistical differences

1236 were calculated using *t* tests. For panel (G), significance is indicated relative to baseline

1237 (arid) conditions). *P* < 0.05 was considered statistically significant; *, *P* < 0.05; **, *P*<

1238 0.01. ***, *P*< 0.001. n.s.-not significant.

1239

Figure 4. Bcl-xL is necessary for survival of quiescent PDAC cells *in vivo*.

(**A**) Measurement of median tumor volumes comparing subcutaneously implanted EV and Bcl-xL KO tumor clones (n=8 EV; n=6 Bcl-xL KO1; n=6 Bcl-xL KO2).

(**B-C**) Measurements of tumor weight (**B**), and apoptotic rate (**C**) in tumors shown in (**A**).

(**D**) Representative confocal image and image-based quantification of EV (green) and Bcl-xL KO (red) mixed tumors. Dashed line approximates well perfused (left) and poorly perfused (right) regions for illustration purposes. Scale bar=100 μm.

(**E**) Measurement of the area occupied by Bcl-xL KO-mCherry cancer cells and EV-GFP tumor cells in mixed tumors (n=5).

(**F**) Ratio between EV-GFP and Bcl-xL KO-mCherry cells as a function of distance from dextran-positive perfused regions in mixed tumors (n=5).

(**G**) Quantification of the spatial distribution of cleaved caspase-3+ cancer cells in PANC1-GFP xenografts injected intratumorally with A-1155463 or vehicle (n=5).

(**H**) Quantification of the spatial distribution of cleaved caspase-3+ cancer cells in PANC1-GFP xenografts injected with Gemcitabine/Nab-Paclitaxel or PBS (n=5).

(**I**) Top: Schematic of the experimental strategy for combining Gemcitabine and Nab-paclitaxel (Gem/nP) with the Bcl-xL inhibitor A-1331852. Bottom: Waterfall plots showing final change in the volume of MH6620c1 tumors grown in immunocompetent C57Bl/6 hosts following 14 days of treatment.

In (A) statistical differences were calculated using repeated measures One-way ANOVA and Dunnett test (Compared to EV), In (B,C) statistical differences were calculated using One-way ANOVA and Dunnett test (Comparing to EV) and in (E,G,H) statistical

1262   differences were calculated using *t* tests. *P* < 0.05 was considered statistically

1263   significant; *, *P* < 0.05; ***, *P*< 0.001.

1264

1265 **Figure 5. Quiescent cells in human PDAC exhibit signatures of nutrient and**

1266 **oxygen deprivation.**

1267 (**A**) Relative abundance of Bcl-xL mRNA across tumor types from TCGA data.

1268 (**B**) Relative abundance of Bcl-xL mRNA comparing PDAC and normal pancreas tissue

1269 (TCGA).

1270 (**C**) Correlation (hazard ratio) between Bcl-xL mRNA levels and patient survival across

1271 The Cancer Genome Atlas (TCGA).

1272 (**D**) Kaplan-Meier plot showing PDAC survival based on the top (red) and bottom (blue)

1273 quartiles of BCL2L1 in PDAC (TCGA).

1274 (**E**) Top: UMAP plots of single cell RNA-sequencing profiles from 3 independent studies

1275 of human PDAC. The proliferative subpopulation of tumor cells is shown in green, and

1276 the quiescent subpopulation of tumor cells is shown in orange. Bottom: Relative

1277 expression of BCL2L1 and cell cycle markers segregated into proliferative and

1278 quiescent subpopulations. Panels represent pooled data pooled from n=24 (Peng et al.),

1279 n=10 (Steele et al.), and n=16 (Lin et al.) tumors, respectively.

1280 (**F**) Functional annotation by GSEA msGDMIB for Hallmark pathways of upregulated

1281 and downregulated genes, comparing quiescent cells to proliferating cells in data from

1282 Peng et al. (FDR<0.05).

1283

Figure 6. Bcl-xL protects cells from "inappropriate" biosynthesis

(**A**) Functional annotation by GSEA Hallmark pathways of genes upregulated or downregulated in Bcl-xL KO clones comparing to EV cells under arid conditions (FDR<0.05).

(**B**) Western blots of c-Myc and S6 phosphorylation under fertile and arid conditions in EV and Bcl-Xl KO cells.

(**C**) Flow cytometry-based measurements of EdU+ cells in EV and Bcl-xL KO clones (24h pulse) during the first 3 days in arid conditions (data pooled from n=3 experiments, 2 replicates per experiment).

(**D**) Immunostaining-based quantification of Ki-67+ cells in cells cultured at day 7 under arid condition. (n=3).

(**E**) Schematicsdepicting cell cycle phase marking by the FUCCI-PIP reporter.

(**F-H**) Frequency of G1→S transitions (F) frequency of mitotic events (G) and frequency of cell death in G1, S and G2 (H) comparing control (EV) and Bcl-xL KO (non-clonal) cells tagged with FUCCI-PIP over 48hrs of timelapse microscopy starting at 2 days of arid culture. Results represent the mean of at least 3 different fields over two-three separate sessions. (Abemacicilib, Abm).

(**I**) Representative confocal images and histogram showing frequency of Ki-67+ tumor cells as a function of distance from perfused blood vessels in EV-GFP (n=3) and Bcl-xL KO1-mCherry (n=4) PANC-1 cells derived xenografts. Scale Bar = 100 μm.

In (C,D, F-H) statistical differences were calculated using One-way ANOVA and Dunnett test (Compared to EV) . $P < 0.05$ was considered statistically significant; *, $P < 0.05$; **, $P< 0.01$. ***, $P< 0.001$. ****, $P< 0.0001$.

64

1308 **Figure 7. Biosynthetic pressure under nutrient deprivation is lethal to genetically**

1309 **intact PDAC cells**

1310 (**A-B**) Fraction of EdU+ (**A**) or non-viable (**B**) PANC-1 cells cultured under arid

1311 conditions for 72h with an addback of serum and/or glucose (data pooled from n=3-4

1312 experiments, 2-3 replicates per experiment).

1313 (**C-D**) Fraction of EdU+ (**C**) or non-viable (**D**) PANC-1 cells cultured under arid

1314 conditions for 72h with an addback of serum in the presence or absence of the indicated

1315 biosynthesis inhibitors (data pooled from n=2-5 experiments, 2-3 replicates per

1316 experiment).

1317 Statistical differences were calculated using One-way ANOVA and Sidak test. $P < 0.05$

1318 was considered statistically significant; *, $P < 0.05$; **, $P < 0.01$. ***, $P < 0.001$. n.s.-not

1319 significant.
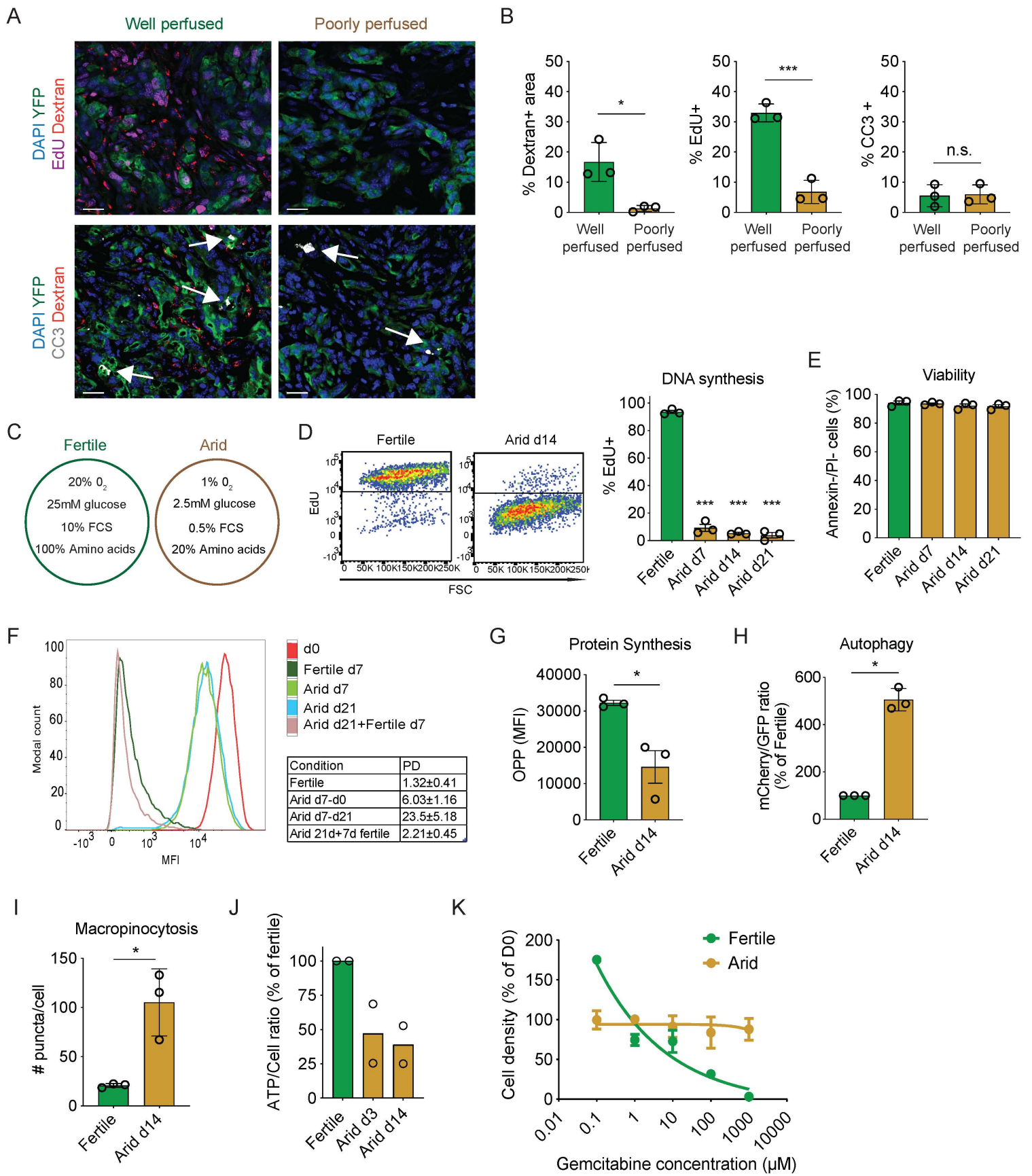
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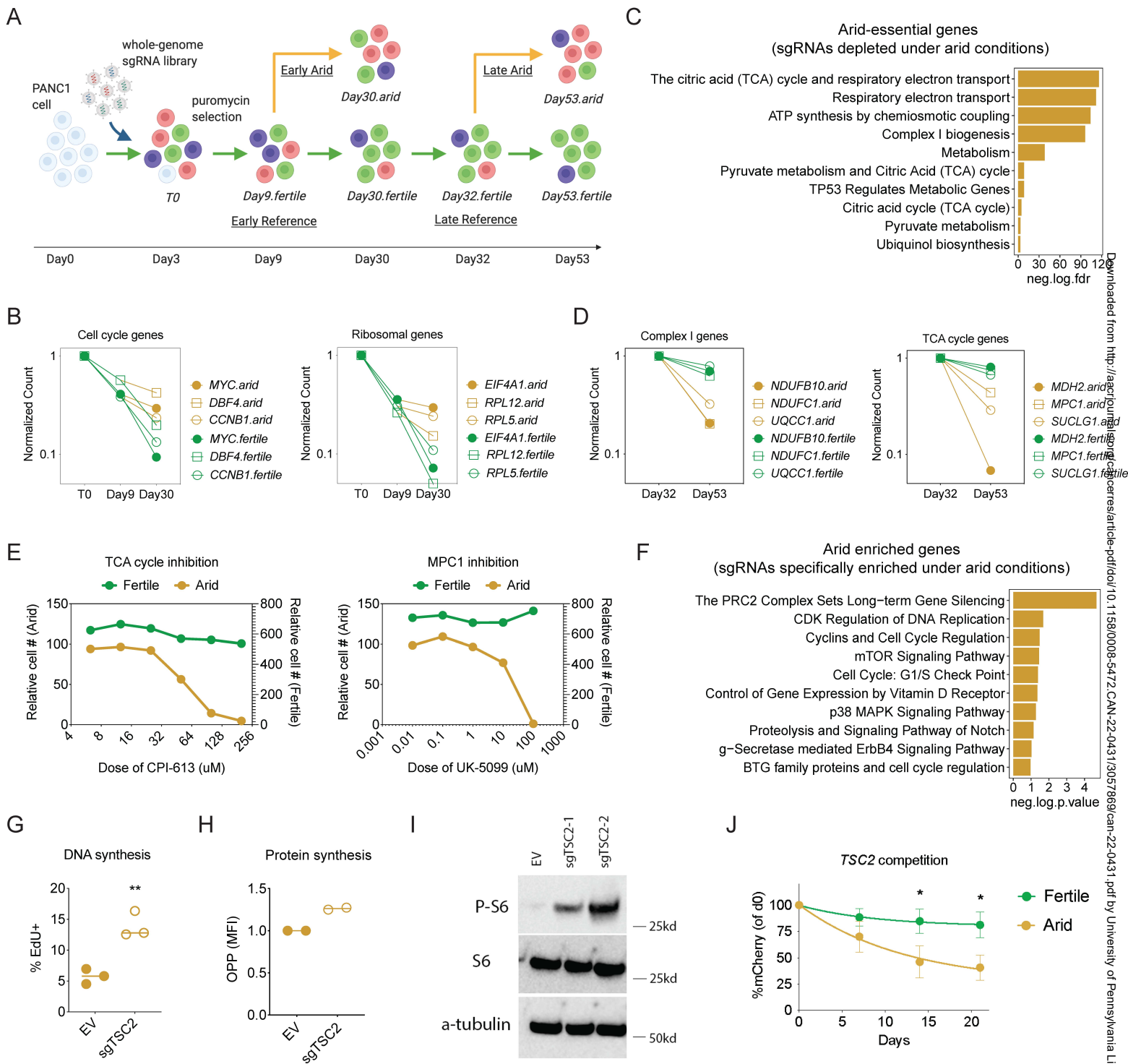
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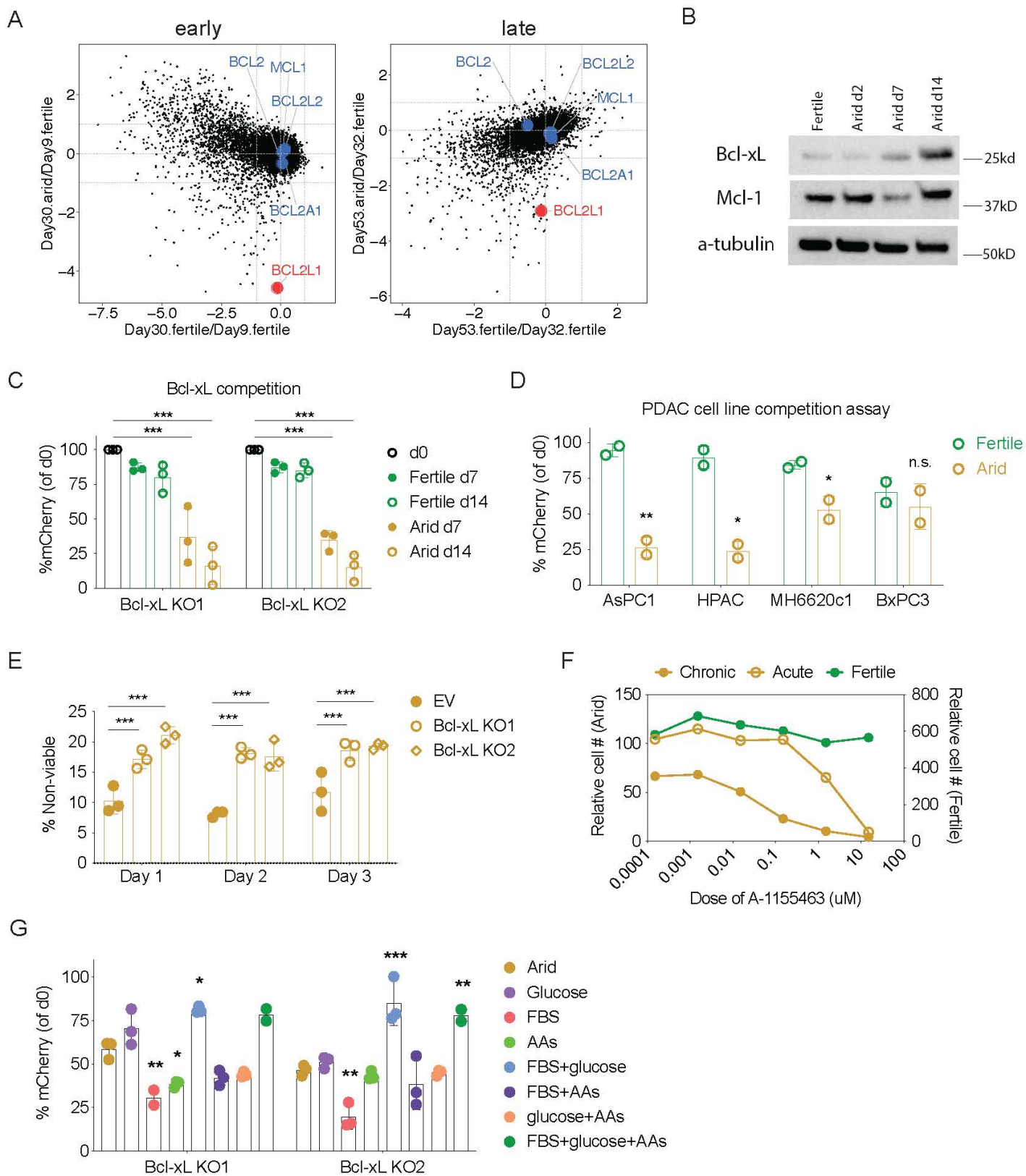
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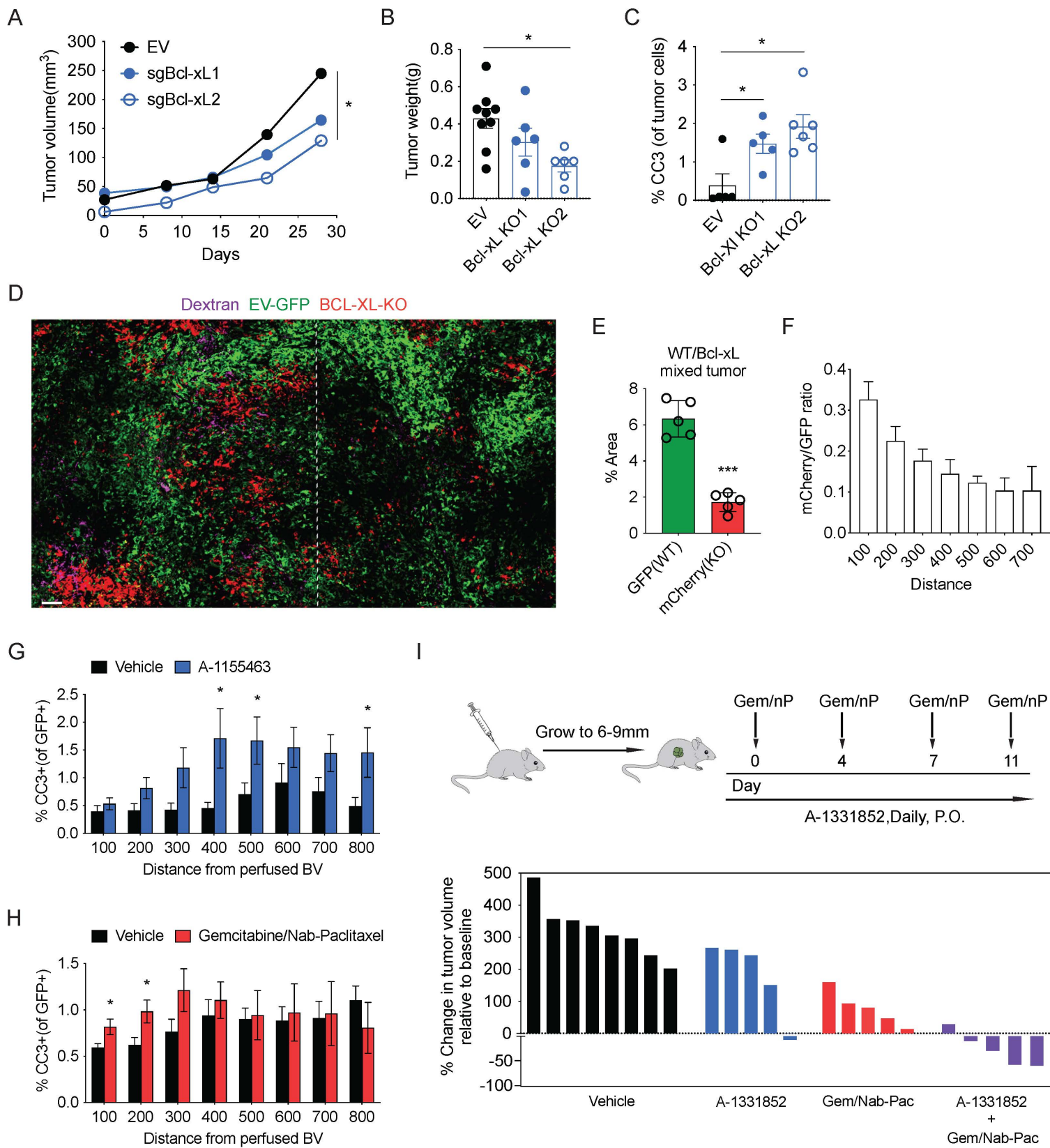
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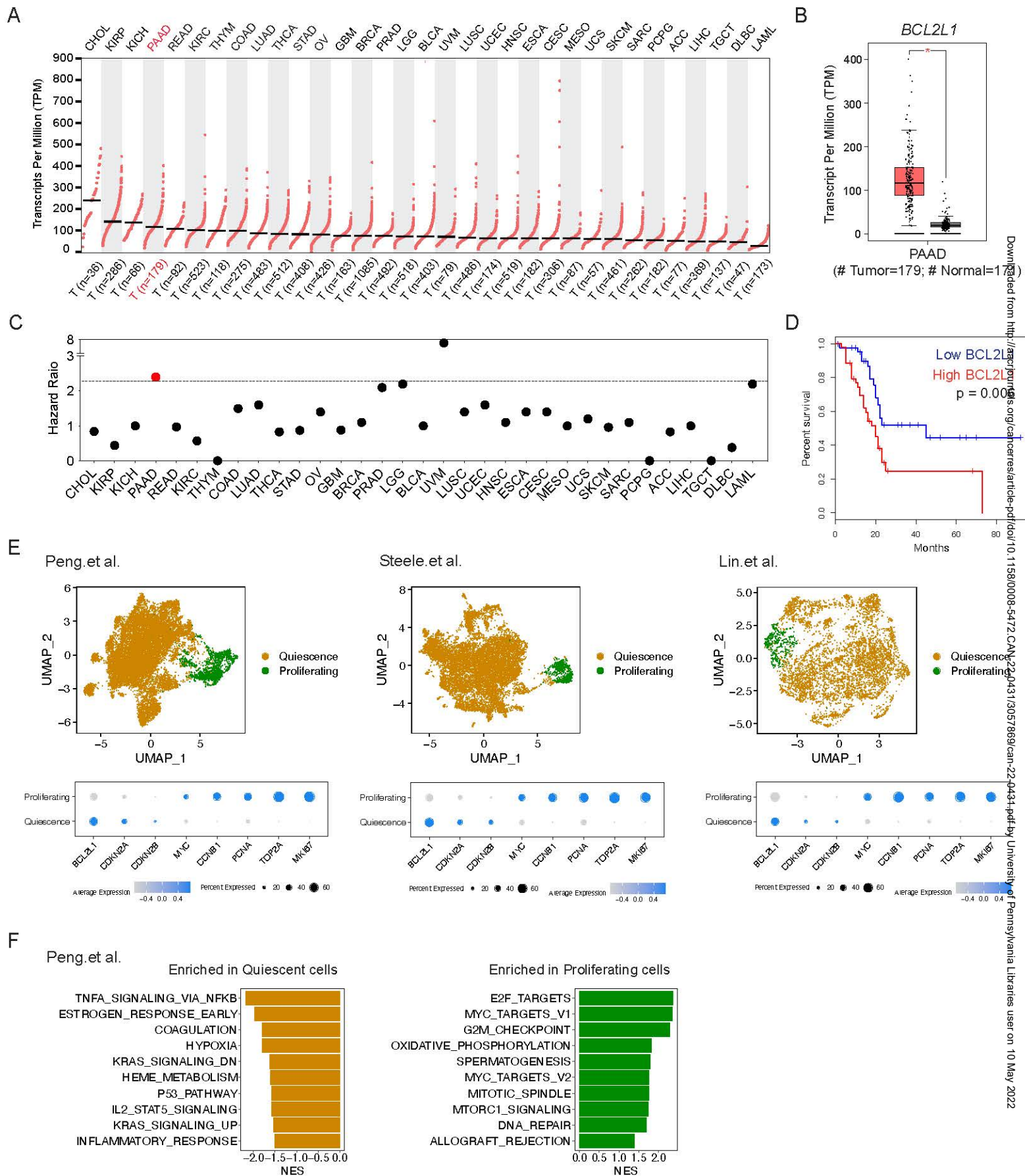
Figure.5

A

Downregulated in Bcl-xL KO vs. EV under arid

HYPOXIA
UV_RESPONSE_DN
EPITHELIAL_MESENCHYMAL_TRANSITION
CHOLESTEROL_HOMEOSTASIS
APICAL_SURFACE
KRAS_SIGNALING_DN
HEDGEHOG_SIGNALING
ANDROGEN_RESPONSE
BILE_ACID_METABOLISM
ANGIOGENESIS

-1.5 -1.0 -0.5 0.0
NES

Upregulated in Bcl-xL KO vs. EV under arid

E2F_TARGETS
G2M_CHECKPOINT
OXIDATIVE_PHOSPHORYLATION
MYC_TARGETS_V2
MYC_TARGETS_V1
DNA_REPAIR
UV_RESPONSE_UP
MITOTIC_SPINDLE
UNFOLDED_PROTEIN_RESPONSE
ESTROGEN_RESPONSE_LATE

0 1 2
NES

B

EV fertile
Bcl-xL KO1 fertile
Bcl-xL KO2 fertile
EV Arid d7
Bcl-xL KO1 Arid d7
Bcl-xL KO2 Arid d7

P-S6 — 25kd
S6 — 25kd
c-MYC — 50kD
a-tubulin — 50kD

C

% EdU+

● EV ○ Bcl-xL KO1 ◇ Bcl-xL KO2

Day 1, Day 2, Day 3

D

% Ki-67+

EV, Bcl-xL KO1, Bcl-xL KO2

E

G1, M, G2, S

F

G1-->S transitions (% of G1)

EV, Bcl-xL KO, Bcl-xL KO+Abm

G

% Mitoses

WT, Bcl-xL KO, Bcl-xL KO+Abm

H

% Non-viable

● EV ○ Bclxl KO ▽ Bclxl KO+Abm

G1, S, G2/M

I

EV
Tumor cells Dextran KI-67

Distance from perfused BV (uM)
KI-67+ tumor cells (R.U.)

Bcl-xL KO
Tumor cells Dextran KI-67

Distance from perfused BV (uM)
KI-67+ tumor cells (R.U.)

Figure.6

Figure.7