

Systematic identification of synergistic combinations of targeted agents and immunotherapies in breast cancer using intratumor multiplex implantable microdevice assay

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4
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17

18 **Abstract**

19 Systematically identifying synergistic combinations between targeted agents and
20 immunotherapies in cancer based on genomic or other static biomarkers remains elusive. Here
21 we integrate two novel high-content and high-throughput techniques, an implantable
22 microdevice to administer multiple drugs into different sites in tumors at nanodoses; and spatial
23 systems analysis of tumor microenvironmental states to describe tumor cell and immunological
24 response signatures and rapidly, within days, identify effective combinations from among
25 numerous agents. We demonstrate in systemic follow-up studies across three mammary
26 carcinoma models that combinations identified by this approach lead to highly synergistic
27 effects. Biomarkers associated with resistance to each agent allowed us to prioritize at least five
28 novel treatment strategies of which the panobinostat/venetoclax/anti-CD40 was the most
29 effective inducing complete tumor control across models. We show that spatial association of

30 cancer stem cells with dendritic cells during immunogenic cell death is a potential mechanism of
31 action underlying long-term breast cancer control.

32

33 **Introduction**

34 Modern cancer therapies increasingly seek to effect tumor control by simultaneously attacking
35 tumor intrinsic vulnerabilities, enhancing anti-tumor immune activity and/or mitigating stromal
36 mediators of resistance. Targeted drugs typically are designed to attack genetic or transcriptional
37 vulnerabilities on which tumor cells depend for survival but non-malignant cells do not¹.

38 Genomic screening approaches have supported such tumor-intrinsic aspects of precision
39 medicine, leading to matching of genomic aberrations with specific targeted agents². In breast
40 cancer, treatments targeting tumors that depend on estrogen receptor (ER) signaling, aberrant
41 signaling resulting from human epidermal growth factor receptor 2 (HER2) amplification and/or
42 over expression, CDK4/6 signaling and defects in DNA repair in triple negative breast cancer
43 (TNBC) have been particularly effective³. Unfortunately, these treatments are not uniformly
44 effective even in primary tumors carrying the target and are usually only transiently effective in
45 metastatic disease^{4,5}. This may be due in part to drug modulation of aspects of the tumor
46 microenvironment (TME) suggesting that treatment efficacy can be increased by combing these
47 drugs with agents that increase immunogenicity and/or counter microenvironment-mediated
48 resistance, a hypothesis that we address in this paper.

49 The concept of enhancing cancer treatment efficacy by combining chemotherapies and targeted
50 drugs with agents that enhance immune mediated anti-tumor activity is increasingly well
51 established⁶. The clearest example is the use of immunotherapies, including immune checkpoint
52 blocking (ICB) antibodies as complements to tumor targeted therapies in various liquid and solid
53 malignancies⁷. However, many cancers do not benefit from ICB including in breast cancer where
54 efficacy has been limited to a subset of TNBC patients^{8,9}. This lack of efficacy has been
55 attributed, in part, to low tumor mutational burden¹⁰ and to two mechanisms: i) Low antigenicity
56 through decreased expression of major histocompatibility complex class I (MHC-I) proteins -
57 observed mainly in luminal ER+ BC^{4,11} and HER2+ BCs^{12,13}; and ii) a naturally
58 immunosuppressive TME associated mainly with TNBC and HER2+ BC^{14,15}. Both of these
59 mechanisms may limit CD8+ T cell-mediated anti-tumor responses, which then cannot be
60 leveraged to improve efficacy of ICB therapies¹⁶. Combinations of conventional chemotherapies

61 and/or targeted anticancer drugs that increase immunogenic cell kill promise significant
62 improvements in overall outcome^{17,18}. However, further understanding of drug-immune system
63 interactions is required to design effective and safe immune modulating combinatorial regimens.

64 A variety of experimental approaches have been deployed to elucidate the effects of drug
65 combinations on the tumor and stromal components and to identify biomarkers that inform on
66 the efficacy of treatment combination decisions¹. Biomarkers typically are identified by
67 establishing associations between tumor features and outcomes in clinical studies¹⁰ such as those
68 supported by the NCI National Clinical Trials Network¹⁹, The Cancer Genome Atlas²⁰ and
69 Human Tumor Atlas Network²¹ programs. However, these association-based approaches need to
70 be tested for causality in systems that faithfully recreate the interactions of the various
71 components of the TME. Common model systems include tumors that arise in immune
72 competent mice and short- or long-term *ex vivo* cultures comprised of tumor and stromal
73 components using miniscule scaffolds and active fluidics to closely model specific aspects of the
74 TME^{22,23}. However, the whole animal mouse studies typically are slow, expensive and labor-
75 intensive, and comprehensive modeling and faithful recapitulation of TME interactions in *ex*
76 *vivo* systems remains a major challenge²⁴.

77 We report now on an integrated *in vivo* approach to rapidly, safely and efficiently assess the
78 effects of multi-drug treatments on the TME composition and architecture in living mice. Our
79 study focuses on mouse mammary cancers and our approach is based on the intratumor delivery
80 of nanoliter doses (nanodoses) of multiple drugs or drug combinations into spatially separate
81 regions of a tumor using a minimally invasive, implantable microdevice (IMD)²⁵⁻²⁷ and
82 multiplexed immunohistochemical (mIHC) assessments^{28,29} of the *in-situ* responses of the tumor-
83 microenvironment milieu near each drug delivery site. Computational analyses of serial mIHC
84 staining and imaging of 30+ proteins allow precise characterization of tumor cell states (e.g.
85 proliferation, stemness, antigenicity, apoptosis) as well as comprehensive classification of cells
86 comprising the TME including immune cells, vasculature and other stroma cells. Assessment of
87 the composition and spatial distribution of the functionally different cell types in each drug
88 delivery area facilitates identification of drug-mediated mechanisms of response and resistance
89 that suggest new therapeutic interventions. We refer to this approach as the Multiplex
90 Implantable Microdevice Assay (MIMA) and we used it to evaluate the effects of five targeted
91 anticancer agents (olaparib, palbociclib, venetoclax, panobinostat, lenvatinib) and two

92 chemotherapies (doxorubicin, paclitaxel) to predict synergistic anti-tumor effects with different
93 immune-based therapies. The data predicted that palbociclib would synergized with anti-CSF1R,
94 venetoclax with anti-CD40 and panobinostat with anti-PD-1 immunotherapy, respectively, which
95 we validated in traditional systemic dosing studies. We found the triple combination of
96 panobinostat, venetoclax and anti-CD40 as curative and well-tolerated across multiple models of
97 mammary cancer with immunogenic cell death and spatial association of dendritic cells with
98 cancer stem cells representing the likely mechanism underlying cancer stem cell specific anti-
99 tumor immunity in breast cancer.

100

101 **Results**

102 **MIMA components and design**

103 The IMD used for drug delivery in the MIMA system was a 5 mm long, 0,75 mm diameter
104 biocompatible resin cylinder that delivered multiple drugs or drug combinations in up to 18
105 spatially separate regions inside a living tissue (Fig. 1a). IMDs were loaded with drugs
106 formulated with poly-ethylene glycol (PEG) in semi-solid form so that drugs are released with
107 controlled kinetics upon implantation via passive diffusion²⁵. Local concentrations of drugs in
108 the IMD were tuned to produce drug levels at each site in the tissue that recapitulate those
109 achieved during systemic treatment (Extended Data Fig. 1a and Supplementary Table 1).
110 Importantly, the nanodoses of drugs do not generate the whole animal toxicities typically
111 associated with systemic treatments²⁵.

112 After treatment for 3 days, tumors were harvested with the IMD in place, prepared as a formalin
113 fixed, paraffin embedded (FFPE) samples and serial tissue sections were cut orthogonal to the
114 axis of the IMD (Fig. 1a). Sections through each drug delivery well were stained using mIHC – a
115 process of serial immunostaining, imaging and stripping (Fig. 1b and Extended Data Fig. 1b,
116 c)^{28,29} – to assess local drug effects using a range of markers with specific staining patterns being
117 cross validated against those generated using cyclic immunofluorescence (cycIF)²⁸ (Extended
118 Data Fig. 1c-f). The-mIHC generated multiprotein images were then analyzed by segmenting
119 individual cells and calculating protein expression levels in each segmented cell (Fig. 1c and
120 Extended Data Fig. 2). For our MIMA studies we developed a comprehensive mouse specific
121 readout panel including 30+ proteins (Fig. 1d and Supplementary Table 2, 3) with the criteria to

122 (i) interrogate a broad range of tumor and TME states and functions and (ii) to identify
123 actionable phenotypes with preferential detection of early and local responses. We selected 13
124 proteins (Epcam, CD45, CD31, α SMA, CD3, CD4, CD8, CD11b, F4/80, CSF1R, CD11c, Ly6G,
125 MHC-II; Fig. 1a, baseline discovery panel) to classify 17 “standard cell types” which were
126 essential and satisfactory to capture major TME states predicting effective treatment
127 combinations (Fig. 1e-g and Supplementary Table 4). We interrogated additional proteins to
128 refine the 17 standard cell types and/or to report on basic drug sensitivity (proliferation,
129 apoptosis), immunogenic cell death and/or processes typically associated with resistance such as
130 cancer stem cells (Fig. 1d; extended readout).

131

132 **MIMA identifies drug specific histological signatures of TME response predicting rational** 133 **treatment combinations**

134 We used the MIMA system to perform a small-scale *in situ* screen and quantitatively assess
135 responses to seven FDA approved drugs with distinct modes of action. The targeted drugs were
136 the poly (adenosine diphosphate [ADP]) ribose polymerase (PARP) inhibitor, olaparib; the
137 multi-kinase vascular endothelial growth factor receptor (VEGFR)-1/2/3 inhibitor, lenvatinib; the
138 cyclin dependent kinase (CDK)-4/6 inhibitor, palbociclib; the B-cell lymphoma (BCL)-2
139 inhibitor, venetoclax; and the pan- histone-deacetylase (HDAC) inhibitor, panobinostat. The
140 chemotherapeutic drugs were the DNA-intercalating agent, doxorubicin and the mitotic inhibitor,
141 paclitaxel that are often used in first line therapy for BCs³⁰. We assessed the responses in tumors
142 arising in immunocompetent MMTV-PyMT (mouse mammary tumor virus-polyoma middle
143 tumor-antigen) mice – a commonly used genetically engineered mouse model for breast cancer
144 that mirrors many aspects of human breast cancer progression and heterogeneity^{31,32}. We chose a
145 spontaneous rather than transplanted tumor model to better account for all stages of immune-
146 biology associated with de novo tumor progression³³, including editing³⁴.

147 Our analyses of harvested tumors focused on the cell and molecular compositions and
148 organizations that were significantly enriched in regions close to the drug delivery sites
149 compared to distant intratumoral controls (Fig. 1h). The changes observed for our 17 standard
150 cell types are summarized in Fig. 1g for all seven drugs and Figs. 1i-l show computed images of
151 selected cell types after treatment.

152 Lenvatinib and paclitaxel produced no detectable effects and they resembled those produced by
153 PEG negative control (Fig. 1g, i and Extended Data Fig. 3a-c); while olaparib caused only a
154 modest increase in macrophage, neutrophil and fibroblast number (Fig. 1g). Doxorubicin did not
155 mediate immune changes, but did cause a significant enrichment of endothelial cells (Fig. 1g and
156 Extended Data Fig. 3d) suggesting that normalization of vasculature^{35,36} could increase efficacy
157 of doxorubicin in breast cancer. Palbociclib, venetoclax, and panobinostat produced the strongest
158 changes in the immune and non-immune stromal states (Fig. 1g, j, k l). We extended mIHC
159 analytics and performed spatial cell measurements to describe the mechanism of action of these
160 drugs in more detail.

161

162 **Palbociclib induces enrichment of CSF1R+ macrophages associated with pericyte** 163 **branching and de novo tumor proliferation**

164 Intratumoral treatment with palbociclib induced significant accumulation of several stromal cell
165 types into the assay area including CSF1R-positive, MHC-II negative pro-tumorigenic
166 macrophages⁶, endothelial cells, vascular pericytes and mesenchymal cells (Fig. 1g, j; 2a, b and
167 Extended Data Fig. 4a-c). Spatial analyses measuring relative abundance of cells at increasing
168 distances from the drug delivery well showed that while the CD45+ macrophages – as classified
169 by standard cell type – were localized to regions immediately proximal to the drug delivery
170 well; the CD45- less-differentiated macrophages^{37,38} were localized both proximally and more
171 distally (Fig. 2c, d) and in some regions were associated with contractile pericytes³⁶ (Fig. 2d).
172 We also assessed the propensity of specific cell types to cluster together by mapping the
173 locations where 10 or more cells of a defined phenotype occurred together in regions 30, 50 or
174 75 μm in diameter (Fig. 2e and Extended Data Fig. 4d). These analyses showed that the CSF1R+
175 macrophages and CD31+ endothelial cell/pericyte structures were organized together in response
176 to palbociclib drug stimulus and did not appear in PEG control tissues (Fig. 2e). The patterns for
177 the CD31+ cell aggregates were branch-like with pericytes integrated within endothelial
178 structures suggestive of large vessel formation and enhanced blood flow/pressure control³⁶ (Fig.
179 2e and Extended Data Fig. 4d). The profile plot and distance-based cluster analyses also showed
180 clusters of Ki67-positive neoplastic cells distant from the drug delivery site and proximal to the
181 macrophage-pericyte networks (Fig. 2d, e and Extended Data Fig. 4b, d) indicating that the
182 macrophage-pericyte structures likely contribute to an increase in tumor cell proliferation in local

183 microculture as summarized schematically in Fig. 2f. These results provide direct evidence of
184 how specific changes in tumor microenvironmental states induced by monotherapy may mediate
185 acquired resistance. The high expression of CSF1R on multiple cell types (Fig. 2c) and the
186 associated increase in Ki67+ tumor cells (Fig. 2d-e) suggested to us that targeting the
187 CSF1/CSF1R axis might enhance palbociclib efficacy by countering CSF1R-mediated processes
188 (Supplementary Table 4).

189 We tested this concept in a systemic study of the EMT6 breast cancer model, by treating mice
190 bearing tumors orthotopically implanted into the mammary fat pads of immunocompetent
191 syngeneic mice with intraperitoneal injections of palbociclib, an anti-CSF1R antibody
192 monotherapy, and a combination of the two. The individual drugs did not affect the rate of tumor
193 growth. However, the combination treatment significantly reduced tumor growth (Fig. 2g). Thus,
194 the efficacy of palbociclib/anti-CSF1R suggested by analyses of responses to intratumoral
195 treatments was confirmed in whole animal experiments.

196

197 **Venetoclax recruits phenotypically distinct clusters of dendritic cells, immature myeloid** 198 **cells and endothelial cells**

199 Intratumor treatment with venetoclax resulted in significant recruitment of CD11c+ dendritic
200 cells (DCs), immature myeloid cells and CD31+ endothelial cells to the drug assay area (Fig.
201 1g,k; Fig. 3a and Extended Data Fig. 4e, f). Unlike in the palbociclib condition, the CD31+
202 endothelial cells did not express α SMA suggesting they formed small blood vessels that were
203 not supported by pericytes³⁶ (Fig. 3b). CD11c+ DCs, which play a critical role in regulating the
204 balance between immune tolerance and activity³⁹, aggregated into multiple, spatially separate
205 clusters in regions near venetoclax delivery, but not in random intratumoral regions far from the
206 drug releasing site (Fig. 3c). The clusters were phenotypically distinct as defined by their
207 morphology (Fig. 3d) and expression of Epcam, CD45, MHC-II and CD11b (Fig. 2e). DCs
208 closer to the reservoir exhibited brighter and smaller nuclei (Fig. 3d, 1) and greater than 60%
209 were Epcam+, CD45- (Fig. 2e) suggesting that they were phagocytic⁴⁰; while others displayed a
210 “Bull’s-eye” membrane CD45 staining pattern typical of unstimulated myeloid cells⁴⁰ (Fig. 3d,
211 4). However, only a small fraction of these cells, which were spatially associated with
212 endothelial cells (Fig. 2d, 3), were MHC-II positive (Fig. 3e) and thus were likely limited in their

213 ability to present available tumor antigens⁴¹. Agonist monoclonal anti-CD40 antibodies can act
214 on DCs and immature myeloid cells to increase their antigen presenting capacity, maturation and
215 activation potential (called licensing) thereby shifting the balance from tolerance to anti-tumor
216 immunity^{39,42,43}. We reasoned that this immunotherapy could be used to enhance anti-tumor
217 capacity of the immune cells recruited by venetoclax which were already primed to have
218 antitumor activity (Fig. 3f).

219 Our test of this hypothesis by systemic treatment of the E0771 orthotopic breast cancer model
220 with a combination of venetoclax and an anti-CD40 agonist showed that this combination
221 reduced tumor growth rate and increased overall survival with 60% of mice surviving for >180
222 days (Fig. 3g). For comparison, the combination of venetoclax with a programmed death ligand-
223 1 (PD-1) inhibitory antibody did not significantly affect tumor growth rate or survival (Fig. 3g).
224 Again, a therapeutic strategy suggested by the MIMA proved to be effective in whole animal
225 experiments.

226

227 **Panobinostat induces immunogenic cell death associated with recruitment of antigen** 228 **presenting neutrophils and macrophages**

229 Intratumor delivery of panobinostat led to significant recruitment of several immune cell
230 populations including dendritic cells, antigen presenting macrophages and (antigen presenting)
231 neutrophils with the latter being the most abundant (Fig. 1g, l; 4a, b and Extended Data Fig. 5a-
232 c).

233 Neutrophils are considered to be rapid responders against pathogens and classically are not
234 categorized as professional antigen presenting cells as compared to DCs, B-cells, monocytes and
235 macrophages, which have superior ability to prime naïve T cells⁴¹. However, 13% of neutrophils
236 were MHC-II-positive (Fig. 4c, d) suggesting had undergone strong phenotypic maturation⁴⁴.
237 MHC-II+ neutrophils have recently been linked to immunogenic cell death (ICD) during which
238 they phagocytose dying tumor cells and mediate respiratory-burst-dependent cytotoxicity against
239 residual cells⁴⁴. Interestingly, panobinostat induced the highest cell kill among the seven drugs
240 tested (Fig. 4e, f). Based on our observation of significant enrichment of MHC-II+ antigen
241 presenting neutrophils associated with cell death, we hypothesized that panobinostat-mediated

242 cell death would be immunogenic and the efficacy of this targeted therapy would be enhanced by
243 PD-1 blockade.

244 Systemic treatment of EMT6 and E0771 model tumors with panobinostat plus anti-PD-1
245 increased survival duration and reduced tumor growth rate relative to treatment controls or to
246 treatment with panobinostat alone (Fig. 5g) indicating effective induction of antitumor immunity.
247 Consistent with this, systemic treatment with panobinostat significantly increased the proportion
248 of intratumoral CD8+ T cells as compared to stromal parenchyma (Extended Data Fig. 5d).
249 However, the treatments did not achieve long term tumor control (Fig. 5c), and in vaccination
250 studies⁴⁵, only a subset of mice in both EMT6 and E0771 models rejected the tumor post re-
251 challenge (Fig. 4i). These results suggest that resistance mechanisms exist that might counter the
252 full potential of panobinostat-mediated antitumor immunity, and thus we explored this treatment
253 condition in more detail.

254

255 **Biomarkers of response and mechanisms of resistance associated with early induced anti-** 256 **tumor immunity in breast cancer**

257 Through literature review, we generated a list of early *in situ* biomarkers which have been
258 directly or indirectly linked to ICD, increased tumor CD8+ T cell infiltrate and/or ICB efficacy.
259 These include: intercellular adhesion molecule 1 (ICAM1)^{46,47}, myeloperoxidase (MPO)⁴⁷,
260 calreticulin^{17,18,48}, MHC-I^{49,50}, galectin-3^{46,51}, neuropilin-1^{52,53} and PD-L1^{8,9}. We validated the
261 presence of these biomarkers at panobinostat reservoirs (Fig. 5a and Extended Data Fig. 6a) and
262 measured their expression and spatial association in relation with the standard stromal cell types
263 in the assay area (Fig. 5b) as well as cancer stem cells (CSCs, Epcam-CD45+PyMT+Ki67-
264 Sox9+) (Fig. 5c-f) – a subset of tumor cells that have self-renewal and tumor initiating capacity
265 which often exhibit resistance to anti-cancer treatments^{5,54,55}.

266 ICAM1, MPO and Neuropilin-1 were localized in the *proximal* cell death and neutrophils rich
267 assay region; while PD-L1, galectin-3, MHC-I and calreticulin were localized mostly on tumor
268 cells *distal* from the well with the latter two having decreasing gradient profile (Fig. 5a and
269 Extended Data Fig. 6a). A majority (65%) of Ly6G+ neutrophils were positive for MPO
270 (Extended Data Fig. 6b) consistent with cytotoxic capacity. Positivity for ICAM1 (Fig. 5b) and
271 the mutually exclusive expression of the immune suppressive molecule arginase-1 on this

272 population (Extended Data Fig. 5b and 6a) indicate these are anti-tumor (reported also as N1)
273 rather than protumor (N2) neutrophils⁵⁶. Co-treatment with panobinostat and an anti-Ly6G
274 antibody decreased panobinostat mediated cell death implying that these neutrophils may have
275 tumor-killing function as a result of the drug's mechanism of action (Extended Data Fig. 6c).
276 The vast majority (up to 88%) of neuropilin-1 positive cells proximal to the panobinostat well
277 were cytotoxic neutrophils (Fig. 5a and Extended Data Fig. 6d) raising the possibility that
278 neuropilin-1 may be a novel biomarker of anti-tumor neutrophils in BC – a hypothesis that
279 remains to be functionally tested.

280 Nuclear expression of Sox9 has been associated with stemness in mammary tissue and mammary
281 carcinoma^{5,54,55}. We observed CC3 and nuclear Sox9 staining to be mutually exclusive (Fig. 5c
282 and Extended Data Fig. 5b) at the *border* of cell death/neutrophil rich region providing direct *in*
283 *vivo* evidence that the CSCs were resistant to the most potent tumor killing therapy in our screen.
284 In contrast, galectin-3 and Sox9 were co-expressed in many areas of the *border* region (Fig. 5c,
285 d) with 22% of galectin-3+ cells being CSCs (Fig. 5b). This indicates galectin-3 might be
286 classified as a new biomarker enriching CSCs in breast cancer. Expression and spatial
287 association of galectin-3 with both response (MHC-I, calreticulin) and resistance (PD-L1 and
288 CSCs) mechanisms (Fig. 5a-d) suggest pleiotropic involvement of this protein which implies that
289 targeting galectin-3 during immunogenic cell death should be carefully considered (Extended
290 Data Fig. 6c).

291 Finally, we wanted to measure which immune cells are spatially located within the resistant
292 cancer stem cell niche. Three spatial analyses, including macroscopic profile plots of relative cell
293 abundance (Fig. 5a), as well as the distance-based cluster analyses (Fig. 5d), and pairwise
294 proximity measurements in Sox9 microcultures (Fig. 5e, f and Extended Data Fig. 6e, f) showed
295 that CD11c+ dendritic cells were preferentially located in close proximity to CSCs, suggesting
296 functional interactions between the two cell types.

297

298 **Combination of panobinostat, venetoclax and anti-CD40 immunotherapy maximizes tumor** 299 **killing and anti-tumor immunity in mammary carcinoma**

300 The observed spatial association between CSC and DC allowed us to generate a model of drug
301 response maximizing anti-tumor activity through immune-modulation. In this model (Fig. 6a),

302 panobinostat induces immunogenic cell death of bulk tumor while CSCs remain resistant in the
303 TME. Venetoclax induces recruitment of DCs that we have shown to localize to the – now
304 accessible – CSC niche. We hypothesize that CD40 ligation induced licensing of DCs that had
305 captured and processed antigen from neighboring CSCs, would result in activation of CSC-
306 specific anti-tumor immunity leading to complete tumor clearance. Thus, panobinostat is
307 presumed to induce antitumor immunity on the level of bulk tumor, while venetoclax/anti-CD40
308 may induce anti-tumor immunity on the level of resistant, tumor initiating cancer stem cells.

309 We tested the possibility that combination of panobinostat/venetoclax (PV) with anti-CD40
310 immunotherapy would provide maximal therapeutic efficacy in breast cancer. We tested this by
311 systemically treating mice bearing EMT6 and E0771 tumors and compared the responses to
312 those obtained using a PV/anti-PD-1 combination. Treatment with PV/anti-PD-1 significantly
313 reduced the tumor burden as compared to dual PV and panobinostat/anti-PD-1 (Fig. 6b, c)
314 treatments with survival rates of 40% in mice bearing EMT6 tumors (Fig. 6c). The triple
315 combination of PV/anti-CD40, however, was superior and eliminated measurable tumors in
316 100% of EMT6 tumors and 85% of E0771 tumors, respectively (Fig. 6c, d). We also assessed the
317 efficacy of PV/anti-CD40 against spontaneous tumors arising in the MMTV-PyMT model and
318 found that this combination inhibited tumor progression and doubled the overall survival (Fig.
319 6d). Importantly, none of the combination treatments in whole animal studies were associated
320 with adverse events, likely because we used lower systemic concentrations of drugs than
321 published previously. While antigen specific T cell responses remain to be critically evaluated,
322 overall, these results suggest the triple combination of panobinostat, venetoclax and anti-CD40
323 as a highly synergistic therapeutic strategy for long term breast cancer control.

324

325 **Conclusion**

326 The MIMA platform described here provides a strategy to design effective combination regimens
327 based on intratumor nanodose exposure to a range of agents (Supplementary Table 4), coupled
328 with highly multiplexed phenotyping and integrated spatial analysis of tumor response to each
329 therapy. The focal drug delivery begins at the time of implantation and can be treated as a spatial
330 and temporal pharmacological perturbation. Since distances from the drug delivery wells reflect
331 recruitment events, analyses of the responses produced by devices left in place provide data
332 about drug induced changes in cellular densities, molecular phenotypes and possible functional

333 cell interactions. These MIMA based observations rapidly translate into models of drug response
334 in which we can identify therapeutic vulnerabilities that can be used to predict effective TME-
335 modulating combination treatment strategies (Fig. 2f,g, 3f, g and 6a). Many of these drug effects
336 are difficult or impossible to study in animal models treated systemically, due to heterogeneous
337 and indeterminate drug distribution that can vary greatly over different regions of a tumor and
338 over time. The TME response patterns obtained from MIMA studies may in future be used as
339 early *in situ* biomarkers of therapeutic response and their further computational processing could
340 provide actionable information to guide the development of effective drug doses and schedules.
341 By testing multiple therapeutic strategies in the same tumor, we can for the first time perform
342 systems level analysis using multiple parallel pharmacological perturbations in the same
343 organism. Furthermore, recent work by Jonas et al has demonstrated that IMD applications are
344 safe and feasible in patients across multiple cancer indications including breast, prostate, T cell
345 lymphoma and glioblastoma²⁷. It may become feasible to use the MIMA approach to measure
346 multiple drug responses in individual patients to guide their combination treatment design.

347 Although intended as proof of concept that analyses of local nanodose drug responses can
348 effectively guide systemic treatment strategies, we have already identified specific therapeutic
349 strategies that warrant clinical consideration. Based on local, significantly enriched
350 histopathological signatures, we predicted synergies of palbociclib with anti-CSF1R, venetoclax
351 with anti-CD40, panobinostat with anti-PD-1 monoclonal antibody and doxorubicin with
352 vasculature-normalizing agents (not validated here). These strategies have been tested in only a
353 few model systems and more extensive testing in subtype specific manner is warranted.
354 However, the combination of lower dose panobinostat/venetoclax/anti-CD40 appears especially
355 effective in three different models and so should be considered for clinical evaluation.

356 All in all, MIMA represents a new approach to identification of effective combination regimens
357 for individual patients on a personalized basis. Extended use of MIMA will also open new
358 opportunities in *in silico* modeling to model dynamic drug-tumor-stromal interactions.

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369

370 **Author contributions**

371 Conceptualization, ZT, OJ, JWG; Methodology, ZT, OJ, JWG; Software, ZT, DCB;
372 Investigation, ZT, DCB; Data Analysis and Interpretation, ZT, OJ, JWG; Writing – original and
373 final draft, ZT, OJ, JWG; Writing – review & editing, JEK, LMH, JLM, PJS, SWA, GBM,
374 LMC; Resources, JLM, LMC, OJ, JWG; Funding, OJ, JWG; Supervision, OJ, JWG.

375

376 **Declaration of interests**

377 J.E.K. is a cofounder and stock holder of Convergent Genomics.

378 GBM has licensed technologies to Myriad Genetics and Nanostring; is on the SAB or is a
379 consultant to Amphista, AstraZeneca, Chrysallis Biotechnology, GSK, ImmunoMET, Ionis,
380 Lilly, PDX Pharmaceuticals, Signalchem Lifesciences, Symphogen, Tarveda, Turbine, and
381 Zentalis Pharmaceuticals; and has stock/options/financial interests in Catena Pharmaceuticals,
382 ImmunoMet, SignalChem, and Tarveda.

383 LMC is a paid consultant for Cell Signaling Technologies, Shasqi Inc., and AbbVie Inc.;
384 received reagent and/or research support from Janssen Research & Development, LLC, Abbott
385 Labs, Eisai, Inc., ImClone, Aduro Biotech, Inc., Becton Dickinson, Plexxikon Inc.,
386 Pharmacyclics, Inc., Acerta Pharma, LLC, Deciphera Pharmaceuticals, LLC, Genentech, Inc.,
387 Roche Glycart AG, Syndax Pharmaceuticals Inc., Innate Pharma, and NanoString Technologies,
388 and Cell Signaling Technologies; and is a member of the Scientific Advisory Boards of Syndax
389 Pharmaceuticals, Carisma Therapeutics, Zymeworks, Inc, Verseau Therapeutics, Cytomix
390 Therapeutics, Inc., and Kineta Inc., HiberCell, Inc., Cell Signaling Technologies, Alkermes, Inc.

391 O.J. is a consultant to Kibur Medical. Dr. Jonas's interests were reviewed and are managed by
392 BWH and Mass General Brigham in accordance with their conflict of interest policies.

393 JWG has licensed technologies to Abbott Diagnostics, PDX Pharmaceuticals and Zorro Bio; has
394 ownership positions in Convergent Genomics, Health Technology Innovations, Zorro Bio and
395 PDX Pharmaceuticals; serves as a paid consultant to New Leaf Ventures; has received research
396 support from Thermo Fisher Scientific (formerly FEI), Zeiss, Miltenyi Biotech, Quantitative
397 Imaging, Health Technology Innovations and Micron Technologies; and owns stock in Abbott
398 Diagnostics, AbbVie, Alphabet, Amazon, AMD, Amgen, Apple, Berkshire, Cisco systems,
399 Clorox, Colgate Palmolive, Crown Castle Int., Humana, Keysight, Linde, Proctor and Gamble,
400 Qualcomm, Unilever, Gilead, Intel, Johnson & Johnson, Microsoft, Nvidia, Taiwan
401 Semiconductor, and Zimmer Biomet.

402 The other authors declare no competing interests.

403

404 **Methods**

405 **Murine Models**

406 Mice were purchased from The Jackson Laboratory. All animal studies were conducted in
407 accordance with protocols approved by Institutional Animal Care and Use Committee (IACUC)
408 at OHSU (protocol number: IP00000956). All mice were bred and housed under specific
409 pathogen free conditions under a standard 12h light / 12h dark cycle. C57LB/6, BALB/c, and
410 FVB/N mice were purchased from the Jackson Laboratory. MMTV-PyMT were from Dr. Lisa
411 Coussens and purchased from the Jackson Laboratory. Virgin female mice of 8-24 weeks of age
412 were used for all experiments.

413

414 **Cell lines**

415 EMT6 (mouse breast cancer) cells were purchased from American Type Culture Collection and
416 were maintained in Waymouth's medium with 10% FBS, and 2mM L-glutamine. E0771 (mouse
417 breast cancer) cells were purchased from CH3 BioSystems® and were cultured in RPMI-1640
418 with 10% FBS and 10mM HEPES. Both cell lines were pathogen tested and were grown at 5%
419 CO₂ and 37C.

420

421 **Experimental design**

422 The objective of the studies in figures is to show how intact tumor microenvironment responds to
423 local stimulus of drug release and to test whether this response was significantly different from
424 the baseline tumor microenvironmental state in tumor region distant from the drug site. The
425 number of independent biological replicates of each experiment (n) performed are given in the
426 figure legends. Spatial systems analyses were designed to quantitatively define directional spatial
427 cell dependencies and cause consequence cell association with distance from the reservoir
428 translating to models of drug response. Within these models we aimed to identify therapeutic
429 vulnerabilities to predict rational immune or TME modulating treatment combinations and their
430 optimal schedule/sequencing which we then validated in traditional whole animal studies.

431

432 **Microdevice implantation studies and sample collection**

433 Nanodose drug delivery devices were manufactured and implanted as described previously in ²⁵.
434 Briefly, cylindrical microdevices 5.5mm in length and 750 μ m in diameter were manufactured
435 from medical-grade Delrin acetyl resin blocks (DuPont) by micromachining (CNC
436 Micromachining Center) with 18 reservoirs 200 μ m (diameter) x 250 μ m (depth) on the outer
437 surface. Reservoirs were packed with drugs mixed with Polyethylene glycol (PEG, MW 1450,
438 Polysciences) polymer at the concentrations indicated in Table S1. Recommended systemic dose
439 in cancer patients was derived from the <https://rxlist.com> web page to June 2017. Systemic doses
440 ranging between 0-1mg/kg, 1-2mg/kg, 2-4mg/kg, >4mg/kg translate to 20%, 25%, 30% and 40%
441 of drug concentration in PEG, respectively, when released from the nanowell. The calibration
442 was determined previously using mass spectrometry measurements (Jonas et al., 2015). Pure
443 PEG was used in control conditions. Implanting multiple devices per tumor and/or multifocal
444 animal model can increase the throughput up to 50-70 times as compared to conventional
445 systemic treatment studies. When two drugs were loaded into one reservoir, they were at
446 approximately 1:1 ratio. The combination partner was loaded on the bottom of the well;
447 panobinostat was released first. Microdevices were implanted for three days in MMTV-PyMT
448 with late stage spontaneously growing tumors in all experiments. Tumor size was between 1.2 -
449 1.5cm in the longest dimension at the time of implant. Tumors were excised at three days after
450 device implantation unless otherwise stated, fixed for 48h in 10% formalin or 4%
451 paraformaldehyde, then perfused with paraffin. Specimen were sectioned using a standard
452 microtome and 5 μ m tissue sections were collected from each reservoir. Dry FFPE tissues were

453 baked in a 65°C oven for 30mins. Following deparaffinization with xylene and rehydration in
454 serially graded alcohol to distilled water, slides were subjected to endogenous peroxidase
455 blocking in fresh 3% H₂O₂ for 10 minutes at RT. Sections were then stained by multiplex
456 immunohistochemistry and/or cyclic immunofluorescence (see also Extended Data Fig. 2b and
457 c).

458

459 **Cyclic Immunofluorescence**

460 Before iterative cycles of (i) staining, (ii) whole slide scanning and (iii) fluorophore bleaching,
461 the slides were subjected to heat-mediated antigen retrieval immersed in citrate buffer (pH 5.5,
462 HK0809K, BioGenex Laboratories Citra Plus Antigen Retrieval), then in Tris/EDTA buffer (pH
463 9.0, S2368, Dako Target Retrieval Solution) using Cuisinart Electric Pressure Cooker (CPC-
464 600N1) for total of 35 to 40 minutes. Protein blocking was performed for 30 minutes RT with
465 10% normal goat serum (S-1000, Vector Lab) and 1% bovine serum albumin (BP1600-100) in
466 1xPBS. (i) Slides were incubated with primary antibody (concentrations defined in Table S2) for
467 2 hours at RT while being protected from light in a dark humid chamber. All washing steps were
468 performed for 3 x 2-5 minutes in 1xPBS while agitating. Slides were mounted with SlowFade
469 Gold antifade mountant with DAPI (S36938) using a Corning Cover Glass (2980-245). (ii)
470 Images were acquired using Zeiss Axio Scan.Z1 Digital Slide Scanner (Carl Zeiss Microscopy)
471 at 20x magnification after which the coverslips were gently removed in 1xPBS while agitating.
472 (iii) Fluorophores were chemically inactivated using a 3% H₂O₂ and 20mM NaOH in 1xPBS for
473 30 minutes at RT while being continuously illuminated. The fluorophore inactivation was
474 repeated twice with a short, 10-minute, 1xPBS wash in between. Efficacy of bleaching was
475 imaged before antibody incubation (baseline autofluorescence) and every third to fourth cycle in
476 average. After protein blocking, samples were subjected to the next round of staining. Single cell
477 feature extraction was not applied to evaluate sections stained by cyclic immunofluorescence.

478

479 **Multiplex Immunohistochemistry**

480 Before iterative cycles of (i) staining, (ii) whole slide scanning and (iii) and heat and chemical
481 stripping of antibodies and chromogen, the slides were subjected to staining with F4/80 and
482 CSF1R antibodies (cycle zero, no antigen retrieval, Supplementary Table 2) and hematoxylin
483 staining (S3301, Dako) for 1-5mins followed by whole slide scanning. Slides were then

484 subjected to the first heat-mediated antigen retrieval in 1x pH 5.5-6 citrate buffer (Biogenex
485 Laboratories, HK0809K) for 90 seconds in a low power microwave and 16 minutes in a steamer
486 followed by protein blocking with 10% normal goat serum (S-1000, Vector Lab) and 1% bovine
487 serum albumin (BP1600-100) in 1xPBS for 30 minutes RT. (i) Slides were incubated with
488 primary antibodies (concentrations defined in Table S2) for 1 hour at RT or 16-17 hours at 4
489 degrees Celsius while being protected from light in a dark humid chamber. Signal was visualized
490 with either anti-rabbit or anti-rat Histofine Simple Stain MAX PO horseradish peroxidase (HRP)
491 conjugated polymer (Nichirei Biosciences) followed by peroxidase detection with 3-amino-9-
492 ethylcarbazole (AEC). Two or three drops of HRP polymer were used for up to nickel-size or
493 whole slide tissue sample, respectively. Timing of AEC development was determined by visual
494 inspection of positive control tissue (Extended Data Fig. 1d-f) for each antibody. All washing
495 steps were performed for 3 x 5-10 minutes in 1xPBS while agitating. Slides were mounted with a
496 filtered 1xPBS with 0.075% Tween20 (BP337100) using a Signature Series Cover Glass cover
497 glass (Thermo Scientific, 12460S). (ii) Images were acquired using the Aperio ImageScope AT
498 (Leica Biosystems) at 20x magnification after which the coverslips were gently removed in
499 1xPBS while agitating. (iii) Within one cycle, removal of AEC and HRP inactivation was
500 accomplished by incubating the slides in 0.6% fresh H₂O₂ in methanol for 15 minutes; AEC
501 removal and stripping of antibodies was accomplished by Ethanol gradient incubation and heat-
502 mediated antigen retrieval such as described above between cycles. After washing and protein
503 blocking, samples were subjected to the next round of staining.

504

505 **Image processing and feature extraction of mIHC images**

506 The iteratively digitized images were co-registered using Matlab (The MathWorks, Inc., Natic,
507 MA, version 2019b) utilizing the detectSURFFeatures algorithm from the Computer Vision
508 Toolbox. The imperfectly registered images were additionally processed using the Linear Stack
509 Alignment with SIFT plugin (Fiji) so that cell features overlap down to a single pixel level.
510 Hematoxylin-stained images were color deconvoluted for single cell nuclear segmentation to
511 generate a binary mask using watershed function and standard image processing steps (noise
512 removal, erosion, dilation; Fiji)⁵⁷. AEC chromogenic signal was extracted using the NIH plugin
513 RGB_to_CMYK to separate AEC signal into the yellow channel for improved sensitivity of IHC
514 evaluation^{58,59}. Gray scale images of all proteins and the binary mask were imported to

515 CellProfiler (version 3.1.8, Broad Institute) ⁶⁰ to quantify single cell signal mean intensity as
516 defined by mask which was scaled to a range 0-1. IdentifyPrimaryObjects module was used to
517 identify nuclei from mask; MeasureObjectIntensity module measured mean intensity for each
518 object for each protein. The mean signal intensity per cell output was imported to FCS Express 6
519 and 7 Image Cytometry Software (DeNovo Software) to perform multidimensionality reduction
520 to classify “cell standards”. Gating strategies and hierarchical cell classification is presented in
521 Fig. 1e and Extended Data Fig. 2e. Polygonal gates moving around central vertex without
522 changing the polygon shapes was used to obtain quantitatively reproducible multiplex data, batch
523 to batch, independent of the condition measured. Positive control tissues were used to help to
524 define single parameter threshold for positivity by manual gating. Total of 3000-5000 cells were
525 analyzed for feature extraction in the assay area located above the drug releasing site with ± 300
526 total cells for paired, experimental vs control, region. Minimum population proportion within 5%
527 margin of error and 95% confidence level was set to 0.75% (represents 12 cells) to discriminate
528 noise from specific cell enrichment induced by e.g. increased protein expression or cell
529 recruitment into the assay region. Experimental condition of the assay area was compared to
530 random control intratumoral region located perpendicular and/or far from the drug-releasing
531 reservoir. To obtain greater control over confounding variables, paired sample one tailed t-tests
532 were used to determine enrichment of induced TME states. Percentage of positivity and
533 significance was presented in form of a heatmap or bar graphs. Quality of the single cell data was
534 ensured by excluding deformed (folded), lost or unevenly stained tissue (border effects). The
535 assay area was determined by the first 3000-5000 cells above the well excluding these deformed
536 regions. Single cell data from FCS Express was extracted in data grid to Matlab for downstream
537 spatial systems analyses. In computed images, neutrophils are presented independent of the
538 Epcam \pm status.

539

540 **Spatial Systems Analyses**

541 Distance based cluster function finds clusters in a set of spatial points expressed in XY space
542 (adapted and modified from Yann Marcon; Matlab October 2019). The clustering is based on
543 Euclidean distance between the points (cells). The function does not require the number of
544 clusters to be known beforehand. Each cell clusters with the closest neighboring cell if distance
545 between the two cells is shorter than the defined threshold. Minimal number of cells per cluster

546 are defined by user. The function outputs non-clustering cells in gray color while each cluster
547 meeting the defined parameters (minimal number of cells within maximum distance range) are
548 presented in randomized colors. Clusters within the maximum defined distance merge and share
549 one color. Number of clusters and total coverage in the assay area was calculated using distinct
550 cluster sizes (defined by minimal number of cells within maximum distance range) for control
551 PEG and palbociclib which identified that cells cluster in response to treatment if minimum 10
552 cells are present within maximum distance range 30-75 μ m (systematic comparison not shown in
553 this study). Cluster parametrization using as few as 5 cells and distances as large as 100 μ m
554 resulted in treatment non-specific cluster formation in PEG negative control. Treatment specific
555 cluster formation with cluster definition of minimum 10 cells within 50 μ m distance was
556 generalizable to all marker and standard cell types which was confirmed in panobinostat
557 condition by comparing assay area and distal region side by side in one field of view (Extended
558 Data Fig. 6e). This treatment specific cluster parametrization was applied in downstream
559 analytics to identify hotspots/zones of interest (e.g. *proximal*, *border*, *distal*, network adjacent,
560 CD11c+ DC clusters) in an objective, biology driven, manner.

561 For the relative abundance profile plot, marker positive cells and the standard cell types were
562 extracted to XY coordinate space, signal was blurred using Gaussian Blur filter and relative
563 abundance of positive cells was displayed with distance from the well in a profile plot as outlines
564 in corresponding Extended Data Figures. A moving average filter with 50 μ m; and 100 μ m
565 window size (movmean function; Matlab) was additionally applied to smoothen the feature
566 signal for palbociclib and panobinostat condition, respectively. Signal in the profile plots was not
567 scaled.

568 Inside the hotspot, spatial (geographical) interactions between marker positive cells were
569 determined by proximity measurements in local microculture by using the pdist2 function in
570 Matlab (MathWorks, Inc., Natic, MA, version 2019b) which returns the distance of each pair of
571 observations (positive cells) in X and Y using metric specified by Euclidean distance. Random
572 circular regions of 175 μ m diameter (defined by Extended Data Fig. 6f) were selected in the
573 border, cancer stem cell, zone of the panobinostat assay area and Euclidean distance was
574 measured between Sox9+ and other marker positive cells. The number of distances was
575 presented in form of a histogram. To quantify spatially interrelated phenomenon, proportions of

576 distances lower than 50 μ m (as defined by distance-based cluster analyses) was compared
577 between different cell pairs (e.g. Sox9+/Ly6G+ vs Sox9+/CD11c+).
578 Extended hierarchical cell classification was applied to characterize the significantly enriched
579 cell phenotypes forming zones of interest which were outside the standard cell type classification
580 (e.g less differentiated macrophages or phagocytic DCs). Probe combination, number of cells
581 analyzed within number of clusters are defined in the figures and figure legends.
582 2D composite and 3D composite images were presented by using Fiji ⁵⁷ and QiTissue
583 Quantitative Imaging System (<http://www.qi-tissue.com>).

584 The spatial systems analyses were used to identify drug models of response (presented as line
585 diagrams) and the identified therapeutic vulnerabilities were tested in whole animal studies.
586

587 **Whole animal treatment studies**

588 While the high-throughput IMD experiments were performed in the MMTV-PyMT model^{31,32,61,62}
589 with spontaneously growing tumors; the whole animal validation studies of predicted immune-
590 modulating combinations were performed using transplantable breast cancer cell lines in
591 syngeneic mice to avoid extensive breeding and colony maintenance necessary to test synergy of
592 multiple predicted combinations. E0771 and EMT6 models, which are typically used in breast
593 cancer research involving immunotherapy testing⁶³⁻⁶⁵, were selected randomly for validation of
594 different combinatios. The combination of panobinostat and anti-PD-1 was tested in both
595 transplantable models. The most potent triple combination of panobinostat, venetoclax and anti-
596 CD40 was additionally tested in the MMTV-PyMT model with spontaneously growing tumors.

597 MMTV-PyMT transgenic mice that were 80 days old were randomized and included in the study
598 when their total tumor burden was between 150-550mm³ (treatment initiation). For the
599 orthotopically induced tumor models of mammary carcinoma, EMT6 (0.5 x 10⁶ in 1xPBS per
600 site), E0771 (0.5 x 10⁶ in Corning matrigel per site) and primary tumor derived LPA3 (0.8 x 10⁵
601 in Corning matrigel per site) cells were injected into the #4 mammary fat pad of female virgin
602 C57LB/6, BALB/c, and FVB/N mice, respectively. One tumor was induced in the E0771, LPA3
603 models and two tumors were induced in the EMT6 model. Caliper measurements were used to
604 calculate the tumor volumes using formula length x width² / 2. Treatments were initiated when
605 total tumor burden was between 60-150mm³. For all models, the endpoint was determined by

606 tumor volume above 2000mm³ in two consecutive measurements or one measurement above
607 2200mm³. Treatments were administered by intraperitoneal injection. Dose, schedule and
608 duration are indicated in the respective figures and figure legends. Treatment schedule was
609 estimated depending on the location of the targetable cell phenotype in proximity to the well or
610 more distal from the drug source. E.g. cells in the *immediate proximity* to the drug well at 3 days
611 of exposure were likely recruited first to the drug assay area thus early targeting (pre-treatment)
612 of these cells is preferred. Inversely, cells located in *distal* regions should be targeted by
613 posttreatment approach. Diluent and IgG2a isotype control (BioXCell) concentrations were
614 equivalent to the highest dose of the respective drug used in each experiment.

615 The mice were monitored daily to determine any possible effects on the general condition of the
616 animals using parameters as established by (Morton and Griffiths, 1985). The guidelines for
617 pain, discomfort and distress recognition were used to evaluate weight loss, appearance,
618 spontaneous behavior, behavior in response to manipulation and vital signs. Specifically, general
619 appearance (dehydration, missing anatomy, abnormal posture, swelling, tissue masses, prolapse)
620 skin and fur appearance (discoloration, urine stain, pallor, redness, cyanosis, icterus, wound,
621 sore, abscess, ulcer, alopecia, ruffled fur), eyes (exophthalmos, microphthalmia, ptosis, reddened
622 eye, lacrimation, discharge, opacity), feces (discoloration, blood in the feces, softness/diarrhea),
623 locomotor (hyperactivity, coma, ataxia, circling) were monitored to determine loss of body
624 condition (BC) score, namely: BC 1 (emaciated) score applied when skeletal structure was
625 extremely prominent with little or no flesh/muscle mass and vertebrae was distinctly segmented;
626 BC 2 (under-conditioned) score applied when segmentation of vertebrate column was evident,
627 dorsal pelvic bones were readily palpable and muscle mass was reduced; BC 3 (well-
628 conditioned) applies when vertebrae and dorsal pelvis were not prominent/visible, and were
629 palpable with slight pressure. Loss of BC was also considered when anorexia (lack or loss of
630 appetite) or failure to drink; debilitating diarrhea, dehydration/reduced skin turgor; edema,
631 sizable abdominal enlargement or ascites, progressive dermatitis, rough hair coat/unkept
632 appearance, hunched posture, lethargy, loss of righting reflex, neurological signs or bleeding
633 from any orifice appeared in treated mice. Majority of treated groups were well-conditioned (BC
634 score 3); less than 20% of mice in each group experienced mild diarrhea for up to 2 days once
635 during the course of treatment (typically post first or second therapy administration). Mice
636 receiving palbociclib monotherapy were under-conditioned (BC score 2) starting from day 3 till

637 the end of the treatment. Two out of eight mice in the MMTV-PyMT model died within 1-3 days
638 after first injection of α CD40 immunotherapy when administered as single agent. Lethal toxicity
639 of anti-CD40 used as a single agent was previously reported due to a shock-like syndrome ⁶⁶ and
640 our data also strongly suggest this immunotherapy is tolerable only with prior administration of
641 anti-cancer agent(s). Surviving mice receiving venetoclax/anti-CD40 combination experienced
642 fur graying to different degree starting approximately four weeks post treatment. No signs of
643 pain, discomfort or distress were observed in the surviving mice. Emaciated (BC score 1), over-
644 conditioned (BC score 4) nor obese (BC score 5) were observed in our studies.

645 To show CD8+ T cell infiltration inside the tumor bed, ErbB2 Δ Ex16 mice⁶⁷ with spontaneously
646 growing late stage tumors were intraperitoneally injected with panobinostat (15mg/mg) on day 0,
647 2 and 4. Tumors were extracted at day 7, were FFPE processed and were stained for CD8 to
648 compare the rate of intratumoral CD8+ T cells in panobinostat treated vs control (diluent) treated
649 mice.

650 **Vaccination study**

651 EMT6 and E0771 cells in tissue culture were treated with a soluble drug panobinostat at 5 μ M
652 concentration when they would reach 60-70% confluency. After two days the cells were
653 harvested and were injected subcutaneously (total 2-3 x 10⁶ cells) into lower left flank of
654 BALB/c and C57Bl6 mice, respectively. Cells freeze-thawed three times served as negative
655 control for non-immunogenic form of cell death. After 7-8 days, the mice were re-inoculated by
656 injecting living cells orthotopically into one #4 mammary fat pad (total 0.5 x 10⁶ cells) and tumor
657 appearance was monitored by minimal tumor size approximately 5mm and 3.5mm in the longest
658 dimension for E0771 and EMT6 model, respectively (palpable tumors). We note the E0771
659 tumors after re-challenge appeared at the primary subcutaneous site and no tumors were
660 developed in the orthotopic site.

661

662 **Statistical analysis**

663 All data are combined from two to three independent experiments, unless specifically noted. To
664 accomplish randomization for systemic mouse experiments, animals were sorted by a blinded
665 investigator and then groups were assigned. Each group was checked post-hoc to verify no
666 statistical significance in average starting tumor size. There was no sample-size estimation of in

667 standard drug treatment experiments. Data are shown as mean \pm SEM, unless otherwise noted.
668 For tumor growth rate, significance was calculated by unpaired two-tailed t-test with equal
669 variance. For survival and tumor free analyses, Kaplan-Meier curves were generated to
670 demonstrate time to event and log-rank (Mantel-Cox) test was used to evaluate statistical
671 significance.

672

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Fig. 1

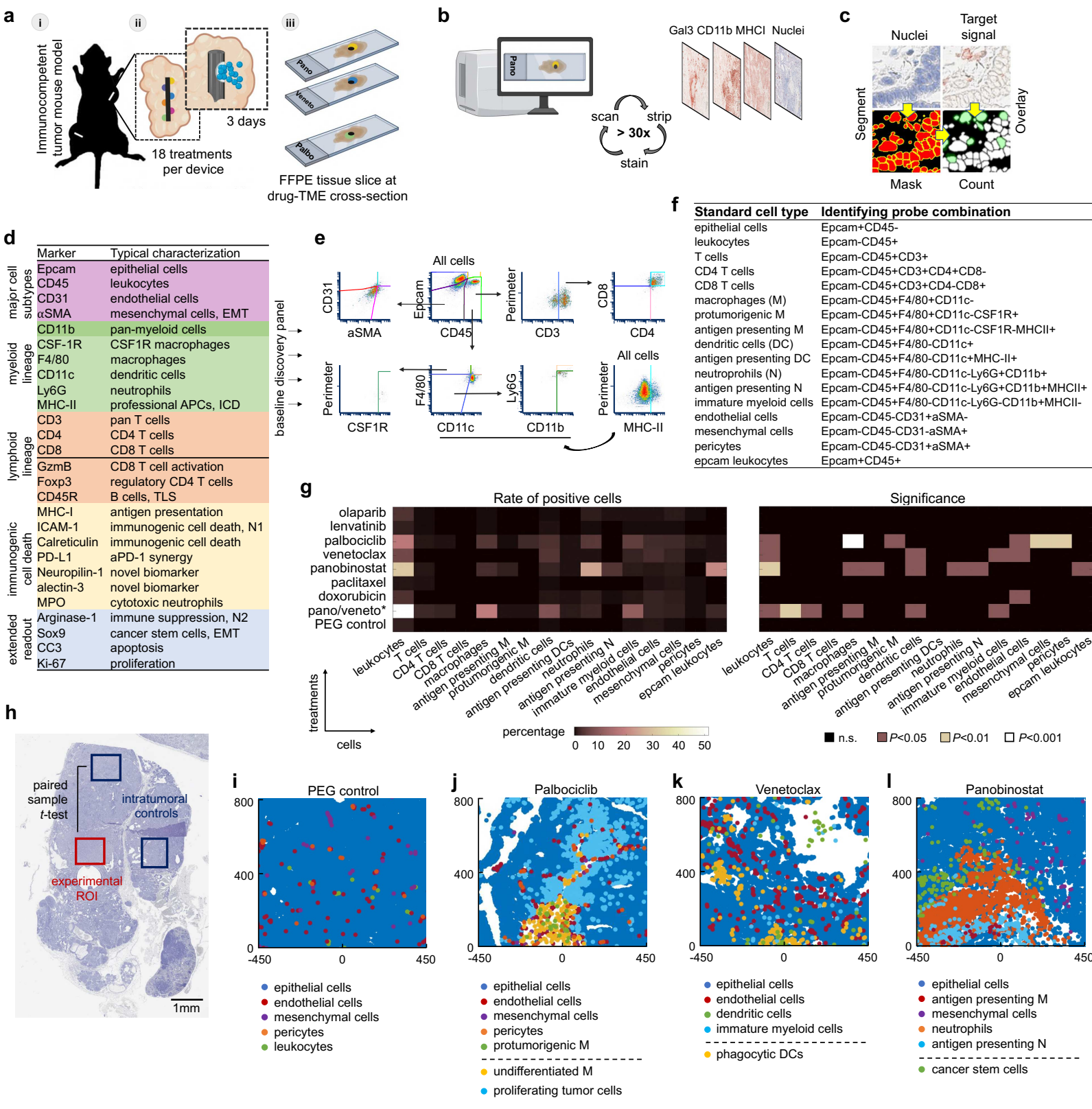


Fig. 1 | MIMA components and testing of locally induced drug effects on TME. **a**, Schematic of IMDs implanted into a multifocal mouse model of mammary carcinoma (i) showing treatments being released into spatially separated regions of tumors through passive diffusion (ii) and each condition being assayed individually (iii). **b**, Schematic of the mIHC technique composed of iterative histological stripping, staining and scanning using digital scanning microscopy to detect the target set of markers. **c**, Acquired images are co-registered with nuclear staining and the mean intensity of antibody staining within a mask is calculated for each cell to count marker positive cells in a spatially intact tissue. **d**, Antibody list primary probe classification used to interrogate a broad range of tumor intrinsic and tumor-microenvironmental states. **e, f**, Multidimensionality reduction in hierarchical gating (e) and list of probe combinations identifying standard cell types (f). **g, h**, Heatmap of mean percentage of positive cells (left) and level of significance (right) at depicted targeted agents and chemotherapies (y-axis) with PEG being the negative control (g). Total cell counts were between 3000 to 5000 cells per assay area and were matched \pm 300 total cells for paired samples: experimental vs control region as shown in the macroscopic view of the hematoxylin-stained tumor tissue implanted with IMD (h). Minimum population proportion within 5% margin of error and 95% confidence level was set to 0.75% (represents 12 cells) to discriminate noise from specific signal. $n=3$ wells from 3 tumors from 2-3 mice per treatment. MMTV-PyMT mice with late stage spontaneously growing tumors were implanted for three days. **i-l**, Presentation of selected standard cell types in XY space. [0,0] coordinate is the drug releasing site; direction of release is upward.

Fig. 2

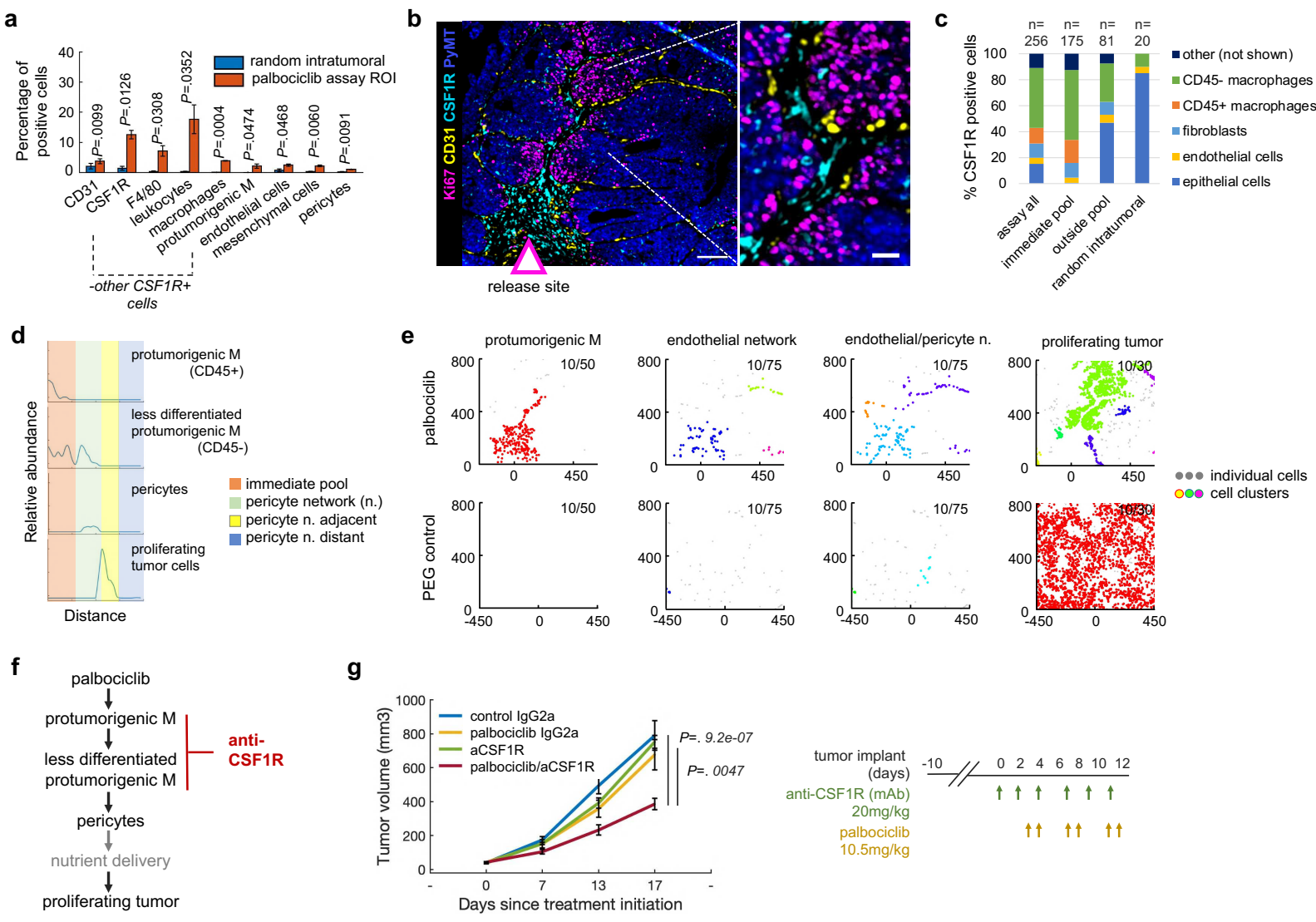


Fig. 2 | Local TME changes induced by palbociclib and whole animal studies testing the combination efficacy with predicted anti-CSF1R immunotherapy. **a**, Quantification of single cell events using individual markers and standard cell type classification. Bars are mean ± s.e.; n=3 reservoirs. Significance was calculated by paired sample one tailed t-test. For quantification of all TME lineages, see Extended Data Fig. 4a.. **b**, Sample composite image of the key response markers at the palbociclib well. Scale bar is 100µm (left); and 25µm (right). **c**, Percentage of top five cell types expressing CSF1R stratified by zones in the palbociclib assay area. "Immediate pool" zone is visualized by the dashed line in Extended Data Fig. 4c. The number of cells analyzed (n) is shown. **d**, Line profile of relative cell abundance as a function of distance from well (left to right). Assay zones are color-coded in the legend; profile line is shown in Extended Data Fig. 4c.. **e**, Distance-based clustering of depicted cell types as a set of XY coordinates. Coordinate [0,0] identifies the drug source. The direction of the drug release is upward. Clusters were identified by a minimum 10 cells within maximum distances of 50µm, 75µm and 30µm for CSF1R+ protumorigenic macrophages, endothelial/pericyte network and proliferating tumor cells, respectively. Each cluster is depicted with a randomized color; individual (non-clustering) cells are shown as light gray points. **f**, Palbociclib model of response presented as line diagram and site of intervention using immunotherapy depicted in red. **g**, Tumor burden measurement of mice bearing EMT6 tumors after systemic treatment using drugs as color-coded in the graph. Shown is mean ± s.e.; n=8 to 10 tumors per group. Significance was calculated using an independent two-sample two-tailed t-test with equal variance.

Fig. 3

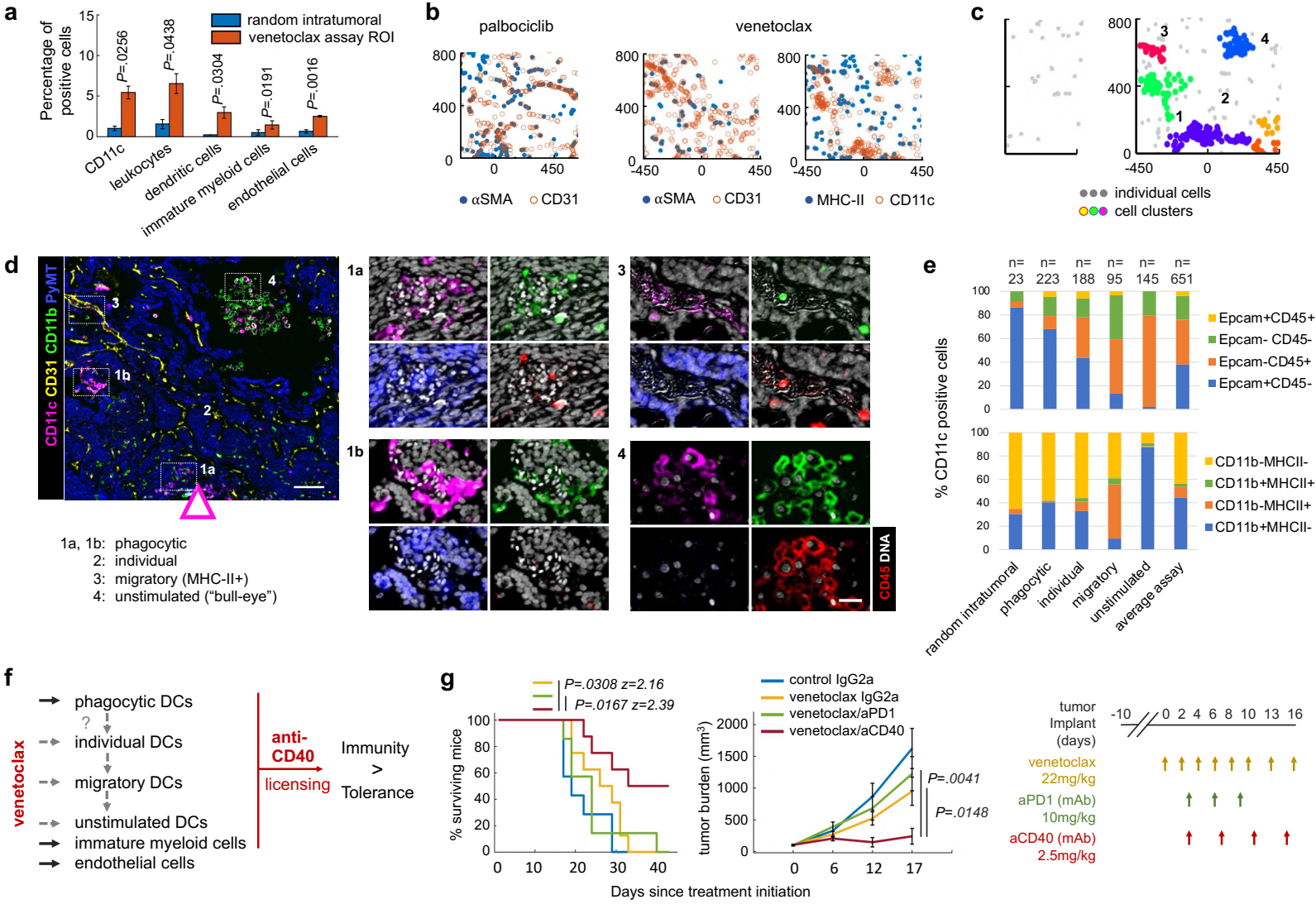


Fig. 3 | Local TME changes induced by Venetoclax and whole animal studies testing the combination treatment efficacy with the predicted anti-CD40 immunotherapy. **a**, Quantification of single cell events using individual markers and standard cell types. Bars are mean \pm s.e.; $n=3$ reservoirs. Significance was calculated by paired sample one tailed t-test. For quantification of all cells, see Extended Data Fig. 4e. **b**, Marker co-expression in XY coordinates in the palbociclib (left) and venetoclax (mid, right) assay area. Each color-coded dot represents a marker positive cell. Coordinate [0,0] identifies the drug source. The direction of the drug release is upward. **c**, Distance-based cluster analysis of CD11c positive cells as a set of XY coordinates in random intratumoral (left) and venetoclax assay (right) regions. Clusters are displayed in randomized colors if at least 10 cells are present within maximum distance range 50 μ m; individual cells not meeting this criterium are shown as light gray points. **d**, Sample composite image of the key response markers at the venetoclax well. Arrow indicates the source and direction of the drug release. Numbered hashed boxes define the magnified area on the right where individual markers are overlayed on the DNA signal (in white). Scale bar 100 μ m (left); and 30 μ m (right). **e**, Percentages of Epcam and CD45 (top) and CD11b and MHC-II (bottom) positive cells within morphologically different CD11c + DCs presented as a stack bar graph. The number of cells analyzed (n) is shown. Two to three ROIs from two venetoclax samples were summed per each zone. **f**, Venetoclax model of response presented as an influence diagram with sites of intervention using immunotherapy depicted in red. The relation of morphologically distinct and spatially separate CD11c DC clusters remains unclear (gray dashed arrows). **g**, Survival rates (left) and tumor burden measurements (right) of mice bearing E0771 tumors after systemic treatment using drugs as color-coded in the line graphs. Shown is mean \pm s.e.; $n=7-8$ mice per group. Significance was calculated by log-rank (Mantel-Cox) and by an unpaired two-tailed t-test with equal variance for survival and tumor burden rate, respectively. For results using anti-PD-1 and anti-CD40 monotherapy see Fig. 6c.

Fig. 4

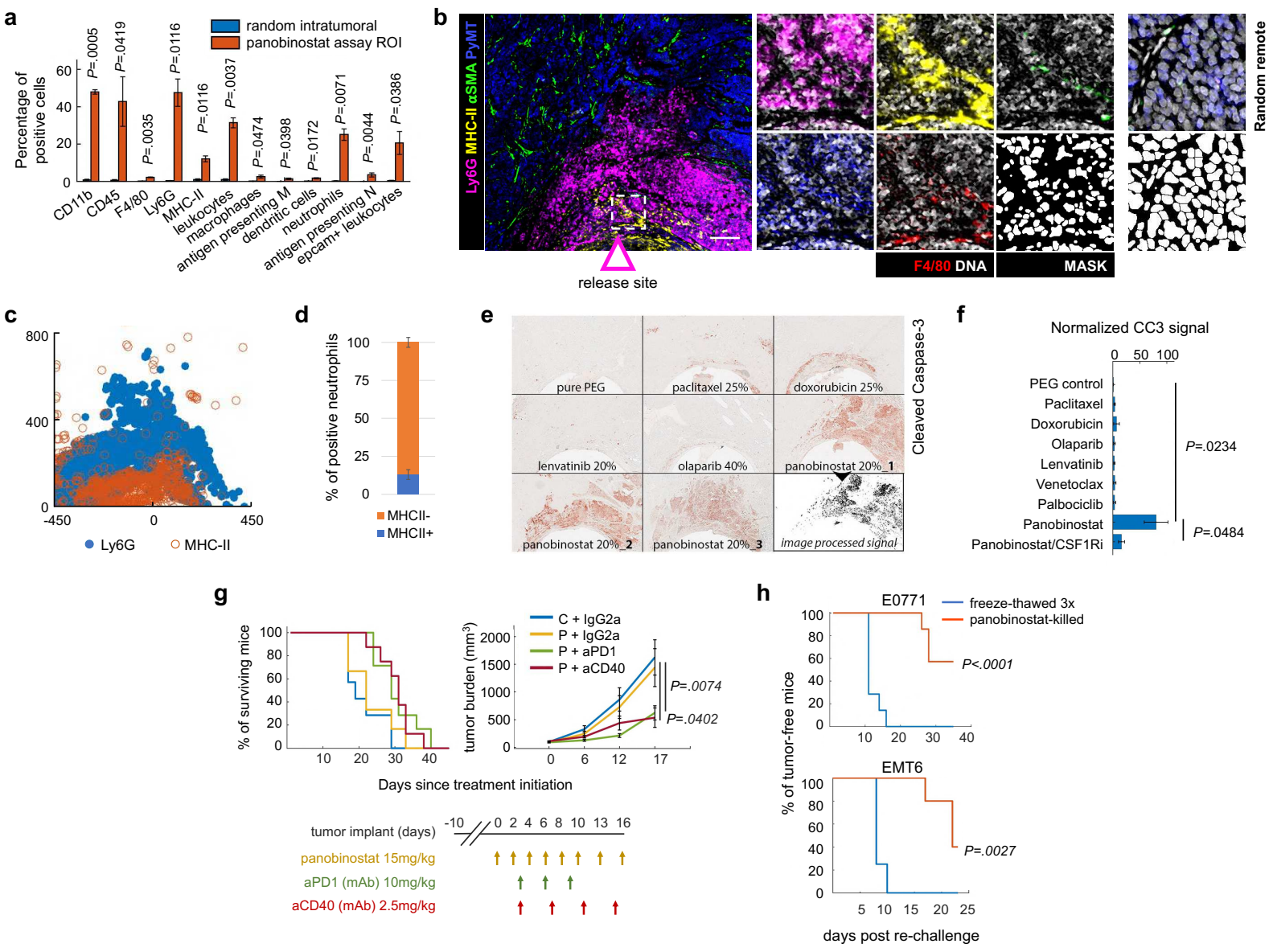


Fig. 4| Local effects of panobinostat and whole animal studies testing induction of anti-tumor immunity in mouse mammary carcinoma. a, Quantification of single cell events using individual markers and standard cell types. Bars are mean \pm s.e.; n=3 reservoirs. Significance was calculated by paired sample one tailed t-test. For quantification of all cell, see Extended Data Fig. 5a. **b,** Sample composite image of the key response markers at the panobinostat well. A dashed box defines the magnified area (right), which shows F4/80 staining in red and DNA signal and DNA-derived mask in white. Scale bar, 100 μ m. **c,** Marker co-expression in XY coordinates. Each dot represents a marker positive cell. Coordinate [0,0] identifies the drug source. The direction of the drug release is upwards. **d,** Percentage of MHC-II+ neutrophils. Shown is mean \pm s.e.; n=3 panobinostat reservoirs. **e,** CC3 IHC image of a sectioned tissue surrounding the IMD at depicted targeted agents and chemotherapies. Three replicates are presented for the most potent death-inducing drug, panobinostat. A computationally processed CC3 signal is shown as a binary image. **f,** Quantification of PEG normalized average mean CC3 intensity (px value) in the assay region. The graph shows mean \pm s.e.; n=3 wells per treatment; significance was calculated using an independent two-sample t-test with equal variance. **g,** Survival rates (left) and tumor burden measurements (right) of mice bearing E0771 tumors after systemic treatment using control diluent (C), panobinostat (P), anti-PD1, anti-CD40 and IgG2a isotype control monoclonal antibody. Shown is mean \pm s.e.; n=7-8 mice per group. Significance was calculated by log-rank (Mantel-Cox) and by an unpaired two-tailed t-test with equal variance for survival and tumor burden rate, respectively. For results using anti-PD-1 and anti-CD40 monotherapy see Fig. 6c. Treatment dose and schedule is presented. **h,** Induction of anti-tumor immunity measured in a vaccination study using panobinostat treated cells and negative control (cells killed by three freeze/thaw cycles). Line graphs show percentages of mice free from palpable tumors. The P-value was calculated by log-rank (Mantel-Cox) test. n=7 per each group for E0771 model; and n=4 (control) and n=5 (experimental) for EMT6 model, respectively.

Fig. 5

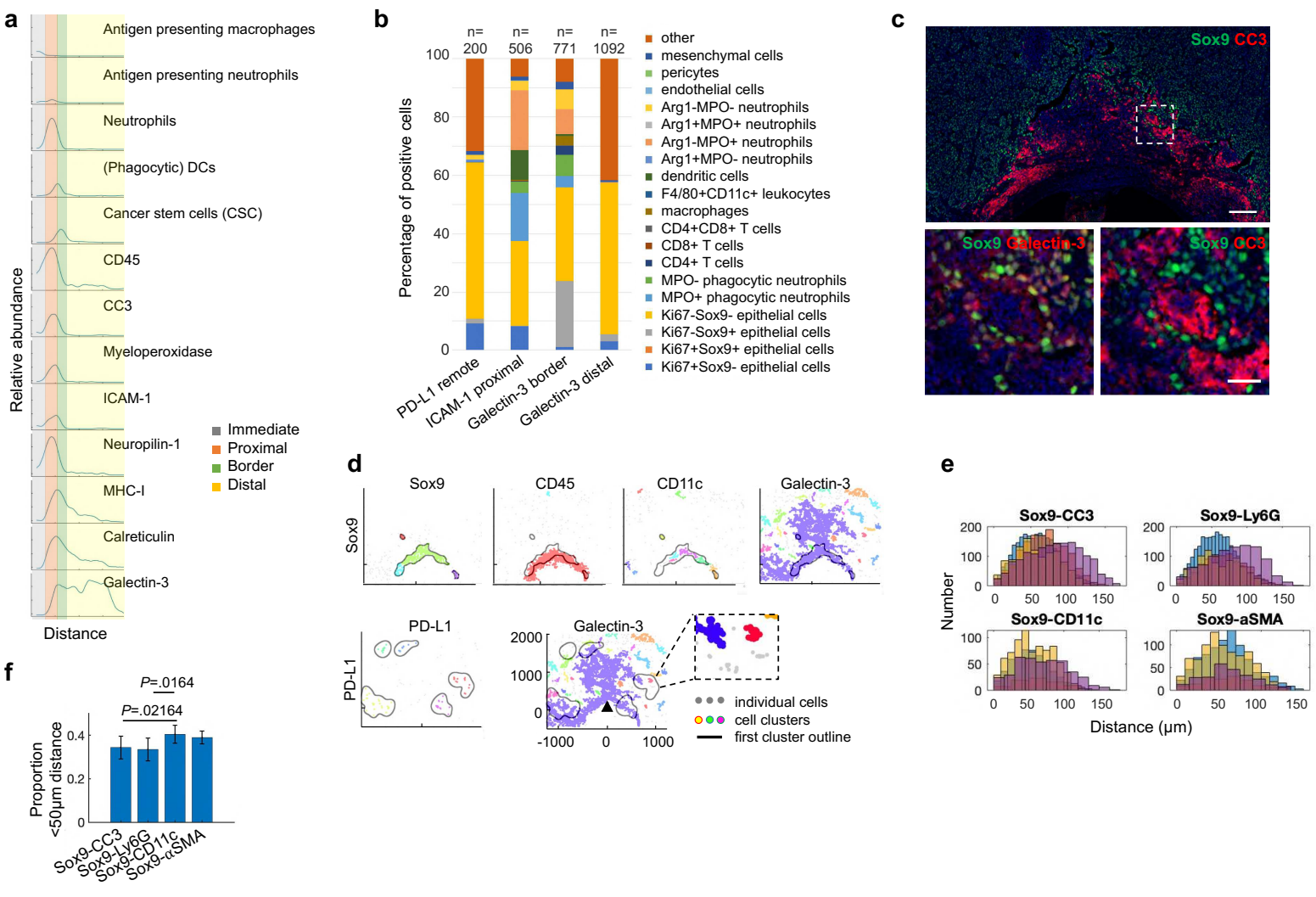


Fig. 5 | Spatial single cell analyses of immunogenic cell death biomarkers and associated resistance mechanisms. a, Profile plot of the relative abundance of standard cell types and individual biomarkers with distance from the well. Assay zones are color-coded in the legend; profile area is shown in Extended Data Fig. 6a. **b**, Percentages of cells expressing biomarkers of ICD on standard cell types presented in form of a stack bar graph. The number of cells quantified (n) is presented. **c**, A composite image showing mutually exclusive staining of Sox9 and CC3; and co-expression of Sox9 with galectin-3 (bottom left image). Scale bar 100µm and 25µm for top and bottom images, respectively. **d**, Distance-based clustering of depicted marker positive cells in XY coordinates with overlay (black line) with Sox9 (top) and PD-L1 cluster border (bottom), respectively. Individual clusters were identified by a minimum 10 cells within a maximum 50µm distance for all but PD-L1 marker which clustered with a maximum distance set to 150µm. **e, f**, Number of Sox9+ pairwise distances with other marker positive cells presented in form of a histogram, e; and bar graph showing average proportion of Sox9 pairwise distances which were less than 50µm, f. n=4 ROIs of 175µm diameter in the border assay zone. Significance was determined by paired two tailed t test.

Fig. 6

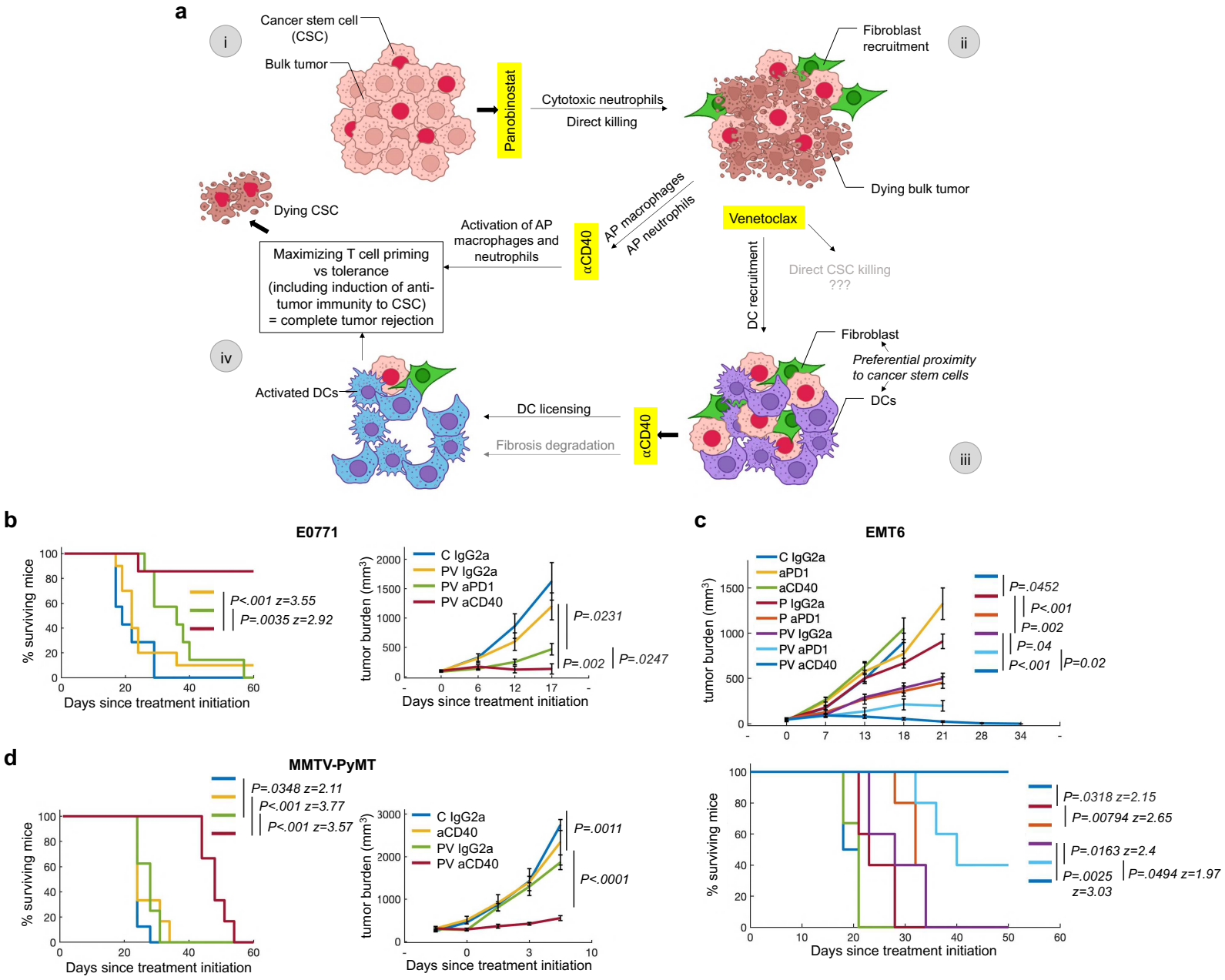


Fig. 6| Efficacy of the triple combination of panobinostat, venetoclax and anti-CD40 immunotherapy in mammary carcinoma and rationale for the combination. **a**, Hypothetical model of response for panobinostat/venetoclax/anti-CD40 triple combination treatment efficacy in breast cancers. Briefly, the tumor is composed of bulk tumor and cancer stem cells (i). Panobinostat induces immunogenic cell death of the bulk tumor while CSCs remain resistant in the tumor microenvironment (ii). Venetoclax induces recruitment of dendritic cells in close proximity to cancer stem cells (iii). We hypothesize that if CD40 ligation induces licensing of DCs which captured and processed antigen from neighboring CSCs, the triple combination potentiates CSC-specific anti-tumor immunity leading to complete tumor rejection (iv). **b, c, d**, Survival rate (left and bottom graphs; 100% to 0%) and tumor burden measurements (right and top graphs) over time in E0771, **b**; EMT6, **c**; orthotopically induced tumor bearing mice and MMTV-PyMT mice with spontaneously growing tumors, **d**. C, control; P, panobinostat, PV, panobinostat-venetoclax combination. Treatment schedules and doses match those in Fig. 3g and 4g except the doses for panobinostat and venetoclax were decreased to 11.5mg/kg and 18mg/kg, respectively, when drugs were combined. For survival rate, P-value was calculated by log-rank (Mantel-Cox). For tumor burden, line graphs are mean ± s.e. per timepoint; n= 8-12 mice, and 6-12 tumors and 6-8 mice per group in **b, c** and **d**, respectively. Significance was calculated by unpaired two-tailed t-test with equal variance.

Supplementary Files

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