1	GSK-3 inhibitor elraglusib enhances tumor-infiltrating immune cell activation in tumo		
2	biopsies and synergizes with anti-PD-L1 in a murine model of colorectal cancer		
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60 Abstract

Inhibition of GSK-3 using small-molecule elraglusib has shown promising preclinical antitumor 61 activity. Using in vitro systems, we found that elraglusib promotes immune cell-mediated tumor 62 cell killing, enhances tumor cell pyroptosis, decreases tumor cell NF-kB-regulated survival protein 63 64 expression, and increases immune cell effector molecule secretion. Using in vivo systems, we 65 observed synergy between elraglusib and anti-PD-L1 in an immunocompetent murine model of colorectal cancer. Murine responders had more tumor-infiltrating T-cells, fewer tumor-infiltrating 66 Tregs, lower tumorigenic circulating cytokine concentrations, and higher immunostimulatory 67 68 circulating cytokine concentrations. To determine the clinical significance, we utilized human plasma samples from patients treated with elraglusib and correlated cytokine profiles with 69 70 survival. Using paired tumor biopsies, we found that CD45+ tumor-infiltrating immune cells had 71 lower expression of inhibitory immune checkpoints and higher expression of T-cell activation 72 markers in post-elraglusib patient biopsies. These results introduce several immunomodulatory mechanisms of GSK-3 inhibition using elraglusib, providing a rationale for the clinical evaluation 73 74 of elraglusib in combination with immunotherapy.

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# 76 Statement of significance

Pharmacologic inhibition of GSK-3 using elraglusib sensitizes tumor cells, activates immune cells for increased anti-tumor immunity, and synergizes with anti-PD-L1 immune checkpoint blockade. These results introduce novel biomarkers for correlations with response to therapy which could provide significant clinical utility and suggest that elraglusib, and other GSK-3 inhibitors, should be evaluated in combination with immune checkpoint blockade.

82

# 83 Introduction

84 Glycogen synthase kinase 3 (GSK-3) is a serine/threonine kinase with key roles in myriad 85 biological processes such as tumor progression, and inhibition of GSK-3 using a novel smallmolecule elraglusib has shown promising preclinical antitumor activity in multiple tumor types (1). 86 There is a growing body of literature characterizing the immunomodulatory roles of GSK-3 in the 87 context of anti-tumor immunity (2). GSK-3 is known to inhibit cytokine production and T cell 88 89 activation (3.4). Aberrant overexpression of GSK-3 has been shown to promote tumor growth and epithelial-to-mesenchymal transition (EMT) through various mechanisms including modulation of 90 pro-survival NF-κB signaling pathways (5). Thus, GSK-3 is a promising target in the treatment of 91 92 human malignancies.

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Globally, colorectal cancer (CRC) ranks third in terms of incidence and second in terms of 94 95 mortality. Treatment options include surgery, chemotherapy, radiation therapy, targeted therapy, and immunotherapy. Immune checkpoint blockade (ICB) has now entered into clinical care for 96 97 CRC with the recent U.S. Food and Drug Administration approvals of checkpoint inhibitors nivolumab and pembrolizumab for microsatellite instability-high (MSI-H) CRC cases after 98 chemotherapy (6). Thus far, ICB clinical trials have demonstrated efficacy in MSI-H CRC, 99 100 however, the impressive durability of tumor regression stands in stark contrast with the lack of 101 response observed in microsatellite stable (MSS) CRC (6). Thus, there remains a substantial unmet need in the ~85% of patients with MSS CRC in whom ICB is less effective (7). Moreover, 102

the percentage of patients with MSS CRC dramatically increases to ~96% in Stage IV disease(7).

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We sought to evaluate elraglusib (9-ING-41), a small molecule that targets GSK-3 which has the potential to increase the efficacy of ICB. We chose to evaluate elraglusib, which inhibits both  $\alpha$ and  $\beta$  isoforms, because it is a clinically relevant small molecule with superior pharmacokinetic properties and is significantly more potent than other GSK-3 inhibitors (8,9). Although there are ongoing efforts to further characterize the immunomodulatory effects of GSK-3 inhibitors, few utilize small-molecule elraglusib (10-12).

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Here, we characterize the effects of elraglusib *in vitro* on tumor and immune cells, *in vivo* in combination with ICB in a syngeneic murine colon carcinoma BALB/c model using MSS cell line CT-26, and in human tumor biopsies and plasma samples from patients with refractory solid tumors of multiple tissue origins enrolled in a Phase 1 clinical trial investigating elraglusib (NCT03678883).

118

119 **Results** 

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121 Elraglusib sensitizes tumor cells to immune-mediated cytotoxicity

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A co-culture of fluorescently-labeled SW480 MSS CRC cells and TALL-104 CD8+ T cells treated with elraglusib led to an increase in tumor cell death after 24 hours (**Supplementary Figure 1A**). Treatment doses chosen were significantly less than the 24- and 72-hour IC-50s calculated for all cell lines evaluated in the co-culture to ensure the majority of tumor cell death was immune cellmediated (**Supplementary Figure 2A-B**). We observed limited tumor cell death in SW480 monocultures treated with drug only (**Supplementary Figure 1B**). In the co-culture with tumor

and immune cells only, in the absence of the drug, we noted that the baseline percentage of dead cells out of total cells was approximately 40%, after normalization. Co-cultures of tumor cells and TALL-104 T cells treated with 5  $\mu$ M elraglusib had an average of 60% dead cells, while co-cultures treated with 10  $\mu$ M of elraglusib had an average of 65% dead cells (**Supplementary Figure 1C**).

134 Because TALL-104 cells are a human leukemic T cell line, we next wanted to determine the relevancy of these results using normal T cells. Donor-derived CD8+ T cells were isolated from a 135 136 donor blood sample in accordance with an IRB-approved protocol. A co-culture of fluorescently-137 labeled SW480 tumor cells and CD8+ donor-derived CD8+ T cells was then treated with elraglusib and the percentage of dead cells out of total cells was guantified after 24 hours (Supplementary 138 Figure 1D). We again observed limited tumor cell death in SW480 monocultures treated with drug 139 140 only (Supplementary Figure 1E). The data was then normalized, as previously described, and 141 we noted even more robust immune cell-mediated tumor cell death in the co-cultures treated with elraglusib (Supplementary Figure 1F). Co-cultures of tumor cells and donor-derived CD8+ T 142 cells treated with 5 µM elraglusib had an average of 65% dead cells, while co-cultures treated 143 with 10 µM of elraglusib had an average of 75% dead cells. 144

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To determine if the increased amount of immune-cell mediated tumor cell-killing was due to the 146 drug's impact on the tumor cells or the immune cells, we next pre-treated tumor cells with 147 elraglusib for 24 hours before the co-culture with immune cells began. We observed that pre-148 149 treatment with elraglusib sensitized SW480 tumor cells to TALL-104 cell-mediated tumor cell killing (Figure 1A). We again used the raw percentages of cell death to normalize the data and 150 observed minimal amounts of drug cytotoxicity at the concentration and duration of treatment 151 used (Figure 1B). Tumor cells pre-treated with 5 µM elraglusib for 24 hours and then co-cultured 152 153 with TALL-104 T cells had an average of 65% dead cells (Figure 1C). Once again, we sought to confirm these co-culture results using donor-derived CD8+ T cells instead of TALL-104 cells 154

(Figure 1D). We observed similar results with the CD8+ T cells where elraglusib pre-treatment of tumor cells led to a statistically significant increase in tumor cell death after 24 hours of co-culture (Figure 1E). Tumor cells pre-treated with 5  $\mu$ M elraglusib for 24 hours and then co-cultured with donor-derived CD8+ T cells had an average of 65% dead cells, while co-cultures treated with 10  $\mu$ M of elraglusib for 24 hours and then co-cultured with donor-derived CD8+ T cells had an average of 70% dead cells (Figure 1F).

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To confirm these results, we repeated these experiments using a GFP+ co-culture system with 162 additional CRC cell lines HCT-116 and HT-29 (Supplementary Figure 1G). We chose to 163 evaluate both HCT-116 and HT-29 CRC cells in this co-culture model to determine if the 164 elraglusib-mediated increase in immune cell-mediated SW480 cell killing could be reproduced in 165 166 additional CRC cell lines. These cell lines were selected based on their varied mutational profiles, 167 with both MSI-H and MSS statuses reflected (Supplementary Figure 2C). When HCT-116 GFP+ cells were co-cultured with TALL-104 cells in the presence or absence of 5 µM elraglusib we 168 noted a significant decrease in GFP+ cells per low-powered field in the 5  $\mu$ M elraglusib only, 169 TALL-104 only, and combination therapy groups as compared to the DMSO only control group 170 171 (Figure 1G). We noted a significant decrease in the number of GFP+ cells per field in the combination therapy group of TALL-104 and 5 µM elraglusib co-culture condition as compared to 172 TALL-104 which recapitulated the results observed in the first co-culture system. We observed a 173 174 similar trend in the HT-29 cell line where the combination therapy group showed increased tumor 175 cell death as compared to the drug-only or T cell-only groups (Figure 1H). To determine if these 176 results applied to other cytotoxic immune cell lines we repeated the co-culture experiments with a natural killer cell line, NK-92. We observed similar trends in the co-culture of NK-92 cells with 177 HCT-116 cells where the combination of 5 µM elraglusib and NK-92 cells showed increased tumor 178 179 cell death as compared to the drug-only treatment or immune cell-only treatment (Figure 1). In

the HT-29 cells, we noted increased tumor cell death in the combination therapy group as compared to immune cell only and as compared to DMSO only (**Figure 1J**).

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183 Elraglusib enhances tumor cell pyroptosis in a co-culture of colorectal cancer cells and immune 184 cells

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To determine if pyroptosis-mediated immune cell activity played a role in the co-culture results 186 187 observed, we examined higher-power co-culture images for evidence of pyroptosis. Indeed, we 188 observed some pyroptotic events in the co-cultures involving tumor cells and TALL-104 cells only (Figure 1K). We did not observe any pyroptotic events in the DMSO or drug-only conditions 189 suggesting that tumor cell pyroptosis was mediated by an immune cell-secreted molecule as it 190 191 was only observed in the co-culture wells with immune cells (Figure 1K, Supplementary Figure 192 **1H).** Interestingly, in the co-culture of CRC (HCT-116, HT-29) and TALL-104 cells in the presence of 5 µM elraglusib treatment, we noted a significant increase in pyroptotic events (Figure 1K, 193 194 Supplementary Figure 11-J). To determine what immune cell-secreted molecules were most likely contributing to tumor cell pyroptosis, we probed for downstream mediator of pyroptotic death 195 196 gasdermin B expression in tumor cells treated with a vehicle-only control (DMSO), 1 µM 197 elraglusib, 100 mg/mL IFN-y, 250 ng/mL IFN-y, 1 ng/mL TNF-α, and 1 ng/mL TRAIL (Figure 1L). We observed an increase in gasdermin B expression with both concentrations of IFN-y used in 198 both the HCT-116 cells and the HT-29 cells suggesting that IFN-y secreted by immune cells was 199 200 a major contributor to the pyroptosis observed (Figure 1M). To test whether immune cells secrete more IFN-y post-treatment with elraglusib, we treated immune cell lines (TALL-104, NK-92) with 201 elraglusib for 24 hours and indeed noted a significant increase in IFN-y post-treatment in cell 202 culture supernatants (Figure 1N-O). 203

Elraglusib upregulates tumor cell PD-L1 and proapoptotic pathway expression as well as downregulates immunosuppressive/angiogenic protein expression and pro-survival pathways

To help elucidate the mechanism behind the CRC cell sensitization to immune cell killing that we 208 209 observed in the co-culture assays, we performed western blot analyses on CRC cells (HCT-116, 210 HT-29) treated with elraglusib over a 72-hour timecourse. Using the same low dose of elraglusib utilized in the co-culture assays, we observed little to no cleaved PARP (cPARP) in both cell lines 211 212 analyzed until the 48-hour timepoint confirming that the tumor cell death observed in the co-213 culture assays was not a product of drug cytotoxicity (Figure 2A). Because GSK-3 is a known regulator of NF-kB signaling pathways we also probed for NF-kB p65 and noted decreased 214 expression as the timecourse progressed. However, we observed increases in PD-L1 expression 215 216 as the treatment duration increased. To further elucidate elraglusib-mediated effects on tumor cell 217 survival we probed for survival factors Bcl-2 and Survivin and noted decreases in protein expression in both cell lines analyzed, especially at the later timepoints (48, 72 hr). In HCT-116 218 219 cells, we also probed for survival factor McI-1 and again noted marked decreases in protein 220 expression by the 24-hour timepoint (Figure 2B).

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We then utilized microarray analysis to gain insights into gene expression changes in CRC cell 222 223 lines post-GSK-3 inhibition with elraglusib. Several CRC cell lines (HCT-116, HT-29, KM12C) 224 were treated with elraglusib at IC-50 concentrations or DMSO as vehicle control for 24 hours, and 225 treated versus untreated samples were compared in triplicate using microarray analysis (Supplementary Figure 3A-F). Results were calculated using a fold change (FC) cutoff of >1.5, 226 <-1.5, and a minimum *p-value* of <0.05. HCT-116 cells had 340 differentially expressed genes 227 post-treatment (Figure 2C). Top differentially expressed genes of interest that were upregulated 228 229 in HCT-116 cells included many anti-proliferative (BTG2, TP53INP1, LYZ, GADD45A, CDKN1A, ATF3, SESN1, SUSD6) and proapoptotic (DRAM1, FAS, BLOC1S2, TNFRSF10B, KLLN, PLK3, 230

231 MXD1, GADD45B, TRIM31, TP53I3, TNFRSF10A, BAK1) genes (Supplementary Table 1). Of note, several of the upregulated genes are known p53 targets (BTG2, MDM2, TP53INP1, 232 DRAM1. GADD45A. CDKN1A. PMAIP1. ATF3. FAS. SESN1. TNFRSF10D. TNFRSF10B. AEN. 233 234 PLK3, TP53I3, SUSD6, GDF15) (13). Meanwhile, many of the downregulated genes included 235 those that promote cell cycle progression (CDC25C, PRC1, ANLN, BARD1, PDK1, DHX32, CCNF, PRR11, TTK, FANCD2, AURKB, UHRF1), EMT (ENO2, MST1R) or cellular proliferation 236 (FASN, ARHGEF39, FOXC1, CDCA3, MKI67). Another upregulated (1.78-FC) gene of interest 237 238 was PPP1R1C and increased expression may increase tumor cell susceptibility to TNF-induced 239 apoptosis (14). Interestingly, CMTM4 expression was downregulated (-1.84-FC) post-treatment and is known to protect PD-L1 from being polyubiguitinated and targeted for degradation (15). 240 Furthermore, NEK2 was downregulated (-2.21-FC) post-treatment and NEK2 protein inhibition is 241 242 known to sensitize PD-L1 blockade (16).

243

In HT-29 cells, we observed 2,307 differentially expressed genes post-treatment (Figure 2D). We 244 245 also observed that many of the upregulated genes post-treatment were proapoptotic (AEN, TNFRSF12A, CCAR1, SFN) or anti-proliferative (SOCS7, CDKN1A, SMAD3, BCCIP, CRLF3) 246 247 and many of the downregulated genes were involved with the promotion of cellular proliferation (TNIK, BRAF, EAPP, JAK1, PDS5B, CDCA3), cell cycle progression (MCIDAS, DYNC1H1, 248 CDC45, UHRF1, CDK2, CDC25C, CCNE1, CDK1, BARD1, CCNE2), EMT (MTA3, AGGF1, 249 E2F8, E2F7, or have antiapoptotic functions (PIM1, SGK1, BCL6, E2F7, TRIB1) 250 (Supplementary Table 2). Interestingly, NCR3LG1 (B7-H6) was upregulated (1.78-FC) post-251 treatment and is known to trigger NCR3-dependent NK cell activation and cytotoxicity (17). 252

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Finally, KM12C cells had 1,032 differentially expressed genes post-treatment (**Figure 2E**). We observed upregulation of proapoptotic genes (*TNFRSF12A, BIK*) while we observed downregulation of genes involved with the promotion of EMT (*CXCL1, AGGF1, IRF2BP2, MET,* 

NRP1, GDF15, E2F8), the promotion of cell cycle progression (CDCA2, IGFBP2, CDC25C,
CCNE1, CCND2, CDK1, CCNE2, BARD1), cellular proliferation (MKI67, BRAF), and the
regulation of TGFβ signaling (TGFBR2, LTBP1, TGFBR3, CD109) in KM12C cells post-treatment
as compared to control (Supplementary Table 3). Of note, we noticed an upregulation (1.53FC) of GZMA (granzyme A) expression post-treatment which is known to cleave gasdermin B to
induce pyroptosis (18).

263

Several relevant signaling pathways had differentially expressed genes post-elraglusib in all three 264 cell lines examined including the VEGFA-VEGFR2, TGFB, IL-18, CCL18, EGF/EGFR, miR-265 targeted genes in lymphocytes, Apoptosis, and cell cycle signaling pathways (Figure 2F). The 266 most significant commonly downregulated signaling pathway was VEGFA-VEGFR2 which had 29 267 268 downregulated genes in HCT-116 cells, 37 downregulated genes in HT-29 cells, and 48 269 downregulated genes in KM12C cells. A Venn Diagram was used to compare the 3,124 genes that were differentially expressed post-treatment as compared to control with elraglusib in the 270 271 three colon cancer cell lines (HCT-116, HT-29, KM12C) (Figure 2G). HCT-116 cells had 241 (7.7%), HT-29 cells had 1,805 (57.8%) and KM12C cells had 549 (17.6%) differentially expressed 272 273 genes post-treatment as compared to control. HCT-116 and HT-29 cells shared 46 differentially 274 expressed genes (1.5%), HCT-116 and KM12C shared 27 (0.86%), KM12C and HT-29 shared 430 (13.8%), and all three cell lines shared 26 (0.83%). All three cell lines showed post-treatment 275 differential expression of NF-kB regulators with increased expression of many negative regulators 276 of NF-kB (NFKBIA, TNFAIP3, TRAIP, IL32) and decreased expression of several positive 277 regulators of NF-kB (IRAK1BP1, FADD, IL17RA, MYD88, ERBB2IP, IL17RB, TNFSF15, NFKBIZ, 278 NFKBIA, MAP3K1, TRAF5, TRAF6, TAB3, TNFRSF11A, MTDH, TLR3) (Supplementary Tables 279 1-3). 280

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282 We previously found that elraglusib treatment of human CRC cell lines (HCT-116, HT-29, KM12C) 283 with varied mutational profiles modified cytokine, chemokine, and growth factor secretion into cell culture media (19). Here, we treated tumor cells (HCT-116, HT-29) with 1 µM or 5 µM elraglusib 284 for 48 hours and subsequently analyzed the cell culture supernatant using Luminex 200 285 286 technology (Figure 2H-I). Several cytokines, chemokines, and growth factors associated with 287 angiogenesis and/or EMT were downregulated in both cell lines (HCT-116, HT-29) at both concentrations of elraglusib. Notably, GDF-15, GM-CSF, and VEGF all had decreased secretion 288 289 post-treatment in both cell lines and at both concentrations of elraglusib. Likewise, several 290 cytokines, chemokines, and growth factors associated with immunosuppression were also downregulated post-treatment including CCL5/RANTES, DcR3, Fas, and soluble PD-L1 (sPD-291 L1). 292

293

#### 294 Elraglusib enhances immune cell effector function

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296 We next analyzed immune cell lines (TALL-104, NK-92) using western blot analysis. Interestingly, 297 when we probed for the same proteins in the cytotoxic immune cell lysates, we observed many 298 opposing trends to those observed in the tumor cells. In TALL-104 cells, we did not notice 299 significant changes in NF-kB or survival protein Bcl-2 as treatment duration increased (Figure 300 **3A)**. Because of the differential impact of elraglusib on tumor and immune cells that we observed 301 via western blot, we next sought to compare the levels of another survival protein Mcl-1 in NK-92 302 natural killer cells and we did not observe a significant decrease in Mcl-1 protein expression through the 72-hour endpoint (Figure 3B). Surprisingly, we noted increases in survival protein 303 Survivin and NF-kB-inducing kinase (NIK), a protein commonly associated with activation of the 304 305 non-canonical NF-KB signaling pathway which led us to create a working model of NIK-mediated 306 increased immune cell recruitment (Figure 3C). Although GSK-3 plays a role in the regulation of  $\beta$ -catenin, we did not focus on elraglusib-mediated effects on  $\beta$ -catenin because colon cancers 307

often harbor mutations in  $\beta$ -catenin or adenomatous polyposis coli (APC), thus nullifying any impact GSK-3 inhibition would have on  $\beta$ -catenin expression. HCT116 cells are heterozygous for  $\beta$ -catenin, harboring one wild-type allele and one mutant allele with inactivation of one of the residues (SER45) phosphorylated by GSK3 $\beta$  that is frequently mutated in tumors (20). Moreover, HT-29, KM12C, and SW480 cells harbor APC mutations (21) **(Supplementary Figure 2C)**.

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Next, microarray analysis was used to gain insights into gene expression changes in immune cell 314 315 lines post-GSK-3 inhibition with elraglusib. Immune cell lines (TALL-104, NK-92) were treated 316 with elraglusib at IC-50 concentrations or DMSO as vehicle control for 24 hours, and treated 317 versus untreated samples were compared in triplicate using microarray analysis (Supplementary **Figure 4A-F)**. Results were calculated using a FC cutoff of >1.5, <-1.5, and a minimum *p* value 318 319 of <0.05. NK-92 cells had 61 differentially expressed genes post-treatment (Figure 3D). We 320 observed an increase in genes that promote immune cell proliferation (TNFSF14, RAB38) and control immune cell adhesion and migration (WNK1) post-elraglusib treatment (Supplementary 321 322 **Table 4).** We also noted decreases in proapoptotic genes (*MIR186, S100A12*) and genes that 323 are involved in the activation of latent TGF $\beta$  to suppress immune cell function (*ITGB8*). TALL-104 324 cells had 64 differentially expressed genes post-treatment (Figure 3E). We observed increased 325 expression of genes involved in the modulation of NF-κB activity (RNY4, RNY5), cytotoxic granule 326 exocytosis (STX19, VAMP8), and anti-apoptotic gene BCL2A1 (BCL2-related protein A1). We also saw an upregulation (1.56-FC) of KIF7 (kinesin family member 7) which is required for T cell 327 328 development and MHC expression as well as an increased expression (1.52-FC) of CCL3 329 (chemokine [C-C motif] ligand 3) which is known to recruit and enhance the proliferation of CD8+ T cells (22). In contrast, we observed decreased expression of genes involved in TGF $\beta$  signaling 330 331 pathways (ACVR1B, PTPN14) and proapoptotic genes (HSPA1A, UBE3A). We also saw a 332 decreased expression (-1.56-FC) of inhibitory immune checkpoint PTPN3 (protein tyrosine phosphatase, non-receptor type 3). In total there were 124 differentially expressed genes post-333

treatment and only 1, an unnamed gene (probe set ID TC22000564.hg.1, coding), was shared
between both cell lines (Figure 3F).

336

To determine if there was any heterogeneity in response to drug treatment, we employed 10X 337 338 single-cell sequencing analysis on both immune cell lines (TALL-104, NK-92) treated with low-339 dose 1 µM elraglusib or vehicle control (DMSO) for 24 hours. As expected, samples clustered by cell type when aggregate data was visualized using a t-SNE plot (Figure 3G). Interestingly, 340 341 immune cells showed differential expression of mitochondrial-encoded genes (MT) and ribosomal 342 genes (RB) post-treatment with elraglusib suggesting a metabolic shift in line with the extensive metabolic reprogramming undergone in immune cells post-activation (23) to support immune cell 343 activities such as cytokine production (Figure 3H). Several genes showed the same trends post-344 345 treatment in both cell lines (Figure 3I). In both cell lines, we observed an increase in immune cell 346 activation marker CD69 and a decrease in the immunosuppressive marker CHI3L1. Finally, we noted an increase in immune cell attractant CCL4 in the NK-92 cells and an increase in immune 347 cell chemoattractant CXCR4 in the TALL-104 cells. 348

349

350 Because the previously observed non-canonical NF-κB pathway activation is known to enhance 351 the expression of immune cell chemotactic chemokines and cytokines, we sought to determine how elraglusib treatment impacts the immune cell secretome. TALL-104 and NK-92 cells were 352 treated with 1 µM elraglusib for 48 hours before cell culture supernatant was collected for cytokine 353 354 profile analysis. TALL-104 cells treated with elraglusib showed increases in effector molecules IFN-y, granzyme B, and TRAIL concentrations, as measured in picogram per milliliter (Figure 3J). 355 In contrast, NK-92 cells treated with elraglusib showed increases in IFN-y and TRAIL but showed 356 decreases in the concentration of secreted granzyme B. 357

359 Elraglusib significantly prolongs survival in combination with anti-PD-L1 therapy in a syngeneic 360 MSS CRC murine model

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Because elraglusib activated immune cells and increased tumor cell PD-L1 expression, we sought 362 363 to evaluate the potential for elraglusib to increase the efficacy of ICB and utilized a syngeneic 364 murine colon carcinoma BALB/c murine model using a MSS cell line CT-26 (Figure 4A). In this MSS CRC model, we observed a significantly improved survival curve in the elraglusib and anti-365 366 PD-L1 combination therapy group (Figure 4B). We also observed statistically significant improved 367 survival in the elraglusib, anti-PD-1, and anti-PD-L1 alone groups as compared to the control (Supplementary Figure 5A-E). However, we saw the most sustained response in the elraglusib 368 and anti-PD-L1 combination therapy group (Supplementary Figure 5F). Murine body weights 369 370 did not differ significantly regardless of the treatment group (Supplementary Figure 5G-L). Also, 371 the mice did not show evidence of significant treatment-related toxicity on complete blood count or serum chemistry analysis (Supplementary Table 5). Both the elraglusib individual treatment 372 373 and dual treatment groups maintained normal renal function as evidenced by normal blood urea nitrogen (BUN) and creatinine and were free of significant electrolyte perturbations. Liver function 374 375 tests did not reveal any evidence of liver toxicity and the dual-treatment mice did not have any 376 elevations of AST, ALT, or bilirubin. As can be expected in mice with significant tumor burdens, mice across treatment groups had decreased albumin levels and evidence of mild marrow 377 hypoplasia resulting in mild anemia, and lower white blood cell and platelet counts. This effect 378 379 was independent of the treatment group and likely related to tumor burden at the time of sacrifice. 380

381 *Murine responders have more T cell tumor-infiltration and higher tumoral CD8+/Treg and* 382 *CD4+/Treg ratios* 

383

384 To begin to evaluate our hypothesis that elraglusib increases immune cell activation and recruitment, we utilized multi-color flow cytometry to characterize the natural killer (NK) and T cell 385 populations 14-days post-treatment initiation, and immune cell subpopulations were analyzed in 386 both the spleen and the tumor (Figure 4C). 14 days post-treatment initiation, mice were grouped 387 388 as responders (R) or non-responders (NR) based on a tumor volume less than or greater than 389 100 mm<sup>3</sup>, respectively. Compared to non-responders, regardless of treatment group, responders 14-days post-treatment had statistically significantly lower levels of splenic CD4+ and CD8+ T 390 cells and had increased percentages of CD69+ activated T cells and Foxp3+ regulatory T cells 391 392 (Treqs) (Figure 4D). Meanwhile, responders had increased percentages of tumor-infiltrating CD3+ and CD4+ T cells (Figure 4E). We also observed that responders had increased 393 percentages of splenic KLRG1+ mature NK cells and tumor-infiltrating CD11b-/CD27- immature 394 395 NK cells, and decreased percentages of tumor-infiltrating CD11b+/CD27- activated NK cells 14-396 days post-treatment initiation (Figure 4F-G). We did not observe striking differences between non-responders and responders in the splenic immature natural killer cell subsets (CD11b-/CD27-397 398 , CD11b-/CD27+, CD11b+/CD27+, CD11b+CD27-) (Figure 4H-I). In contrast, we did observe significant differences between non-responders and responders in the tumor-infiltrating immature 399 400 natural killer cell subsets (Figure 4J-K). We observed that responders had a greater proportion of immature (CD11b-/CD27-) NK cells and a lower proportion of mature (CD11b+CD27-) NK cells 401 402 14 days post-treatment initiation. When comparing the T cell ratios, compared to non-responders, responders had a lower splenic CD8+/Treg and CD4+/Treg ratio (Figure 4L). The CD8+/Treg 403 404 ratio is commonly used as an index of TIL's effector function (24). Additionally, responders had a higher intra-tumoral CD8+/Treg and CD4+/Treg ratio (Figure 4M). Overall, the observed changes 405 in immune cell subsets in responders are consistent with increased infiltration of cytotoxic immune 406 cells into the tumor. 407

408

409 Murine responders show an immunostimulatory tumor microenvironment by IHC

410

To further interrogate the tumor microenvironment (TME), we utilized immunohistochemistry 411 (IHC) analysis on tumor sections from the 14-day post-treatment initiation timepoint or from the 412 end-of-study (EOS) timepoint. We compared non-responders (NR) and responders (R) and 413 414 stained for T cell marker CD3 and observed that responders had significantly more CD3+ T cells 415 as compared to non-responders at both timepoints analyzed. (Figure 5A-B). To determine if there were any differences in immune cell activation, we stained for Granzyme B and again observed 416 417 that responders had significantly more Granzyme B+ staining at both timepoints analyzed as 418 compared to non-responders (Figure 5C-D). We stained for Ki67 as a marker of tumor cell proliferation and observed that responders had less tumor cell proliferation as compared to 419 420 responders at both of the timepoints analyzed (Figure 5E-F). Because we found that elraglusib 421 upregulated tumor cell PD-L1 expression and because we observed such a striking difference in 422 survival when elraglusib was combined with anti-PD-L1 therapy as compared to anti-PD-1 therapy, we next looked at PD-L1 staining in the tumor sections (Figure 5G-H). We observed that 423 424 responders had more PD-L1+ tumor cells as compared to non-responders at both timepoints 425 analyzed. To examine tumor cell apoptosis, we then stained for cleaved-caspase 3 (CC3) and 426 noted that there was no difference in CC3 expression at the mid-timepoint (14 days post-treatment 427 initiation), however, responders did have significantly more CC3 expression than non-responders 428 at the EOS timepoint (Figure 5I-J). We also analyzed the expression of CD4, CD8, Foxp3+, NKp46, TRAIL, PD-1, VEGF, and TGF $\beta$ 2 to gain additional insights into the tumor immune 429 430 microenvironment at both the 14 days post-treatment initiation timepoint and the EOS timepoint, respectively (Supplementary Figure 6). To examine helper T cell presence, we stained for CD4 431 and observed that responders had more CD4+ T cells than non-responders at both of the 432 433 timepoints examined (Supplementary Figure 6A). Interestingly, we saw the same trends when 434 we examined CD8 expression where responders had more CD8+ T cells as compared to nonresponders which differed from the flow cytometry results but could be explained by the large 435

436 variability in CD8a+ T cells we observed by flow cytometry in the non-responder group (Supplementary Figure 6B). We did not observe statistically significant differences in Foxp3+ 437 Treg expression between responders and non-responders at either timepoint (Supplementary 438 439 Figure 6C). When we examined NK cell tumor-infiltration by IHC we noted more NKp46+ NK cells 440 in responders at the 14-day post-treatment initiation timepoint, but this difference was not 441 significant at the EOS timepoint (Supplementary Figure 6D). We chose to examine another cytotoxic mediator TRAIL, and observed no difference between responders and non-responders 442 at the mid-timepoint but, interestingly, observed less TRAIL expression in the responders as 443 444 compared to the non-responders at the EOS timepoint (Supplementary Figure 6E). We also examined PD-1 expression and did not note any significant differences between responders and 445 non-responders at either of the timepoints examined (Supplementary Figure 6F). Again, we 446 447 noted a similar lack of significance when we examined immunosuppressive and angiogenic VEGF 448 expression (Supplementary Figure 6G). Finally, we examined immunosuppressive TGF $\beta$ 2 expression and noted no differences between responders and non-responders at the mid-449 450 timepoint but noted that responders had significantly lower expression at the EOS timepoint (Supplementary Figure 6H). Signal was quantified by converting randomly sampled 20X images 451 452 into 16-bit images and then utilizing Fiji to employ MaxEntropy thresholding (Supplementary Figure 7). 453

454

455 *Murine responders have lower tumorigenic and higher immunomodulatory cytokine* 456 *concentrations* 

457

We next analyzed murine serum samples from EOS mice for cytokine profiles and noted interesting trends between responders and non-responders. Responders were more likely to have lower serum concentrations of CCL21 (p=0.000213), VEGFR2 (p=0.000282), CCL7 (p=0.000633), CCL12 (p=0.0092), BAFF (p=0.0116), and VEGF (p=0.0396) compared to non-

462	responders (Figure 5K-P). In contrast, responders had higher serum concentrations of IL-1 $\beta$
463	(p=0.00135), IL-6 (p=0.0022), CCL22 (p=0.00803), GM-CSF (p=0.0108), CCL4 (p=0.0127),
464	TWEAK ( <i>p</i> =0.02), and CCL2 ( <i>p</i> =0.0291) compared to non-responders (Figure 5Q-W).

465

466 Analytes that were statistically significant between responders and non-responders at both 467 timepoints (14 days post-treatment initiation, EOS) included CCL7/MCP-3/MARC (p=2.19E-05). CCL12/MCP-5 (p=0.000606), TWEAK/TNFSF12 (p=0.00112), BAFF/TNFSF13B (p=0.00469), 468 IL-1 β/IL-1F2 (*p*=0.00507), CCL21/6Ckine (*p*=0.00539), VEGF (*p*=0.00646), IFN-γ (*p*=0.00817), 469 470 CCL4/MIP-1 β (p=0.0133), IL-6 (p=0.229), and GM-CSF (p=0.0257). When comparing responders and non-responders, a Kruskal-Wallis test was used to calculate statistical 471 significance followed by a Benjamini-Hochberg correction for multiple comparisons. The entire 472 473 panel of cytokines, chemokines, and growth factors analyzed by multiplex immunoassay in murine 474 serum from the EOS timepoint included BAFF, MCP-1, MIP-1 α, MIP-1 β, RANTES, MCP-3, Eotaxin, MCP-5, VEGFR2, MIP-3 α, CCL21, MDC, IP-10, CXCL12, GM-CSF, Granzyme B, IFN-475 y, IL-1 α, IL-18, IL-2, IL-3, IL-4, IL-6, IL-7, IL-10, IL-12 p70, IL-13, IL-16, VEGF, M-CSF, Prolactin, 476 and TWEAK (Supplementary Figure 8A-S). 477

478

Patient plasma concentrations of cytokines from a Phase 1 clinical trial investigating elraglusib
correlate with progression-free survival, overall survival, and in vivo response to therapy results

To determine the clinical relevance of the biomarkers of response identified in our murine model, we next employed Luminex 200 technology to analyze plasma samples from patients with refractory solid tumors of multiple tissue origins enrolled in a Phase 1 clinical trial investigating elraglusib (<u>NCT03678883</u>). We found that baseline concentrations of several analytes (IL-12, CXCL11, Fas Ligand, IL-8, VEGF, IL-1  $\beta$ , M-CSF, IL-2) correlated with progression-free survival

487 (PFS) (Figure 6A). Heatmaps were used to visualize linear regression, R squared, and p values. 488 Likewise, concentrations of several analytes (IL-12, IL-1  $\beta$ , IL-21, IL-8, IFN- $\alpha$ , IFN- $\gamma$ , M-CSF, CCL4, Fas Ligand, IL-2, IL-10, CCL11, IL-15, IL-4, Granzyme B, CXCL11) 24-hours post-dose 489 490 also correlated with PFS (Figure 6B). We next analyzed overall survival (OS) data and noted that 491 baseline concentrations of several analytes (IL-8, CXCL11, CCL11, IFN- $\alpha$ , TNF- $\alpha$ , Fas Ligand, TRAIL R2, IL-1 β) correlated with OS (Figure 6C). Next, 24-hour post-dose concentrations of 492 several analytes (IFN-α, Fas Ligand, TRAIL R2, CCL11) also correlated with OS (Figure 6D). 493 494 Patients included in this analysis represented multiple tumor types including appendix (n=3, 495 15.8%), adult T-cell leukemia/lymphoma (ATLL) (n=1, 5.3%), cholangiocarcinoma (n=1, 5.3%), colorectal (n=7, 36.8%), desmoid (n=1, 5.3%), hepatocellular carcinoma (HCC) (n=1, 5.3%), 496 leiomyosarcoma (n=1, 5.3%), non-small cell lung cancer (NSCLC) (n=2, 10.5%), and pancreas 497 498 (n=2, 10.5%) cancer (Figure 6E). The median PFS was 75.9 days, and the median OS was 101 499 days (Supplementary Table 6).

500

501 Many of the analytes were upregulated at 8- and 24-hours post-dose as compared to baseline (Figure 6F). When the cytokines, chemokines, and growth factors were grouped by timepoint 502 503 and raw values were visualized with a heatmap we noticed several interesting trends (Supplementary Figure 9A). When grouped by primary tumor location (appendix, adult T cell 504 505 leukemia/lymphoma [ATLL], cholangiocarcinoma, colorectal, desmoid, hepatocellular carcinoma [HCC], leiomyosarcoma, non-small cell lung cancer [NSCLC], pancreatic), we noted that the 506 507 patient with a desmoid tumor had elevated expression of many of the analytes included in the panel. When cytokines were grouped by elraglusib dose (1, 2, 3.3, 5, 7, 9.3, 12.37) in milligrams 508 per kilogram, we noted that patients receiving a 7 mg/kg dose had increased expression of many 509 510 of the analytes included in the panel at both the 8- and 24-hour post-dose timepoints 511 (Supplementary Figure 9B). Finally, when cytokines were grouped by cytokine, chemokine, or growth factor family we noted that TNF family molecules (BAFF, Fas Ligand, Fas, TNF-α, TRAIL 512

R2, TRAIL R3, TRAIL, TRANCE) has a decreased expression at the 8-hour post-dose timepoint
as compared to baseline and had increased over baseline levels by the 24-hour timepoint
(Supplementary Figure 9C).

516

To compare both murine and human circulating biomarker trends, we created a table to visualize 517 518 major trends (Figure 6G). EOS analyte concentrations that positively correlated with OS in the mouse model included IL-1 β, CCL22, CCL4, TWEAK, GM-CSF, and IL-6. Those that negatively 519 520 correlated with OS in the mouse model included CCL21, VEGFR2, CCL12, BAFF, and VEGF. 521 Interestingly, we observed that many of these trends held true when analyzing the human data. IL-1 β, CCL22, and CCL4 all were positively correlated with PFS and OS in the human cohort. 522 likewise, BAFF and VEGF were negatively correlated with OS and PFS. GM-CSF and IL-6 had 523 524 opposing correlations in the human cohort as compared to the murine cohort.

525

526 PanCK+ expression of immunosuppressive CD39 negatively correlated with time-on-treatment 527 (Tx time) while CD45+ expression of monocyte/macrophage marker CD163 positively correlated 528 with Tx time

529

To gain insights into the human TME post-elraglusib, we utilized GeoMx Digital Spatial Profiling 530 (DSP) technology to profile the expression of 59 proteins in tumor biopsies (n=12) from patients 531 532 treated with elraglusib (n=7). 42% (n=5) of the tumor biopsies analyzed were collected near or 533 before treatment start (pre-treatment) and 58% (n=7) of the biopsies analyzed were collected from post-treatment (average time-on-treatment [Tx time] at post-treatment biopsy: 270 days) (Figure 534 7A). Primary tumor types included CRC (n=4, 33%) and pancreatic cancer (n=8, 67%), while 535 metastatic biopsy tissue sites included lung (n=2, 17%), liver (n=7, 58%), rectum (n=2, 17%), and 536 537 pleura (n=1, 8%). We analyzed five paired tumor biopsies (n=10 slides total, 83%), and 2 unpaired biopsies (n=2 slides total, 17%). Half (n=6, 50%) of the tumor sections were needle biopsies 538

539 (Supplementary Figure 10) and half (n=6, 50%) were tissue biopsies (Supplementary Figure 540 **11).** All patients included in this analysis were considered responders based on the definition used in the Phase 1 trial that treatment response is equal to disease control greater than 16 weeks. 541 542 Our region of interest (ROI) selection strategy focused on mixed tumor and immune cell segments 543 within FFPE tissue. ROIs were segmented based on panCK+ and CD45+ morphology stains to 544 compare tumor versus immune cells protein expression (Figure 7B, Supplementary Figure 12). We utilized a PCA plot to visualize dimensionality reduction and as expected, samples tended to 545 546 cluster by tissue type (liver, lung, pleura, rectum) and further separated by segment (CD45, 547 panCK) on PC2 (Supplementary Figure 13A-B). We utilized a Sankey diagram to visualize the study design where the width of a cord in the figure represents how many segments are in 548 common between the two annotations they connect (Figure 7C). Also as expected, samples 549 550 tended to cluster together based on patient ID, primary tumor location, biopsy timepoint, 551 metastatic biopsy tissue site, immune cell location, or segment (CD45, panCK) type when visualized on an aggregate heatmap (Figure 7D). As we were interested in the ability to predict 552 553 a patient's time-on-treatment (Tx time), we sought to correlate pre-treatment protein expression levels among the responders with Tx time data and found that PanCK+ segment expression of 554 555 immunosuppressive CD39 negatively correlated with Tx time (Figure 7E) while CD45+ segment 556 monocyte/macrophage marker CD163 expression positively correlated with Tx time (Figure 7F) (25). 557

558

559 Tumor-infiltrating immune cells have reduced inhibitory checkpoint expression and increased 560 expression of T cell activation markers post-elraglusib

561

562 When comparing all samples, CD45+ regions of post-treatment biopsies had increased protein 563 expression of T cell activation marker OX40L (p = 0.016) and decreased protein expression of

checkpoint molecules VISTA (p = 2.0E-24), PD-L1 (p = 3.2E-13), PD-L2 (p = 2.0E-9), LAG3 (p = 564 565 5.1E-4), and PD-1 (p = 5.6E-9). CD45+ regions of post-treatment biopsies also had decreased protein expression of myeloid/neutrophil marker CD66b (p = 7.5E-15), myeloid markers IDO1 (p 566 = 4.8E-6), CD80 (p = 5.4E-6), and CD11b (p = 6.7E-3), TAM/M2 macrophage marker CD68 (p =567 568 3.8E-4), myeloid/T cell activation marker OX40L (p = 0.016), myeloid marker CD40 (p = 0.020), and DC/myeloid marker CD11c (p = 0.022) as compared to pre-treatment samples (Figure 7G). 569 570 Because we were interested in the differential expression of proteins based on immune cell location in relation to the tumor, we annotated CD45+ ROI locations as tumor-infiltrating, tumor-571 adjacent, or normal tissue (Supplementary Figure 14A-C). When next compared tumor-572 infiltrating CD45+ immune cell segments in pre-versus post-treatment biopsies and found that 573 post-treatment tumor-infiltrating CD45+ immune cell segments had lower protein expression of 574 575 immune checkpoints VISTA (p = 1.6E-14), PD-L1 (p = 1.1E-6), PD-L2 (p = 7.6E-4), and PD-1 (p= 1.6E-3) and higher protein expression of T cell activation markers CTLA4 (p = 3.1E-5) and 576 OX40L (p = 1.6E-3) (Figure 7H). We also noted that post-treatment tumor-infiltrating CD45+ 577 578 immune cell segments had lower protein expression of myeloid marker CD66b (p = 1.4E-13), 579 antigen PTEN (p = 1.5E-11), hematopoietic marker CD34 (p = 3.3E-9), T cell activation marker CD44 (p = 3.1E-7), antigen presentation B2M (p = 2.5E-6), immune cell activation marker HLA-580 DR (p = 3.1E-5), TAM/M2 macrophage marker ARG1 (p = 7.6E-5), memory T cell marker 581 CD45RO (p = 1.1E-4), proliferation marker Ki-67 (p = 2.7E-4), TAM/M2 macrophage marker CD68 582 (p = 5.8E-4), myeloid marker IDO1 (p = 6.6E-4), myeloid marker CD80 (p = 2.4E-3), NK cell 583 marker CD56 (p = 6.9E-3), DC/myeloid marker CD11c (p = 9.5E-3), and T cell activation marker 584 GITR (p = 0.021) and had higher protein expression of immune checkpoint molecule B7-H3 (p = 0.021) 585 0.012) and Treg marker CD127 (p = 0.012) as compared to pre-treatment tumor-infiltrating CD45+ 586 immune cell segments. 587

Patients with a long time-on-treatment have decreased B cell and myeloid marker expression in
 immune cell regions and have decreased immune checkpoint expression in tumor cell regions

591

Next, we sought to compare pre-treatment biopsy protein expression in CD45+ segments 592 between patients who were on treatment for a longer duration of time called "Long Tx patients" 593 594 and patients who were on the study for a shorter duration of time called "Short Tx patients" and 595 observed that Long Tx patients had lower protein expression of B cell marker CD20 (p = 0.012) and myeloid activation marker CD80 (p = 0.047) (Supplementary Figure 13C). Long Tx was 596 597 defined as a Tx time greater than 275 days (~39 weeks). Then we compared protein expression 598 in CD45+ segments in post-treatment biopsies between Long Tx patients and Short Tx patients. We observed that Long Tx patients had lower protein expression of antigen NY-ESO-1 (p = 0.021) 599 600 and progesterone receptor (PR) (p = 0.022) (Supplementary Figure 13D). We then compared pre-treatment biopsy protein expression in PanCK+ segments between Long Tx patients and 601 Short Tx patients and observed that Long Tx patients had lower protein expression of cytotoxic T 602 cell marker CD8 (p = 3.5E-3), antigen Her2 (p = 0.033), Treg marker Foxp3 (p = 0.033), T cell 603 marker CD3 (p = 0.035), and B cell marker CD20 (p = 0.046). Long Tx patients also had lower 604 immune checkpoint protein expression of LAG3 (p = 0.023), PD-L2 (p = 0.028), and PD-1 (p = 0.028) 605 606 0.046) (Supplementary Figure 13E). We carried out the same analysis with a focus on panCK+ segments in post-treatment biopsies. Long Tx patients had lower protein expression of mature B 607 cell/DC marker CD35 (p = 8.5E-3), antigen NY-ESO-1 (p = 8.7E-3), antigen Her2 (p = 0.022), 608 609 antigen MART1 (p = 0.029), cytotoxic T cell marker CD8 (p = 0.030), Treg marker Foxp3 (p =610 0.030), antigen PTEN (p = 0.032), DC/myeloid marker CD11c (p = 0.034), memory T cell marker CD45RO (p = 0.036), checkpoint PD-L1 (p = 0.047), and PR (p = 0.049) as compared to Short 611 Tx patients (Supplementary Figure 13F). Several additional comparisons were made between 612

613 pre- and post-treatment biopsies, immune cell location in proximity to the tumor, and paired and

614 unpaired biopsies (Supplementary Figure 15A-N).

615

616 Discussion

617

618 ICB is a promising treatment strategy for many cancer patients, including MSI-H CRC patients. However, the response rate to ICB in MSS CRC patients is very limited, especially as the tumor 619 620 stage advances, thus there is a clear need for improved treatment strategies for this patient population. Evaluating the combination of ICB with small molecules in oncology represents one 621 of the ways we might improve the efficacy of ICB in MSS CRC patients. Here, we focus on small-622 623 molecule inhibitor of GSK-3 elraglusib and characterize several immunomodulatory mechanisms 624 that provide a clinical rationale for the combination of GSK-3 inhibitors such as elraglusib in 625 combination with ICB.

626

We demonstrate that small-molecule inhibition of GSK-3 using elraglusib leads to increased 627 natural killer and T cell-mediated CRC cell killing in a co-culture model. Moreover, elraglusib acts 628 629 on tumor cells to sensitize them to immune cell-mediated killing. This tumor cell sensitization could be resultant of drug-induced modifications in the tumor cell secretome such as decreased VEGF 630 expression, decreased soluble PD-L1, and increased CXCL14, as we previously described (19). 631 VEGF has been shown to inhibit T cell activation (26) while CXCL14 is a known NK cell 632 633 chemoattractant (27). It has been shown that the soluble or shed version of PD-L1 can retain the ability to bind PD-1 and function as a decoy receptor to negatively regulate T cell function, despite 634 635 being a truncated version lacking the membrane domain of the protein (28). Therefore, the increase in efficacy in combination with ICB that we observed in the co-culture model could be 636 637 due to a concomitant downregulation of sPD-L1 and an upregulation of cell surface-expressed

PD-L1. This *in vitro* work was presented, in part, at the 2021 American Association of Cancer
Research (AACR) Annual Conference.

640

Elraglusib-mediated immunostimulation may also function, in part, by inducing pyroptosis in 641 642 cancer cells. Pyroptosis is a lytic and pro-inflammatory type of programmed cell death that results in cell swelling and membrane perforation. Although the role of pyroptosis in cancer is 643 controversial, it has been suggested that pyroptosis may contribute to anti-tumor immunity (29). 644 Since we observed gasdermin B expression post-IFN-y treatment in CRC cells and because we 645 646 found that elraglusib treatment upregulated immune cell IFN-y secretion, we hypothesize that the IFN-y released from CD8+ T cells and NK cells is responsible for triggering pyroptosis which may, 647 in part, contribute to elraglusib-mediated immunostimulation. 648

649

650 Another mechanism behind elraglusib-mediated immunomodulation is the suppression of inflammatory NF-kB signaling and survival pathways in the tumor cells. We demonstrated that 651 652 elraglusib treatment of CRC cells decreased Survivin, NF-kB p65, Bcl-2, and Mcl-1expression while increasing PD-L1 expression. This is in accordance with previous studies that have shown 653 654 that GSK-3 is a positive regulator of NF-κB (30). Microarray data showed increased expression of antiproliferative, proapoptotic, and NF-kB regulator genes and decreased expression of genes 655 involved in cell cycle progression, antiapoptotic, and EMT genes in CRC cell lines. Multiplex 656 immunoassay data showed decreased tumor cell secretion of proteins involved in angiogenesis, 657 658 EMT, and immunosuppression.

659

Meanwhile, we observed the opposite effect on NF- $\kappa$ B signaling in immune cells, where we observed that drug treatment increased NF- $\kappa$ B-inducing kinase (NIK) expression. NIK is the upstream kinase that regulates activation of the non-canonical NF- $\kappa$ B signaling pathway, and may implicate a role for non-canonical NF- $\kappa$ B signaling in immune cells post-treatment with elraglusib,

664 which future studies could further evaluate. It is known that increased expression of NIK leads to 665 enhanced expression of chemokines and cytokines such as CCL3, TNF- $\alpha$ , and MCP-1, which thus leads to increased recruitment and proliferation of cytotoxic immune cells (31). Moreover, 666 elraglusib treatment of immune cells increased effector molecule secretion in both T and NK cells 667 668 as well as led to increased expression of genes involved in cytotoxic granule exocytosis, cellular proliferation, and modulators of NF-kB activity. Moreover, elraglusib treatment resulted in 669 decreased gene expression of proapoptotic molecules and regulators of TGF<sup>β</sup> signaling which 670 671 may also contribute to the tumor suppressive and anti-angiogenic effects of elraglusib that have 672 been previously described (32).

673

In a syngeneic murine colon carcinoma BALB/c murine model using MSS cell line CT-26, we 674 observed significantly improved survival of mice treated with elraglusib and anti-PD-L1 therapy. 675 676 We also demonstrated increased survival of mice treated with elraglusib alone as compared to the control group. We also observed statistically significant improved survival in the anti-PD-1 and 677 anti-PD-L1 alone groups as compared to the control. Responders had lower percentages of 678 splenic CD4+ T cells and splenic CD8+ T cells and had increased percentages of CD69+ 679 680 activated T cells and Foxp3+ Tregs. The increased splenic percentages of both activated and end-stage T cells in the responder groups could be indicative of an anti-tumor immune response 681 that was mounted earlier in the treatment course. Future studies could analyze the changes in 682 these immune cell populations during the course of therapy in greater detail, especially 683 684 considering we could have missed important changes in immune cell subtypes due to limited timepoints. Compared to non-responders, responders also had more CD3+ and CD4+ tumor-685 infiltrating lymphocytes. Further studies could evaluate the contribution of CD4+ versus CD8+ 686 tumor-infiltrating T cells to the observed response to elraglusib and anti-PD-L1 therapy, especially 687 688 considering the recent interest in the contribution of CD4+ helper T cells to anti-tumor immunity (33). We did not observe many significant differences in splenic NK cell subpopulations in either 689

the tumor or the spleen, although perhaps the timepoint we chose to analyze was not representative of NK cell subpopulation changes that may have occurred earlier or later in the course of treatment. One limitation of this model is that it is a heterotopic flank tumor model as opposed to an orthotopic colon tumor model which may be more representative of the CRC TME. Follow-up experiments could examine the contribution of CD4+ T cells, CD8+ T cells, and NK cells to response to therapy in the murine MSS CRC model by blocking the function of each cell population in individual experiments.

697

698 We observed that murine responders had lower serum concentrations of BAFF, CCL7, CCL12, 699 VEGF, VEGFR2, and CCL21. BAFF is a cytokine that belongs to the TNF ligand superfamily, that 700 may promote tumorigenesis indirectly by induction of inflammation in the TME and directly by 701 induction of EMT (34). Meanwhile, CCL7 has been shown to enhance both cancer progression 702 and metastasis via EMT, including in CRC cells (35). Similarly, others have demonstrated that CXCR4 plays a critical role in the promotion of the progression of inflammatory CRC (36). It is 703 704 commonly known that expression of VEGF-1 in CRC is associated with disease localization, 705 stage, and long-term survival (37). We had previously observed suppression of VEGF in a panel 706 of CRC cell lines post-elraglusib treatment and saw a similar suppression of VEGF in the murine 707 responders. Moreover, we noted a decrease in VEGFR2 in murine responders, a protein that is 708 highly expressed in CRC and promotes angiogenesis (38). Finally, CCL21 has been shown to play a role in colon cancer metastasis (39). Since many of the downregulated analytes in 709 710 responders play a role in EMT, future studies of elraglusib could include metastatic CRC models.

711

We observed that responders had higher serum concentrations of CCL4, TWEAK, GM-CSF, CCL22, and IL-12p70 as compared to non-responders. Others have demonstrated that CCL4 is an important chemokine in the TME in determining response to ICB and that a lack of CCL4 can lead to the absence of CD103+ dendritic cells (DCs) (40). DCs are an important cell population

716 influencing the response to ICB, and although we did not monitor their levels in this study, it is 717 conceivable that they played a role in influencing response to therapy. For this reason, further studies could monitor DC populations during the course of therapy. TWEAK is commonly 718 719 expressed by peripheral blood monocytes and upregulates its expression after exposure to IFN-720 y (41). TWEAK has also been shown to promote the nuclear translocation of both classical and 721 alternative NF-kB pathway subunits (42). GM-CSF is a well-known immunomodulatory factor that has immunostimulatory functions but it is also predictive of poor prognosis in CRC (43). Finally, 722 we observed increased levels of IL-12p70 in murine responders. IL-12 is a potent, pro-723 724 inflammatory cytokine that has been shown to increase activation and cytotoxicity of both T and NK cells as well as inhibit immunosuppressive cells, such as TAMs (44) and myeloid-derived 725 suppressor cells (MDSCs) (45). We demonstrated that GSK-3 inhibitors such as elraglusib 726 727 represent a possible combination strategy to increase the efficacy of ICB in patients with MSS 728 CRC. The elraglusib-mediated increase in tumor surface cell-expressed PD-L1 presumably makes this an ideal small molecule to combine with anti-PD-L1 therapies. As this study was 729 730 concerned solely with CRC, future studies could evaluate the combination of GSK-3 inhibitors 731 with ICB in other malignancies of interest such as pancreatic cancer. This in vivo work was 732 presented, in part, at the 2022 American Association of Cancer Research (AACR) Annual 733 Conference.

734

Cytokine analysis of plasma samples from patients with refractory solid tumors of multiple tissue origins enrolled in a Phase 1 clinical trial investigating elraglusib (NCT03678883) revealed that elevated baseline plasma levels of proteins such as IL-1  $\beta$  and reduced levels of proteins such as VEGF correlated with improved PFS and OS. PFS was also found to be positively correlated with elevated plasma levels of immunostimulatory analytes such as Granzyme B, IFN- $\gamma$ , and IL-2 at 24 hours post-treatment with elraglusib. Several of these secreted proteins correlated with results from the *in vivo* study where expression of proteins such as IL-1  $\beta$ , CCL22, CCL4, and TWEAK

was positively correlated with improved response to therapy while expression of proteins such as
 BAFF and VEGF negatively correlated with response to therapy. These results introduce novel
 circulating biomarkers for correlations with response to therapy which could provide significant
 clinical utility.

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DSP analysis of paired FFPE tumor biopsies from patients with CRC or pancreatic cancer before 747 and after treatment revealed that CD39 expression in PanCK+ segments was negatively 748 749 correlated with duration of treatment while CD163 expression in CD45+ segments was positively 750 correlated with duration of treatment and potential therapeutic benefit. It is known that CD39 can inhibit costimulatory signaling, increase immunosuppression during T cell priming, and its 751 expression is associated with TAMs, Tregs, and inhibited cytotoxic immune cell function (46). 752 753 CD39 has been shown to suppress pyroptosis, impair immunogenic cell death, and CD39 754 expression on endothelial cells regulates the migration of immune cells and promotes angiogenesis (46). Moreover, CD163 is a marker of cells from the monocyte/macrophage lineage 755 756 therefore future studies could evaluate the impact of monocyte/macrophages on response to 757 elraglusib. We also noted that immune cell segments showed differential protein expression 758 based on the proximity to the tumor where tumor-infiltrating immune cells had decreased 759 expression of immune checkpoints (PD-L1, Tim-3, PD-1) and Treg markers (CD25, CD127) as 760 compared to tumor-adjacent immune cells regardless of timepoint. While the downregulation of immune checkpoint proteins PD-1, TIGIT, and LAG-3 by elraglusib has been previously described 761 in melanoma models (47), our findings regarding VISTA and PD-L2 have not yet been reported. 762 763 These novel observations regarding emerging immune checkpoint inhibitors should be included in future correlative studies regarding GSK-3 inhibition. 764

765

When we analyzed differential protein expression between Long Tx patients and Short Tx patients, we found that Long Tx patients had lower post-treatment expression of mature B cell/DC

768 marker CD35, antigen NY-ESO-1, antigen Her2, antigen MART1, cytotoxic T cell marker CD8, 769 Treg marker Foxp3, antigen PTEN, DC/myeloid marker CD11c, memory T cell marker CD45RO, checkpoint PD-L1, and PR in PanCK+ segments as compared to Short Tx patients which 770 771 introduces several novel potential biomarkers of response to GSK-3 therapy which should be 772 validated in further studies. Moreover, when we compared post-treatment protein expression in 773 tumor-infiltrating CD45+ immune cell segments in Long Tx patients and Short Tx patients and found that Long Tx patients had decreased expression of antigens NY-ESO-1, PTEN, and PR as 774 775 compared to Short Tx patients. Interestingly, these three antigens (NY-ESO-1, PTEN, and PR) 776 had decreased expression in Long Tx patients post-treatment regardless of tumor or immune cell region. 777

778

779 There are several potential limitations of this study. One such limitation is that we tested the 780 combination of elraglusib and ICB therapy in a mouse model using only one MSS CRC cell line. Future studies could determine how other MSS CRC cell lines, and perhaps MSI-H cell lines, will 781 respond to this combination treatment. We also had sample size limitations for the number of 782 mice that were included in each treatment group at each flow cytometry timepoint throughout the 783 784 course of the study, due to the feasibility of the mouse work. Future studies could include larger numbers of mice per flow cytometry timepoint as well as include the comparison of both male and 785 female mice to determine if there are any sex-specific effects. Furthermore, given access to an 786 787 expanded cohort of tumor biopsies from patients treated with elraglusib, it would be interesting to 788 analyze pre-treatment biopsies between responders and non-responders using DSP technology to aid in identifying predictive biomarkers. 789

790

In conclusion, this work demonstrates that small-molecule inhibition of GSK-3 using elraglusib
 may be a potential means to increase the efficacy of ICB and improve response in patients with

MSS CRC, and possibly other tumor types. These findings support further studies and clinical development of elraglusib in combination with ICB, anti-PD-L1 therapy in particular. Moreover, this study, to our knowledge, represents the first digital spatial analysis of tumor biopsies from patients treated with elraglusib and very few oncology drugs have been evaluated using GeoMx technology to date. The novel circulating biomarkers of response to GSK-3 inhibition identified using the cytokine profiling data could provide significant clinical utility and the spatial proteomics data gives us novel insights into the immunomodulatory mechanisms of GSK-3 inhibition.

800

# 801 Methods

802

## 803 Cell culture maintenance

804 Human CRC cells SW480 (RRID: CVCL 0546), HCT-116 (RRID: CVCL 0291), HT-29 (RRID: 805 CVCL 0320), and KM12C (RRID: CVCL 9547) were used in this study. SW480 cells were cultured in Dulbecco's Modified Eagle Medium (DMEM) supplemented with 10% FBS and 1% 806 807 Penicillin-Streptomycin HCT-116 and HT-29 were cultured in McCoy's 5A (modified) Medium supplemented with 10% FBS and 1% Penicillin-Streptomycin. KM12C cells were cultured in 808 809 Eagle's Minimal Essential Medium supplemented with 10% FBS and 1% Penicillin-Streptomycin. Human immune cells NK-92 (RRID: CVCL 2142), TALL-104 (RRID: CVCL 2771), and patient-810 derived CD8+ T cells were also used in this study. NK-92 cells were cultured in Alpha Minimum 811 Essential medium supplemented with 2 mM L-glutamine, 1.5 g/L sodium bicarbonate, 0.2 mM 812 813 inositol, 0.1 mM 2-mercaptoethanol, 0.02 mM folic acid, 12.5% horse serum, and 12.5% FBS. TALL-104 cells (CD2 +; CD3 +; CD7 +; CD8 +; CD56 +; CD4 -; CD16 -) and patient-derived T 814 cells (CD3 +; CD8 +) were cultured in RPMI-1640 containing 20% FBS, 100 U/ml penicillin, and 815 100 µg/ml streptomycin. Recombinant human IL-2 (Miltenyi cat# 130-097744) with a final 816 817 concentration of 100 units/mL was added to all immune cell culture media. All cell lines were

incubated at 37°C in a humidified atmosphere containing 5% CO2. Cell lines were authenticated
and tested to ensure the cultures were free of mycoplasma infection.

820

### 821 Measurement of cell viability

Cells were seeded at a density of  $3 \times 10^3$  cells per well in a 96-well plate (Greiner Bio-One, 822 823 Monroe, NC, USA). Cell viability was assessed using the CellTiter Glo assay (Promega, Madison, WI, USA). Cells were mixed with 25 µL of CellTiter-Glo reagents in 100 µL of culture volume, and 824 bioluminescence imaging was measured using the Xenogen IVIS imager (Caliper Life Sciences, 825 826 Waltham, MA). The percent of cell viability was determined by normalizing the luminescence 827 signal to control wells. Dose-response curves were generated and the half maximal inhibitory concentration (IC-50) was calculated using Graph-Pad Prism (RRID: SCR 002798) version 9.2.0. 828 829 For IC50 generation, concentrations were log-transformed and data were then normalized to 830 control and a log (inhibitor) versus response (three parameters) test was used.

831

### 832 Pyroptosis assay

Recombinant Human TNF-α (Cat #300-01A, PeproTech, Rocky Hill, NJ, USA) and Recombinant
Human IFN-γ (Cat # 300-02, Peprotech, Rocky Hill, NJ, USA) were purchased for use in western
blot analysis while rhTRAIL was generated in-house (48).

836

Reagent or Resource	Source	Identifier	Dilution
Vinculin (E1E9V) XP® Rabbit mAb	Cell Signaling	Cat# 13901	1:1000
Anti-GSDMB antibody	Sigma-Aldrich	Cat# HPA052407	1:1000

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838

## 839 Isolation of donor-derived CD8+ T cells

An Easy Step Human CD8+ T Cell Isolation Kit was used to isolate CD8+ T cells from a donor PBMC sample via negative selection (Cat #, 17913, Stem Cell Technologies, Vancouver, Canada).

843

844 Collection of cell culture supernatants used in cytokine measurements

Cells were plated at  $3.5 \times 10^4$  cells in a 48-well plate (Thermo Fisher Scientific, Waltham, MA, USA) in complete medium and incubated at 37°C with 5% CO2. At 24 hours after plating, almost all the tumor cells were adherent to the bottom of the flask and the complete medium was replaced with the drug-containing medium. Subsequently, the culture supernatants were collected after 48 hours of incubation and were frozen at -80°C until the measurement of cytokines was performed. On the day of analysis, samples were thawed and centrifuged to remove cellular debris.

851

#### 852 Human cytokine profiling

Human cell line culture supernatants were analyzed using an R&D systems Human Premixed 853 Multi-Analyte Kit (R&D Systems, Inc., Minneapolis, MN, USA) and a Luminex 200 (RRID: 854 SCR 018025) Instrument (LX200-XPON-RUO, Luminex Corporation, Austin, TX, USA) 855 according to the manufacturer's instructions. Sample levels of TNF-a, 4-1BB/TNFRSF9/CD137, 856 IL-8/CXCL8, Ferritin, IFN-B, IL-10, CCL2/JE/MCP-1, VEGF, CXCL13/BLC/BCA-1, IFN-y, 857 CCL20/MIP-3 α, CCL3/MIP-1 α, CCL22/MDC, CCL4/MIP-1 β, Fas Ligand/TNFSF6, IL-17/IL-17A, 858 BAFF/BLyS/TNFSF13B, GM-CSF, CXCL5/ENA-78, TRANCE/TNFSF11/RANK L, 859 IL-2, CXCL9/MIG, G-CSF, IFN-y R1/CD119, VEGFR3/Flt-4, C-Reactive Protein/CRP, CXCL11/I-TAC, 860 IL-21, CXCL14/BRAK, IL-6, Fas/TNFRSF6/CD95, TRAIL R3/TNFRSF10C, IL-4, CCL5/RANTES, 861 PD-L1/B7-H1, CCL7/MCP-3/MARC, Chitinase 3-like 1, CXCL10/IP-10/CRG-2, IL-1 β/IL-1F2, IL-862 7, Prolactin, CCL8/MCP-2, TRAIL R2/TNFRSF10B, M-CSF, IL-15, Granzyme B, IFN-α, TREM-1, 863 864 IL-12/IL-23 p40, TRAIL/TNFSF10, CCL11/Eotaxin, and IL-18/IL-1F4. Quantitative analysis with 6 standards and a minimum of 50 counts per bead region was used with the Luminex to generate 865

analyte values reported as picograms/ milliliter (pg/mL). Sample concentrations less than the lower limit of detection for each particular analyte were recoded as the lower limit value divided by ten. Sample concentrations above the upper limit of detection for a particular analyte were recoded as the upper limit of detection.

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#### 871 Murine cytokine profiling

Whole blood from mice was collected, allowed to clot, and serum was isolated using a serum 872 873 separator tube (SST) according to manufacturer instructions. Murine serum samples were 874 analyzed using an R&D systems Murine Premixed Multi-Analyte Kit (R&D Systems, Inc., Minneapolis, MN, USA) and a Luminex 200 (RRID: SCR 018025) Instrument (LX200-XPON-875 RUO, Luminex Corporation, Austin, TX, USA) according to the manufacturer's instructions. 876 Sample levels of GM-CSF, IL-7, IL-12 p70, CCL2/JE/MCP-1, IL-1 β/IL-1F2, VEGF, IL-2, IL-4, 877 878 VEGFR2/KDR/Flk-1, IL-6, IL-10, IL-13, IFN-y, IL-3, IL-16, CXCL10/IP-10/CRG-2, CCL5/RANTES, CCL7/MCP-3/MARC, CCL12/MCP-5, Prolactin, M-CSF, CCL3/MIP-1 a, IL-1 a/IL-1F1, 879 CCL20/MIP-3 α, CCL4/MIP-1 β, TWEAK/TNFSF12, CXCL12/SDF-1 α, BAFF/BLyS/TNFSF13B, 880 Granzyme B, CCL21/6Ckine, CCL11/Eotaxin, and CCL22/MDC. Sample values are reported in 881 882 picograms per milliliter (pg/mL). Quantitative analysis with 6 standards and a minimum of 50 counts per bead region was used with the Luminex to generate analyte values reported as 883 picograms/ milliliter (pg/mL). Sample concentrations less than the lower limit of detection for each 884 particular analyte were recoded as the lower limit value divided by ten. Sample concentrations 885 886 above the upper limit of detection for a particular analyte were recoded as the upper limit of detection. Data analysis and visualization were generated using R (RRID: SCR 001905) software 887 (R Development Core Team, 2020). 888

889

890 *GFP+ cell line generation* 

50,000 HT-29 or HCT 116 cells were seeded in a 12-well tissue culture plate and allowed to
adhere overnight. They were then transduced with lentivirus containing the plasmid
pLenti\_CMV\_GFP\_Hygro [pLenti CMV GFP Hygro (656-4) was a gift from Eric Campeau & Paul
Kaufman (Addgene viral prep # 17446-LV; RRID: Addgene\_17446)] at a multiplicity of infection
of 10 with 8 µg/mL polybrene (hexadimethrine bromide [Cat # 107689, Sigma Aldrich, St. Louis,
MO, USA) for 24 hours before washing with PBS and replacing with fresh medium (49). The cells
were then sorted for GFP-positivity using a BD FACSAria™ III Cell Sorter (RRID: SCR\_016695).

899 *Multicolor immune cell co-culture experiments* 

900 10,000 HCT-116, SW480, or HT-29 cells were plated per well in a clear-bottom, black-walled 48well tissue culture plate and were allowed to adhere overnight. Cells were subsequently treated 901 902 with DMSO, 5 µM or 10 µM elraglusib, and/or 10,000 TALL-104 or NK-92 cells (for an effector-to-903 tumor ratio of 1:1) for 24 hours. CRC cells were labeled using CellTracker<sup>™</sup> Green CMFDA (5chloromethylfluorescein diacetate), immune cells (NK-92, TALL-104) were labeled using 904 905 CellTracker™ Blue CMAC Dye (7-amino-4-chloromethylcoumarin), and ethidium homodimer-1 (EthD-1) was used as a marker of cell death (Invitrogen, Waltham, MA). 10X images were 906 907 captured using a Nikon Ti-U Inverted Fluorescence Microscope and NIS-Elements F Package imaging software 3.22.00 Build 710 (Nikon Instruments Inc, USA). The number of red/green color 908 909 cells in random fields was determined using thresholding and particle analysis in the Fiji modification (RRID: SCR 002285) of ImageJ and expressed as a dead/live cell ratio. 910 911 Normalization was carried out by subtracting the percentage of cell death due to drug or vehicle control (DMSO) only from the percentage of dead cells observed in the co-culture of tumor and 912 immune cells treated with the drug. At least 100 cells were evaluated per sample, with 3 913 914 independent replicates. Statistical analysis was done using GraphPad Prism 9 (RRID: 915 SCR 002798).

916
#### 917 Single-color immune cell co-culture experiments

918 5000 HT-29 GFP+ or HCT 116 GFP+ cells were plated per well in a clear-bottom, black-walled 96-well tissue culture plate and were allowed to adhere overnight. Cells were subsequently 919 920 treated with DMSO, 5 µM elraglusib, and/or 5000 TALL-104 or NK-92 cells (for an effector-to-921 tumor ratio of 1:1) for 48 hours. Nine images were taken per well at 10X magnification using a 922 Molecular Devices ImageXpress® Confocal HT.ai High-Content Imaging System and guantified for the number of GFP+ objects using the MetaXpress (RRID: SCR 016654) software (Molecular 923 924 Devices, San Jose, CA, USA). 40X Images were also taken at 24 hours for representative images 925 of cellular morphology changes. Statistical analysis was done using GraphPad Prism 9 (RRID: SCR 002798). 926

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#### 928 Generation of single-cell suspensions

Spleens were strained, filtered, and washed while tumors were collected, washed, and digested
before lymphocytes were collected using a Percoll gradient (Cat # P1644-100ML, Sigma Aldrich,
St. Louis, MO).

932

#### 933 Flow cytometry

934 Flow cytometry viability staining was conducted by suspending murine spleen and tumor single cell suspensions in Zombie Violet fixable viability kit (Cat # 423114, BioLegend, San Diego, CA, 935 936 USA) according to manufacturer instructions for 30 minutes at room temperature. Staining for 937 membrane surface proteins was conducted using conjugated primary antibodies for 1 hour on ice, according to manufacturer instructions. Cells were fixed and permeabilized using the 938 eBioscience<sup>™</sup> Foxp3/Transcription Factor Staining Buffer Set according to manufacturer 939 940 instructions (Cat# 00-5523-00, Invitrogen, Waltham, MA). Cells were resuspended in Flow 941 Cytometry Staining Buffer (R&D Systems, Minneapolis, MN, USA) and were analyzed using a BD

#### 942 Biosciences LSR II (RRID: SCR\_002159) and FlowJo (RRID: SCR\_008520) version 10.1

- 943 (FlowJo, Ashland, OR, USA).
- 944

Antibody name	Manufactuer	Catalog number	Concentration
Zombie Violet™ Fixable Viability Kit	BioLegend	423114	1:1000
CD45 Monoclonal Antibody (30-F11), eVolve 605	eBioscience™	83-0451-42	5 µL/test
PE Rat Anti-Mouse CD3 Molecular Complex, Clone 17A2 (RUO)	BD Biosciences	555275	0.125 µg/test
CD335 (NKp46) Monoclonal Antibody (29A1.4), APC	eBioscience™	17-3351-82	0.125 µg/test
APC/Cy7 anti-mouse/human CD11b, clone: M1/70	BioLegend	101226	0.125 µg/test
Cd27 Monoclonal Antibody (LG.7F9), FITC	eBioscience™	11-0271-82	0.5 µg/test
Klrg1 Monoclonal Antibody (2F1), PE-Cyanine7	eBioscience™	25-5893-82	0.25 µg/test
Anti-mouse CD45, eBioscience, eVolve 605, clone: 30-F11	Invitrogen	83-0451-42	µg/test
APC-Cy™7 Rat Anti-Mouse CD3 Molecular Complex, clone 17A2	BD Biosciences	560590	0.125 µg/test
CD4 Monoclonal Antibody (RM4-5), PE-Cyanine7	Invitrogen	25-0042-82	0.25 µg/test
PE Rat Anti-Mouse CD8a, Clone 53-6.7 (RUO)	BD Biosciences	553032	0.125 µg/test
CD69 Monoclonal Antibody (H1.2F3), FITC	eBioscience™	11-0691-81	0.5 µg/test
FOXP3 Monoclonal Antibody (FJK-16s), APC	Manufacturer	17-5773-82	1 µg/test

945

946 Natural killer cell immunophenotyping

The NK cell flow cytometry panel included the following directly-conjugated primary antibodies:

948 Anti-mouse CD45, eBioscience eVolve 605 clone: 30-F11 (Ref # 83-0451-42, Invitrogen), PE anti-

mouse CD3 molecular complex (17A2) (mat. #: 555275, BD biosciences), Anti-mouse NKp46

950 APC (Ref # 17-3351-82), APC/Cy7 anti-mouse/human CD11b clone: M1/70 (cat# 101226,

- BioLegend), anti-Cd27 Monoclonal Antibody (LG.7F9) FITC (eBioscience™, Thermo Scientific,
- cat # 11-0271-82), and (Klrg1 Monoclonal Antibody (2F1) PE-Cyanine7 (eBioscience, Thermo
- 953 Scientific, cat # 25-5893-82). Gating strategies are as follows:
- 954 NK cell: live/CD45/CD3-/NK1.1+
- 955 Mature NK cell: live/CD45/CD3-/NK1.1+/ KRLG1+
- 956 Activated NK cell: live/CD45/CD3-/NK1.1+/CD11b+
- 957 NK cell subset 1: live/CD45/CD3-/NK1.1+/ CD11b-CD27-
- 958 NK cell subset 2: live/CD45/CD3-/NK1.1+/ CD11b-CD27+

959	NK cell subset 3: live/CD45/CD3-/NK1.1+/ CD11b+CD27+
960	NK cell subset 4: live/CD45/CD3-/NK1.1+/ CD11b+CD27-
961	
962	T cell immunophenotyping
963	The T cell flow cytometry panel included the following directly-conjugated primary antibodies: Anti-
964	mouse CD45 superbright 600 clone: 30-511 (ref# 63-0451-82, eBioscience), anti-CD3 APC-Cy7
965	clone 17A2(BD Biosciences, cat # 560590), eBioscience anti-mouse CD4 PE-Cy7 clone: RM4-5
966	(Ref # 25-0042-82, Invitrogen), PE anti-mouse CD8a (Ly-2)(53-6.7) (cat # 553032, BD), Anti-
967	mouse CD69 FITC clone: H1.2F3 (Ref# 11-0691-81, eBioscience), and Foxp3 (FJK-16s) APC
968	(eBioscience). Gating strategies are as follows:
969	CD4+ T cell: live/CD45+/CD3+/CD4+/Foxp3-
970	CD8+ T cell: live/CD45+/CD3+/CD8+
971	Treg: live/CD45+/CD3+/CD4+/Foxp3+
972	Activated CD8+ T cell: live/CD45+/CD3+/CD8+/CD69+
973	
974	Western blot analysis
975	Cells were plated in a 6-well plate and incubated overnight before the spent media was replaced
976	with drugged media. Drug treatment lasted for indicated durations. Protein was extracted using
977	radioimmunoprecipitation (RIPA) assay buffer (Cat # R0278, Sigma-Aldrich, St. Louis, MO)
978	containing cOmplete™, Mini, EDTA-free Protease Inhibitor Cocktail (Cat # 4693159001, Roche,
979	Basel, Switzerland) from sub-confluent cells. Denaturing sample buffer was added, samples were
980	boiled at 95 degrees for 10 minutes, and an equal amount of protein lysate was electrophoresed

through NuPAGE<sup>™</sup> 4 to 12%, Bis-Tris, 1.5 mm, Mini Protein Gels (Invitrogen, Waltham, MA) then

transferred to PVDF membranes. The PVDF membrane was blocked with 5% non-fat milk

(Sigma-Aldrich, St. Louis, MO) in 1x TTBS. Primary antibodies were incubated with the

transferred PVDF membrane in blocking buffer at 4°C overnight. Secondary antibodies used

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included Goat anti-Rabbit IgG (H + L) Secondary Antibody, HRP (Cat # 31460, Invitrogen,
Waltham, MA), and Goat anti-Mouse IgG (H + L) Secondary Antibody, HRP (Cat # 31430,
Invitrogen, Waltham, MA). Signal was detected using Pierce™ ECL Western Blotting Substrate
(Cat # 32106, Thermo Scientific, Waltham, MA, USA) and a Syngene Imaging System (RRID:
SCR\_015770).

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Reagent or Resource	Source	Identifier	Dilution
PARP Antibody	Cell Signaling	Cat# 9542S	1:1000
McI-1 (D2W9E) Rabbit mAb	Cell Signaling	Cat# 94296S	1:1000
NF-кB p65 (L8F6) Mouse mAb	Cell Signaling	Cat# 6956	1:1000
PD-L1 (E1L3N®) XP® Rabbit mAb	Cell Signaling	Cat# 13684	1:1000
Bcl-2 (D55G8) Rabbit mAb	Cell Signaling	Cat# 4223S	1:1000
Survivin (71G4B7) Rabbit mAb	Cell Signaling	Cat# 2808S	1:1000
Mouse Anti-Ran	BD Biosciences	Cat# 610341	1:5000
NIK Antibody	Cell Signaling	Cat# 4994	1:1000

#### 991

#### 992 In vivo studies

The experimental in vivo protocol (Protocol # 19-01-003) was approved by the Institutional Animal 993 Care and Use Committee of Brown University (Providence, RI, USA), Six to 7 weeks-old female 994 995 BALB/c mice (RRID: IMSR JAX:000651) were purchased from Taconic. 50,000 cells were 996 suspended in 50 µL ice-cold PBS and 50 µL Matrigel (Catalog # 354234, Corning, New York, 997 USA), and 100 uL was injected subcutaneously into the rear flanks. Once tumor volume reached at least 100 mm<sup>3</sup>, mice were randomly assigned to one of seven groups (3 mice/group): Control 998 999 (isotype), elraglusib, elraglusib + Isotype, anti-PD-1, anti-PD-L1, elraglusib + anti-PD-1, and 1000 elraglusib + anti-PD-L1. All treatments were delivered by IP injection on the following dosing schedule: Isotype (70 mg/kg, twice a week), elraglusib (70 mg/kg, twice a week), anti-PD-1 (10 1001 mg/kg, twice a week), anti-PD-L1 (10 mg/kg, twice a week). The treatment continued until mice 1002 1003 developed signs of discomfort from excessive tumor growth. Mice were weighed once a week to 1004 monitor signs of drug toxicity. The length (L) and width (W) of the masses were measured three times per week with a digital caliper, and the tumor volume was calculated by applying the formula: 0.5LW2. Collection of whole blood and serum was performed by cardiac puncture and sent to Antech GLP for blood cell count and chemistry tests, or in-house cytokine profiling. Tumors and organs were dissected and harvested for analysis by IHC and flow cytometry.

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#### 1010 *Immunohistochemistry*

1011 Excised tissues are fixed with 10% neutral buffered formalin and paraffin-embedded. 5-1012 micrometer tissue sections are cut with a microtome and mounted on glass microscope slides for 1013 staining. Hematoxylin and eosin staining was completed for all tumor specimens. Paraffin 1014 embedding and sectioning of slides were performed by the Brown University Molecular Pathology Core Facility. Slides were dewaxed in xylene and subsequently hydrated in ethanol at decreasing 1015 1016 concentrations. Antigen retrieval was carried out by boiling the slides in 2.1 g citric acid (pH 6) for 1017 10 minutes. Endogenous peroxidases were guenched by incubating the slides in 3% hydrogen 1018 peroxide for 5 minutes. After nuclear membrane permeabilization with Tris-buffered saline plus 1019 0.1% Tween 20, slides were blocked with horse serum (Cat# MP-7401-15, Vector Laboratories, Burlingame, CA, USA), and incubated with primary antibodies overnight (Supplementary Table 1020 1021 S1) in a humidified chamber at 4C. After washing with PBS, a secondary antibody (Cat# MP-7401-15 or MP-7402, Vector Laboratories, Burlingame, CA, USA) was added for 30 minutes, 1022 1023 followed by diaminobenzidine application (Cat# NC9276270, Thermo Fisher Scientific, Waltham, MA, USA) according to the manufacturer's protocol. Samples were counterstained with 1024 1025 hematoxylin, rinsed with distilled water, dehydrated in an increasing gradient of ethanol, cleared 1026 with xylene, and mounted with Cytoseal mounting medium (Thermo Fisher Scientific, catalog no. 8312-4). Images were recorded on a Zeiss Axioskop microscope (RRID: SCR 014587), using 1027 1028 QCapture (RRID: SCR 014432). QuPath software (RRID: SCR 018257) was used to 1029 automatically count positive cells. For each IHC marker, five 20X images per group were analyzed, and results were represented as the absolute number of positive cells per 20X field. 1030

#### 1031

Antibody name	Manufacturer	Catalog number	Antibody dilution
CD4 (D7D2Z) Rabbit mAb	Cell Signaling	25229S	1:200
CD8α (D4W2Z) XP® Rabbit mAb (Mouse Specific)	Cell Signaling	98941	1:800
Anti-TRAIL antibody	Abcam	ab231265	20 µg/ml
NKp46 (CD335) Polyclonal Antibody	Invitrogen	PA5-79720	1 µg/mL
FoxP3 (D6O8R) Rabbit mAb	Cell Signaling	12653	1:800
Granzyme B (E5V2L) Rabbit mAb	Cell Signaling	44153	1:200
Ki-67 (D3B5) Rabbit mAb (Mouse Preferred; IHC Formulated)	Cell Signaling	12202	1:800
PD-1/CD279 Polyclonal antibody	Proteintech	18106-1-AP	1:1000
PD-L1/CD274 Monoclonal antibody	Proteintech	66248-1-lg	1:5000
Cleaved Caspase-3 (Asp175) Antibody	Cell Signaling	9661	1:400
VEGF Monoclonal Antibody (JH121)	Invitrogen	MA5-13182	1:20
TGF beta 2-Specific Polyclonal antibody	Proteintech	19999-1-AP	1:500

#### 1032

#### 1033 Microarrays

1034 A total of 0.5x10<sup>6</sup> tumor cells (HCT-116, HT-29, KM12C) were plated in a 6-well plate and allowed to adhere overnight before 24-hour treatment as indicated. 1x10<sup>6</sup> immune cells (NK92, TALL-1035 1036 104) were plated and treated with elraglusib as indicated for 24 hours. RNA was isolated from cell pellets in batches of 6 using an RNeasy Plus Mini Kit (Cat # 74134, Qiagen, Hilden, Germany). 1037 1038 Acceptable RNA concentration and quality were verified with Nanodrop and Bioanalyzer 1039 measurements. GeneChip<sup>™</sup> Human Transcriptome Array 2.0 assays were conducted according to manufacturer instructions in two batches using randomized samples to limit batch effects (Cat# 1040 1041 902162, Applied Biosystems, Waltham, MA, USA). Applied Biosystems Transcriptomic Analysis Console (TAC) software (RRID: SCR 016519) was used to calculate fold changes in gene 1042 expression relative to the untreated control cells. Values were considered statistically significant 1043 1044 for p values <0.05.

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#### 1046 Single-cell RNA sequencing

Single cells were captured and 3' single-cell gene expression libraries were conducted (Next GEM
v3.1) using the 10x Genomics Chromium system by SingulOmics (SingulOmics, New York, NY,

42

USA). Gene expression libraries were sequenced with ~200 million PE150 reads per sample on
Illumina (RRID: SCR\_016387) NovaSeq (Illumina, Inc., San Diego, CA, USA). After sequencing
clean reads were then analyzed with human reference genome GRCh38 using Cell Ranger v6.1.2
([RRID: SCR\_017344],10X Genomics, Pleasanton, CA, USA). Data were analyzed and visualized
using Loupe Browser ([RRID: SCR\_018555], 10X Genomics, Pleasanton, CA, USA).

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#### 1055 Digital Spatial Profiling

An Agilent technologies hybridization oven was used for baking tissue onto slides (Agilent, Santa 1056 1057 Clara, CA, USA). A NanoString GeoMx® Digital Spatial Profiler (DSP) instrument (NanoString, Seattle, WA, USA) was used to scan slides, identify regions of interest (ROIs), and collect 1058 photocleavable barcodes according to manufacturer instructions. A custom panel was designed 1059 1060 to include the following proteins: Ms IgG1, Ms IgG2a, Rb IgG, GAPDH, Histone H3, S6, Beta-2-1061 microglobulin, CD31, CD45, Ki-67, ARG1, CD11b, CD11c, CD14, CD163, CD39, CD40, CD68, HLA-DR, GZMB, CD20, CD3, CD34, CD4, CD56, CD66b, CD8, Foxp3, Fibronectin, 4-1BB, B7-1062 H3, CTLA4, GITR, IDO1, LAG3, OX40L, STING, Tim-3, VISTA, Bcl-2, ER-α, EpCAM, Her2, 1063 MART1, NY-ESO-1, PR, PTEN, PanCk, SMA, CD127, CD25, CD27, CD44, CD45RO, CD80, 1064 1065 ICOS, PD-1, PD-L1, and PD-L2. An Eppendorf MasterCycler Gradient Thermal Cycler was used 1066 to generate the Illumina sequencing libraries from the photocleaved tags. (Eppendorf, Hamburg, 1067 Germany). An Agilent Fragment Analyzer (RRID: SCR 019417) was used for library size distribution analysis with a high-sensitivity NGS Fragment Kit (Cat# DNF-474-0500, Agilent, Santa 1068 1069 Clara, CA, USA). gPCR for quantification was run using an Illumina-compatible KAPA Library 1070 Quantification Kits (ROX Low) (cat# KK4873) on an Applied Biosystems ViiA 7 Real-Time gPCR / PCR Thermal Cycler System (Applied Biosystems, San Francisco, CA, USA) and was analyzed 1071 1072 using QuantStudio software (RRID: SCR 018712). Sequencing was performed using a NextSeq 1073 500/550 High Output Kit v2.5 (75 Cycles) kit (cat# 20024906) on an Illumina Sequencing NextSeq 550 System ([RRID: SCR 016381], Illumina, San Diego, CA, USA). The initial annotated dataset 1074

1075 went through quality control (QC) to check if housekeeper genes and background (isotype) control 1076 molecules were themselves correlated with the predictors of interest. Every ROI was tested for 1077 raw sequencing reads (segments with <1000 raw reads were removed), % sequencing saturation 1078 (defined as [1-deduplicated reads/aligned reads]%, segments below ~50% were not analyzed), 1079 and nuclei count per segment (>100 nuclei per segment is generally recommended). Both 1080 immunoglobulins (IgGs) and housekeeper genes were highly correlated with one another. Signal to noise (SNR) ratio was calculated using background probes and all probes were detected above 1081 1082 the background in at least one ROI. Finally, data were normalized based on background IgG 1083 expression and all normalization factors were well distributed. Data analysis and visualization were generated using R ([RRID: SCR 001905], R Development Core Team, 2020). 1084

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#### 1086 Clinical specimens

1087 Archival tumor specimens and peripheral blood samples were collected from patients enrolled in the Phase I study of Elraglusib (9-ING-41), a small molecule selective glycogen synthase kinase-1088 1089 3 beta (GSK-3b) inhibitor, as monotherapy or combined with cytotoxic regimens in patients with relapsed or refractory hematologic malignancies or solid tumors (Clinicaltrials.gov NCT03678883) 1090 1091 who received treatment at the Lifespan Cancer Institute (Providence, RI, USA). The study was 1092 conducted in accordance with the Declaration of Helsinki and the International Conference on 1093 Harmonization Good Clinical Practice guidelines. The study protocol was approved by the 1094 Institutional Review Board (IRB) of Rhode Island Hospital under protocol number 1324888-120. 1095 The patients also participated in a Lifespan Cancer Institute research protocol designed to 1096 investigate molecular and genetic features of tumors and mechanisms of resistance (Rhode Island Hospital IRB protocol number 449060-38). All patients provided written informed consent. 1097

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1099 Statistical analysis

GraphPad Prism (RRID: SCR\_002798) version 9.5.0 was used for statistical analyses and graphical representation (GraphPad, San Diego, CA, USA). Data are presented as means  $\pm$ standard deviation (SD) or standard error of the mean (SEM). The relations between groups were compared using two-tailed, paired student's T tests or one-way ANOVA tests. Survival was analyzed with the Kaplan-Meier method and was compared with the log-rank test. For multiple testing, Tukey's or Benjamini-Hochberg's methods were employed. Statistical significance is reported as follows: P ≤ 0.05: \*, P ≤ 0.01: \*\*, and P ≤ 0.001: \*\*\*.

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#### 1108 Data Availability Statement

The microarray data generated in this study are publicly available in Gene Expression Omnibus (GSE222849) at GSE. Other data generated in this study are available within the article and its supplementary data files. Further information and requests for resources and reagents should be directed to and will be fulfilled by the lead contact.

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#### 1114 Institutional review board statement

1115 This study was approved by the Institutional Review Board (IRB) of Rhode Island Hospital under 1116 protocol numbers 449060-38 and 1324888-120.

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- 1129
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Figure 1. Elraglusib triggers pyroptosis and sensitizes tumor cells to increase immunemediated cytotoxicity in a co-culture model. Co-cultures were treated with drug concentrations as indicated. A 1:1 effector to target (E:T) ratio was used with a 24-hour co-culture duration. EthD-1 was used to visualize dead cells, 10X magnification, scale bar indicates 100 µm. (A) SW480 and TALL-104 T cell co-culture assay images at the 24-hour timepoint. 24-hour tumor cell pretreatment with 5 µM elraglusib, followed by 24-hour co-culture. (B) Quantification of co-culture experiment using the percentage of dead cells out of total cells (n=3). (C) Quantification normalized by cell death observed with drug treatment alone (n=3). (D) SW480 and donor-derived CD8+ T cell co-culture assay images at the 24-hour timepoint. 24-hour tumor cell pre-treatment with 5 µM elraglusib, followed by 24-hour co-culture. (E) Quantification of co-culture experiment using the percentage of dead cells out of total cells (n=3). (F) Quantification normalized by cell death observed with drug treatment alone (n=3). (G) The number of HCT 116 GFP+ cells were quantified after 48 hours of culture with DMSO, 5 µM elraglusib, and/or 5000 TALL-104 cells (n=3). (H) The number of HT-29 GFP+ cells were quantified after 48 hours of culture with DMSO, 5 µM elraglusib, and/or 5000 TALL-104 cells (n=3). (I) The number of HCT 116 GFP+ cells were guantified after 48 hours of culture with DMSO, 5 µM elraglusib, and/or 5000 NK-92 cells (n=3). (J) The number of HT-29 GFP+ cells were quantified after 48 hours of culture with DMSO, 5 µM elraglusib, and/or 5000 NK-92 cells (n=3). (K) 40X images were collected with a Molecular Devices ImageXpress® Confocal HT.ai High-Content Imaging System. White arrows indicate pyroptotic events. Western blot analysis of (L) HCT-116 and (M) HT-29 CRC cells for expression of indicated proteins after treatment with indicated cytokines or drugs. Quantification of IFN-y secretion (pg/mL) post-DMSO or elraglusib treatment for 24 hours in (N) TALL-104 cells and (O) NK-92 cells (n=3). Error bars represent the mean +/- standard deviation. Statistical test: one-way ANOVA with Tukey's test for multiple comparisons. P-value legend: \* p < 0.05, \*\* p < 0.01, \*\*\* p < 0.001, \*\*\*\* p < 0.0001.

Figure 2. Elraglusib treatment induces apoptosis and suppresses survival pathways in tumor cells. Western blot analysis of (A) HCT-116 and HT-29 CRC cells for expression of indicated proteins after increasing durations of elraglusib treatment (0-72 hours). (B) Western blot analysis of McI-1 expression in HCT-116 CRC cells after increasing durations of elraglusib treatment. CRC cells were treated with 1 µM elraglusib for 24 hours and treated versus untreated samples were compared in triplicate. Microarray analysis results were visualized using volcano plots for (C) HCT-116, (D) HT-29, and (E) KM12C CRC cell lines. Top down- and up-regulated genes post-elraglusib treatment as compared to controls are shown. Results were calculated using a FC cutoff of >1.5, <-1.5, and a p value of <0.05. (F) The number of genes up- or downregulated in each of the three cell lines within several signaling pathways of interest. Green indicates downregulation and red indicates upregulation of gene expression. (G) A Venn Diagram was used to compare the 3,124 genes that were differentially expressed post-treatment with elraglusib in the three colon cancer cell lines (HCT-116, HT-29, KM12C). (H) Tumor cells (HCT-116, HT-29) were treated with 1 µM elraglusib for 48 hours and cell culture supernatant was analyzed with the Luminex 200. Red indicates a positive FC and green indicates a negative FC (n=3). (I) Tumor cells (HCT-116, HT-29) were treated with 5 µM elraglusib for 48 hours and cell culture supernatant was analyzed with the Luminex 200. Red indicates a positive FC and green indicates a negative FC (n=3).

**Figure 3.** Elraglusib treatment increases effector molecule secretion and induces an energetic shift in cytotoxic immune cells. Western blot analysis of (**A**) TALL-104 and (**B**) HT-29 cytotoxic immune cells for expression of indicated proteins after increasing durations of elraglusib treatment (0-72 hours). (**C**) Proposed model for non-canonical NF-κB pathway activation: increased NIK expression indicates non-canonical NF-κB pathway activation which enhances the expression of chemokines and cytokines (CCL11, TNF-α, GM-CSF) and subsequently leads to increased recruitment and proliferation of cytotoxic immune cells (CD8+ T,

CD4+ T, NK cells). Immune cells were treated with 1  $\mu$ M elraglusib for 24 hours and treated versus untreated samples were compared in triplicate. Microarray analysis results were visualized using volcano plots for **(D)** NK-92 and **(E)** TALL-104 immune cell lines. **(F)** A Venn Diagram was used to compare the 124 genes that were differentially expressed post-treatment with elraglusib in the two immune cell lines (TALL-104, NK-92). **(G)** 10X single-cell sequencing analysis of immune cells treated with elraglusib. TALL-104 and NK-92 cells were treated with 1  $\mu$ M elraglusib for 24 hours and aggregate data was visualized using a t-SNE plot. **(H)** Immune cells show differential expression of mitochondria-encoded genes (MT) and ribosomal genes (RB) post-treatment with elraglusib. **(I)** Heatmap comparing gene expression post-elraglusib treatment as compared to control. Red indicates a positive FC and green indicates a negative FC. **(J)** Immune cells (TALL-104, NK-92) were treated with 1  $\mu$ M elraglusib for 48 hours and cell culture supernatant was analyzed with the Luminex 200. Red indicates a positive FC and green indicates a negative FC and green indicates a negative FC (n=3).

**Figure 4. Elraglusib enhances immune cell tumor-infiltration to prolong survival in combination with anti-PD-L1 therapy in a syngeneic murine model of MSS colon carcinoma.** (A) Experimental model overview of the syngeneic murine colon carcinoma BALB/c murine model using MSS cell line CT-26. (B) Kaplan–Meier estimator curves for all treatment groups as indicated. Statistical significance was determined using a Log-rank (Mantel-Cox) test. (C) Overview of cell lineage markers used for flow cytometric immunophenotyping analysis. 14days post-treatment initiation immune cell subpopulations were analyzed in the spleen and tumor. (D) Splenic T cells, (E) Tumor-infiltrating T cells, (F) Splenic NK cells, and (G) Tumor-infiltrating NK cells were compared between responders (R, n=3) and non-responders (NR, n=18). NK cell subsets based on the expression of CD11b and CD27 were compared in the spleen and visualized via (H) bar graph and (I) pie chart. NK cell subsets based on the expression of CD11b and CD27 were also compared in the tumor and visualized via (J) bar graph and (K) pie chart. T cell ratios were compared in the **(L)** Spleen and **(M)** Tumor. Statistical significance was determined using two-tailed unpaired T tests. P-value legend: \* p < 0.05, \*\* p < 0.01, \*\*\* p < 0.001, \*\*\*\* p < 0.0001.

Figure 5. Responders have a more immunostimulatory tumor microenvironment as compared to non-responders. IHC analysis of tumors 14 days post-treatment initiation or tumors from long-term mice. Non-responders (NR) and responders (R) were compared. 20X images, scale bar represents 100  $\mu$ m. (A-B) CD3, (C-D) Granzyme B, (E-F) Ki67, (G-H) PD-L1, and (I-J) cleaved-caspase 3 (CC3) were compared at the 14 days post-treatment initiation timepoint, and the long-term timepoint, respectively. Statistical significance was determined using two-tailed unpaired T tests (n=6). Serum from long-term mice sacrificed was analyzed via cytokine profiling for (K) CCL21, (L) VEGFR2, (M) CCL7, (N) CCL12, (O) BAFF, (P) VEGF, (Q) IL-1  $\beta$ , (R) IL-6, (S) CCL22, (T) GM-CSF, (U) CCL4, (V) TWEAK, and (W) CCL2. Responders (red) and non-responders (black) were compared. A Kruskal-Wallis test was used to calculate statistical significance followed by a Benjamini-Hochberg correction for multiple comparisons. *p* values are shown for analytes that were significantly different between responders and non-responders and are ordered by significance. P-value legend: \* p < 0.05, \*\* p < 0.01, \*\*\* p < 0.001, \*\*\*\* p < 0.0001.

**Figure 6.** Patient plasma concentrations of cytokines correlate with progression-free survival (PFS), overall survival (OS), and *in vivo* response to therapy results. Plasma samples from human patients with refractory solid tumors of multiple tissue origins enrolled in a Phase 1 clinical trial investigating a novel GSK-3 inhibitor elraglusib (NCT03678883) were analyzed using a Luminex 200 (n=19). (A) Baseline analyte concentrations in pg/mL were plotted against PFS. (B) 24-hour post-dose analyte concentrations in pg/mL were plotted against PFS. (C) Baseline analyte concentrations in pg/mL were plotted against OS. (D) 24-hour post-dose analyte concentrations in pg/mL were used to

calculate significance. R squared and *p* values were reported. *p* values less than 0.05 were reported as statistically significant. Graphs are ordered from most to least significant starting at the upper left. Heatmaps show linear regression slope values, R squared values, and *p* values ordered by significance starting from the top. **(E)** Table summarizing demographics. **(F)** Cytokines grouped by function. FC is shown where green indicates a negative (<0) FC compared to the baseline (pre-dose) value and red indicates a positive (>0) FC. **(G)** Table comparing murine and human circulating biomarker trends. Red boxes indicate that an analyte concentration positively correlated with response to therapy/PFS/OS while green boxes indicate that an analyte concentration negatively correlated with response to therapy/PFS/OS.

Figure 7. Spatial profiling of patient tumor biopsies reveals a more immunostimulatory tumor microenvironment post-treatment with elraglusib. Patient samples were analyzed using NanoString GeoMx Digital Spatial Profiling (DSP) technology. (A) Pie charts showing biopsy timepoint, primary tumor type, metastatic biopsy tissue type, and paired/unpaired biopsy sample information breakdowns. (B) A representative region of interest (ROI) showing PanCK+ and CD45+ masking. Green indicates CK, red indicates CD45, and blue indicates DAPI staining. (C) A Sankey diagram was used to visualize the study design where the width of a cord in the figure represents how many segments are in common between the two annotations they connect. The scale bar represents 50 segments. Blue cords represent CD45+ segments and yellow cords represent panCK+ segments. (D) Heatmap of all areas of interest (AOIs). Patient IDs, immune cell locations, biopsy timepoint, biopsy tissue, primary tumor location, and segment identity information are color coded as indicated in the legend. (E) PanCK+ ROI CD39 expression plotted against time-on-study (TOS). Points are color-coded by time on study (TOS) / time on treatment with darker blue points indicating a shorter TOS or time on treatment. (F) CD45+ ROI CD163 expression plotted against TOS. (G) Volcano plot showing a comparison of CD45+ region protein expression in post-treatment biopsies and pre-treatment biopsies regardless of timepoint. Grey

points are non-significant (NS), blue points have p values < 0.05, and red points have false discovery rate (FDR) values less than 0.05. The size of the point represents the log2 UQ Signal-to-noise ratio (SNR). **(H)** Volcano plot showing a comparison of tumor-infiltrating CD45+ immune cell segment protein expression in pre- versus post-treatment biopsies. Grey points are non-significant (NS), blue points have p values < 0.05, and red points have false discovery rate (FDR) values less than 0.05. The size of the point represents the log2 UQ Signal-to-noise ratio (SNR).

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.2

Pre ← log2 (FC) → Post

## Supplementary Table 1

#### HCT-116 Elraglusib vs. NT

Gene Symbol	Fold Change	P-val	Description	Function
BTG2	4.35	7.46E-10	BTG family, member 2	Anti-proliferative
MDM2	4.17	3.65E-11	MDM2 proto-oncogene, E3 ubiquitin protein ligase	Contributes to TP53 reguation
TP53INP1	3.62	4.21E-11	tumor protein p53 inducible nuclear protein 1	Antiproliferative / proapoptotic
LYZ	3.41	2.30E-03	lysozyme	Anti-proliferative
DRAM1	3.1	3.05E-08	DNA-damage regulated autophagy modulator 1	Proapoptotic
GADD45A	3.04	1.34E-09	growth arrest and DNA-damage-inducible, alpha	Anti-proliferative
CDKN1A	2.95	1.12E-09	cyclin-dependent kinase inhibitor 1A (p21, Cip1)	Anti-proliferative
PMAIP1	2.8	3.21E-05	phorbol-12-myristate-13-acetate-induced protein 1	Promotes activation of caspases and apoptosis
ATF3	2.73	1.04E-10	activating transcription factor 3	Anti-proliferative
FAS	2.56	2.17E-10	Fas cell surface death receptor	Proapoptotic
BLOC1S2	2.5	2.50E-08	biogenesis of lysosomal organelles complex-1, subunit 2	Proapoptotic
SESN1	2.32	3.65E-09	sestrin 1	Anti-proliferative
TNFRSF10D	2.25	1.68E-07	tumor necrosis factor receptor superfamily, member 10d	Decoy TRAIL receptor
TNFRSF10B	2.12	1.26E-08	tumor necrosis factor receptor superfamily, member 10b	Proapoptotic
KLLN	2.08	4.00E-04	killin, p53-regulated DNA replication inhibitor	Proapoptotic
AEN	2.04	3.09E-06	apoptosis enhancing nuclease	Proapoptotic
PLK3	2	2.56E-07	polo-like kinase 3	Proapoptotic
MXD1	1.94	3.00E-04	MAX dimerization protein 1	Proapoptotic
GADD45B	1.88	6.64E-06	growth arrest and DNA-damage-inducible, beta	Proapoptotic
TRIM31	1.79	3.10E-03	tripartite motif containing 31	Proapoptotic
PPP1R1C	1.78	7.50E-05	protein phosphatase 1, regulatory (inhibitor) subunit 1C	May increase cell susceptibility to TNF-induced apoptosis
NEKBIA	1.77	5.00E-04	nuclear factor of kappa light chain gene enhancer in B-cells inhibitor, alpha	Regulator of NF-kappa-B
TP5313	1.77	3.31E-07	tumor protein p53 inducible protein 3	Proapoptotic
CSNK1G1	1.72	3.31E-06	casein kinase 1. gamma 1	Antiproliferative and proapoptotic
SUSD6	1.71	2.15E-05	sushi domain containing 6	Antiproliferative and proapoptotic
TNFRSF10A	1.68	3.00E-04	tumor necrosis factor receptor superfamily, member 10a	Proapoptotic / Regulator of NF-kappa-B
TNFAIP3	1 64	2 64E-06	tumor necrosis factor, alpha-induced protein 3	Negative regulator of NE-kappa-B
TNFRSF9	1.52	1.00E-04	tumor necrosis factor receptor superfamily member 9	T cell costimulatory receptor 4-1BB
TNFRSF10C	1.52	3.03E-05	tumor necrosis factor receptor superfamily, member 10c	Decov TRAIL receptor
BAK1	1.51	2.60E-03	BCI 2-antagonist/killer 1	Proapoptotic
CDC25C	-1.5	1.00E-03	cell division cycle 25C	Promotes cell cycle progression
PRC1	-1.52	2.00E-04	protein regulator of cytokinesis 1	Promotes cell cycle progression
ANLN	-1.54	1.18E-05	anillin actin binding protein	Promotes cell cycle progression
BARD1	-1.56	5.00E-04	BRCA1 associated RING domain 1	Promotes cell cycle progression
IRAK1BP1	-1.57	3 16E-02	interleukin 1 receptor associated kinase 1 binding protein 1	Promotes NF-kappa-B activation
PDK1	-1.58	372E-05	pyruvate dehydrogenase kinase, isozyme 1	Promotes cell cycle progression
DHX32	-1.59	3.06E-06	DEAH (Asp-Glu-Ala-His) box polypeptide 32	Promotes cell cycle progression
CCNF	-1.59	2.30E-03	cyclin F	Promotes cell cycle progression
FZD3	-1.59	2.00E-04	frizzled class receptor 3	Component of the Wrt signaling pathway
ENO2	-1.6	2.55E-05	enolase 2 (gamma, neuronal)	Promotes EMT
MST1R	-1.6	1.00E-03	macrophage stimulating 1 receptor	Promotes EMT
BRCA1	-1.62	2.00E-04	breast cancer 1. early onset	Promotes cell cycle progression
FASN	-1.64	2.00E-04	fatty acid synthase	Promotes cell proliferation
ARHGEF39	-1 67	2 00E-04	Rho guanine nucleotide exchange factor 39	Promotes cell proliferation
PRR11	-1.67	2 00E-04	proline rich 11	Promotes cell cycle progression
SOX4	-1.72	1.18E-05	SRY box 4	Induces tumor cell resistance to cytotoxic T cells
TTK	-172	7.34E-06	TTK protein kinase	Promotes cell cycle progression
CMTM4	-1.84	120E-06	CKLE-like MARVEL transmembrane domain containing 4	Protects PD-L1 from being polyubiguitinated and targeted for degradation
FANCD2	-1.86	1 27E-07	Fanconi anemia complementation group D2	Promotes cell cycle progression
FOXC1	-1.88	1.89E-08	forkhead box C1	Promotes cell proliferation / promotes EMT
CDCA3	-1.91	1.46E-05	cell division cycle associated 3	Promotes cell proliferation
AURKB	-1.93	344E-06	aurora kinase B	Promotes cell cycle progression
UHRF1	-1.97	4 00F-04	ubiguitin-like with PHD and ring finger domains 1	Promotes cell cycle progression
MKI67	-2.02	2 40F-03	marker of proliferation Ki-67	Promotes cell proliferation
NEK2	-2.21	5 50E-09	NIM A-related kinase 2	Inhibition sensitizes PD-I 1 blockade / promotes cell proliferation
	the state of the s	U.U.U.L. UV		

\*\*\*Results using fold change >1.5, <-1.5 as cut-off, p value <0.05

### Supplementary Table 2

#### HT-29 Elraglusib vs. NT

Gene Symbol	Fold Change	P-val	Description	Function
EGR1	5.41	3.81E-12	early growth response 1	Activates tumor supressor p53
B2M	2.41	6.88E-07	beta-2-microglobulin	May shape immune landscape
AEN	2.33	1.76E-07	apoptosis enhancing nuclease	Proapoptotic
TNFRSF12A	1.9	9.60E-03	tumor necrosis factor receptor superfamily, member 12A	Proapoptotic
TRAIP	1.83	4.43E-05	TRAF interacting protein	Regulator of NF-kappa-B
NCR3LG1	1.78	2.00E-03	natural killer cell cytotoxicity receptor 3 ligand 1	Triggers NCR3-dependent NK cell activation and cytotoxicity
SOCS7	1.74	1.74E-06	suppressor of cytokine signaling 7	Anti-proliferative
CDKN1A	1.72	2.00E-04	cyclin-dependent kinase inhibitor 1A (p21, Cip1)	Anti-proliferative
SMAD3	1.69	7.01E-06	SMAD family member 3	Anti-proliferative
MDM4	1.68	8.02E-07	MDM4, p53 regulator	Contributes to TP53 reguation
BCCIP	1.61	1.24E-05	BRCA2 and CDKN1A interacting protein	Anti-proliferative
CCAR1	1.56	1.40E-03	cell division cycle and apoptosis regulator 1; small nucleolar RNA, C/D box 98	Proapoptotic
SFN	1.54	1.06E-02	stratifin	Anti-proliferative / proapoptotic
CRLF3	1.5	1.20E-03	cytokine receptor-like factor 3	Anti-proliferative
TNIK	-1.51	9.00E-04	TRAF2 and NCK interacting kinase	Promotes cell proliferation
BRAF	-1.53	2.70E-03	B-Raf proto-oncogene, serine/threonine kinase	Promotes cell proliferation
CD276	-1.56	1.00E-04	CD2/6 molecule	Suppresses antitumor activity
BTN3A2	-1.58	4.70E-05	butyrophilin, subfamily 3, member A2	Inhibits the release of IFNG from activated T-cells
EAPP	-1.58	8.36E-07	E2F-associated phosphoprotein	Promotes cell proliferation
JAK1	-1.58	2.94E-05	Janus kinase 1	Promotes cell proliferation
PDS5B	-1.58	5.10E-03	PDS5 cohesin associated factor B	Promotes cell proliferation
MCIDAS	-1.61	1.46E-05	multiciliate differentiation and DNA synthesis associated cell cycle protein	Promotes cell cycle progression
FADD	-1.00	5.79E-05	Fas (TNFRSF6)-associated via death domain	Regulator of NF-kappa-B
HIP1	-1.67	6.00E-04	nuntingtin interacting protein 1	Antiapoptotic
IL17RA	-1.68	1.02E-05	Interleukin 17 receptor A	Regulator of NF-kappa-B
MYD88	-1.68	2.00E-04	myeloid differentiation primary response 88	Regulator of NF-kappa-B
CDCA3	-1./	3.00E-04	cell division cycle associated 3	Promotes cell proliferation
DYNCIHI	-1./	9.20E-05	dynein, cytopiasmic 1, neavy chain 1	Promotes cell cycle progression
ERBB2IP	-1.7	1.81E-02	erod interacting protein	Regulator of NF-kappa-B
CDC45	-1.71	8.02E-05	mizzled class receptor 7	Component of the whit signaling pathway
DIM1	-1.75	0.40E-00	Dim 1 proto opcogono, corino//broopino kinaso	Artiaportatio
SCK1	1.75	2.30E-03	corum/duccocorticoid regulated kinase	Artiapoptotic
LIHDE1	1.75	5.00E 04	ubiquitin like with PHD and ring finger domains 1	Promotes cell cycle progression
MTA3	1.84	1.07E 00	motoctasis associated 1 family member 3	Promotes EMT
ITGB6	1 01	3 26E 07	integrin beta 6	Regulator of TGE & Signaling
II 17DB	2.03	6 33E 06	interleukin 17 recentor B	Regulator of NE kappa B
AGGE1	-2.03	2.00E 04	angiogenic factor with G natch and EHA domains 1	Promotos EMT
CDK2	2.21	6 11E 00	cyclin dependent kingse 2	Promotes cell cycle progression
TNESE15	-2.20	2.58E-07	tumor necrosis factor (ligand) superfamily, member 15	Regulator of NE-kappa-B
CDC25C	-2.52	3.43E-08	cell division cycle 25C	Promotes cell cycle progression
CCNE1	-26	1 13E-08	cyclin E1	Promotes cell cycle progression
CD14	-2.63	2 82E-07	CD14 molecule	Regulator of NE-kappa-B
NEKBIZ	-2.68	6.65E-10	nuclear factor of kappa light polypeptide gene enhancer in B-cells inhibitor zeta	Regulator of NE-kappa-B
CDK1	-3.05	579E-07	cyclin-dependent kinase 1	Promotes cell cycle progression
F2F8	-31	774E-07	E2E transcription factor 8	Promotes EMT
BCL6	-3.43	8.65E-11	B-cell CLL/lymphoma 6	Antiapoptotic
E2F7	-3.82	1.32E-07	E2F transcription factor 7	Promotes EMT / antiapoptotic
TGFBR3	-4.82	1.01E-11	transforming growth factor beta receptor III	Regulates TGF-B Signaling
BARD1	-5.06	2.65E-10	BRCA1 associated RING domain 1	Promotes cell cycle progression
NFKBIA	-5.25	3.00E-10	nuclear factor of kappa light polypeptide gene enhancer in B-cells inhibitor, alpha	Regulator of NF-kappa-B
CCNE2	-5.83	6.53E-10	cyclin E2	Promotes cell cycle progression
MAP3K1	-6.1	2.49E-13	mitogen-activated protein kinase kinase kinase 1, E3 ubiquitin protein ligase	Regulator of NF-kappa-B
TRIB1	-9.14	8.08E-12	tribbles pseudokinase 1	Antiapoptotic

\*\*\*Results using fold change >1.5, <-1.5 as cut-off, p value <0.05

## **Supplementary Table 3**

#### KM12C Elraglusib vs. NT

Gene Symbol	Fold	P-val	Description	Function
11.32	1.55	4 00E 03	interleukin 32	Pequilator of NE kappa B
C 7MA	1.50	4.00E-03	aranzumo A	Triggers pyreptesis
	1.00	2.10E-02	granzyme A	Dreenentatio
TDAID	1.00	3. ISE-02	TDAE interacting protoin	Proapopiolic Degulator of NE kappa R
	1.00	9.00E-03	RAF Interacting protein	Regulator of NF-Kappa-D
BIK	1.01	1.30E-03	BCL2-Interacting killer (apoptosis-inducing)	
CDCA2	-1.51	1.70E-03	cell division cycle associated 2	Promotes cell cycle progression
IGF2BP2	-1.51	5.00E-04	Insulin-like growth factor 2 mRNA binding protein 2	Promotes cell cycle progression / antiapoptotic
TRAFS	-1.52	5.60E-03	INF receptor-associated factor 5	Regulator of NF-kappa-B
CXCL1	-1.53	2.00E-04	chemokine (C-X-C motif) ligand 1	Promotes EM I
MKI67	-1.53	7.50E-03	marker of proliferation KI-67	Promotes cell proliferation
INFRSF10A	-1.54	6.50E-03	tumor necrosis factor receptor superfamily, member 10a	Proapoptotic / Regulator of NF-kappa-B
BCL9	-1.55	3.49E-02	B-cell CLL/lymphoma 9	Promotes the Wnt signaling pathway
CDC25C	-1.55	5.00E-04	cell division cycle 25C	Promotes cell cycle progression
TNFRSF1B	-1.56	2.65E-02	tumor necrosis factor receptor superfamily, member 1B	Antiapoptotic
CCNE1	-1.57	5.79E-05	cyclin E1	Promotes cell cycle progression
TRAF6	-1.57	1.00E-04	TNF receptor-associated factor 6, E3 ubiquitin protein ligase	Regulator of NF-kappa-B
BRD3	-1.58	1.00E-04	bromodomain containing 3	Antiapoptotic
CCND2	-1.58	7.90E-03	cyclin D2	Promotes cell cycle progression
MTBP	-1.58	2.92E-02	MDM2 binding protein	Contributes to TP53 reguation
TNIK	-1.59	4.00E-04	TRAF2 and NCK interacting kinase	Promotes the Wnt signaling pathway
AGGF1	-1.6	1.23E-02	angiogenic factor with G-patch and FHA domains 1	Promotes EMT
IRF2BP2	-1.6	3.00E-04	interferon regulatory factor 2 binding protein 2	Promotes EMT
MDM2	-1.61	1.20E-03	MDM2 proto-oncogene, E3 ubiquitin protein ligase	Contributes to TP53 reguation
TAB3	-1.63	5.00E-04	TGF-beta activated kinase 1/MAP3K7 binding protein 3	Regulator of NF-kappa-B
TNFRSF11A	-1.64	1.23E-05	tumor necrosis factor receptor superfamily, member 11a, NFKB activator	Regulator of NF-kappa-B
BRCA1	-1.71	8.00E-04	breast cancer 1, early onset	Promotes cell cycle progression
IL27RA	-1.72	7.00E-04	interleukin 27 receptor, alpha	Binds immunomodulatory cytokine IL-27
MTDH	-1.74	8.48E-05	metadherin	Regulator of NF-kappa-B
FZD3	-1.76	8.90E-05	frizzled class receptor 3	Component of the Wnt signaling pathway
MET	-1.79	1.77E-05	MET proto-oncogene, receptor tyrosine kinase	Promotes EMT
ERBB2IP	-1.88	9.00E-04	erbb2 interacting protein	Regulator of NF-kappa-B
IL6ST	-1.88	8.13E-05	interleukin 6 signal transducer	Component of the IL-6 signaling pathway
NRP1	-1.88	1.70E-05	neuropilin 1	Promotes EMT
MAP3K1	-1.92	1.31E-05	mitogen-activated protein kinase kinase kinase 1, E3 ubiquitin protein ligase	Regulator of NF-kappa-B
CDK1	-2	1.00E-04	cyclin-dependent kinase 1	Promotes cell cycle progression
JMY	-2.03	1.15E-05	junction mediating and regulatory protein, p53 cofactor	Contributes to TP53 reguation
BRAF	-2.05	2.00E-04	B-Raf proto-oncogene, serine/threonine kinase	Promotes cell proliferation
CD109	-2.09	3.00E-04	CD109 molecule	Regulates TGF-β Signaling
TGFBR2	-2.11	7.17E-07	transforming growth factor beta receptor II	Regulates TGF-B Signaling
LTBP1	-2.24	4.70E-06	latent transforming growth factor beta binding protein 1	Regulates TGF-β Signaling
TLR3	-2.25	6.24E-06	toll-like receptor 3	Regulator of NF-kappa-B
GDF15	-2.29	6.00E-04	growth differentiation factor 15	Promotes EMT
TRIB1	-2.37	8.89E-06	tribbles pseudokinase 1	Antiapoptotic
E2F7	-2.5	9.13E-05	E2F transcription factor 7	Promotes EMT / antiapoptotic
NFKBIA	-2.51	3.25E-07	nuclear factor of kappa light polypeptide gene enhancer in B-cells inhibitor, alpha	Regulator of NF-kappa-B
CCNE2	-2.64	5.46E-07	cyclin E2	Promotes cell cycle progression
BARD1	-3.03	1.59E-07	BRCA1 associated RING domain 1	Promotes cell cycle progression
E2F8	-3.16	3.26E-07	E2F transcription factor 8	Promotes EMT
MAP2K6	-3.66	1.13E-09	mitogen-activated protein kinase kinase 6	Antiapoptotic
TGFBR3	-3.72	7.53E-10	transforming growth factor beta receptor III	Regulates TGF-β Signaling

\*\*\*Results using fold change >1.5, <-1.5 as cut-off, p value <0.05

## Supplementary Table 4

#### NK-92 Elraglusib vs. NT

Gene	Fold			
Symbol	Change	P-val	Description	Function
RNY5	3.32	0.027	RNA, Ro-associated Y5	May modulate NF-kB activity
RAB38	1.65	5.44E-05	RAB38, member RAS oncogene family	Promotes cellular proliferation
TNFSF14	1.5	0.043	tumor necrosis factor (ligand) superfamily, member 14	Stimulates T cell proliferation
WNK1	1.5	0.0119	WNK lysine deficient protein kinase 1	Controls immune cell adhesion and migration
NAP1L1	-1.51	0.0278	nucleosome assembly protein 1-like 1	May modulate NF-kB activity
MIR 186	-1.52	0.0132	microRNA 186	Proapoptotic
ITGB8	-1.53	0.0059	integrin beta 8	Activates latent TGF $\beta$ to supress immune responses
S100A12	-1.78	0.0407	S100 calcium binding protein A12	Proapototic

\*\*\*Results using fold change >1.5, <-1.5 as cut-off, p value <0.05

#### TALL-104 Elraglusib vs. NT

Gene Symbol	Fold Change	P-val	Description	Function
RNY4	2.19	0.0218	RNA, Ro-associated Y4	May modulate NF-ĸB activity
RNY5	1.66	0.0416	RNA, Ro-associated Y5	May modulate NF-kB activity
BCL2A1	1.63	0.023	BCL2-related protein A1	Antiapoptotic
CKS1B	1.6	0.013	CDC28 protein kinase regulatory subunit 1B	Promotes cell proliferation
STX19	1.58	0.0004	syntaxin 19	Involved in cytotoxic granule exocytosis
VAMP8	1.56	0.0193	vesicle associated membrane protein 8	Involved in cytotoxic granule exocytosis
KIF7	1.56	0.0091	kinesin family member 7	Required for T cell development and MHC expression
CCL3	1.52	0.022	chemokine (C-C motif) ligand 3	Recruits and enhances proliferation of CD8+ T cells
ORAI3	1.51	0.0387	ORAI calcium release-activated calcium modulator 3	Promotes cell proliferation
CD84	-1.53	0.0318	CD84 molecule	Regulator of immune cell function
PPARA	-1.54	0.0074	peroxisome proliferator-activated receptor alpha	Regulator of immune cell function
PTPN3	-1.56	0.0239	protein tyrosine phosphatase, non-receptor type 3	Inhibitory immune checkpoint
ACVR1B	-1.61	0.0205	activin A receptor type IB	Regulates TGFβ signaling
PTPN14	-1.62	0.0041	protein tyrosine phosphatase, non-receptor type 14	Regulates TGFβ signaling
HSPA1A	-1.63	0.0391	heat shock 70kDa protein 1B; heat shock 70kDa protein 1A	Proapoptotic
DUSP6	-1.66	0.0013	dual specificity phosphatase 6	Regulator of immune cell function
UBE3A	-1.73	0.0286	ubiquitin protein ligase E3A	Proapoptotic
CCR8	-2.14	0.0004	chemokine (C-C motif) receptor 8	Marker of regulatory T cells
CAMK1D	-2.5	0.0256	calcium/calmodulin-dependent protein kinase ID	Key modulator of tumor-intrinsic immune resistance

\*\*\*Results using fold change >1.5, <-1.5 as cut-off, p value <0.05

## Supplementary Table 5

Test code	lsotype control	Elraglusib	αPD-1	αPD-L1	αPD-1 + Elraglusib	αPD-L1 + Elraglusib
BUN (mg/dL)	23	27	28	23	23	23
CREA (mg/dL)	0.2	0.2	0.2	<0.2	0.2	0.2
GLU (mg/dL)	217	230	340	176	240	292
NA (mmol/L)	148	146	146	149	147	147
K (mmol/L)	6.8	>10.0	6.1	6.9	6.2	5.7
CL (mmol/L)	110	111	112	116	111	114
ALP (U/L)	38	4	46	21	36	83
ALT (U/L)	16	26	23	42	26	36
AST (U/L)	266	198	197	883	217	218
TBIL (mg/dL)	0.2	0.5	0.1	0.4	0.2	0.1
DBIL (mg/dL)	0	0	0	0.1	0	0
LDH (U/L)	867	2230	710	>12000	771	447
CPK (U/L)	476	1968	1396	447	653	1477
GGT (U/L)	0	0	0	0	0	0
TPRO (g/dL)	4.2	4.5	4.2	3.7	4.2	4.3
ALB (g/dL)	2.4	2.7	2.4	2	2.5	2.6
CA (mg/dL)	10	0.4	9.6	7.3	10.2	8.6
PHOS (mg/dL)	8.4	8.2	11.4	6.2	7.5	8.9
MG (mg/dL)	2.5	1.2	2.9	2.1	2.5	2.5
CHOL (mg/dL)	90	101	81	81	83	67
TRIG (mg/dL)	269	136	159	434	169	75
AMY (U/L)	265	275	307	241	318	442
LIP (U/L)	49	59	55	52	42	66
WBC (10 <sup>3</sup> /µL)			2.96	1.8	3.75	2.68
RBC (10 <sup>6</sup> /µL)			8.86	8.16	8.5	8.85
HB (g/dL)			13	11.9	12.7	13.2
HCT (%)			50.6	46.9	49	51
MCV (fL)			57.1	57.5	57.6	57.6
MCH (pg)			14.6	14.6	14.9	14.9
MCHC (g/dL)			25.6	25.3	25.9	25.8
PLT (10 <sup>3</sup> /µL)			403	691	401	471
NEU% (%)			55.8	29.4	60.1	50.8
NEU (10 <sup>3</sup> /µL)			1.65	0.53	2.26	1.36
LYM% (%)			34.7	57.3	33.1	39.6
LYM (10 <sup>3</sup> /µL)			1.03	1.03	1.24	1.06
MON% (%)			3	3.3	1.2	2.2
MON (10 <sup>3</sup> /µL)			0.09	0.06	0.04	0.06
EOS% (%)			3	5.1	2.8	4.3
EOS (10 <sup>3</sup> /µL)			0.09	0.09	0.11	0.11
BAS% (%)			0.8	0.5	0.3	1.4
BAS (10 <sup>3</sup> /µL)			0.02	0.01	0.01	0.04
LUC% (%)			2.6	4.4	2.5	3.2
LUC (10 <sup>3</sup> /µL)			0.08	0.08	0.1	0.09

## Supplementary Table 6

Subject ID	Tumor type	Elraglusib dose (mg) cycle 1, cycle 2	Elraglusib dose (mg/kg)	Number of cycles	Age at enrollment (years)	Sex	Race	Ethnicity	PFS (days)	OS (days)
05001	Pancreas	67	1	1	61	F	White/Caucasian	Not Hispanic/Latino	UN	UN
05002	Appendix	47	1	1	59	F	Other	Hispanic or Latino	UN	UN
05003	Colorectal	58	1	1	56	F	White/Caucasian	Not Hispanic/Latino	26	26
05004	Colorectal	76	1	1	60	Μ	White/Caucasian	Not Hispanic/Latino	28	UN
05005	Colorectal	71, 130	1	2	68	Μ	White/Caucasian	Not Hispanic/Latino	99	105
05006	HCC	205	2	1	59	Μ	White/Caucasian	Not Hispanic/Latino	234	234
05009	Cholangiocarcinoma	144	2	1	60	Μ	White/Caucasian	Not Hispanic/Latino	46	UN
05010	Colorectal	182	2	1	51	Μ	White/Caucasian	Not Hispanic/Latino	UN	UN
05011	NSCLC	105	2	1	51	F	White/Caucasian	Not Hispanic/Latino	31	39
05013	Colorectal	235	3.3	1	70	F	White/Caucasian	Not Hispanic/Latino	130	UN
05016	Colorectal	219	3.3	1	33	F	White/Caucasian	Not Hispanic/Latino	UN	UN
05017	Colorectal	603	5	1	61	F	Black or African American	Not Hispanic/Latino	83	UN
05018	NSCLC	305	5	1	73	F	White/Caucasian	Not Hispanic/Latino	41	UN
05019	Appendix	450	7	1	63	F	White/Caucasian	Not Hispanic/Latino	UN	UN
05020	Desmoid	741	7	1	28	F	White/Caucasian	Not Hispanic/Latino	UN	UN
05024	Appendix	354	7	1	71	F	White/Caucasian	Not Hispanic/Latino	41	UN
05038	Pancreas	766	9.3	1	70	F	White/Caucasian	Not Hispanic/Latino	UN	UN
05051	ATLL	673	12.37	1	45	М	Black or African American	Not Hispanic/Latino	UN	UN
05055	Leiomyosarcoma	518	12.37	1	67	М	White/Caucasian	Not Hispanic/Latino	UN	UN

Supplementary Table 1. HCT-116 CRC cell microarray analysis. HCT-116 CRC cells were treated with 1  $\mu$ M elraglusib for 24 hours and treated versus untreated control samples were compared in triplicate via microarray analysis. Table showing differentially expressed genes of interest with their corresponding FCs, *p* values, descriptions, and functions. Genes highlighted in yellow are known p53 targets (13). Genes are ordered by FC and were calculated using a FC cutoff of >1.5, <-1.5, and a minimum *p* value of <0.05.

**Supplementary Table 2. HT-29 CRC cell microarray analysis.** HT-29 CRC cells were treated with 1  $\mu$ M elraglusib for 24 hours and treated versus untreated control samples were compared in triplicate via microarray analysis. Table showing differentially expressed genes of interest with their corresponding FCs, *p* values, descriptions, and functions. Genes highlighted in yellow are known p53 targets. Genes are ordered by FC and were calculated using a FC cutoff of >1.5, <-1.5, and a minimum *p* value of <0.05.

Supplementary Table 3. KM12C CRC cell microarray analysis. KM12C CRC cells were treated with 1  $\mu$ M elraglusib for 24 hours and treated versus untreated control samples were compared in triplicate via microarray analysis. Table showing differentially expressed genes of interest with their corresponding FCs, *p* values, descriptions, and functions. Genes highlighted in yellow are known p53 targets. Genes are ordered by FC and were calculated using a FC cutoff of >1.5, <-1.5, and a minimum *p* value of <0.05.

**Supplementary Table 4. Immune cell microarray analysis.** NK-92 and TALL-104 immune cells were treated with 1  $\mu$ M elraglusib for 24 hours and treated versus untreated control samples were compared in triplicate via microarray analysis. Tables showing differentially expressed genes of interest with their corresponding FCs, *p* values, descriptions, and functions. Genes are ordered by FC and were calculated using a FC cutoff of >1.5, <-1.5, and a minimum *p* value of <0.05.

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## Supplementary Table 5. Murine serum chemistry analysis does not show treatment-related

toxicity. Whole blood from long-term mice sacrificed was submitted for serum chemistry analysis. Results are shown from the complete metabolic panel and complete blood count with differential. ALB: Albumin, ALP: Alkaline Phosphatase, ALT: Alanine aminotransferase, AMY: Amylase, ANIS: Anisocytosis, AST: Aspartate aminotransferase, ATYP: Atypical Lymphs, BAS: Absolute Basophils, BAS%: % Basophils, BUN: Urea Nitrogen, CA: Calcium, CHOL: Cholesterol, CL: Chloride, CPK: Creatine kinase, CPLT: Clumped Platelets, CREA: Creatinine, DBIL: Direct Bilirubin, EOS: Absolute Eosinophils, EOS%: % Eosinophils, GGT: Gamma-glutamyl Transferase, GLU: Glucose, HB: Hemoglobin, HCT: Hematocrit, HJB: Howell-Jolly Bodies, HYPO: Hypochromasia, HYPR: Hyperchromasia, K: Potassium, LDH: Lactate Dehydrogenase, LIP: Lipase, LPLT: Large Platelets, LUC: Absolute Large Unstained Cells, LUC%: % Large Unstained Cells, LYM: Absolute Lymphocytes, LYM%: % Lymphocytes, MAC: Macrocytosis, MCH: Mean Corpuscular Hemoglobin, MCHC: Mean Corpuscular Hemoglobin Count, MCV: Mean Corpuscular Volume, MG: Magnesium, MIC: Microcytosis, MON: Absolute Monocytes, MON%: % Monocytes, NA: Sodium, NEU: Absolute Neutrophils, NEU%: % Neutrophils, PHOS: Inorganic Phosphorus, PLT: Platelet Count, POLK: Poikilocytosis, RBC: Red Blood Cell Count, TBIL: Total Bilirubin, TPRO: Total Protein, TRIG: Triglyceride, WBC: White Blood Cell Count.

# **Supplementary Table 6. Individual patient information for human patient cytokine analysis.** Tumor type, elraglusib dose (mg, mg/kg), number of cycles, age at enrollment, sex, race, ethnicity, median progression-free survival and median overall survival data is shown.

**Supplementary Figure 1. Elraglusib increases immune-mediated cytotoxicity in a coculture model with CRC cells. (A)** Co-culture SW480 and TALL-104 T cell co-culture assay images at the 24-hour timepoint. 24-hour tumor cell pre-treatment with 5 µM elraglusib, followed

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by 24-hour co-culture. EthD-1 was used to visualize dead cells, 10X magnification, scale bar indicates 100 µm. (B) Quantification of co-culture experiment using the percentage of dead cells out of total cells (n=3). (C) Quantification normalized by cell death observed with drug treatment alone (n=3). (D) SW480 and donor-derived CD8+ T cell co-culture assay images at the 24-hour timepoint. (E) Quantification of co-culture experiment using the percentage of dead cells out of total cells (n=3). (F) Quantification normalized by cell death observed with drug treatment alone (n=3). A one-way ANOVA followed by a post-hoc Dunnett's multiple comparisons test was used to calculate statistical significance. Statistical significance is reported as follows:  $p \le 0.05$ : \*,  $p \le$ 0.01: \*\*, and  $p \le 0.001$ . (G) HCT-116 GFP+ or HT-29 GFP+ cells were co-cultured with TALL-104 cells at a 1:1 E:T ratio and were treated with DMSO or 5 µM elraglusib (n=3). (H) 40X images were collected after 24 hours of DMSO or 5 µM elraglusib treatment. (I) 40X images of a coculture of HCT-116 GFP+ cells and NK-92 cells at a 1:1 E:T ratio were collected after 36 hours of 5 µM elraglusib treatment. White arrows indicate pyroptotic events. (J) 40X images of a co-culture of HT-29 GFP+ CRC cells and NK-92 cells at a 1:1 E:T ratio were after 36 hours of 5 µM elraglusib treatment. White arrows indicate pyroptotic events. P-value legend: \* p < 0.05, \*\* p < 0.01, \*\*\* p < 0.001, \*\*\*\* p < 0.0001.

Supplementary Figure 2. CRC cell lines selected represent diverse mutational backgrounds and exhibit varying elraglusib IC-50 values. Tumor cell lines (HCT-116, HT-29, SW480) and immune cell lines (NK-92, TALL-104) were treated as indicated for (A) 24-hour or (B) 72-hour cell viability was assessed to determine IC-50 values. (C) Table of CRC cell lines included in the study and their diverse mutational profiles.

**Supplementary Figure 3. Internal controls for tumor cell microarray analysis. (A)** PCA mapping demonstrated clear mapping of HCT-116, HT-29, and KM12C cells. **(B)** Quality control

was determined satisfactory for further analysis. (C) Hybridization controls. (D) Labeling controls.(E) Pos vs Neg Area Under the Curve (AUC). (F) Signal box plot.

**Supplementary Figure 4. Internal controls for immune cell microarray analysis. (A)** PCA mapping demonstrated clear mapping of NK-91 and TALL-104 cells. **(B)** Quality control was determined satisfactory for further analysis. **(C)** Hybridization controls. **(D)** Labeling controls. **(E)** Pos vs Neg Area Under the Curve (AUC). **(F)** Signal box plot.

Supplementary Figure 5. Syngeneic murine colon carcinoma BALB/c murine model with MSS cell line CT-26 Kaplan Meier curves and mouse body weights grouped by treatment. Individual Kaplan Meier curves for isotype control compared to (A) elraglusib, (B) anti-PD-1, (C) anti-PD-L1, (D) elraglusib + anti-PD-1, and (E) elraglusib + anti-PD-L1. (F) Bar graph indicating the percentage of responders (R) and non-responders (NR) per treatment group. Individual body weight plots for (G) Isotype control, (H) elraglusib, (I) anti-PD-1, (J) anti-PD-L1, (K) elraglusib + anti-PD-1, and (L) elraglusib + anti-PD-L1. P-value legend: \* p < 0.05, \*\* p < 0.01, \*\*\* p < 0.001.

Supplementary Figure 6. Immunohistochemistry analysis of tumor sections in responders as compared to non-responders. (A) CD4, (B) CD8, (C) Foxp3, (D) NKp46, (E) TNF-related apoptosis-inducing ligand (TRAIL), (F) PD-1, (G) Vascular Endothelial Growth Factor (VEGF), and (H) Transforming Growth Factor Beta 2 (TGF $\beta$ 2) were compared at the 14 days post-treatment initiation timepoint and the end-of-study (EOS) timepoint, respectively. Non-responders (NR) and responders (R) were compared. Statistical significance was determined using two-tailed unpaired T tests (n=6). 20X images, scale bar represents 100 µm.
**Supplementary Figure 7. IHC thresholding analysis workflow.** (A) 20X images were converted to (B) 16-bit images and were then analyzed using (C) MaxEntropy thresholding. Particles were analyzed and the reported percentage area covered was used to quantify the signal.

Supplementary Figure 8. Murine serum cytokine profiling assay results. Serum from endof-study mice was analyzed via cytokine profiling for (A) MIP-1  $\alpha$ , (B) RANTES, (C) Eotaxin, (D) MIP-3  $\alpha$ , (E) IP-10, (F) CXCL12, (G) Granzyme B, (H) IFN- $\gamma$ , (I) IL-1  $\alpha$ , (J) IL-2, (K) IL-3, (L) IL-4, (M) IL-7, (N) IL-10, (O) IL-12 p70, (P) IL-13, (Q) IL-16, (R) M-CSF, and (S) Prolactin. Responders (red) and non-responders (black) were compared. A Kruskal-Wallis test was used to calculate statistical significance followed by a Benjamini-Hochberg correction for multiple comparisons.

Supplementary Figure 9. Multiplex immunoassay reveals dynamic cytokine changes 8- and 24-hours post-elraglusib dose. Plasma samples from human patients with refractory solid tumors of multiple tissue origins enrolled in a Phase 1 clinical trial investigating GSK-3 inhibitor elraglusib (NCT03678883) were analyzed using a Luminex 200. (A) Raw analyte values are grouped by timepoint: baseline (pre-dose), 8-hour post-PK, and 24-hour post-PK and categorized by location: leukemia/lymphoma primary tumor appendix, adult Т cell (ATLL), cholangiocarcinoma, colorectal, desmoid, hepatocellular carcinoma (HCC), leiomyosarcoma, non-small cell lung cancer (NSCLC), and pancreatic. The scale bar is in pg/mL. (B) Raw analyte values are grouped by timepoint: 8-hour post-PK and 24-hour post-PK and categorized by elraglusib dose: 1, 2, 3.3, 5, 7, 9.3, or 12.37 mg/kg. (C) FC heatmaps grouped by cytokine family. 8- and 24-hours post-PK were compared to baseline (pre-PK) analyte values. Green indicates downregulation and red indicates upregulation.

# **Supplementary Figure 10. Needle biopsies scanned by the GeoMx Digital Spatial Profiler (DSP).** Whole slide scans are provided for all needle biopsies imaged by the GeoMx DSP (n=6). PanCK is indicated by green, CD45 is indicated by red, and DAPI is indicated by blue staining. Slide IDs are provided on each image in white text.

#### Supplementary Figure 11. Tissue biopsies scanned by the GeoMx Digital Spatial Profiler

(**DSP**). Whole slide scans are provided for all tissue biopsies imaged by the GeoMx DSP (n=6). PanCK is indicated by green, CD45 is indicated by red, and DAPI is indicated by blue staining. Slide IDs are provided on each image in white text.

#### Supplementary Figure 12. ROI selection and segmentation strategy using PanCK and CD45

**markers.** (A) Representative image of whole tissue scan used for ROI identification. ROIs are outlined in red circles. (B) Individual ROIs are ordered by number. Fluorescent channel settings: FITC / 525nm / SYTO 13 / DNA (Blue), Cy3 / 568nm / Alexa 532 / PanCK (Green), and Texas Red / 615nm / Alexa 594 / CD45 (Red). A yellow mask was used for PanCK+ tumor cell identification and a teal mask was used for CD45+ hematopoietic cell identification.

Supplementary Figure 13. Several proteins are differentially expressed when patients are segmented into two groups based on time-on-treatment. PCA plots showing how similar the different Group levels are from one another in the (A) total sample set and (B) at both biopsies timepoints (pre-, post-treatment). Samples tend to cluster by tissue type and further separate by segment on PC2. Circles represent CD45+ segments and triangles represent pan CK+ segments. Biopsy tissue locations are color-coded where blue indicates liver, yellow indicates lung, red indicates pleura, and green indicates rectum. (C) Volcano plot showing the comparison of pre-treatment biopsy protein expression in CD45+ segments between long time-on-treatment (Long Tx) patients and short time-on-treatment (Short Tx) patients. Violin plots show statistically

significant differentially expressed proteins including B cell marker CD20 (p = 0.012) and myeloid activation marker CD80 (p = 0.047). (D) Volcano plot showing the comparison of CD45+ segments in post-treatment biopsies between Long Tx patients and Short Tx patients. Violin plots show statistically significant differentially expressed proteins including antigen NY-ESO-1 (p = 0.021) and progesterone receptor (PR) (p = 0.022). (E) Volcano plot showing the comparison of pre-treatment protein expression in PanCK+ segments between Long Tx patients and Short Tx patients. Violin plots show statistically significant differentially expressed proteins including cytotoxic T cell marker CD8 (p = 3.5E-3), antigen Her2 (p = 0.033), Treg marker Foxp3 (p = 0.033), T cell marker CD3 (p = 0.035), B cell marker CD20 (p = 0.046), LAG3 (p = 0.023), PD-L2 (p = 0.028), and PD-1 (p = 0.046). (F) Volcano plot showing the comparison of post-treatment protein expression in PanCK+ segments between Long Tx patients and Short Tx patients. Violin plots show statistically significant differentially expressed proteins including mature B cell/DC marker CD35 (p = 8.5E-3), antigen NY-ESO-1 (p = 8.7E-3), antigen Her2 (p = 0.022), antigen MART1 (p= 0.029), cytotoxic T cell marker CD8 (p = 0.030), Treg marker Foxp3 (p = 0.030), antigen PTEN (p = 0.032), DC/myeloid marker CD11c (p = 0.034), memory T cell marker CD45RO (p = 0.036), checkpoint PD-L1 (p = 0.047), and PR (p = 0.049).

**Supplementary Figure 14. Immune cell localization categorization strategy.** Immune cell locations were categorized as **(A)** tumor-infiltrating, **(B)** tumor-adjacent, or **(C)** normal tissue. Representative ROI images are shown.

Supplementary Figure 15. Differential expression analyses of protein expression in human tumor biopsies pre- and post-elraglusib treatment. (A) Volcano plot showing differential protein expression in PanCK+ regions between pre- and post-treatment biopsies in paired samples. (B) Volcano plot showing differential protein expression in CD45+ regions between preand post-treatment biopsies in paired samples. (C) Volcano plot showing differential protein expression between tumor-adjacent CD45+ segments and tumor-infiltrating CD45+ segments in pre-treatment biopsies. (D) Volcano plot showing differential protein expression between tumoradjacent CD45+ segments and tumor-infiltrating CD45+ segments in post-treatment biopsies. (E) Volcano plot showing differential protein expression between CD45+ regions of pre-treatment and post-treatment biopsies. (F) Volcano plot showing differential protein expression panCK+ regions of pre-treatment and post-treatment biopsies. (G) Volcano plot showing differential post-treatment protein expression in tumor-adjacent CD45+ immune cell segments in Long Tx patients as compared to Short Tx patients. (H) Volcano plot showing differential post-treatment protein expression in CD45+ immune cell segments located in normal (non-tumor) tissue in Long Tx patients as compared to Short Tx patients. (I) Volcano plot showing differential pre-treatment protein expression in CD45+ immune cell segments located in normal (non-tumor) tissue as compared to tumor-adjacent tissue. (J) Volcano plot showing differential post-treatment protein expression in CD45+ immune cell segments located in normal (non-tumor) tissue as compared to tumor-adjacent tissue. (K) Volcano plot showing differential pre-treatment protein expression in CD45+ immune cell segments located in normal (non-tumor) tissue as compared to those in tumor tissue. (L) Volcano plot showing differential post-treatment protein expression in CD45+ immune cell segments located in normal (non-tumor) tissue as compared to those in tumor tissue. (M) Volcano plot showing a comparison of tumor-adjacent CD45+ segments with tumor-infiltrating CD45+ segments in all biopsies regardless of timepoint. (N) Volcano plot showing a comparison of post-treatment protein expression of tumor-infiltrating CD45+ immune cell segments in Long Tx patients as compared to Short Tx patients. Grey points are non-significant (NS), blue points have p values < 0.05, and red points have false discovery rate (FDR) values less than 0.05. The size of the point represents the log2 UQ Signal-to-noise ratio (SNR).



## **Supplementary Figure 2**



Cell Line	Elraglusib ; IC <sub>50</sub> (uM)
HCT-116	21.78
HT-29	100.39
NK-92	41.73
TALL-104	52.41
SW480	95.49



В



Cell Line	Elraglusib; IC <sub>50</sub> (uM)	
HCT-116	0.36	
HT-29	0.41	
NK-92	1.67	
TALL-104	19.95	
SW480	2.29	



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CRC Cell Line Name	Species	MSI / MSS status	TP53	HRAS	NRAS	KRAS	BRAF	PIK3CA	PTEN expressi on	APC	TRK	CTNNB1	ACVR2A	BRCA2	TGFBR2
HCT-116	human	MSI	WT	WT	WT	p.G13D	WT	H1047R heterozyg ous	positive	WT	WT	Heterozy gous for p.Ser45d el	p.K437fs	Heterozy gous p.Ile2675f s*6	. WT
HT-29	human	MSS	R273H	WT	WT	WT	p.V600E	P449T heterozyg ous	positive	E853* heterozyg ous, T1556fs* 41	WT	WT	WT	WT	
KM12C	human	MSI	p.Arg72fs *51 (c.215del G)	WT	WT	WT	WT	WT	null	Heterozy gous p.Asn181 9fs*7	TPM3- NTRK1 gene fusion		Homozyg ous p.Lys437f s*5	Heterozy gous for BRCA2 p.Asn178 4Hisfs*7	Heterozy gous p.Lys128 Serfs*35
SW480	human	MSS	R273H: P309S	WT	WT	p.G12V	WT	WT	positive	homozyg ous Q1338*	WT	WT	WT	WT	

В



	Controls	Controls	Neg AUC
Sample condition	Threshold	Threshold	Threshold
KM12C NT	Pass	Pass	Pass
HT-29 NT	Pass	Pass	Pass
HT-29 9-ING-41	Pass	Pass	Pass
HCT-116 NT	Pass	Pass	Pass
KM12C NT	Pass	Pass	Pass
HT-29 9-ING-41	Pass	Pass	Pass
HCT-116 9-ING-41	Pass	Pass	Pass
HCT-116 NT	Pass	Pass	Pass
HCT-116 NT	Pass	Pass	Pass
HT-29 NT	Pass	Pass	Pass
HCT-116 9-ING-41	Pass	Pass	Pass
HCT-116 9-ING-41	Pass	Pass	Pass
KM12C NT	Pass	Pass	Pass
HT-29 9-ING-41	Out	Pass	Pass
HT-29 NT	Pass	Pass	Pass
KM12C 9-ING-41	Pass	Pass	Pass
KM12C 9-ING-41	Pass	Pass	Pass
KM12C 9-ING-41	Pass	Pass	Pass

Labeling

Hybridization Pos vs









В

A PCAI

# PCA Mapping 88.7 (CHP)



	Sample condition	Labeling Controls Threshold	Hybridization Controls Threshold	Pos vs Neg AUC Threshold
	NK-92 9-ING-41	Pass	Pass	Pass
	NK-92 NT	Pass	Pass	Pass
	TALL-104 9-ING-41	Pass	Pass	Pass
	NK-92 NT	Pass	Pass	Pass
	TALL-104 NT	Pass	Pass	Pass
1	NK-92 9-ING-41	Pass	Pass	Pass
•	NK-92 NT	Pass	Pass	Pass
	TALL-104 9-ING-41	Pass	Pass	Pass
	NK-92 9-ING-41	Pass	Pass	Pass
	TALL-104 9-ING-41	Pass	Pass	Pass
	TALL-104 NT	Pass	Pass	Pass



#### **Supplementary Figure 5**



7112/2021

BI612021 BI13/2021 

Timepoint (days)

Timepoint (days)





# **Supplementary Figure 8**

В









RANTES





























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Legend

Responder

Non-responder





Supplementation provide the second state of th



### **Supplementary Figure 12**

Α







ROI 5







ROI 6





ROI 7



ROI 4



ROI 8







