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Langerhans islets induce anti-tumor immunity at the expense of glycemic control and predict chemotherapy response in pancreatic cancer

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42 ABSTRACT

43 Induction of anti-tumor immunity in pancreatic ductal adenocarcinoma (PDA) is an unresolved 44 challenge. Systematic investigation of the microenvironment of primary pancreatic tumors 45 revealed a role of endocrine Langerhans islets in the coordination of immune activation. We found 46 that intratumoral β-cells, regulated via STAT3, secrete C-C motif chemokine ligand 27 (CCL27) 47 and thereby promote a T_H1 phenotype in the microenvironment resulting in an enhanced T cell 48 infiltration and prolonged patient survival. The local effect can be abrogated in a patient-based 49 human explant model by inhibition of the CCL27 receptor CCR10. This defense mechanism is 50 paralleled by an impaired metabolic function of Langerhans islets with reduced insulin levels 51 resulting in a dysregulation of glycemic control in patients. Based on these findings, screening of 52 PDA cases (n= 2264) led to the identification of type 2 diabetes mellitus (T2DM) and extractable 53 glycated haemoglobin (HbA1c) levels as response markers for neoadjuvant chemotherapy with 54 fluorouracil, leucovorin, irinotecan and oxaliplatin (FOLFIRINOX). Collectively these data provide 55 insights into the interconnection of T2DM and PDA, and link declining glycemic control to 56 therapeutic efficacy, which can be utilized as a tool for clinical decision-making and improve patient 57 management.

58 **INTRODUCTION**

59 Pancreatic ductal adenocarcinoma (PDA) is the seventh-leading cause of cancer-related death 60 worldwide, with a 5-year survival of only 9% and the highest incidence-to-mortality ratio of any 61 solid cancer¹. Over the past decade, not only has the involvement of immune system in 62 malignancies emerged as a critical hallmark of cancer², but immunotherapy has also profoundly 63 changed cancer treatment by improving survival of patients in multiple solid tumors. A major 64 predictor of clinical response to immunotherapy is the extent of intratumoral T cell infiltration. 65 However, such "hot" tumors (high T cell infiltration) stand in contrast to "cold" tumors (low T cell 66 infiltration) like PDA, which remains mostly refractory to immunotherapeutic treatment regimens³. 67 A main feature of the tumor tissue in PDA is its desmoplastic microenvironment, in which immune 68 cells make up nearly 50% of the cellular components but only few of them are anti-tumor effector 69 cells such as CD8⁺ T lymphocytes⁴. Human studies have shown that paucity of T cells is common 70 in PDA, but a subset of primary tumors do exhibit moderate infiltration of CD4⁺ or CD8⁺ T cells. 71 and their sheer presence correlates with expression of cytotoxicity genes and overall survival⁵⁻⁸. 72 Induction of such an anti-tumor immunity can be induced, for example, by chemotherapy with 73 fluorouracil, leucovorin, irinotecan and oxaliplatin (FOLFIRINOX) by increasing cytotoxic T cell 74 densities. To further improve patient outcomes, we need to understand the role of the components 75 defining the tumor microenvironment and identify critical immunomodulatory mechanisms⁹⁻¹¹.

76 In this regard, little is known about the role of endocrine Langerhans islets in shaping the 77 tumoral immune landscape. Previous studies describe multiple proinflammatory cytokines 78 originating from Langerhans islets in metabolic disorders such as obesity and diabetes^{12,13}. Also, 79 Langerhans islets are mainly responsible for chemokine-mediated inflammation and T cell 80 infiltration in type 1 diabetes mellitus¹⁴ and evidence suggests that this patient cohort is protected 81 against PDA¹⁵. But what phenotype do Langerhans islets exhibit in the immune contexture of PDA? 82 And is it clinically relevant? In addition, an impaired glycemic control is a common finding and 83 several studies have shown a high incidence of type 2 diabetes mellitus (T2DM) in PDA patients¹⁶ 84 but it remains unclear whether T2DM is a risk factor or early marker of the disease¹⁷⁻¹⁹.

This study aimed to systematically assess the tumor microenvironment and subsequently decipher immunologic interactions in PDA patients. This led to the in-depth investigation of antitumoral immunomodulatory capacities of Langerhans islets, their consequences for glycemic control and their impact on clinical outcomes, in order to tailor therapeutic strategies by exploiting metabolic parameters as a stratification marker.

90 MATERIAL AND METHODS

91 Patient samples and clinical analyses

92 All patients underwent planned surgery at the department for General, Visceral and 93 Transplantation Surgery at the University Hospital Heidelberg. The study was approved by the 94 local ethics committee (301/2001 and S-457/2019). Written informed consent was obtained from 95 all patients. Tissue samples of 61 PDA patients were used for immunohistochemistry and cytokine 96 analyses. 9 fresh PDA tissues on ice were directly collected from the operating room from patients 97 who underwent surgery in 2019 and 2020. Survival analyses were performed on a set of 51 98 patients with PDA. Clinical information about diagnosis of T2DM, HbA1c levels and neoadjuvant 99 treatment with FOLFIRNOX was collected in a cohort of 2264 patients, which is the total number 100 of patients which was planned for pancreatoduodenectomy from 2016-2020 in the University 101 Hospital Heidelberg. 122 patients were included in the final analysis. All patient data and samples 102 were collected in a prospective database and analyzed retrospectively. All patient data was 103 pseudonymized.

104

105 Patient-based organotypic tumor explant model

106 The organotypic tumor explant model was set up as previously described²⁰. In brief, resected 107 specimens were transferred on ice and under sterile conditions from the operating room to the 108 laboratory. The timeframe was less than thirty minutes upon resection. The resected specimen 109 was immediately processed into serial explant-suitable thin tissue sections (size approximately 6 110 x 6 x 1 mm). From each patient, one or more samples were directly frozen as well as formalin-111 fixed and embedded in paraffin for reference purposes. Tissue culture was performed by placing 112 two explants with 1 ml of Minimum Essential Medium with 1% GlutaMAX supplement (Gibco, USA: 113 41090-036) per well on a 24-well plate in an incubator at 37°C and 5% CO₂. The explants were 114 treated with a small molecule inhibitor of CCR10 (BI-6901) from (Boehringer Ingelheim, Germany). 115 The CCR10 antagonist dosage per well was 0.1 mg/ml. Along with untreated explants (reference). 116 the treated specimens were harvested after 24 hours and cryo-preserved using cryo embedding 117 medium (Medite, USA; 41-3011-00) as well as formalin-fixed and embedded in paraffin.

118

119 Cell Culture of human pancreatic Langerhans islets

Human pancreatic Langerhans islet cells were purchased from (Celprogen, USA; 35002-04). The cells were seeded at 80% of confluence and plated at 10⁵ per ml density. The cells were maintained in the appropriate size, extra-cellular matrix precoated flasks (Celprogen, USA; 35002-04-T75) and cultured in complete growth medium with serum (Celprogen, USA; M35002-04S). Medium was changed every 24 hours. When reached 65-75% of confluence, cells were passaged with 0,05% Trypsin-EDTA (Gibco, USA; 25300-054) and subcultured for expansion. Langerhans islet cells from passages 3 to 5 were used for the experiments.

- 127
- 128 Immunohistochemistry on human tissue samples

129 PDA tissue samples were collected freshly from the operating room, fixed in 4% phosphate buffered formaldehyde (ROTI Histofix, Roth, Germany; P087), placed in ethanol and embedded in 130 131 paraffin. Tissue samples were sliced in 3 µm thick sections. All immunohistochemical stainings 132 were performed on a BOND-MAX (Leica, Germany). FFPE tissues were deparaffinized and 133 rehydrated (BOND Dewax Solution, Leica, Germany; AR9222). After heat-induced epitope 134 retrieval (HIER) at 100°C (BOND Epitope Retrieval Solution 1 or 2, Leica, Germany; HIER 1 135 AR9961, HIER 2 AR9640), endogenous peroxidase activity was blocked by incubation with 3% 136 peroxide block for 20 minutes (BOND Polymer Refine Detection System, Leica, Germany; 137 DS9800). The sections were blocked with 10% normal goat serum (Vector, USA; S-1000-20). The 138 primary antibodies were applied at room temperature for 30 minutes: CD3 (1:100, HIER 1, rabbit 139 monoclonal, clone SP7, Abcam, UK; ab16669), CD4 (1:100, HIER 1, mouse monoclonal, clone 140 4B12, Leica, Germany; CD4-368-L-CE-H), CD8 (1:50, HIER 1, mouse monoclonal, clone 4B11, 141 Leica, Germany, CD8-4B11-L-CE), CD20 (1:100, HIER 1, mouse monoclonal, clone L26, Leica, 142 Germany; CD20-L26-L-CE), CD163 (1:500, HIER 2, rabbit monoclonal, clone EPR19518, Abcam, 143 UK; ab182422), NKp46 (1:175, HIER 1, monoclonal mouse, clone 195314, R&D Systems, USA; 144 MAB1850-500), FoxP3 (1:100, HIER 2, mouse monoclonal, clone 236A/E7, Thermo Fisher 145 Scientific, Germany; 14-4777), CCL27 (1:200, HIER 1, mouse monoclonal, clone 124308, R&D 146 Systems, USA; MAB376), CCR10 (1:100, HIER 1, rabbit polyclonal, Novus Biologicals, USA; 147 NB100-56319), CA19-9 (1:1000, HIER 1, mouse monoclonal, clone 121SLE, Abcam, UK; 148 ab3982), insulin (1:500000, rabbit monoclonal, clone EPR17359, Abcam, UK; ab181547), 149 Phospho-Stat3 (Ser727) (1:200, HIER 2, mouse monoclonal, Cell Signaling Technology, USA; 150 9136S). The slides were incubated with a secondary antibody (rabbit anti-mouse IgG, BOND 151 Polymer Refine Detection System, Leica, Germany, DS9800) for 8 minutes at room temperature. 152 Signal amplification was performed by incubation with horse radish peroxidase and coupled to 153 dextrane molecues in large numbers, for 8 minutes at room temperature (Poly-HRP-mouse anti-154 rabbit IgG. BOND Polymer Refine Detection System, Leica, Germany: DS9800), A color reaction 155 with 3,3-di-amino-benzidine (DAB chromogen, BOND Polymer Refine Detection System; DS9800) 156 was utilized to detect the antigen. Counterstaining was performed with haematoxylin (BOND 157 Polymer Refine Detection System, Leica, Germany; DS9800) and the sections were mounted with 158 Aquatex (Merck, Germany; 108562).

159

160 Immunofluorescence on human tissue samples

Immunofluorescence double staining was performed on paraffin-embedded sections using fluorochrome-conjugated secondary antibodies. For the first primary antibodies CD3, CD4, CD8 and FoxP3 a red fluorescence Alexa Fluor 594 donkey anti-mouse IgG (Thermo Fisher Scientific, Germany; A-21203) was used, and for CCR10 a green fluorescence Alexa 488 goat anti-rabbit IgG (Thermo Fisher Scientific, Germany; A-11008). For the analysis of the first primary antibody CCL27 and Phospho-Stat3 (Ser727) a green Alexa Fluor 488 goat anti-mouse IgG (Thermo Fisher Scientific, Germany; A-11029) was used, and for insulin a red Alexa Fluor 594 donkey anti-rabbit IgG (Thermo Fisher Scientific, Germany; A-21207). The sections were stained according to antibody recommendation. After incubation of the first primary antibody overnight at 4°C, Alexa Fluor 488 (1:100 dilution) was applied for 60 minutes. The second primary antibody was applied for 180 minutes at room temperature and detected with Alexa Fluor 594 (1:100 dilution) for 60 minutes during sequential double staining. Mounting and staining for cell nuclei was performed using Vectashield with DAPI (1:10000, Vector, USA; H-1200). Images were taken with a Nanozoomer 2.0-HT slide scanner (Hamamatsu, Japan).

175

176 Whole-slide immune cell quantification

For quantification analysis of immune cells, tissue sections were digitized with a Leica Aperio AT2 scanner (Leica, Germany). Whole-slide microscopic images of full tissue sections were automatically obtained (virtual microscopy). The slides were scanned at 40-fold magnification and further examined using an image analysis software (VIS software suite, Visiopharm, Denmark). Given regions of interests (tumor and stroma) were manually annotated and density and distribution of immune cells was analyzed semi-automatically, as reported previously²¹⁻²³. A visual consistency check was performed on all evaluations.

184

185 Laser capture microdissection

The tumoral and stromal compartment on PDA tissue sections was separated from each other by laser capture microdissection. This technique permits to isolate selected human cell populations from a section of complex tissue under direct microscopic visualization. The standard protocols of the inventers were used²⁴. In brief, the tissue section was focused (20-fold magnification) and the tumoral and stromal area was manually separated using the Leica Laser Microdissection Software (Leica, Germany); the dissection was completed using a carbon dioxide laser pulse.

192

193 Multiplex protein quantification of cytokines and metabolic hormones

194 Small pieces of dissected frozen pancreatic tumor tissues were collected and lysed (Bio-Plex Cell 195 Lysis Kit, BioRad, USA; 171304011), followed by a repeated procedure of vortexing, freezing (-196 80°C for 10 minutes), thawing (on ice) and ultrasonic bathing (for 10 minutes). The supernatants 197 were then centrifuged at 13.000 rpm for 20 minutes at 4°C. When supernatants of cell culture 198 experiments were analyzed no lysis was performed. In all samples, the protein concentrations 199 were determined (Pierce BCA Protein Assay, Thermo Fisher Scientific, Germany; 23227), the 200 concentration then was adjusted to 200 µg/ml and cytokine as well as metabolic hormone 201 concentrations were quantified by multiplex protein arrays, according to the instructions of the 202 manufacturer (BioRad, USA). A two-laser array reader simultaneously quantifies all proteins of 203 interest (cytokines/metabolic hormones) and concentrations are calculated with Bio-Plex Manager 204 4.1.1 based on a 5-parameter logistic plot regression formula. For cytokine quantification Bio-Plex 205 Pro Human Cytokine Screening Panel 48-plex (BioRad, USA; 12007283), Bio-Plex Pro Human 206 Cytokine ICAM-1 (BioRad, USA; 171B6009M) and Bio-Plex Pro Human Cytokine VCAM-1

(BioRad, USA; 171B6022M) were used. For the quantification of metabolic hormones Bio-Plex Pro
 Human Diabetes 10-plex Assay (BioRad, USA; 171A7001M) was used. Previous experimental
 insights showed the technical reproducibility of this protocol ²⁰.

210

211 Human Langerhans islets in tumoral microenvironment

212 Langerhans islets cells were placed in a 96-well plate (around 7500 cells/per well) and cultured in 213 a mixture of 150 µl volume of complete growth medium with serum (Celprogen, USA; M35002-214 04S) and 50 µl of supernatant of human PDA tissue explants. For reference purposes Langerhans 215 islets cells were cultured in 200 µl of complete growth medium only. The supernatants were used 216 to mimic a PDA tumor microenvironment and to investigate the behavior of intratumoral 217 Langerhans islet cells. Supernatants of explants from five different PDA patients were used. The 218 cells were treated for 48 hours. Afterwards, the total supernatants of the treated cells were 219 collected and analyzed (Multiplex protein quantification of cytokines and metabolic hormones). For 220 reference purposes the supernatant of undiluted human PDA tissue explants was also analyzed. 221 The remaining cells were lysed (Bio-Plex Cell Lysis Kit, BioRad, USA; 171304011). In brief, the 222 well-plate was placed on ice, the cells were rinsed with cell wash buffer and 120 µl of cell lysis 223 buffer was added. The cells were incubated for 25 minutes on ice and during this time vortexed 224 thoroughly every 5 minutes. After centrifugation (13.000 rpm for 30 minutes at 4°C), supernatant 225 was collected and used for further analyses (signaling pathway analysis).

226

227 Signaling pathway analysis

228 Protein concentrations of lysate samples were determined (Pierce BCA Protein Assay, Thermo 229 Fisher Scientific, Germany; 23227), the concentration then was adjusted from 20 to 130 µg/ml. Afterwards, multiple phosphorylated and total proteins were simultaneously quantified in each well 230 231 of 96-well plates, using a protein array system according to the instructions of the manufacturer 232 (BioRad, USA). A dual-laser microplate reader system detects the fluorescence of the individual 233 dyed beads and the signal intensity on the bead surface. The relative abundance of each target 234 protein is reported as the ratio of fluorescence among the wells. In the present study, Bio-Plex Pro 235 Cell Signaling MAPK Panel 9-plex (BioRad, USA; LQ00000S6KL81S) and Bio-Plex Pro Cell 236 Signaling Akt Panel 8-plex (BioRad, USA; LQ00006JK0K0RR) were used for phosphorylated 237 protein guantification and Bio-Plex Pro Total Akt (BioRad, USA, 171V60001M), Bio-Plex Pro Total 238 ERK1/2 (BioRad, USA, 171V60003M), Bio-Plex Pro Total GSK-3β (BioRad, USA, 171V60004M), 239 Bio-Plex Pro Total JNK (BioRad, USA, 171V60007M), Bio-Plex Pro Total MEK1 (BioRad, USA, 240 171V60008M), Bio-Plex Pro Total PTEN (BioRad, USA, 171V60016M), Bio-Plex Pro Total mTOR 241 (BioRad, USA, 171V60015M), Bio-Plex Pro Total p38 MAPK (BioRad, USA, 171V60009M), Bio-242 Plex Pro Total p70 S6 Kinase (BioRad, USA, 171V60010M), Bio-Plex Pro Total Human GAPDH 243 (BioRad, USA, 171V60019M), Bio-Plex Pro Total β-Actin (BioRad, USA, 171V60001M) were used 244 for quantification of total proteins. The protein concentrations are calculated with Bio-Plex Manager 245 4.1.1 based on a 5-parameter logistic plot regression formula.

246

247 CCL27 quantification from stained tissue sections

Samples were processed and stained automatically as described above. Whole-slide microscopic images were obtained and calibrated for proper comparability as described previously ²⁵. Corresponding cytokine concentrations were used for reference and after calibration, tissues of interest were quantified for CCL27 positivity and concentrations were calculated based on reference curves.

253

254 Statistics

255 Normality of the distributions was tested with Shapiro-Wilk test, and for normal distributed data the 256 variance within each group of data was estimated and tested for equality between groups by a 257 two-sided F-test. Cytokines which were undetectable in more than 10 percentage of samples were 258 excluded. Correction for batch effects from three experiments was performed using the Python 259 package pycombat (version 0.14) and validated by analyzing the mixture of samples within UMAP 260 embeddings ²⁶. For comparison of two patient groups, two-sided Student's t test was used where 261 stated, otherwise the non-parametric two-sided Wilcoxon-rank sum test was used. Based on the 262 cytokine concentration data we reconstructed a T_H1 cytokine-cytokine co-expression network. The 263 edge weights of the network are based on the Pearson correlation coefficient between cytokine-264 cytokine ($r \ge 0$, P < 0.05). Association of CCL27 concentrations with number of chemotherapy 265 cycles was done using Kendall rank correlation. Resulting p-values were adjusted for multiple 266 hypothesis testing according to the Benjamini and Hochberg method ²⁷.

267 The overall survival time was defined using the latest information. For survival analysis, the 268 patients were dichotomized based on cytokine concentration and cell density. The median 269 cutpoints were determined to stratify patient into two groups (Hi and Lo). Kaplan Meier estimators 270 of survival were used to visualize the survival curves. The log-rank test was used to compare 271 overall survival between patients in different groups. P-values for the HiHi, HiLo, LoHi, and LoLo 272 cytokine/cell combination analysis were corrected for multiple testing using the Benjamini-273 Hochberg method. All analyses were performed using the statistical software environment R 274 (package survival). Stated percentages and quartiles include rounded numbers. Statistical 275 analyses were carried out using R-4.0.2 and Python-3.6.4. Clustering and visualization were done 276 with the software Genesis ²⁸.

277 **RESULTS**

278 Intratumoral CCL27 expression is associated with improved overall survival

To investigate the quantities of intratumoral immune cells and corresponding cytokine levels in PDA, we systematically performed stainings for CD3⁺ T cells, CD8⁺ T cells, CD4⁺ T cells, FoxP3⁺ T cells, CD20⁺ B cells, NKp46⁺ natural killer cells and CD163⁺ tumor-associated macrophages and evaluated the expression profile of intratumoral cytokines in the resected tumor tissue of 51 PDA patients (**Table S1**) (**Figure S1A**). These parameters were analyzed in relation to the clinical outcome of patients.

285 In tumor tissue, the only cytokine significantly associated with prolonged survival was the 286 expression of C-C motif chemokine ligand 27 (CCL27) (Figure 1A and 1B). Along with that, the 287 tumor infiltration by CD8⁺ cytotoxic T lymphocytes and the intratumoral CD8⁺/CD163⁺-ratio was 288 significantly associated with improved survival (Figure 1B). Particularly, the combination of 289 intratumoral CCL27 and CD8⁺ T cells proved to be a strong marker for favorable prognosis (Figure 290 1B) (Table 1). On the other hand, intratumoral expression of IFN-y was significantly associated 291 with poorer survival in patients (Figure 1A). The other intratumoral cytokines and immune cells 292 tested were not significantly associated with overall survival (Figure 1A). The association of clinical 293 features (lymph node status, metastatic status, tumor grading) to overall survival confirmed 294 previous reports (Figure S1B).

295

β-cells within Langerhans islets are the source of CCL27 and its expression is correlated with a T_H1-type cytokine program

To elucidate whether the intratumoral expression of CCL27 relates to an immunity-driven antitumor signature within the tissue of PDA patients, we performed cytokine-cytokine correlation analyses. By that, we observed a characteristic T_H1 -type cytokine signature correlating to the intratumoral presence of CCL27 (Figure 2A and 2B).

302 Next, immunohistochemical and immunofluorescence stainings were performed on patient 303 samples to identify the origin of CCL27 production. A staining for CCL27 revealed that islet-like 304 structures within the tumor core are the main site of CCL27 expression (**Figure 2C**). This 305 observation prompted us to perform an immunofluorescence staining for the Langerhans islet 306 marker insulin and CCL27, which corroborated that CCL27 is mainly expressed by β -cells within 307 Langerhans islets (**Figure 2D**).

308

309 CCR10 is expressed on CD4⁺ FoxP3⁻ T cells and selective inhibition of CCR10 abrogates 310 the T_H1-type cytokine profile

Interaction of CCL27 with its only known receptor C-C chemokine receptor 10 (CCR10) is a key regulator for T-cell migration to the skin in inflammatory disorders²⁹. And since our data revealed that tumor infiltration by cytotoxic T cells is independently prognostic favorable, we hypothesized that CCL27 might have similar immunomodulatory capacities in PDA. To identify CCR10expressing cells in PDA, we performed systematic immunofluorescence stainings on patient samples for CCR10⁺ CD3⁺ T cells, CCR10⁺ CD4⁺ T cells, CCR10⁺ FoxP3⁺ T cells and CCR10⁺
CD8⁺ T cells. A strong co-positivity for CCR10 was observed on CD3⁺ and CD4⁺ T cells (Figure **3A)**. FoxP3⁺ and CD8⁺ T cells showed negligible expression of CCR10 (Figure 3A).

- 319 To assess whether blockade of CCR10 abolishes anti-tumor properties in the 320 microenvironment of PDA, we investigated the effect of a selective small molecule inhibitor of 321 CCR10 (BI-6901) in a patient-based organotypic tumor explant model²⁰ (Table S2) (Figure 3B). 322 Inhibition of CCR10 led to an abrogation of the T_H 1-type cytokine program by downregulating the 323 expression of IFN-v, IFN- α 2, TNF- α and TNF- β (Figure 3C). Other T_H1-supporting cytokines 324 (TRAIL, IL-12p40, IL-12p70, IL-2, IL-7, IL-10) showed the same alteration (Figure S3A). At the 325 cellular level no difference was observed in the quantity of CD163⁺ or CD4⁺ cells upon blockade 326 of CCR10 (Figure 3D). However, the two tissues with the highest absolute number of CD4+ 327 lymphocytes showed the clearest reduction in tumor-infiltrating cytotoxic T cells after CCR10 328 inhibition (Figure 3D).
- 329

Intratumoral Langerhans islet cells secrete CCL27 via STAT3 regulation and simultaneously downregulate insulin production

We aimed to determine the metabolic implications for immunomodulatory CCL27-producingLangerhans islets, which are primarily attributed to the endocrine regulation of glycemic control.

- 334 To evaluate clinically relevant metabolic features of Langerhans islets, we sought to compare the 335 preoperative glycemic status (type 2 diabetes mellitus (T2DM) or no T2DM) of PDA patients based 336 on their intratumoral CCL27 expression. This analysis unraveled that CCL27 expression is 337 significantly associated with the onset of T2DM in tumor patients (Figure 4A). Furthermore, the 338 marker combination of CCL27 and preoperative diagnosis of diabetes was shown to serve as a 339 potential parameter for favorable prognosis. However, T2DM is a complex disease with multiple 340 negative implications for human health and further investigation is needed to better understand 341 the role of different types of diabetes and the timepoint of disease onset (long-standing vs. new-342 onset T2DM) in the context of PDA (Figure 4B) (Table 2).
- 343 To more fully characterize the multifaceted role of Langerhans islets in PDA, we explored 344 their secretion and signaling profile after exerting tumoral stress on them (Figure 4C). The tumor 345 microenvironment for this analysis was mimicked by using the supernatant of PDA explants from 346 five different patients. We observed that tumoral stress led to an increased secretion of CCL27 347 matching our previous findings (Figure 4D). Simultaneously, the secretion of insulin and glucagon 348 was downregulated (Figure 4D). While on the other hand, the secretion of the incretin glucose-349 dependent insulinotropic polypeptide (GIP) as well as the production of the hormone resistin was 350 increased in Langerhans islet cells (Figure 4D). The same tendency (upregulation in 3 of 5 cases) 351 was seen for glucagon-like peptide 1 (GLP-1) (Figure S4A). However, evaluation of dynamic 352 changes in hormone concentrations is necessary to comprehensively understand these regulatory 353 mechanisms.

354 Molecular analyses based on protein phosphorylation patterns in these Langerhans islets 355 cells showed an activation of signal transducer and activator of transcription 3 (STAT3) and BCL2-356 associated agonist of cell death (BAD) upstream regulated by phosphatase and tensin homologue 357 (PTEN) and AKT (also known as protein kinase B or PKB). Simultaneously, the extracellular signal-358 regulated kinases 1 and 2 (ERK1/2) were dephosphorylated and thereby inactivated (Figure 4E 359 and S4B). Further, we corroborated the phosphorylation of STAT3 in intratumoral Langerhans 360 islets via immunofluorescence staining by comparing human PDA tissue and healthy pancreas 361 tissue (Figure 4F).

362

T2DM and dynamic of HbA1c levels are markers for response to neoadjuvant chemotherapy

To explore the relationship of tumoral CCL27 expression and treatment response to adjuvant chemotherapy (= number of adjuvant chemotherapy cycles), we performed a comparison analysis between tissues of patients with high tumoral CCL27 expression (CCL27^{hi}) and low tumoral CCL27 expression (CCL27^{io}). We discovered that CCL27 expression, also in a linear relationship, was significantly associated with the number of chemotherapy cycles (**Figure 5A**).

369 Since CCL27 secretion is linked to glycemic control, we hypothesized that diagnosis of 370 T2DM or glycated haemoglobin (HbA1c) levels may have the potential to identify patients who are 371 most likely to respond to chemotherapy. To investigate this, we screened a cohort of 2264 PDA 372 patients who were planned for pancreatoduodenectomy (Figure B). We identified 122 patients 373 who had undergone neoadjuvant chemotherapy with FOLFIRINOX prior to the planned surgery 374 and with extractable data on HbA1c levels before and after FOLFIRINOX (Table 3). The 375 retrospective analysis unveiled that diagnosis of T2DM was significantly associated with response 376 to neoadiuvant chemotherapy with FOLFIRINOX (Figure 5B). Moreover, decline of alvcemic 377 control (= increase of HbA1c levels) during neoadjuvant chemotherapy with FOLFIRINOX was 378 also significantly associated with treatment response. This observation was statistically significant 379 in PDA patients with and without T2DM (Figure S5A). In contrast, improved glycemic control (= 380 decrease of HbA1c levels) was significantly associated with unresponsiveness to neoadjuvant FOLFIRINOX (Figure 5 B). This was significant in patients without T2DM and the same trend was 381 382 seen for patients with T2DM (Figure S5A).

To confirm our concept that deterioration of glycemic control is accompanied by increased local CCL27 levels, we analyzed the tumor tissue of a patient who responded to neoadjuvant chemotherapy with FOLFIRINOX and had a rising HbA1c level (Figure 5C). This case validated our findings and demonstrated that not only did the HbA1c level increase, but also the local CCL27 concentration (Figure 5 C and S5B).

388 **DISCUSSION**

Induction of anti-tumor immunity by increasing the number of tumor-infiltrating T cells is an 389 390 unresolved challenge and limited T cell infiltration is a major reason for resistance to 391 immunotherapy in PDA. In the present report, we demonstrate a crucial role of endocrine 392 Langerhans islets in shaping anti-tumor immunity by undergoing a phenotype shift from glycemic 393 control to CCL27 production. Subsequently, CCL27 promotes a T_H1-type cytokine program in the 394 microenvironment, enhances tumoral T cell infiltration and improves survival of patients. To date, 395 CCL27 has primarily been described as a chemotactic mediator of T cell-dependent (skin) 396 inflammation and previous reports showed concordantly that CCL27 induces T cell attraction and 397 inflammation via CCR10⁺ CD4⁺ T lymphocytes whereas CD8⁺ T lymphocytes show negligible 398 levels of CCR10 on their cell surface^{29,30}. Our data corroborated these findings in the context of 399 PDA and demonstrated that the anti-tumor effect can be abrogated by inhibition of CCR10. In other 400 malignancies CCL27-CCR10 interaction has been suspected to promote lymph node metastases³¹ 401 and contribute to inflammation-driven hepatocarcinogenesis³². However, our results highlight that 402 CCL27-CCR10 interaction plays an opposite role in the microenvironment of PDA by potentially 403 turning it into an immunologically "hot" tumor with beneficial clinical outcomes. Also, our data 404 indicate that efficacy of effector T cell-attraction by CCL27 is dependent on the quantity of CCR10+ 405 $CD4^+$ T cells, in order to generate a sufficient T_H1-cytokine signal. This is line with existing 406 evidence, which showed that CD4⁺ T cells play a fundamental role in driving anti-tumor CD8⁺ T 407 cell responses and that their presence is associated with the number of CD8⁺ T cells in solid 408 tumors^{33,34}. The use of a fully human patient-derived model in our experiments allowed us to link 409 the clinical observations to functional molecular findings.

410 Another interesting aspect of our results is that endocrine Langerhans islet cells were identified as the primary source of CCL27 suggesting a critical involvement of the endocrine-411 412 exocrine axis in anti-tumor immunity. Primarily, Langerhans islets are attributed to the endocrine 413 regulation of glycemic control, which requires a precisely fine-tuned balance of multiple 414 glucoregulatory hormones. Glucose homeostasis is primarily regulated by a tug-of-war between 415 endocrine Langerhans islet hormones. Glucagon is secreted by α -cells and increases plasma 416 glucose levels, whereas insulin from β -cells decreases them. Furthermore, a variety of other 417 hormones are critically involved, such as the incretins GIP and GLP-1, which are secreted by α -418 cells and regulate blood glucose levels through potentiation of insulin secretion and inhibition of glucagon secretion³⁵⁻³⁹. In light of the existing evidence, our findings suggest that while 419 420 intratumoral β-cells secrete CCL27 which inhibits tumor progression, their metabolic function declines resulting in an insulin deficiency. This eventually leads to a compensatory upregulation 421 422 of intrainsular GIP and GLP-1 secretion, which fail to properly potentiate insulin expression but 423 inhibit glucagon secretion. This mechanism of endocrine-exocrine interaction also explains our 424 clinical observation that onset of T2DM in PDA patients is significantly associated with CCL27 425 expression of tumors. In addition, the observed lower insulin levels might further help to limit aberrant activation of oncogenic signaling pathways and may contribute to systemic antineoplastic
functions⁴⁰⁻⁴². Another factor potentially contributing to the loss of glycemic control in patients is
the upregulated resistin secretion. Resistin is secreted by adipocytes and Langerhans islets,
known as a key link between obesity and diabetes and leads to peripheral insulin resistance⁴³.

Further, the identification of STAT3 as activator of CCL27 production is in line with previous findings, which presented its common involvement in cytokine release by Langerhans islet cells⁴⁴. Interestingly, STAT3 also plays a critical role in inhibiting insulin secretion in mice^{45,46}, which corroborates our findings. And the observed phosphorylation and activation of anti-apoptotic BAD might contribute to preservation of this CCL27-releasing and insulin-inhibiting phenotype of Langerhans islets.

436 The interplay of T2DM to PDA is complex and, despite numerous studies, not 437 comprehensively understood. However, strong existing evidence demonstrated that (new-onset) 438 T2DM is likely to be a consequence of a tumor microenvironment consisting of progressively 439 growing PDA cells⁴⁷. We complement prior findings by showing that onset of T2DM is a potential 440 sign of functionally shifting Langerhans islets towards shaping anti-tumor immunity via CCL27 441 production as a defense mechanism against PDA. This observation also underscores the complex 442 and bilateral role of local immunity in PDA: While IL-1β-induced pancreatitis promotes PDA via 443 immunosuppression⁴⁸, development of T2DM promotes autoimmune anti-tumor responses via 444 CCL27. Further, the interconnection of alvcemic control and PDA prompted us to investigate 445 metabolic parameters as markers for response to neoadjuvant chemotherapy with FOLFIRINOX. 446 Historically, the combination therapies FOLFIRINOX and gemcitabine with nab-paclitaxel 447 significantly increased survival of patients^{49,50}. While FOLFIRINOX is more effective than 448 gemcitabine, the regimen also causes more side effects and significantly reduces guality of life of 449 patients. However, response to chemotherapy varies, with only one third of patients responding to 450 a specific regimen⁵¹. Given the fact that patients with unresponsiveness to neoadjuvant 451 chemotherapy and irresectable PDA have a median life expectancy of less than a year preventing 452 FOLFIRINOX-induced toxicity is an urgent clinical need. FOLFIRINOX is known to induce an anti-453 tumor immune infiltrate in the pancreatic tumor microenvironment, which is characterized by 454 increased cell densities of CD8⁺ and CD4⁺ T lymphocytes as well as decreased numbers of FoxP3⁺ 455 and CD163⁺ cells⁵²⁻⁵⁴. We hypothesize that this local immune reaction is the reason for our 456 observation of elevated HbA1c levels and increased CCL27 secretion after exposure to 457 FOLFIRINOX, similarly to the production of inflammatory signals as an Langerhans islet response to various local inflammatory factors during development of diabetes^{14,55,56}. Our findings highlight 458 459 that the presence of T2DM before the start of neoadjuvant chemotherapy as well as the dynamic 460 of HbA1c levels during the treatment are markers for response to FOLFIRINOX. In line with this, 461 another independent clinical investigation demonstrated that elevated HbA1c levels can be utilized 462 as a marker for stratifying patients most likely to respond to FOLFIRINOX⁵¹.

In conclusion, our findings describe a novel mechanism of anti-tumor action in PDA
 unravelling an unexpected role for endocrine Langerhans islets with implications for the clinical
 13

465 management of PDA. Repurposing metabolic parameters has the potential to serve as a tool for

466 clinical decision-making. However, prospective clinical trials are needed to further investigate

467 these applications. Also, CCL27-CCR10 interaction could serve as a stratification parameter for

468 immunotherapeutic strategies.

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- 474

475 **CONTRIBUTORS**

- 476 Conceptualization, A.A. and N.H.; Methodology, A.A., S.K., M.S. and N.H.; Formal Analysis, A.A.,
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486 **COMPETING INTERESTS**

- 487 None declared.
- 488

489 ETHICS APPROVAL

- 490 Ethics Committee of the University of Heidelberg.
- 491

492 DATA AVAILABILITY STATEMENT

493 All data are available upon request. All data relevant to the study are included in the article or

494 uploaded as supplementary information.

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TABLES

Table 1. Subject characteristics

		CCL27 ^{hi}	CCL27 ^{lo}	CCL27 ^{hi}	CCL27 ^{lo}	P-value
		CD8 ^{hi}	CD8 ^{hi}	CD8 ^{lo}	CD8 ^{lo}	
Total number of patients (n)		16	9	9	16	
Female / Male (n / n)		11 / 5	3/6	5/4	5 / 11	0.143
Age	Mean (years)	67.8±0.6	68.6±1.3	63.8±0.9	61.8±0.7	
	> / ≤ Average age ^a	44 / 5	E / A	A / E	0 / 0	0.624
	(n / n)	11/5	5/4	4/5	8/8	0.634
BMI ^b	Mean (kg/m²)	25.5±0.2	23.3±0.4	22.9±0.4	24.7±0.2	
	>/≤ Average BMI ^c	0/4	0 / 0	0 / 0	F / O	0.000
	(n / n)	9/4	2/3	2/6	5/8	0.236
Т	T3 (n)	16	9	9	15	1 000
	T4 (n)	0	0	0	1	1.000
Ν	N0 (n)	3	2	2	1	0.689
	N1 (n)	13	7	7	15	0.009
М	M0 (n)	15	9	8	15	1 000
	M1 (n)	1	0	1	1	1.000
Grade	G2 (n)	10	8	3	10	0 184
	G3 (n)	6	1	5	6	0.104
R ^d	R0 (n)	4	1	0	1	0.220
	R1 (n)	12	8	9	15	0.339
Gemcitabine-based		15	5	6	0	
chemotherapy (n) ^e		15	5	0	9	
Diabetes prior to surgery		8/1	3/4	2/4	3 / 10	0.018
(yes (n) / no (n)) ^f		0/1	0/ 4	2/7	0/10	0.010
Overall survival (days)		919±41	596±39	606±43	319±13	

Data are shown as $mean \pm SEM$.

Fisher's exact test was used to compare patients of the different groups.

T= stage of primary tumor, N= regional lymph node status, M= distant metastasis status, R= resection margin status, BMI= Body-Mass-Index.

^a Average age in all patients is 65.3 years.

^b Information available on BMI from 39 patients.

^c Average BMI in all patients is 24.43 kg/m².

^d Information available on resection margin status from 50 patients.

^e Standard treatment in the study period was upfront resection and gemcitabine-based adjuvant chemotherapy. Information available on confirmed application of gemcitabine from 35 patients.

^f Information available on glycemic status (according to HbA1c levels or medical history) from 35 patients.

		CCL27 ^{hi}	CCL27 ^{hi}	CCL27 ^{lo}	CCL27 ^{lo}	P-value
		Diabetes	No diabetes	Diabetes	No diabetes	
Total number of patients (n)		10	5	6	14	
Female / Male (n / n)		8 / 2	3/2	1 / 5	4 / 10	0.033
Age	Mean (years)	68.9±0.9	62.2±1.7	65.7±1.7	61.8±0.9	
	>/≤ Average age ^a					
	(n / n)	8/2	2/3	3/3	7/7	0.353
BMI ^b	Mean (kg/m²)	25.7±0.5	21.8±0.7	23.1±0.5	24.7±0.2	
	>/≤ Average BMI ^c	6/0	1 / 1	1 / 1	6 / 4	0 152
	(n / n)	0/2	1/4	1/4	0/4	0.155
Т	T3 (n)	10	5	6	13	1 000
	T4 (n)	0	0	0	1	1.000
Ν	N0 (n)	3	0	0	2	0 502
	N1 (n)	7	5	6	12	0.505
Μ	M0 (n)	10	5	6	13	1 000
	M1 (n)	0	0	0	1	1.000
Grade	G2 (n)	6	2	5	9	0.502
	G3 (n)	4	3	1	5	0.592
R ^d	R0 (n)	2	0	0	2	0 721
	R1 (n)	8	5	6	11	0.731
HbA1c	Mean (%)	7.0±0.08	5.8±0.06	7.5±0.20	5.4±0.04	
level ^e	>/≤ Average					
	HbA1c ^f (n / n)	9/1	1/4	6/0	0 / 13	< 0.0001
Gemcitabine-based		10	4	3	10	
chemothe	rapy (n) ^g					
Overall survival (days)		849±52	843±106	450±60	370±17	

Table 2. Subject characteristics

Data are shown as mean ± SEM.

Fisher's exact test was used to compare patients of the different groups.

T= stage of primary tumor, N= regional lymph node status, M= distant metastasis status, R= resection margin status, BMI= Body-Mass-Index.

^a Average age in all patients is 64.5 years.

^b Information available on BMI from 28 patients.

^c Average BMI in all patients is 24.18 kg/m².

^d Information available on resection margin status from 34 patients.

^e Information available on HbA1c level from 34 patients.

^f Average HbA1c level in all patients is 6.3 %.

^{*g*} Standard treatment in the study period was upfront resection and gemcitabine-based adjuvant chemotherapy. Information available on confirmed application of gemcitabine from 27 patients.

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		Response to		No response to		
		FOLFI	RINOX	FOLFIRINOX		
		T2DM	No T2DM	T2DM	No T2DM	
Total number of patients (n)		38	37	11	36	
Female / Male (n / n)		20 / 18	20 / 17	3 / 8	10 / 26	
Age (years)		62.1±1.3	58.8±1.6	65.9±2.0	59.6±2.1	
Т	T1 (n)	8	12			
	T2 (n)	13	16			
	T3 (n)	14	7			
	T4 (n)	3	2			
Ν	N0 (n)	16	20			
	N1 (n)	15	9	Irrese (no histo	ectable pathology)	
	N2 (n)	7	8			
М	M0 (n)	34	33			
	M1 (n)	4	4			
R	R0 (n)	29	27			
	R1 (n)	9	10			

Table 3. Subject characteristics

Data are shown as mean ± SEM.

T= stage of primary tumor, N= regional lymph node status, M= distant metastasis status, R= resection margin status.

FOLFIRINOX= fluorouracil, leucovorin, irinotecan and oxaliplatin

T2DM= type 2 diabetes mellitus



Figure 1 Intratumoral CCL27 expression is associated with improved overall survival **(A)** Volcano plot of statistical significance (y-axis) against log2(Hazard Ratio) (x-axis) for cytokines (left) and immune cells (right) showing favorable and poor prognostic markers.

(B) Kaplan-Meier survival plots of patients with high (hi) versus low (lo) concentration of CCL27 (n=25/n=25), hi versus lo density of CD8+ T cells (n=25/n=26), hi versus lo CD8+/CD168+ ratio (n=25/n=26) and the combination of CCL27 (hi or lo) and CD8+ T cells (hi or lo). The median cutpoints were determined to stratify patients into hi and lo.

Survival data were analyzed using the log-rank test.

See also Figure S1.



Figure 2 β -cells within Langerhans islets are the source of CCL27 and its expression is correlated with a TH1-type cytokine program

(A) Heatmap showing the intratumoral cytokine-cytokine correlation from human PDA tissue samples (n=48). TH1-type cytokines are indicated in blue.

(B) Network plot of intratumoral cytokine-cytokine correlations of TH1-type cytokines in human PDA tissue samples (n=48). The edge weights of the network are based on the Pearson correlation coefficient between cytokine-cytokine ($r \ge 0$, p < 0.05).

(C) Immunohistochemistry for CCL27 in a human PDA tissue sample. Scale bars, 100 µm.

(D) Immunofluorescence for CCL27 and insulin (β -cell marker) in a human PDA tissue sample. Scale bars, 100 μ m

PDA= pancreatic ductal adenocarcinoma



Figure 3 CCR10 is expressed on CD4+ FoxP3- T cells and selective inhibition of CCR10 abrogates the TH1-type cytokine profile

(A) Immunofluorescence of serial human PDA tissue samples as indicated. Scale bars, 100 µm.

(B) Schematic overview of workflow as indicated.

(C) Cytokine alterations within the explant model after 24 hr using human PDA tissue samples. Data from five different patients is presented before and after treatment with the small molecule inhibitor of CCR10 (Anti-CCR10).

(D) Alteration of the intratumoral CD4+, CD8+ and CD163+ immune cell infiltration within the explant model using human PDA tissue samples. Data from seven different patients is presented before and after treatment with the small molecule inhibitor of CCR10 (Anti-CCR10). The two tissues with the highest absolute number of intratumoral CD4+ cells are indicated in green.

PDA= pancreatic ductal adenocarcinoma See also Figure S3.

Figure 4



F	DAPI	Phospho-STAT3 (Ser727)	Insulin	Merged
Langerhans islets in PDA tissue				
Langerhans islets in healthy pancreas		· ·	*	* . *

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Figure 4 Intratumoral Langerhans islet cells secrete CCL27 via STAT3 regulation and simultaneously downregulate insulin production

(A) Pie charts showing the distribution of PDA patients with diagnosis of diabetes prior to surgery. The patients were stratified into CCL27 high (hi) (n=15) and CCL27 low (lo) (n=20) group based on their intratumoral CCL27 concentration.

(B) Kaplan-Meier survival plot of patients based on combination of CCL27 (hi or lo) and T2DM (yes or no). The patients were stratified into CCL27 hi and CCL27 lo group based on their intratumoral CCL27 concentration. The data were analyzed using the log-rank test.

(C) Schematic overview of workflow as indicated.

(D) Alteration of indicated protein concentration expressed by human Langerhans islet cells after 48 hr culture in the supernatant of five different human PDA explants (representing five different human pancreatic tumor microenvironments). The expression profile was compared to human Langerhans islet cells cultured in control media for 48 hr.

(E) Schematic signaling effects of Langerhans islets cells in a pancreatic tumor microenvironment. Grey molecules are inactive and colored molecules are active.

(F) Immunofluorescence of human PDA tissue and healthy pancreas tissue as indicated. Arrows indicate Langerhans islets. Scale bars, 500 μ m.

T2DM= type 2 diabetes mellitus

PDA= pancreatic ductal adenocarcinoma

*p≤0.05.

See also Figure S4.



Figure 5 T2DM and dynamic of HbA1c levels are markers for response to neoadjuvant chemotherapy

(A) Comparison between CCL27 high (hi) and CCL27 low (lo) group based on the number of chemotherapy cycles. Standard treatment regimen was FOLFIRINOX as neoadjuvant chemotherapy. The patients were stratified into CCL27 hi and CCL27 lo group based on their intratumoral CCL27 concentration (left). Correlation analysis showing the association of CCL27 concentrations with number of chemotherapy cycles. The analysis was performed using the Kendall rank correlation (right).

(B) Retrospective analysis performed on a total of 2264 patients. HbA1c levels (before and after FOLFIRINOX) were available from 122 patients who were treated with neoadjuvant chemotherapy. The pie charts are showing the distribution of PDA patients with diagnosis of T2DM at the beginning of neoadjuvant chemotherapy with FOLFIRINOX. The patients were stratified into Response to FOLFIRINOX (n=75) and No response to FOLFIRINOX (n=47). Comparison of HbA1c levels before and after FOLFIRINOX treatment in responders and non-responders. The course of HbA1c levels of individual patients are described as indicated (blue=increase, red=decrease, black=no change).

(C) Timeline describing the case of a patient as indicated.

*p≤0.05, **p≤0.005, ***p≤0.0001.

a All PDA patients planned for pancreatoduodenectomy from 2016-2020 in the University Hospital Heidelberg were included.

b Response to FOLFIRINOX was assumed when the tumor was resectable. No response to FOLFIRNOX was assumed when the tumor remained irresectable.

Data are represented as mean ± SEM and compared by two-sided Student's t test.

PDA= pancreatic ductal adenocarcinoma

T2DM= type 2 diabetes mellitus

FOLFIRINOX= fluorouracil, leucovorin, irinotecan and oxaliplatin

See also Figure S5.