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Defining human mesenchymal and epithelial heterogeneity in response to oral inflammatory disease — Source link ☑

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1	Defining human mesenchymal and epithelial heterogeneity in response to oral
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31 Abstract

Human oral soft tissues provide the first barrier of defence against chronic 32 33 inflammatory disease and hold a remarkable scarless wounding phenotype. Tissue 34 homeostasis requires coordinated actions of epithelial, mesenchymal and immune 35 cells. However, the extent of heterogeneity within the human oral mucosa and how tissue cell types are affected during the course of disease progression is unknown. 36 37 Using single cell transcriptome profiling we reveal a striking remodelling of the 38 epithelial and mesenchymal niches with a decrease in functional populations that are 39 linked to the aetiology of the disease. Analysis of ligand-receptor interaction pairs identify potential intercellular hubs driving the inflammatory component of the disease. 40 Our work establishes a reference map of the human oral mucosa in health and 41 42 disease, and a framework for the development of new therapeutic strategies.

43 44

45 Key words:

46 human oral mucosa, periodontitis, oral mesenchymal cells, oral epithelial cells

48 Introduction

The oral mucosa is one of the most rapidly dividing tissues in the body and provides 49 50 the first line of defence against the development of oral disease. Gingiva is the oral 51 mucosa that surrounds the cervical portion of the teeth, and consists of a keratinised 52 stratified squamous epithelium and an underlying connective tissue containing multiple cell types that collectively orchestrate tissue homeostasis during health and 53 54 in response to mechanical and microbial challenges (Lindhe et al., 2008, Cekici et al., 2014). Periodontal disease is a chronic inflammatory condition associated with a 55 56 dysbiosis of the commensal oral microbiota and host immune defences causing 57 irreversible destruction of the soft and hard supporting tissues of the teeth (Pihlstrom et al., 2005, Lindhe et al., 2008). Gingivitis is a mild and reversible inflammation of the 58 59 gingiva that does not permanently compromise the integrity of the tissues supporting 60 the teeth. Chronic periodontitis occurs when untreated gingivitis progresses to the loss 61 of the gingiva, bone and ligament (Lamont and Hajishengallis, 2015, Pihlstrom et al., 62 2005, Lindhe et al., 2008). Regenerating lost tissues remains the fundamental 63 therapeutic goal and to achieve this it is necessary to understand the mechanisms and pathways controlling disease progression while identifying novel candidates for 64 intervention. 65

Most studies on the pathogenesis of periodontal disease have largely focused on characterising the microbial biofilm and host immune response (Hajishengallis, 2014, Yucel-Lindberg and Bage, 2013). However, it is recognised that tissue resident cells play an instrumental role in innate immunity, immune regulation, and epithelial barrier maintenance (Krausgruber et al., 2020). Additionally, individual molecules known to play important roles in disease pathogenesis and the cell types they originate from remain ill-defined (Yucel-Lindberg and Bage, 2013).

73 Here we set out to unbiasedly profile human gingiva, including epithelial, 74 mesenchymal and immune compartments using single cell RNA sequencing. To better 75 characterise the dynamics of disease progression we used samples isolated from 76 healthy and diseased patients. Our single-cell analysis identified differences in the 77 composition of cellular sub populations residing within the gingival tissues and 78 changes in the transcriptional fingerprint between healthy and diseased patient 79 samples. We showed that these changes correlate with progressive diseased states. Despite the growing recognition that mesenchymal (stromal) cells maintain epithelial 80 81 barrier integrity and immune homeostasis in several organs (Kabiri et al., 2014, 82 Nowarski et al., 2017, Bernardo and Fibbe, 2013), the identity of gingiva-specific 83 mesenchymal subtypes and the molecular attributes that regulate niche maintenance 84 or disease remodelling have not been described. Significantly, we identified specific 85 changes in mesenchymal cell populations indicative of playing a role in disease progression. 86

Intercellular network reconstruction in healthy and diseased states revealed loss of cell communication and increased immune interactions between the identified cell types. We provide novel insights into altered communication patterns between epithelial and mesenchymal cells caused by the inflammatory response.

Taken together, our data characterise the cellular landscape and intercellular interactions of the human gingiva, which enables the discovery of previously unreported cell populations contributing to oral chronic disease. Understanding the crucial roles of individual cell states during disease progression will contribute to the development of targeted cell-based approaches to promote regeneration or reduce inflammation-associated tissue dysfunction.

97

98 **Results**

99 Generation of the gingival transcriptional landscape in health and periodontitis.

100 Similar to other tissues in the gastrointestinal tract, the oral mucosa is a good model 101 for studying a rapidly renewing tissue. To provide an in-depth analysis of cellular 102 architecture, cell heterogeneity and understand gingival cell dynamics when 103 transitioning from health to disease, we transcriptionally profiled single cells derived 104 from patients. We obtained freshly resected human gingival tissue and isolated live 105 cells (Figure S5) to be sequenced on the 10x Genomics Chromium platform for single 106 cell RNA-seg (scRNA-seg) (Figure 1A). A total of 12,411cells were captured across 107 four patient biopsies, allowing us to perform an in-depth analysis of single-cell 108 transcriptomics. In order to ascertain the extent of likely human variation between 109 datasets we first compared data from two healthy patients. Cells from these healthy 110 patients were remarkably similar (Figure S1) and we observed a strong linear 111 relationship in gene signatures between the two patient samples (Figure S1). Having 112 established a high concordance of datasets obtained from two biopsies of healthy 113 gingiva and to amplify the power of the study, these were merged and handled 114 together for the subsequent analysis.

115 Carrying out a comparative bioinformatic analysis of samples obtained from healthy 116 and periodontitis patients revealed a diversity in epithelial, stromal, endothelial and 117 immune cells. A total of 16 distinct transcriptomic signatures were detected that 118 corresponded to cell types or sub-populations of identifiable cell states. These were 119 visualised using UMAP (Figure 1B).

In the epithelial compartment, we identified 3 subsets (clusters 1, 8 and 12), potentially
 corresponding to distinct differentiation stages. Cluster 1 shows a basal cell state with
 expression of *HOPX*, *IGBP5* and *LAMB3*; and cluster 8 a more mature cell state with

expression of *KRT1*, *KRT8*, *LAT* (Linker for Activation of T cells) and *PTGER* both required for TCR (T-cell antigen receptor) signalling (Figure 1B, C; Figure S2).

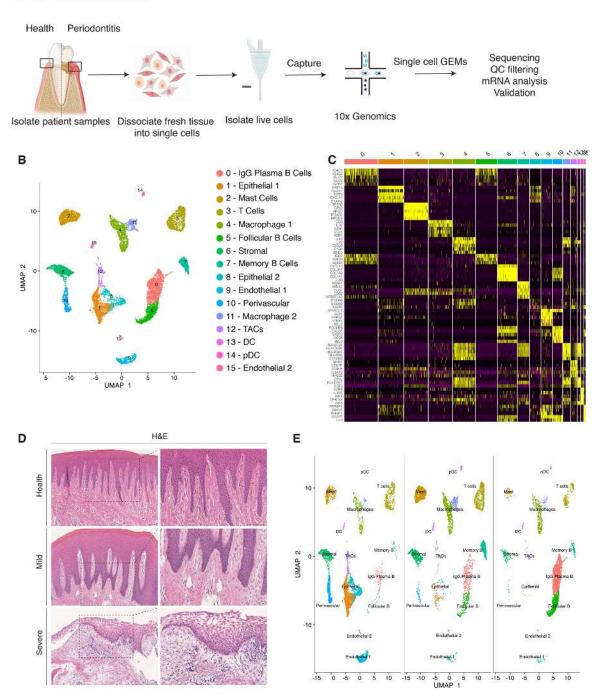
125 Proliferating basal cells were identified in cluster 12 by expression of canonical marker 126 genes of proliferating cells such as MKI67 and TOP2A (Whitfield et al., 2006) (Figure 1B, C; Figure S2). We also identify a mesenchymal (stromal-fibroblast) (cluster 6) 127 based on collagen expression; 1 perivascular (cluster 10) by high expression of 128 129 PDGFRB and RGS5 (Figure 1B, C; Figure S2); 2 endothelial (clusters 9 and 15) in 130 which cluster 9 specifically expresses CLDN5 and EMCN and cluster 15 shows high 131 expression of genes involved in the regulation of angiogenesis such as KDR, TIE1 132 and SOX18 (Jones et al., 2001, Francois et al., 2008) (Figure 1B, C; Figure S2).

133 We identified immune clusters of the myeloid (macrophages and dendritic cells) and 134 lymphoid (T and B cells) lineages. B cells are shown in 3 distinct populations (clusters 135 0, 5 and 7) with clusters 0 and 5 expressing MZB1, DERL3 and IGHG4 characteristic of follicular and IgG plasma B cells respectively, and cluster 7 expressing MS4A1 and 136 137 CD37 corresponding to memory B cells (Akkaya et al., 2020, James et al., 2020) 138 (Figure 1B, C; Figure S2). T cells are shown in cluster 3 identified by expression of 139 canonical TRM marker CXCR6. Dendritic cells of myeloid origin with high expression 140 of CLEC9A and IRF8 are found in clusters 13 and 14 (Eisenbarth, 2019, James et al., 141 2020), and mast cells are indicated in cluster 2 expressing TPSB2 and TPSB1 142 (Abraham and St John, 2010) (Figure 1B, C; Figure S2). Macrophages are found in 143 two populations (clusters 4 and 11) sharing high expression of LYZ and AIF1 144 (Chakarov et al., 2019) (Figure 1B, C; Figure S2).

145 Together, these data provide the first detailed molecular insight into gingival cell146 populations supported by known and novel markers.

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A Experimental approach



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149 Figure 1. Single-cell Atlas of Gingiva Biopsies from Healthy Individuals and Periodontitis 150 Patients. (A) Overview of the experimental workflow. All samples were processed immediately after 151 clinical surgery. (B) scRNA-seq data obtained from healthy and periodontitis cells (n= 12,411) from four 152 donors illustrated by UMAP coloured by cell-type annotation. (C) Heatmap of the mean expression of 153 the most differentially expressed marker genes for each cluster identified. (D) Haematoxylin and eosin 154 staining of gingival sections from healthy, mild and severe patient samples showing increasing changes 155 in tissue architecture with loss of epithelial rete ridges definition and infiltration of leukocytes. (E) 156 Changes in tissue composition in periodontitis showing UMAP of progressive diseased states from 157 healthy, mild, and severely diseased donors.

159 Transcriptional comparison of healthy and periodontitis reveals progressive

160 diseased states

During disease progression there is a distinct signature of clinical phenotypes including redness, swelling, bleeding, destruction of periodontal ligament and bone and gingival recession (Kinane, 2001). These clinical manifestations are due to the dysregulation of a number of cell types which include epithelial, stromal, immune and the associate cross-talk between them. (Pihlstrom et al., 2005).

Histologically, the diseased samples showed different levels of severity. Therefore, in our analysis we staged the samples as healthy, mild and severe. (Figure 1D). In the mildly affected sample, we observed an intact keratinised squamous epithelial layer, minor losses of collagen and rete-ridge definition. In contrast, in the severe state we detected a dense infiltrate of lymphocytes, breakdown of the epithelial barrier and clear reduction of collagen content (Figure 1D).

To investigate the transitions between health and mild to severe periodontitis, we determined the contribution of cells sampled from each condition to the main cell classes, and investigated whether their respective subpopulations were maintained, amplified or depleted across the conditions.

At a transcriptomic level, the cellular landscape is dominated by a corresponding shift in cellular proportions (Figure 1E). In health, we observed low numbers of follicular and plasma B cells and a progressive increase from mild to severe (Figure 1E). The minimal presence of B cells in healthy gingiva was also reported by others (Dutzan et al., 2016, Mahanonda et al., 2016, Artese et al., 2011). Memory B cells show a distinctive increase at disease onset with a subsequent decrease in the severe sample (Figure 1E). 183 Similarly, there was a surge in T cells in mild disease followed by a decrease in severe. While there has been some characterisation of immune cell subsets in health and 184 185 periodontitis (Dutzan et al., 2016), the timing of their involvement is still unclear. Our 186 study addresses this to some extent by showing that these populations may be abundant at disease onset and then gradually decrease as disease progresses. T cell 187 188 senescence as a result of persistent immune activation in chronic diseases has been 189 previously reported (Effros and Pawelec, 1997, Vallejo et al., 2004). A decrease in the 190 severe stage might suggest that the persistent immune activation characteristic of 191 chronic inflammation may lead to T cell senescence, and consequently to the inability 192 to reduce local inflammatory responses contributing to disease persistence. 193 Additionally, we also identified a dynamic shift in the two macrophage populations with 194 an expansion at disease onset consistent with their function in tissue clearing and a 195 subsequent reduction at the severe stage (Figure 1E). There is no clear difference in 196 the dendritic cell compartment during disease progression. Mast cells also show a 197 significant enrichment at disease onset and a decrease in the severe state. These 198 results deliver the first unbiased immune characterisation of the gingiva across 199 disease states (Figure 1E).

In addition to infiltrating immune cells driving the inflammatory process, mesenchymal
and epithelial gingival cells in the gingiva are also affected during the progression and
persistence of the disease (Yucel-Lindberg and Bage, 2013). We observed a
progressive depletion of both mesenchymal and epithelial cell populations (Figure 1E),
in line with the patient matched immunohistochemical studies.

Together these results provide with the first comprehensive platform to compare
dynamic changes of gingival cell populations during disease development.

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208 Cellular and molecular map of the stromal gingival compartment in health and 209 disease identifies subpopulations with potential roles in disease progression 210 Tissue mesenchymal cells play essential roles in epithelial homeostasis, matrix 211 remodelling, immunity and inflammation (Kinchen et al., 2018, Nowarski et al., 2017). 212 Their function in the regulation of acute and chronic inflammation in peripheral organs 213 is now well established (Fiocchi et al., 2006, Kinchen et al., 2018, Croft et al., 2019). 214 Despite the growing recognition that the mesenchyme acts as a critical regulator in 215 disease persistence by producing cytokines, chemokines, proteolytic enzymes and 216 prostaglandins (Yucel-Lindberg and Bage, 2013), the identity of gingiva-specific 217 mesenchymal subtypes and the molecular attributes that regulate niche maintenance 218 in disease have not been described. To better visualise the difference in cellular 219 heterogeneity of gingival stromal cells in health and disease, we performed re-220 clustering analysis of collagen expressing cells to identify any possible sub-clusters with a distinct transcriptional signature. 221

222 These data revealed five fibroblast-like populations, one pericyte and one 223 myofibroblast (Figure 2A). Myofibroblasts were identified by expression of ACTA2 and 224 by gene ontology (GO) terms such as "muscle contraction" and "smooth muscle 225 contraction". Pericytes were identified by PDGFRB and MCAM expression and GO 226 terms such as "regulation of angiogenesis" (Figure 2 C, D). S0, S2 and S4 fibroblast-227 like subpopulations showed enrichment for genes annotated with "extracellular 228 matrix"-related GO terms. Interestingly, one of the fibroblast-like populations (S0) GO 229 enrichment included "upregulation of fibroblast proliferation" with marked expression 230 of PDGFRA, WNT5A and IGF1. It also shows upregulation of POSTN which is 231 essential for tissue repair (Kuhn et al., 2007). Another fibroblast-like population (S2) 232 showed enrichment for genes involved in the negative regulation of Wnt signalling

233 (GREM1, SFRP1, APCDD1 and DKK3); S4 showed expression of OSR2, FGFR1, SOX4 and TBX3 known to be involved in skeletal development. Additionally, S4 also 234 235 differed in the expression of a specific form of collagen, collagen IV, which is known 236 to be a key component of the epithelial basement membrane and might suggest a role 237 in epithelial barrier membrane as previously described (Kinchen et al., 2018). Finally, 238 S5 and S6 show a potential role in immune regulation with enrichment for "cytokine-239 mediated signalling pathway", "IFN-γ signalling" and "T cell activation" (Supplemental 240 Figure 3; Supplemental Table 2). Highly ranked S5 markers included *ILR1*, IFNγR1 241 and a member of the TNF-receptor superfamily – *TNFRS11B* (osteoprotegerin) which 242 is a negative regulator of bone resorption and thus a key regulator of osteoclast activity 243 (Zaidi, 2007).

244 To uncover the role of the newly identified mesenchymal subsets in periodontitis, we 245 investigated changes in their contribution across diseased states. Most significantly, we identified a marked decreased in the myofibroblast (S1) and pericyte (S3) 246 247 subpopulations at disease onset (mild), while the other fibroblast-like cells appeared 248 unchanged with the exception of S6 (Figure 2B). This suggests loss of S1 and S3 cells 249 was the most pronounced change from healthy tissue to mild disease. We further 250 explored the nature of the pro-inflammatory cluster S6 and it included the expression 251 of the major histocompatibility complex (MHC) class II invariant chain (CD74) and 252 AREG (amphiregulin). Amphiregulin is a reparative cytokine previously described with 253 a role in gingival immune homeostasis (Krishnan et al., 2018). These results identified 254 the potential expansion of a novel stromal population enriched for pro-inflammatory 255 genes in periodontitis.

Next, we investigated whether we could detect these changes usingimmunofluorescence analysis in gingival tissue samples. We confirmed a progressive

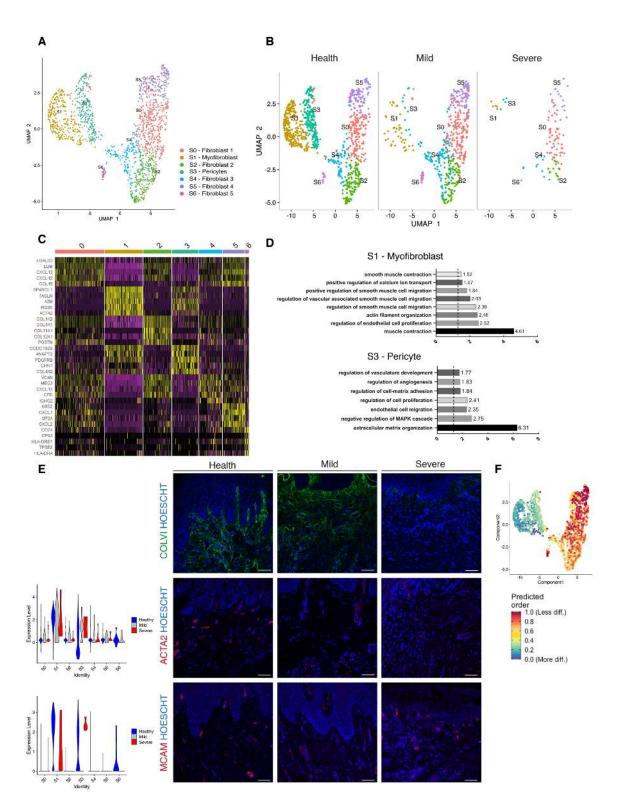
decrease in collagen VI levels suggesting overwhelming changes in the ECM composition and deposition (Figure 2E). We also assessed the myofibroblast and pericyte populations by looking at expression of *ACTA2* and *MCAM* respectively (Figure 2E).

262 Understanding the pathways underlying stromal differentiation will be essential to understand tissue homeostasis in chronic diseases. Given the lack of markers to 263 264 reconstruct a cellular trajectory and the knowledge that the number of expressed 265 genes per cells is a hallmark of developmental potential (Teschendorff and Enver, 266 2017, Han et al., 2020), we used transcriptional diversity to predict candidate stromal 267 precursors (Gulati et al., 2020) (Figure 2F). This analysis placed sub-clusters S5 and 268 S0 as the less differentiated subpopulations, and S1 and S3 (myofibroblasts and 269 pericytes) as fully differentiated states (Figure 3F). Using this pipeline, we identified 270 genes such as IGHBP4 and AEBP1 in the less differentiated states.

Overall, we demonstrate that stromal remodelling in periodontitis is heterogenous with a disruption in cell populations known to be involved in tissue repair, and a higher proportion in a pro-inflammatory cell population that could prevent disease resolution. Collectively, these observations suggest that stromal cells shape a permissive inflammatory niche.

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Figure 2. Cellular and molecular map of the stromal gingival compartment in health and disease
 identifies subpopulations with potential role in disease progression. (A) UMAP plot of gingival
 stromal cells. Single cells coloured by cluster annotation. (B) UMAP plot of stromal cells during disease
 progression. (C) Heatmap showing subset-specific markers. (D) GO enrichment terms for S1
 (myofibroblast) and S3 (pericyte). -log adjusted p-value shown (dotted line corresponds to FDR = 0.05).
 (E) Immunofluorescence staining showing COLVI, ACTA2, MCAM expression throughout disease
 progression. Scale bars, 100 μm. n= 3 patient samples/condition. Violin plots showing ACTA2 and

287 288 289 290	MCAM expression across clusters and conditions. (F) UMAP annotated with CytoTRACE analysis to predict stromal stem populations. Transcriptional diversity is used here to predict maturation states.
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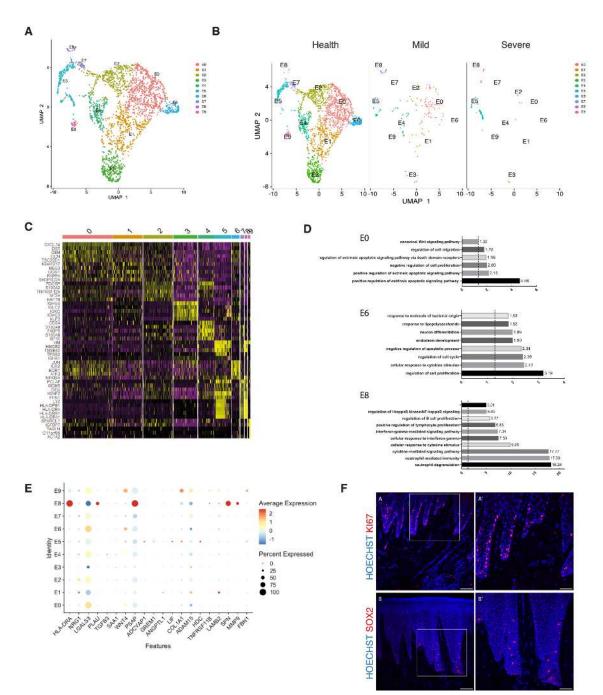
313 Cellular and molecular map of the epithelial gingival compartment in health and

314 disease

315 The oral epithelium is one of the fastest renewing tissues in the human body and 316 shows a remarkable regenerative potential. Cell division in epithelial cells takes place 317 in the basal layer which contains the stem cell compartment. After dividing, the 318 committed cells undergo differentiation that leads to expression of structural keratins 319 as cells move superficially (Blanpain and Fuchs, 2009). Recent work has started to 320 elucidate epithelial heterogeneity in the basal layer using mouse models (Jones et al., 321 2019, Byrd et al., 2019). However, little is known about human gingival epithelial cell 322 heterogeneity and its role in disease. Thus, we further explored the single-cell transcriptomes of epithelial clusters (1, 8 and 12). 323

324 By re-clustering the epithelial cells, we identified ten populations (Figure 3A). Two 325 basal cell populations were identified in E0 and E1. E0 shows expression of HOPX 326 which marks known stem cells in the intestinal and skin epithelia (Takeda et al., 2013, 327 Takeda et al., 2011) and *IGFBP5* which is enriched in transit-amplifying cells (TACs) 328 in the interfollicular epidermis (Tumbar et al., 2004) and recently shown through 329 lineage-tracing to label oral epithelial stem cells in the hard palate (Byrd et al., 2019). 330 E1 indicated a more mature basal cell state with expression of *DDR1* known as a cell 331 surface receptor for fibrillar collagen, and COL17A1. Cycling basal cells were identified 332 in E5 by expression of MKI67 and AURKB. E2 showed enrichment for SAA1 and 333 TNFRSF21 both involved in chronic inflammatory conditions. E3 showed enrichment 334 for B cell receptor signalling pathway, and E4 and E8 for neutrophil mediated 335 immunity. We further identified E6 and E7 with a role in cell cycle regulation. Finally, 336 E9 had a gene expression profile consistent with a role in ECM organisation and angiogenesis (Figure 3A, D; Figure S4). 337

Next, we investigated changes in epithelial cell composition and gene expression through the different disease states (Figure 3B). At disease onset (mild), we observed a depletion in E6 and E7 populations which show enrichment in genes involved in cell cycle regulation; and in E9 which is involved in ECM organisation. Cycling cells (E5) show a decrease in mild, and a subsequent increase in severe (Figure 3B). We detected an increase in E8 defined in GO terms by "cytokine mediated signalling" (Figure 3 B, D). Next, we asked which epithelial signals are predicted to modulate the identified stem cell signature found in E0 in disease. Using NicheNet (Browaeys et al., 2020) we identified sub-cluster E8 as the main signalling source predicted to modulate E0 through the expression of several ligands including MMP9, SPN and HLA-DRA (Figure 3E). While more work is necessary to understand the functional role of the E8 subpopulation, targeting this subpopulation in future immune-modulatory experiments may lead to important findings.



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366 Figure 3. Cellular and molecular map of the epithelial gingival compartment in health and 367 disease. (A) UMAP plot of human gingival epithelial cells. Single cells coloured by cluster annotation. 368 (B) UMAP plot of epithelial cells during disease progression. (C) Heatmap showing subset-specific 369 markers. (D) GO enrichment terms for E0, E6 and E8 with -log adjusted p-value shown (dotted line 370 corresponds to FDR = 0.05). (E) Dot plot showing top predicted ligands expressed by epithelial cells 371 that modulate the E0 (stem) compartment. (F) Expression of KI67 and SOX2 in human healthy tissue. 372 KI67 marks proliferative cells (cluster E5), and SOX2 marks an epithelial stem cell compartment (cluster 373 E0). Scale bars = 100 μm (A, B). Scale bars, 50 μm (A', B'). n = 4 patient samples/condition. 374

375 Identifying ligand-receptor interactions and transcriptional regulation

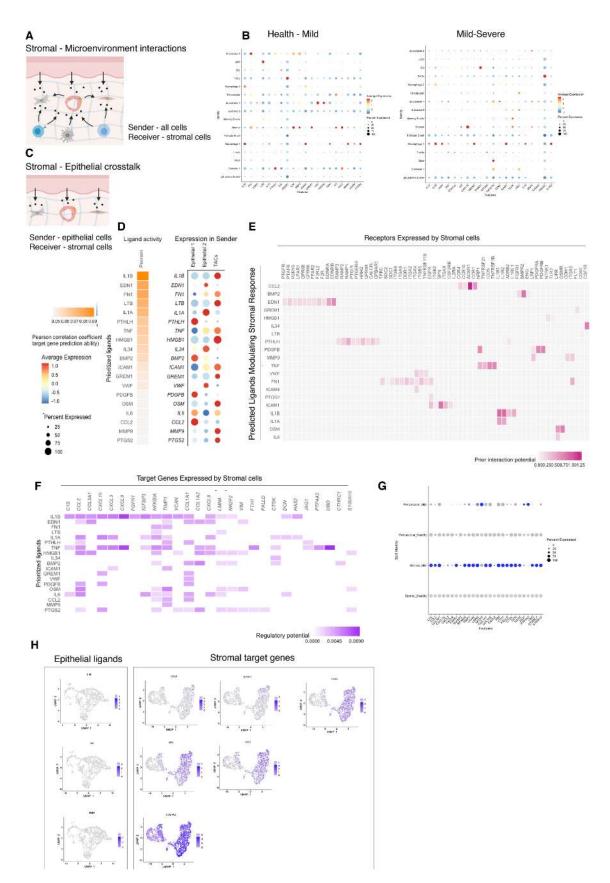
376 contributing to disease progression

Periodontitis is characterised by tissue remodelling, which depends on complex interactions between stromal, epithelial and immune cells. However, how these cells interact to contribute to tissue homeostasis and how these interactions are dysregulated during disease remains poorly defined. To understand this cross-talk, we used NicheNet (Browaeys et al., 2020) to model which cellular signals induce a stromal and perivascular response in periodontitis (Figure 4A).

383 In healthy and mild stages, the cell-stromal/cell-perivascular interaction landscape 384 was dominated by endothelial, stromal, macrophage and epithelial originating signals (Figure 4B). As disease progresses, in mild and severe stages, we observed a clear 385 386 loss in endothelial and stromal originating signals, and an increase in macrophage, 387 mast, T and B cell signalling (Figure 4B). Analysis of these cell-cell interactions 388 revealed several signalling pathways including tumour necrosis factor (TNF) and bone 389 morphogenetic protein (BMP) signalling (Figure 4B). Overall, the number of predicted 390 interactions in severe disease was strongly reduced.

391 We next focused on epithelial-mesenchymal interactions in the mild stage by 392 investigating which signalling interactions could potentially induce an inflammatory 393 signature in the mesenchymal compartment (Figure 4C). Analysis of epithelial ligands 394 predicted to cause an inflammatory response revealed IL1, EDN1, TNF, LTB and 395 BMP2 as the main contributors to the mild inflammatory stage (Figure 4D). 396 Proliferative cells (TACs) are suggested to be the main source of these ligands with 397 the exception of *BMP2* (Figure 4D). We next analysed which stromal and perivascular 398 receptors can potentially bind to these identified epithelial ligands (Figure 4E) and the 399 target genes of these ligand-receptor interactions (Figure 4F). We estimated 400 prominent *IL1B-CXCL9*, *TNF-CXCL9*, *TNF-UBD*, *BMP2-COL1A2* interactions, 401 suggesting that these molecular interactions may be crucial in sustaining a 402 proinflammatory microenvironment. Target genes were confirmed to be differentially 403 expressed with disease (Figure 4G). *IL1B* and *TNF* epithelial ligands specifically 404 targeted S0 and S5 stromal subpopulations, and *BMP2* all fibroblast-like 405 subpopulations and pericytes (Figure 4H).

Together, these results identify *IL1B*, *EDN1*, *TNF* and *BMP2* as the main epithelial modulators driving an inflammatory response in stromal and perivascular cells. Based on their expression, we identified novel epithelial-mesenchymal interactions in periodontitis: the interactions between epithelial *IL1B* and *TNF* and stromal target genes. bioRxiv preprint doi: https://doi.org/10.1101/2020.09.02.279406; this version posted September 2, 2020. The copyright holder for this preprint (which was not certified by peer review) is the author/funder. All rights reserved. No reuse allowed without permission.



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412 Figure 4. Unbiased cell-cell interaction analysis and its effect in the stromal microenvironment.

413 (A) Schematic representation of the NicheNet analysis of upstream ligand-receptor pairs and stromal

414 target genes inducing DE genes in periodontitis. Created with BioRender.com. (B) Dot plots depicting

415 which gingival cell populations express top-ranked ligands contributing to the transcriptional response

observed from health to mild disease and from mild to severe in the stromal compartment. (C) Schematic representation of the NicheNet analysis of epithelial-mesenchymal crosstalk in mild disease. Created with BioRender.com. (D) Top predicted epithelial ligands driving the stromal inflammatory response and dot plot showing which epithelial subpopulation express these ligands. (E) Ligand-receptor heatmap of potential receptors expressed by stromal cells associated with each epithelial ligand. (F) Ligand-target heatmap of stromal and perivascular target genes of the identified epithelial ligands. (G) Dot plot confirming upregulation of the identified stromal target genes in disease. (H) UMAPs feature plots mapping the identified epithelial ligands and target genes to the respective target genes expressed by stromal cells.

445 Single-cell transcriptomics of human B cells reveals activation signature in 446 periodontitis

B cells are essential in the generation of protective immunity. However, tissue-based 447 448 B cell subsets are not well characterised in human oral tissues. Following our 449 observations that there is a consistent increase of B cells in line with disease severity, 450 and their established role in disease immunopathogenesis, we next focused on the 451 humoral response by performing a more in-depth transcriptomic analysis. Previous 452 studies have established that B cells constitute the majority of cells in periodontitis 453 lesions (Thorbert-Mros et al., 2015), and it has been suggested a dual protective and 454 detrimental role (Oliver-Bell et al., 2015, Abe et al., 2015).

We compared their transcriptional profiles across disease states (Figure 5A). We 455 456 found a profound prevalence of IgG plasma B cells in disease which is supported by 457 another study (Kinane et al., 1999) in periodontitis patients. Similarly, it has been reported an increase in local IgG within the gastrointestinal tract during intestinal 458 459 inflammation (Castro-Dopico et al., 2019). Here, we found IgG plasma cells almost 460 absent in health and distinctively expanded with disease progression (Figure 5A). Upregulation of an *IGH* signature has been previously linked to disease severity and 461 462 renders activation of the mononuclear phagocyte response in the intestinal mucosa 463 (Castro-Dopico et al., 2019). In humans, mucosal IgG responses are pro-inflammatory 464 when they involve complement activation. This cluster showed enrichment of genes 465 involved in the complement system such as CFB and C2 (Figure 5D). This system plays a critical role in signalling B cell activation (Carroll and Isenman, 2012, Chen et 466 467 al., 2020), and previous research has established a role in periodontitis.

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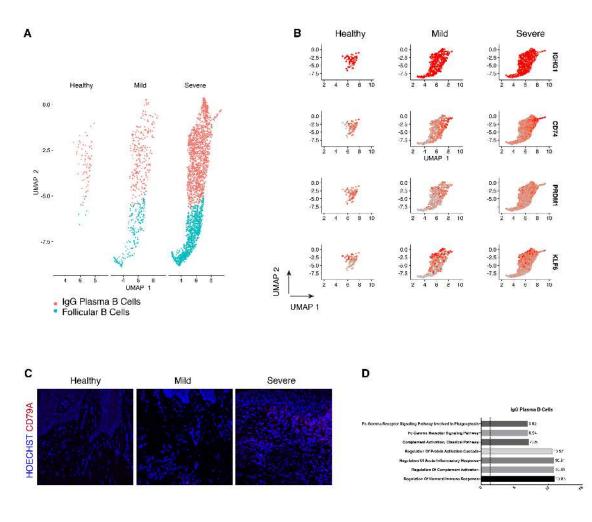


Figure 5. Periodontitis induces an IgG plasma B cell signature in human gingiva. (A) UMAP analysis of human B cells identifying follicular and IgG plasma B cells split by condition. (B) UMAP expression plots of human B cell subset markers. Cells coloured by normalised expression of indicated genes. (C) CD79A in human gingival tissue across health and disease. Scale bars, 100 μ m. n = 3 patient samples/condition. (D) Gene enrichment analysis of IgG Plasma B cells. -log adjusted p-value shown (dotted line corresponds to FDR = 0.05).

486 **Discussion**

487 The human gingiva is a unique barrier site since failure to appropriately control 488 immune responses leads to periodontitis. However, the molecular mechanisms of 489 homeostasis and how they are disrupted in disease are poorly understood. Previous 490 studies have reported on gene expression in gingival tissue from patients with 491 periodontitis, however these studies have used conventional bulk RNA sequencing on 492 whole-biopsies which average gene expression changes across the whole tissue, and 493 therefore lose all information of discreet cellular subpopulations (Becker et al., 2014, 494 Davanian et al., 2012, Demmer et al., 2008, Kim et al., 2016, Lundmark et al., 2015). 495 In this work, we provided the first comprehensive cellular landscape of *in vivo* human 496 gingiva, charting dynamic cellular composition differences at single-cell level across 497 disease states. Our atlas comprises all the main gingival cell types defined by the 498 expression of canonical and novel gene markers, with highly consistent results across 499 all samples tested. Next, we analysed the potential molecular signals driving the 500 inflammatory response in the stromal niche.

501 We identified a striking difference in mesenchymal and epithelial cells during disease 502 progression. In the mesenchymal lineage, we identified populations of established 503 cells, such as myofibroblasts and pericytes, and five additional distinct populations of 504 fibroblast-like cells. Recent studies have started to elucidate the role of stromal cell 505 populations in tissue homeostasis (Shoshkes-Carmel et al., 2018, Bahar Halpern et 506 al., 2020, Greicius et al., 2018), and consistent with previous studies we identified two 507 populations expressing Wnts and Wnt inhibitors suggesting the presence of 508 mesenchymal niche regulating populations (Kinchen et al., 2018, Kim et al., 2020) that 509 may be required for oral mucosa maintenance. In periodontitis, we observed that these 510 populations were preserved in the mild stage, whereas the myofibroblast and pericyte

511 populations were strikingly reduced. Myofibroblasts are known to be responsible for 512 excessive synthesis, deposition and remodelling or extracellular matrix proteins 513 (Tomasek et al., 2002), however less is known about the mechanisms that promote 514 their survival and persistence in inflammatory conditions. Multiple single-cell analysis 515 have revealed that myofibroblast populations are heterogenous and undergo dynamic 516 changes during tissue repair in various organs (Farbehi et al., 2019, Guerrero-Juarez 517 et al., 2019, Xie et al., 2018, Tabib et al., 2018, Peyser et al., 2019, Lambrechts et al., 518 2018). Our observation that myofibroblasts are reduced in the transition from health to 519 mild disease, might suggest a contribution to ECM degradation and to the state of 520 chronic inflammation characteristic of periodontitis. Previous research has suggested 521 two mechanisms that limit myofibroblast survival; either a dependence on growth 522 factor receptor-mediated pathways required for their survival (Bostrom et al., 1996), 523 or pro-apoptotic cytokines might selectively induce apoptosis by directly activating cell 524 death signalling pathways or by inhibiting pro-survival pathways. One example is IL-525 1B which induces caspase-dependent apoptosis in mouse lung myofibroblasts by 526 inhibiting FAK (Zhang and Phan, 1999). We also detected a decrease in the pericyte 527 population from health to mild disease. Pericytes are present in all vascularised 528 tissues, and provide structural support to the vasculature with proven roles in 529 angiogenesis (Lindblom et al., 2003), wound healing (Kramann et al., 2015), 530 progenitor cell functions (Crisan et al., 2008) and immunomodulation (Meyers et al., 531 2018). It has been demonstrated that there is an expansion and dilation of the 532 vasculature in periodontitis (Zoellner et al., 2002), contributing to increased leukocyte 533 recruitment into the tissue. The loss or detachment of pericytes has been implicated 534 in disease (Armulik et al., 2011), and has been related to infiltration of inflammatory 535 cells (Ogura et al., 2017). Interestingly, *Pdgfb* or *Pdgfr* loss-of-function embryos show

vascular hyperplasia and microvessel dilation (Hellstrom et al., 2001). We hypothesise
that the observed pericyte decrease might impair the stromal compartments ability to
regenerate as these are mesenchymal stem cell precursors *in vivo* (Sacchetti et al.,
2016, Yianni and Sharpe, 2018).

In periodontitis, we observed the emergence of one fibroblast-like population highly enriched in pro-inflammatory genes such as AREG. Overall, we observed stromal remodelling in a subpopulation specific way and in accordance with previous reports (Kinchen et al., 2018). Normal repair and regeneration responses are compromised, while continuous production of pro-inflammatory factors prevent inflammatory resolution.

546 This work also provides the first comprehensive analysis of the human gingival 547 epithelium. Understanding the molecular mechanisms underlying this mucosal barrier 548 can help shape immunoregulatory responses in the context of homeostasis and 549 disease. Our data identified a basal progenitor cell population expressing HOPX and 550 IGFBP5. Although, recent studies have started to elucidate oral progenitor cells' 551 heterogeneity, this is the first human detailed characterisation that will allow the 552 development of future validation models. We identified one epithelial subpopulation 553 (E8) expanded in disease, and intercellular communication analysis suggested that 554 this population is the main signalling centre driving the epithelial inflammatory 555 response. More work is needed to address this finding and the immunoregulation of 556 this population.

557 We provided an extensive immune repertoire profiling and described in detail the 558 expansion of B cell subtypes. These results are consistent with data obtained in a 559 previous study despite the difference in tissue collection. Our samples were obtained 560 from sites which had received non-surgical treatment but still had residual disease and

the Dutzan study collected from a cohort that had never been treated for disease (Dutzan et al., 2016). We also observed a T cell-rich inflammatory infiltrate with minimal B cells present in health. This rich and diverse immune network present in health explains the immunosurveillance required to control the constant bacterial exposure. Dutzan *et al*, identified neutrophils as the most notable cellular difference in periodontitis. In our FACS gating strategy, neutrophils co-localised extensively with debris and were therefore excluded to avoid contamination.

568 We specifically provided a detailed molecular description of B cell subsets as it was 569 the major cellular shift detected in the immune cell network. This is consistent with 570 previous observations showing that the most upregulated genes in periodontitis are 571 involved in B cell development (Lundmark et al., 2018). Despite the knowledge that 572 atypical activation of B cells contribute to disease progression by their antigen-573 presentation, cytokine production, and expression and secretion of receptor activator of nuclear factor-kB ligand (RANKL), contributing to osteoclastogenesis (Thorbert-574 575 Mros et al., 2015), little is known about the molecular mechanisms driving these 576 processes. We identified a specific IgG plasma cell response. Recently, a IgG contribution has been specifically linked with driving chronic inflammatory responses 577 (Castro-Dopico et al., 2019). In that study, patient samples with higher levels of IgG 578 579 has the highest disease severity scores and correlated with neutrophil infiltration and 580 IL-1B expression. In our study, this response was associated with complement 581 activation. Previously, complement split products were found absent or present at low 582 concentrations in healthy individuals, but abundant in periodontitis (Damgaard et al., 583 2015, Hajishengallis et al., 2017). Continuous complement activation promotes 584 survival of local pathogens in a nutritionally favourable inflammatory environment that 585 promotes dysbiosis and disease development (Hajishengallis et al., 2017,

586 Hajishengallis et al., 2011, Maekawa et al., 2014). Our findings have therapeutic 587 implications by identifying IgG signalling as a potential therapeutic target in 588 periodontitis.

589 Finally, we aimed to identify the signals driving the inflammatory response in the 590 stromal compartment. Previous studies have reported IL1B and TNF as key regulators 591 in the periodontitis pathogenesis (Yucel-Lindberg and Bage, 2013), therefore it was 592 not surprising to find these molecules highly represented in our cell interaction analysis 593 (Figure 6). We described newly identified molecular mechanisms involved in the 594 regulation of these cytokines by predicting new receptor interactions and previously 595 unidentified target genes. These findings bring new perspectives on periodontitis 596 molecular mechanisms governing tissue loss and future experiments will be important 597 to test these predictions.

In summary, we have established the first human gingiva cell atlas, revealing heterogeneity within major gingiva cell populations and providing with a roadmap for further functional insights into the immune and structural populations present in the gingiva. It also provides new biological insights into the immunopathogenesis of periodontitis. These data offer enormous potential for medicine, drug discovery and diagnostics through a more detailed understanding of cell types, basic biological processes and disease states.

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611 Materials and Methods

612 **Patient recruitment and ethical approval**

613 Human gingival samples were obtained from consenting patients undergoing routine 614 periodontal surgical procedures (Department of Periodontology, Guy's Hospital, King's 615 College London). All samples were collected and processed in compliance with the 616 UK Human Tissue Act (Human Tissue Authority #203019), ethically approved by the 617 UK National Research Ethics Service (Research Ethics Committee 17/LO/1188). Written informed consent was received from participants prior to inclusion in the study. 618 619 Cohort inclusion criteria for all subjects were: absent history of relevant medical 620 conditions, no use of medication, no use of nicotine or nicotine-replacement 621 medications, no pregnancy and breast feeding.

Healthy controls included crown lengthening procedures, and periodontitis patients, pocket reduction surgeries. Patients with periodontitis had tooth sites with probing depth \ge 6 mm, and bleeding on probing. Patients used as controls showed no signs of periodontal disease, with no gingival/periodontal inflammation, a probing depth \le 3 mm, and no bleeding on probing.

Patient 33. Gender: male. Age band: 41-65. No history of periodontal disease. Site:
buccal gingival margin.

629 Patient 35. Gender: female. Age band: 41-65. Chronic periodontitis with previous630 history of non-surgical treatment. Site: buccal gingival margin.

631 Patient 37. Gender: male. Age band: 41-65. Chronic periodontitis with previous history
632 of non-surgical treatment. Site: buccal gingival margin.

Patient 38. Gender: male. Age band: 41-65. No history of periodontal disease. Site:
buccal gingival margin.

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636 Histology and Microscopy

Human gingival tissue was freshly collected and fixed overnight in 4% neutral buffered formalin. Then, tissue underwent three 5-minute washes in PBS at room temperature followed by dehydration washes in increasing ethanol concentrations. After dehydration, tissue was processed using a Leica ASP300 Tissue Processing for one hour. Tissues were then embedded in paraffin. Serial sections (12 µm thick) were cut for haematoxylin and eosin (H&E) and immunohistochemistry (IHC) staining.

643 H&E was carried out for each patient sample using an Automated Slide Stainer. Slides were dewaxed by immersion in Neo-Clear® (Merck Millipore), twice for 10 minutes. 644 Tissue was then rehydrated by decreasing volumes of ethanol in deionised H₂0 645 646 (100%, 90%, 70%, 50%) for two minutes in each step and rinsed in deionised H₂0 for 647 2 minutes. Samples were then stained in Ehrlich's Haematoxylin (Solmedia) for 10 648 minutes followed by a 10-minute rinse under running water and then a two-minute 649 rinse in deionised H₂0. Tissue was then stained in 0.5% Eosin Y (Sigma-Aldrich) for 5 650 minutes and washed twice in deionised H₂0. Samples were dehydrated in increasing 651 IMS in deionised H₂0 concentration steps (70%, 90%, 100%, 100%) for two minutes 652 each. Slides were immersed in Neo-Clear® three times for 5 minutes and then mounted using Neo-mount® mounting medium (Merck Millipore), coverslipped and 653 654 left to dry overnight in at 42°C.

655 Immunohistochemical staining

Immunofluorescence staining was performed on 12 µm sections as described above.
In short, slides were dewaxed in Neo-Clear twice for 10 minutes and rehydrated in a
series of decreasing ethanol volumes as described above. Heat induced epitope
retrieval was performed with sodium citrate buffer (pH 6) in a Decloaking chamber
NXGEN (Menarini Diagnostics) for 3 minutes at 110°C. Slides were cooled to room

661 temperature before blocking for 1 hour at room temperature in Blocking Buffer (0.2%) BSA, 0.15% glycine, 0.1% TritonX in PBS) with 10% goat or donkey serum depending 662 663 on the secondary antibody used. Primary antibodies were diluted in blocking buffer with 1% of the respective blocking buffer and incubated overnight at 4°C. The following 664 day, slides were washed three times in PBST and incubated with the respective 665 secondary antibodies diluted 1:500 in 1% blocking buffer for one hour at room 666 667 temperature. Slides were mounted with Citifluor™ AF1 mountant media (Citifluor Ltd., AF1-100) and cover slipped for microscopy. Slides were put to dry in a dry chamber 668 669 that omitted all light, and kept at 4°C.

The following antibodies were used: COLVI raised in rabbit (ab182744, 1:500, Alexa Fluor-488 secondary), ACTA2 raised in mouse (ab7817, 1:200, Alexa Fluor-633), MCAM raised in rabbit (ab75769), (KI-67 raised in rabbit (ab5580, 1:100, Alexa Fluor-594), SOX2 raised in rabbit (ab92494, 1:100, biotinylated secondary), CD79A raised in rabbit (ab79414, 1:100, Alexa Fluor -488 secondary).

675 Imaging

For bright field images, stained slides were scanned with Nanozoomer-XR Digital slide
scanner (Hamamatsu) and images processed using Nanozoomer Digital Pathology
View. Fluorescent staining was imaged with a TCS SP5 confocal microscope (Leica
Microsystems) and Leica Application Suite Advanced Fluorescence (LAS-AF)
software. Images were collected and labelled using Adobe Photoshop 21.1.2 software
and processed using Fiji (Schindelin et al., 2012).

Tissue processing for single cell isolation

Fresh tissues were processed immediately after clinical surgery using the same protocol. Tissue was transferred to a sterile petri dish and cut into <1mm³ segments before being transferred to a 15 mL conical tube. Tissue was digested for 30 minutes

686 at 37°C with intermittent shaking using an enzymes dissociation kit (Miltenyi, Bergisch-Gladbach, Germany). The resulting cell suspension was filtered through a 70-µm cell 687 688 strainer to ensure a single cell preparation and cells collected by centrifugation (1,200 689 rpm for 5 minutes at 4°C). Cells were resuspended in 0.04% non-acetylated BSA 690 (UltraPure[™] BSA, ThermoFisher Scientific) and stained with 1.5 µg DAPI (D1306, Invitrogen) used as dead cell exclusion marker. Samples were analysed on BD FACD 691 692 Aria III fusion machine. Cells were gated based on size using standard SSC-A and 693 FSC-A parameters so that debris is excluded. Doublets were excluded using SSC-A 694 and SSC-W parameters. Live cells were selected as cells identified to be dimly 695 fluorescing in DAPI and were then sorted into chilled FACS tubes prefilled with 0.04% 696 300µl BSA. Single cell suspensions were captured using the 10X Genomics® 697 Chromium Single Cell 3' Solution (v3) according to the manufacturers protocol. Cells 698 were resuspended separately in PBS with 0.04% BSA at a density of 50-100 cells per 699 μL.

700 Chromium 10x Genomics library and sequencing

701 Single-cell suspensions were manually counted using a haemocytometer and 702 concentration adjusted to a minimum of 300 cells µL⁻¹. Cells were loaded according to 703 standard protocol of the Chromium single-cell 3' kit to capture around 5,000 cells per 704 chip position. Briefly, a single-cell suspension in PBS 0.04% BSA was mixed with RT-705 PCR master mix and loaded together with Single Cell 3' Gel Beads and Partitioning Oil into a Single Cell 3' Chip (10x Genomics) according to the manufacturer's 706 707 instructions. RNA transcripts from single cells were uniquely barcoded and reverse 708 transcribed. Samples were run on individual lanes of the Illumina HiSeg 2500.

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711 Computational analysis of sc-RNAseq datasets

The cell ranger pipeline was used for processing of the single-cell RNAseq data files prior to analysis according to the instructions provided by 10x Genomics. Briefly, base call files obtained from each of the HiSeq2500 flow cells used were demultiplexed by calling the 'cellranger mkfastq'. Resulting FASTQ files were aligned to the human reference genome GRCh37/hg19 and subsequently filtered and had barcodes and unique molecular identifiers counted and count files generated for each sample. These were used for subsequent processing and data analysis using R.

719 Integrative analysis

720 Integrated analysis was performed according to the authors of the Seurat package 721 (Butler et al., 2018, Stuart et al., 2019). Briefly, count files for each condition were read 722 into RStudio and cells corresponding to each condition were labelled accordingly as 723 'Healthy', 'Mild' and 'Severe'. Only cells found to be expressing more than 500 724 transcripts were considered as to limit contamination from dead or dying cells. Each 725 dataset was normalised for sequencing depth by calling the 'NormalizeData' function 726 and the 2000 most variable features of each dataset were detected using the "vst" 'FindVariableFeatures' 727 method bv calling the function. Subsequently the 728 'FindIntegrationAnchors' function was called to identify anchors across the datasets 729 and the 'IntegrateData' function to integrate them so an integrated analysis could be 730 run on all cells simultaneously. The data was then scaled to account for sequencing 731 depth using 'ScaleData' and PCA components were used for an initial clustering of the 732 cells (using 'RunPCA'). 20 dimensions were used to capture the majority of the 733 variability across the datasets. 'FindNeighbors' was then used, utilising the above 734 dimensionality parameters to construct a K-nearest neighbour graph based on 735 Euclidian distances in PCA space. The clusters are then refined by applying a Louvain

algorithm that optimises the modularity of the dataset and groups the cells together
based on global and local characteristics. This is done by calling the 'FindClusters'
function. We then run non-linear dimensionality reduction using UMAP to be able to
visualise and explore the datasets. The same principle components were used as
above. The Stromal, Epithelial and B-cell clusters were then extracted using the
'Subset' function.

742 Stromal cell re-clustering analysis

Stromal clusters were identified as being 'collagen producing'. These two clusters 743 744 were reanalysed separately from the integrated dataset. Stromal cells were filtered to 745 only utilise live cells using percentage of mitochondrial gene expression as an 746 exclusion metric (<15%). Datasets were then re-normalised by calling the 747 'NormalizeData' function to account for the reduction in cell numbers subsequent to 748 subseting the data. According to the author instructions, the top 2000 most variable 749 features across the dataset were then identified using the 'FindVariableFeatures'. 750 These variable features were subsequently used to inform clustering by passing them 751 into the 'RunPCA' command. Using 'Elbowplot' we identified that the first 8 principle 752 components should be used for downstream clustering when invoking the 753 'FindNeighbors' and 'RunUMAP', as detailed above.

754 Epithelial cell re-clustering

Epithelial cells were identified from the epithelial clusters in the integrated UMAP and re-clustered as explained above with some minor exceptions. Epithelial cells were isolated as being the clusters 1, 8, 12. The first 5 principal components were used as these were identified as being significant by the 'Elbowplot' function.

759 Gene Ontology (GO) analysis

Gene ontology (GO) analysis was performed using Enrichr (Chen et al., 2013) on the

top 200 differentially expressed genes (adjusted p value < 0.05 by Wilcoxon Rank

Sum test). GO terms shown are enriched at FDR < 0.05.

763 CytoTRACE

An expression matrix consisting of only the specified sub-set of cellular populations was used as a starting point. CytoTRACE analysis was performed according to the developer's instructions (Gulati et al., 2020). The resulting embeddings were then projected onto the UMAP projections.

768 NicheNet analysis

769 This analysis predicts which ligands produced by a sender cell regulate the expression 770 of receptors/target genes in another (receiver) cell. We followed the open source R 771 implementation available at GitHub (https://github.com/saeyslab/nichenetr). For 772 differential expression we used FindMarkers function in Seurat to generate average logFC values per cell type. For Figure 3E, we assigned all epithelial populations as 773 774 'sender cells' and E0 as 'receiver' to derive a set of predicted epithelial ligands 775 modulating the mild response seen in this specific subpopulation. For Figure 4B, we 776 assigned all cell types as 'sender cells' and the stromal populations as 'receiver' and 777 extracted all cell type signatures by taking the 100 differentially expressed genes 778 isolated in health/mild and in mild/severe.

For Figure 4D-G, we defined all epithelial populations as 'sender' and all stromal as
'receiver' in health vs mild responses.

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782 Data availability

Raw sequencing data obtained from patients used in this study is deposited underGSE152042. These will become available upon acceptance of the manuscript.

785 Study approval

Informed consent in writing before their participation in this study was obtained from each subject in compliance with the UK Human Tissue Act (Human Tissue Authority #203019), and ethically approved by the UK National Research Ethics Service (Research Ethics Committee 17/LO/1188).

810 Author contributions

A.J.C contributed to conception, design, ethical approval, patient informed consent, sample processing, wet laboratory experiments, bioinformatic analysis, data analysis and interpretation, drafted and critically revised the manuscript; V. Y performed bioinformatic analysis, interpretation of data, drafted and critically revised the manuscript; A.A.V contributed to conception, design, ethical approval and critically revised the manuscript; V. B contributed to conception, design, ethical approval, patient informed consent and sample collection; E.D'A contributed to conception, design and critically revised the manuscript; P.T.S acquired funding, contributed to conception, design, data analysis and interpretation, drafted and critically revised the manuscript. All authors gave final approval and agree to be accountable for all aspects of the work.

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The authors state no conflict of interest. However, for the record, ED'A is an employee of Unilever Plc.

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1280 SUPPLEMENTARY INFORMATION

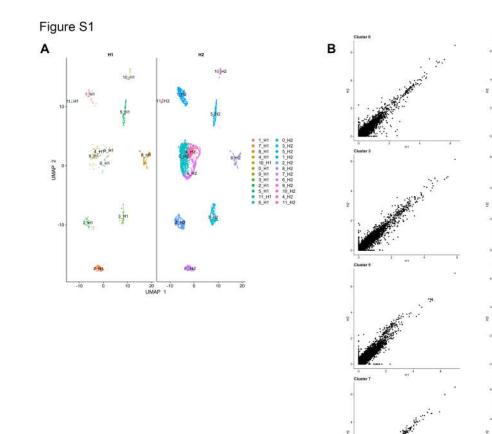
- 1281
- 1282 SUPPLEMENTARY FIGURES
- 1283 SUPPLEMENTARY FIGURE 1. Single-cell profiling of healthy human gingiva
- 1284 datasets using 10x Chromium, Related to Figure 1.
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- 1286 SUPPLEMENTARY FIGURE 2. Single-cell profiling of healthy and disease human
- 1287 gingiva using 10x Chromium, Related to Figure 1.
- 1288
- 1289 SUPPLEMENTARY FIGURE 3. Re-clustering of human stromal gingival cells in
- 1290 health and disease, Related to Figure 3.
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- 1292 SUPPLEMENTARY FIGURE 4. Re-clustering of human epithelial gingival cells in
- 1293 health and disease, Related to Figure 4.
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- 1295 SUPPLEMENTARY FIGURE 5. Flow Cytometry Gating Strategies on Human
- 1296 Gingival Cells.
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1304 Supplementary Figure 1. Single-cell profiling of healthy human gingiva

1305 datasets using 10x Chromium, Related to Figure 1.

samples. Panels A-B, n=2 individuals.

- 1306
- 1307 A. UMAP visualisation of human gingiva clusters from healthy human donors.
- B. Scatter plots showing differential expressed genes across the two healthy
- 1309
- 1310
- 1311

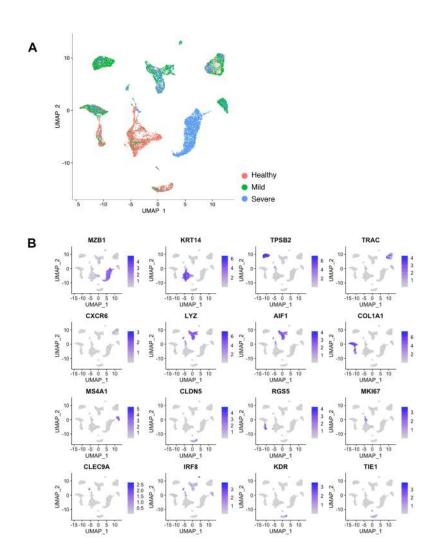


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1313 Supplementary Figure 2. Single-cell profiling of healthy and disease human

1314 gingiva using 10x Chromium, Related to Figure 1.

- 1315
- 1316 **A.** UMAP illustration of scRNA-seq data obtained from healthy and periodontitis cells
- 1317 (n= 12,411) from four donors coloured by condition.
- 1318 **B.** Feature Plot showing the expression of lineage marker genes used for cell-type
- 1319 classification.
- 1320

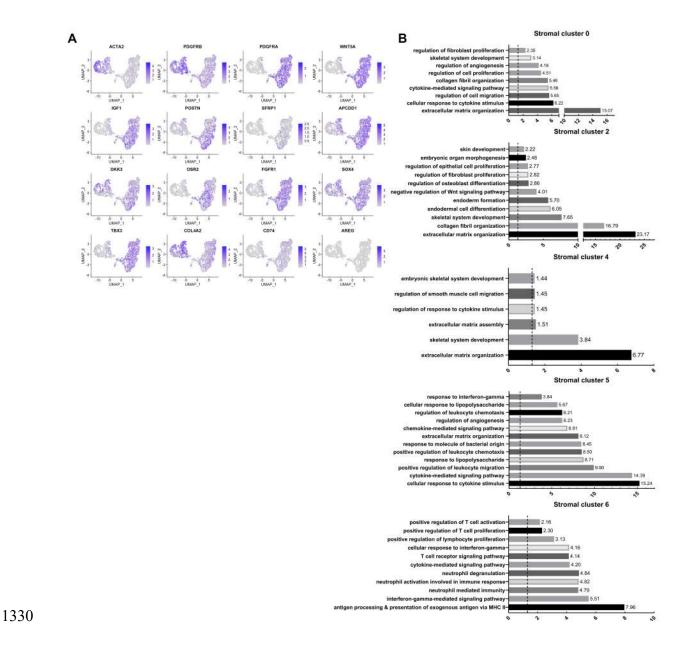


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1322 Supplementary Figure 3. Re-clustering of human stromal gingival cells in

1323 health and disease, Related to Figure 2.

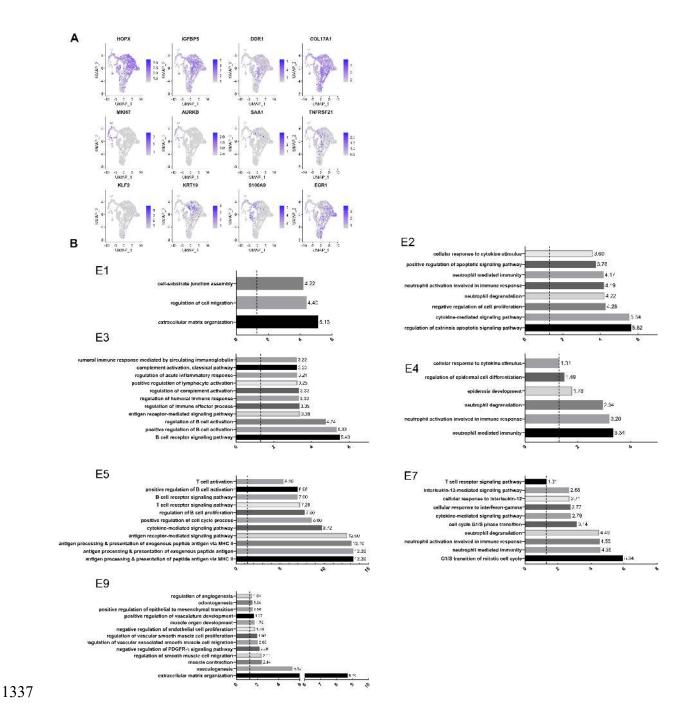
- 1324
- 1325 **A.** Feature Plots showing the expression of individual genes used for cell-type
- 1326 assignment of different stromal subsets.
- 1327 **B.** GO enrichment terms for the different stromal subsets. -log adjusted p-value
- 1328 shown (dotted line corresponds to FDR = 0.05).
- 1329



1331 Supplementary Figure 4. Re-clustering of human epithelial gingival cells in

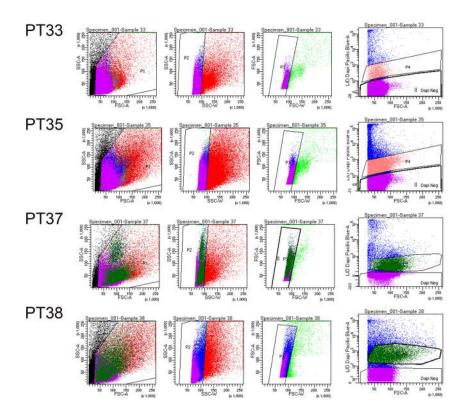
1332 health and disease, Related to Figure 3.

- 1333 A. Feature Plots showing the expression of individual genes used for cell-type
- 1334 assignment of different epithelial subsets.
- 1335 **B.** GO enrichment terms for the different epithelial subsets. -log adjusted p-value
- 1336 shown (dotted line corresponds to FDR = 0.05).



1338 Supplementary Figure 5. Flow Cytometry Gating Strategies on Human Gingival

1339 Cells.



1340