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1	Signaling and transcriptional networks governing late synovial joint development
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22	GRN
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## 24 Abstract

25

26	Background: During synovial joint development, cavitation marks the end of the
27	emergence of new cell types and the onset of the consolidation of cell type specific
28	programs. However, the transcriptional programs that regulate this crucial stage prior to
29	joint maturation are incompletely characterized. Gdf5-lineage cells give rise to the
30	majority of joint constituents such as articular cartilage, meniscus, ligament, and tendon.
31	Therefore, to explore pre-maturation of the synovial joint, we performed single cell RNA-
32	Seq analysis of 1,306 Gdf5-lineage cells from the murine knee joint at E17.5.
33	
34	Results: Using computational analytics and in situ hybridization, we identified nine sub-
35	states contributing to articular cartilage, meniscus, cruciate ligament, synovium, lining,
36	and surrounding fibrous tissue. We identified a common progenitor population that is
37	predicted to give rise to ligamentaocytes, articular chondrocytes, and lining cells. We
38	further found that while a large number of signaling pathways orchestrate the
39	differentiation of this progenitor to either ligamentocytes or to lining cells, only continued
40	FGF signaling guides these cells to a default chondrocyte fate.
41	
42	Conclusions: Our single cell transcriptional atlas is a resource that can be used to
43	better understand and further study synovial joint development and the reactivation of
44	embryonic programs in diseases such as osteoarthritis.
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46

## 47 **1. Introduction**

Synovial joint degeneration is a major contributor to osteoarthritis, a disease with deep 48 and broad impacts on human health in nations with increasing aging populations <sup>1,2</sup>. 49 New therapeutic approaches, such as cell replacement, and better models would 50 benefit from an improved understanding of synovial joint development at different 51 developmental stages <sup>3 4</sup>. For example, we recently determined the transcriptional 52 53 programs that regulate early (E12.5 to E15.5) synovial joint development by a combination of single cell RNA-sequencing (scRNA-Seq) of Gdf5-lineage joint 54 progenitors, computational analyses, and in situ validation <sup>5</sup>. While that study uncovered 55 56 substantial transcriptional and fate bias heterogeneity in interzone cells, it did not characterize how joint progenitors ultimately commit to the major joint cell types, 57 including permanent articular chondrocytes, ligamentocytes, and cells of the menisci 58 and synovium. These lineages begin to be detectable around the time of cavitation, 59 which in the hindlimb occurs around E16.5<sup>6-89</sup>. 60 To understand the transcriptomic programs active during late joint development, 61 microarray have been applied to the E15-E16 elbow and knee joints <sup>10</sup>, to the E16 62 63 meniscus<sup>11</sup>. The transcriptomic characteristics identified by these investigations revealed the involvement of TGFB (e.g. Gdf5) and Wnt (e.g. Sfrp2) signaling in knee 64 morphogenesis, and the involvement of TGF $\beta$  (e.g. Lox) and IGF (lgf1) pathway in 65 meniscus development. However, it is difficult to define the expression signatures of 66

distinct sub-populations using bulk sample molecular profiling. The advent of single cell
 profiling makes it possible to achieve this aim <sup>12,13</sup>. For example, a Lgr5<sup>+</sup> population and

a Tppp3<sup>+</sup>Pdgfra<sup>+</sup> population were recently found that serve as progenitors for cruciate

<sup>70</sup> ligaments, synovial membrane, and articular chondrocytes <sup>14</sup>, and for tendon <sup>15</sup>,

71 respectively.

To gain a comprehensive understanding of the transcriptional programs during 72 73 late synovial joint development, we applied scRNA-Seg to Gdf5-lineage cells of the murine knee joint at E17.5. We combined computational analytics and in situ 74 75 hybridization to identify the cell populations that contribute to different joint constituents 76 and to uncover the transcriptional programs that mediate the lineage transitions. We found that Gdf5-lineage enriched cells consist of at least nine sub-populations that 77 78 contribute to articular cartilage, meniscus, superficial lining, tendon/ligament, synovial fibroblasts, and other connective tissues. Furthermore, we predicted the signaling 79 80 pathways, and the transcriptional programs underpinning the differentiation of joint progenitors to articular chondrocytes and to lining cells. We have made our data and 81 analysis results available for the community to explore at https://e17-82 mouse.herokuapp.com 83 84 2. Materials and Methods 85 86 Mice We cross mated Gdf5-cre (Sperm Cryorecovery via IVF, FVB/NJ background, Jackson 87 laboratory) mouse strain with B6.129X1-Gt(ROSA)26Sortm1(EYFP)Cos/J (RosaEYFP, 88 89 gifted by the lab of Prof. Xu Cao from Johns Hopkins University) strain to generate Gdf5-cre::Rosa-EYFP mice. The genotype of the mice was determined by PCR 90 91 analyses of genomic DNA isolated from mouse tails using the following primers: Gdf5-

92 directed cre forward, 5'GCCTGCATTACCGGTCGATGCAACGA3', and reverse,

93	5'GTGGCAGATGGCGCGGCAACA	CATT3' (protocol	l provided by Prof. David
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94 Kingsley, HHMI and Stanford University). All the protocols were approved by the

95 institutional review board of Johns Hopkins University.

96

#### 97 Mice gender identification

98 We identified mouse gender by genotyping Sry Y gene using the primers: forward,

99 5'CTGGAAATCTACTGTGGTCTG3', and reverse, 5'ACCAAGACCAGAGTTTCCAG3'.

100

## 101 Cell isolation

102 Mice were kept in light-reversed room (light turns on at 10 pm and turns off at 10 am). Timing was determined by putting one male mouse and two female mice in the same 103 104 cage at 9 am and separating them at 4 pm on the same day. We count that midnight as E0.5 stage. On E17.5, the pregnant mice were sacrificed by CO<sub>2</sub> at 3 am. The cells 105 were isolated using the protocol (Primary culture and phenotyping of murine 106 107 Chondrocytes) with modification: The embryos were rinsed three times in PBS on ice. 108 Two presumptive knee joints were isolated by transfemoral and transtibial division in a 109 single 3 cm dish and incubated in digestion solution I (3 mg / mL collagenase D, DMEM high glucose culture medium, serum free) for 45 min at 37 °C, and then in digestion 110 111 solution II (1 mg / mL collagenase D, DMEM high glucose culture medium, serum free) 112 for 3 hrs (one embryo per dish) at 37 °C. During the period of incubation, the mice 113 gender was identified by genotyping and only male samples were chosen for further 114 processing. The tissues with medium were gently pipetted to disperse cell aggregates 115 and filtered through 40 µm cell strainer, then centrifuged for 10 min at 400 g. The pellet

116 was suspended with 0.4% BSA in PBS.

117

#### 118 Cell fractionation

- 119 All cells were fractionated by fluorescence-activated cell sorting (FACS). A MoFlo XDP
- 120 sorter (Beckman Coulter, Miami, FL. USA) was used to collect YFP<sup>+</sup> cells, and
- 121 Propidium lodide was used to exclude dead cells.

122

#### 123 Single cell RNA sequencing

124 GemCode<sup>™</sup> Single Cell platform (10X Genomics) was used to determine the

transcriptomes of single cells <sup>16</sup>. Cells at 1000 / μl were obtained after sorting and

126 placed on ice. One sample was selected and profiled based on the viability and amount.

- 127 A total of 6000 cells were loaded, followed by GEM-RT reaction, and cDNA
- amplification. Single cell libraries were constructed by attaching P7 and P5 primer sites
- and sample index to the cDNA. Single cell RNA sequencing was performed on Illumina

130 NextSeq 500 and HiSeq 2500 to a median depth of 168,000 reads per cell.

131

#### 132 Analysis and visualization of scRNA seq data

133 CellRanger (version 2.0.0) was used to perform the original processing of single cell 134 sequencing reads, aligning them to the mm10 reference genome. We used the 135 command line interface of Velocyto, version 1.7.3, to count reads and attribute them as 136 spliced, un-spliced, or ambiguous <sup>17</sup>. The resulting loom file was then subjected to 137 quality control processing, normalization, estimation of cell cycle phase, clustering, and 138 differential gene expression analysis using Scanpy 1.5.1 <sup>18</sup>. Specifically, we excluded

cells in which mitochondrial gene content exceeded 5% of the total reads or cells in with 139 fewer than 501 unique genes detected. Then, we excluded genes that were detected in 140 fewer than 3 cells, as well as mitochondrially-encoded genes, genes encoding 141 142 ribosomal components, and the highly expressed IncRNA Malat1, resulting in a data set of 2,267 cells and 15,071 genes. Then, we performed an initial normalization on a per 143 144 cell basis followed by log transformation, and scaling. We scored the phases of cell cycle using cell cycle-associated genes as previously described <sup>19</sup>. Then we identified 145 the genes that were most variably expressed across the whole data set, resulting in 146 147 2.176 genes. We performed PCA and inspected the variance ratio plots to determine the 'elbow', or number of PCs that account for most of the total variation in the data. We 148 generated a graph of cell neighbors using diffusion maps <sup>20</sup>, and then we performed 149 Leiden clustering <sup>21</sup>, which we visualized with a UMAP embedding <sup>22</sup>. We also analyzed 150 this with SingleCellNet<sup>23</sup>, which had been trained using the Tabula Muris data set<sup>24</sup>. 151 Using a combination of SingleCellNet classification and manual annotation, we 152 153 identified and removed non-joint cells as described in main text. Differentially expressed genes were identified using the Scanpy rank genes groups function. Gene set 154 155 enrichment analysis was performed using GSEAPY (https://github.com/zgfang/GSEApy), a Python interface to enrichR<sup>25,26</sup>. scVelo was 156 used to compute cell velocities as previously described <sup>27</sup>. CellRank was used to infer 157 158 the starting and end states, and to compute the probability of each cell transitioning to each end state. We performed GRN analysis with Epoch <sup>28</sup> for each trajectory (i.e. 159 progenitor 8 to chondrocyte, and progenitor 8 to lining cells) separately by first isolating 160

those cells in progenitor cluster 8 and progeny clusters based on CellRank probability of

reaching the selected terminal state, Cells within a trajectory were then ordered basedon velocity pseudotime.

164

#### 165 Histochemistry and immunohistochemistry

The specimens were fixed in 10% buffered formalin for 24 hrs at RT, washed with 166 distilled water and equilibrated in 30% sucrose in PBS at 4°C overnight, then mounted 167 in O.C.T and frozen at -80°C. Ten-micrometer-thick coronal-oriented or sagittal-oriented 168 169 sections were performed by cryostat. We performed Trichrome staining according to 170 Trichrome Stain (Connective Tissue Stain) Kit protocol. Immunostaining was performed using a standard protocol. Sections were incubated with primary antibodies to mouse 171 GFP (1:200) in Antibody Diluent, at 4 °C overnight followed with three 5 min washes in 172 173 TBST. The slides were then incubated with secondary antibodies conjugated with fluorescence at room temperature for 1 h while avoiding light followed with three 5 min 174 washes in TBST and nuclear stained with mounting medium containing DAPI. Images 175 176 were captured by Nikon EcLipse Ti-S, DS-U3 and DS-Qi2.

177

#### 178 *In situ* hybridization

See KRT table for the information of oligonucleotides used for templates for antisense RNA probes. The T7 and SP6 primer sequence were added to 5- and 3- prime end, respectively. SP6 RNA polymerase was used for probe transcription. Probes were synthesized with digoxygenin-labeled UTP and hybridized at 68 °C overnight. Results were visualized by Alkaline phosphatase-conjugated anti-digoxygenin antibody and BCIP/NBT substrates.

#### 186 **RNAscope Hiplex**

187 RNAscope Hiplex probes were designed by Advanced Cell Diagnostics (ACD), Inc.

188 Assay were performed according to ACD provided protocol as described in our previous

189 study <sup>5</sup>. See KRT table for details.

190

## 191 3. Results and discussion

## 3.1 Gdf5Cre+ cells in the knee joint from E17.5 Gdf5<sup>Cre</sup>R26<sup>EYFP</sup> mouse are located 192 in the superficial cartilage, ligament, menisci, synovium and non-joint tissues 193 194 To further study the heterogeneity of Gdf5-lineage cells at later stage of synovial joint development, we isolated YFP<sup>+</sup> cells from the knee joint region of Gdf5Cre::R26EYFP 195 196 (Gdf5EYFP) mice at E17.5 by enzymatic disassociation and fluorescence activated cell sorting (FACs) <sup>5</sup>(Supp Fig 1A,B). A total of 2,648 cells were captured by the 10x 197 Genomics Chromium platform and sequenced at a depth of 168,241 reads per cell 198 199 (Supp Table 1). There were 2,267 cells remaining after removing potential doublets and 200 low-quality libraries. We found nine clusters by the Leiden graph-based community detection algorithm <sup>21</sup> (Supp Fig 2A). We used a combination of automated cell-typing 201 202 and marker gene expression to assign putative identity to the clusters. We removed 203 cells representing types that do not contribute to major joint components, including 204 hematopoietic cells (clusters 2, 3, 6, and 8), myoblasts (cluster 4), neural crest derived 205 cells (Sox10 positive cells), endothelial cells and smooth muscle cells (Supp Fig 2B-C). 206 After this process, a total of 1,306 Gdf5-lineage enriched (GLE) cells remained and 207 were analyzed in depth. To localize these GLE cells, we applied IHC on knee joint

sections of E17.5 Gdf5<sup>Cre</sup>R26<sup>EYFP</sup> mice. YFP+ cells were detected in the superficial
cartilage, cruciate ligament, menisci, synovium, and in the surrounding soft tissue, and a
small number of cells were detected in the deeper zone of cartilage (Fig 1A-B).

211

## **3.2 Transcriptional signatures define nine groups of GLE cells**

213 We re-clustered the single cell data to determine the major transcriptional states and identities of the GLE cells. Using Leiden clustering, we found nine groups of cells (Fig. 214 215 **2A**). To annotate these clusters, we used a combination of differential gene expression 216 analysis and gene set enrichment analysis, followed by validation with ISH and 217 RNAscope, as described below. Examining the genes preferentially expressed in each 218 cluster immediately gave some hints as to their identity (Fig 2B). For example, we 219 identified cluster 1 as chondrocytes by the expression of Col2a1, Col9a1, Col9a3, and the enrichment of the GO category "Cartilage development" (Fig 2C). Similarly, we 220 identified cluster 2 as ligamentocytes based on the expression of Scx, Tnmd, and Thbs4 221 222 <sup>29</sup> and the enrichment of the GO category "Collagen fibril organization", a prediction that we confirmed by RNAscope (Fig 2D). 223

Cluster 3 cells uniquely expressed Col22a1 and Tspan15 (**Fig 3A**). Collagen XXII expression has been reported to be restricted to tissue junctions of muscle and articular cartilage <sup>30</sup>. Similarly, an examination of Col22a1 at e16.5 also found that it was expressed at the superficial layer <sup>14</sup>, suggesting that cluster 3 represented a population of superficial lining cells. To test this hypothesis, we performed ISH and RNAscope to determine where cluster 3 genes were expressed in the joint. We detected Col22a1 in a very thin fibrous sheath lining the cartilage surface and menisci by ISH (**Fig. 3B**). Tspan15, a gene encoding a member of the tetraspanin family of cell surface proteins,
has very similar expression pattern as Col22a1. We found that Tspan15 was also
expressed at the superficial layer of articular cartilage and meniscus (Fig. 3B). Taken
together with the observation that cluster 3 also expressed Prg4 and Crip2 <sup>31</sup> (Supp Fig
3A), we conclude that the cells in this cluster comprise the lining or 'skin' of articular
cartilage.

The preferential expression of fibroblast genes Dcn, Mfap2 <sup>32</sup>, and Dlk1 in clusters 4, 5, 6, and 7 (**Fig 2B**, **Fig 3D**) supports the notion that these clusters are mesenchymal cells of the joint. Cluster 8 was made up of a mixture of proliferating chondrocytes and mesenchymal cells (**Fig 3D**).

Cluster 4 was marked by high levels of expression of Cd55, Thy1, and Has1 indicative of synovial fibroblasts <sup>33</sup>. We note that many of these cells co-express genes that have previously be reported to distinguish inner synovial fibroblasts (Thy1) from synovial lining fibroblasts (Cd55, Has1). This discrepancy can be explained by species specific differences or in developmental timing differences between our data and prior reports.

The fact that no genes were substantially preferentially expressed in cluster 8 made it more challenging to identify. We noticed that it had detectable levels of genes that are preferentially expressed in chondrocytes (e.g. Acan and Cd9) (**Supp Fig 3B**), superficial lining cells (e.g. Crip1 and Crip2) (**Supp Fig 3C**), and in mesenchymal cells (e.g. Arl6ip5, Lmna, and Ptn) (**Supp Fig 3D,E**). This suggested that this cluster may represent a less-differentiated progenitor population expressing features of multiple downstream progeny. To determine the localization of this population, we examined the

254 expression, in situ, of Col2a1, Acan, and Ptn, which collectively distinguished chondrocytes, stromal cells, and cluster 8 cells in our single cell data (Fig 4A). While 255 256 Col2a1 was strongly expressed by chondrocytes in articular cartilage, we found that its 257 expression was sparse and weak in menisci (Fig 4B). Although Acan expression was 258 co-localized with Col2a1, its expression was evenly distributed in the inner menisci at a 259 relatively low level as compared with its expression in the long bones. Ptn, on the other hand, was strongly expressed in menisci. Taken together, these observations support 260 the notion that cluster 8 cells are found predominately in the meniscus at e17.5. 261

262

#### 263 **3.3 RNA velocity predicts common transcriptional origin of synovial fibroblasts**,

#### 264 ligamentocytes, articular chondrocytes, and lining cells

265 Next, we performed RNA Velocity analysis to determine how the GLE cells were related to each other. In brief, RNA Velocity uses the ratio of spliced to un-spliced transcript 266 267 counts to model transcriptional kinetics, which are then used to predict the future 268 transcriptional state of each cell <sup>17,34</sup>. Our application of RNA Velocity to e17.5 GLE cells 269 revealed several general patterns of cell dynamics. First, we found that cells within each 270 cluster were still undergoing dynamic transcriptional re-modeling (Fig 5A). Second, in 271 most clusters, the velocities were unidirectional, for example, the chondrocyte velocities 272 were pointing in the direction of higher Col2a1 and Col9a1 expression. Some clusters 273 had unidirectional velocities towards another cluster, for example, the stromal cluster 5 largely had velocities <sup>35</sup> towards stromal cluster 6. Third, stromal clusters 7 and 8 clearly 274 275 had velocities towards two or more other clusters, indicating that these clusters 276 represented multi-potent progenitor populations.

277 To summarize these patterns of transcriptional velocity, we used PAGA, which consolidates the individual cell trajectories into connectivity's between clusters <sup>36</sup>. PAGA 278 279 analysis predicted that cluster 7 flows into the stromal lineages (clusters 5 and 6), the 280 synovial fibroblasts (cluster 4). Cluster 7 also flows into cluster 8, which subsequently 281 flows into the chondrocyte, lining, and ligament clusters (Fig 5B). This suggested that 282 the cells of clusters 7 and 8 continued to serve as a reservoir of progenitor cells. To explore this possibility more rigorously, we used the CellRank computational tool, which 283 284 uses a combination of RNA velocities and cell-cell similarities to infer fate potential in scRNA-Seq data <sup>35</sup>. CellRank identified cluster 7 as an initial cluster from which cells 285 286 traverse trajectories towards terminal states represented by cluster 1 (chondrocytes), cluster 2 (ligamentocytes), cluster 3 (lining cells), cluster 4 (synovial fibroblasts), and 287 288 cluster 5 (stromal cells) (Fig 5C-D). It is possible that cluster 7 progenitor cells are residual, or late differentiating, interzone cells as they do express detectable levels of 289 genes Htra1 and Sfrp2 (Fig 5E) that are expressed at earlier time points in the interzone 290 291 <sup>5</sup>. However, this does not exclude the possibility that they are more recently immigrated Gdf5-lineage cells that primarily contribute to meniscus and intra-articular ligament <sup>37</sup>. 292 293

#### **3.4 FGF-MAPK signaling distinguishes early from late stages of GLE**

295 differentiation

Next, we sought to identify the signaling pathways that regulated transitions from the
progenitor populations to each of the more differentiated end points: ligamentocytes,
synovial fibroblasts, chondrocytes, and lining cells. To achieve this, we first performed
differential gene expression analysis on the pairs of cell clusters that were predicted by

RNA Velocity, PAGA, and CellRank to be immediately related to each other (Fig 6A).
These pairs were 7 (prog) to 8 (prog), 7 (prog) to 4 (synfib), 8 (prog) to 3 (line), 8 (prog)
to 2 (liga), and 8 (prog) to 1 (chon). Then we calculated the extent to which genes
upregulated in each cluster (as compared to their immediate progenitor) were enriched
in known targets of 18 effectors of nine signaling pathways crucial in development
(FGF-MAPK, FGF-PI3K, FGF-STAT, Hedgehog, Hippo, Notch, TGFb-BMP, TGFbActivin, and Wnt).

We found that targets of Etv5, an effector of the FGF-MAPK pathway, and Yap1, 307 308 the effector of the Hippo pathway, were highly enriched in both the progeny of cluster 7: 309 cluster 4 (synfib) and cluster 8 (prog) (Fig 6B). Many of the enriched genes are 310 associated with proliferation, such as Rbms1, Hmga1b, and Map2k1, consistent FGF-MAPK's and Hippo's role in controlling the size of progenitor pools <sup>38,39</sup>. On the other 311 hand, some signaling pathways were either only enriched in one progeny cluster (e.g. 312 313 WNT Ctnnb1 in the synovial fibroblast cluster 4) or were enriched in both but had 314 distinct targets activated. For example, chondroprogenitor master regulator and FGF-315 STAT Stat3 target Sox9 is only activated in the progenitor cluster 8, whereas the FGF-316 STAT Stat3 target Ly6a is mainly activated in the synovial fibroblast cluster 4 (Fig 6B). 317 When we examined the pathways enriched in progeny of cluster 8, we again 318 found pathways that were unique to each lineage, pathways that were enriched in more 319 than one lineage, and pathways that were commonly enriched but had distinct target 320 genes upregulated in different lineages. FGF-STAT Stat3 targets were upregulated in 321 chondrocytes, ligamentocytes, and lining cells compared to their progenitors in cluster 322 8. Both Prg4, which encodes lubricin, and the Egf ligand Hbegf, which is upregulated in

323 osteoarthritis <sup>40</sup>, are FGF-STAT Stat3 targets upregulated in the lining and chondrocyte clusters (Fig 6C). FGF-STAT Stat3 targets that are unique to each lineage include 324 endothelial-associated Aqp1 and Cd81 in lining cells; Fabp5, Klf6, and Btg1 in 325 326 ligamentocytes; and Efna1, Vwa, Farp1 in chondrocytes. Interestingly, the chondrocyte 327 cluster was not marked by enrichment of any other signaling pathway, suggesting that 328 in the absence of other signaling events, it is the default fate from the progenitor 8 state. 329 We also note that nascent ligamentocytes were marked by enrichment of WNT 330 signaling and that the effector targets included the tenocyte/ligamentocyte regulator 331 Scx, as well as Lox, and Col18a1, which are genes encoding proteins important to the structural integrity of ligament <sup>41</sup>. A summary of our analysis of signaling pathways and 332 333 the targets of their effectors is depicted in Figure 6D.

334

## 335 **3.5 Identification of transcriptional circuits underpinning joint population**

## 336 diversity

337 Many lineage specific genes were not predicted to be directly regulated by effectors of 338 the signaling pathways that we analyzed. In addition to signaling pathways, cell intrinsic 339 gene regulatory networks (GRN) contribute to cell fate choice and differentiation during development <sup>42</sup>. To identify the GRNs that underpin joint cell diversification and 340 341 differentiation, and in particular to identify the regulators of lineage specific genes, we 342 used Epoch, which leverages pseudotemporal ordering to infer dynamic GRNs <sup>28</sup>. Epoch defines lineage- or trajectory-specific GRNs, and it divides these temporally into 343 344 time periods, or epochs, to identify dynamic regulatory relationships. The rationale 345 behind this approach is that developmental GRNs change as cells differentiate such

that transcription factors can regulate different genes in different lineages and atdifferent stages of development within a lineage.

We used Epoch to reconstruct the GRNs governing the transitions from the 348 349 progenitor cluster 8 to the chondrocyte cluster 1 and the lining cell cluster 3. We were 350 particularly interested in identifying the biological pathways that characterized each time 351 period, their regulators, and the regulators of genes specific to each lineage (e.g. 352 Col22a1 in the lining cluster and Col9a3 in the chondrocyte cluster) and genes shared 353 in both lineages (e.g. Hbefg and Prg4). Therefore, we first used Epoch to identify the 354 major time periods that marked the progression from progenitor cluster 8 to the chondrocyte cluster 1, and we performed gene set enrichment analysis on genes 355 356 preferentially expressed in each resulting time period (Fig 7A). The early stage of 357 chondrocyte differentiation was characterized by the extracellular matrix organization, regulation of insulin-like growth factor receptor signaling pathway, and skeletal system 358 359 development GO Biological Process categories. The presence of both ECM-production 360 genes and of insulin-like growth factor pathway genes is consistent with the observation 361 that IGF activation enhances the synthesis of cartilage matrix, and our analysis indicates that this is an early event in articular cartilage differentiation <sup>43</sup>. While the 362 363 intermediate, transition stage was not enriched in any category, the final stage was 364 enriched in cholesterol biosynthetic process, regulation of chondrocyte differentiation, 365 and negative regulation of cell-substrate-adhesion. The activation of cholesterol 366 metabolism programs is consistent with prior studies that link RORalpha expression to chondrocyte differentiation <sup>44</sup>. The negative regulation of cell-substrate adhesion may 367 368 play a role in how mesenchymal progenitors cells acquire the stereotypic spherical

morphology of chondrocytes. Indeed, over-expression of Meltf, one in this pathway that
 is up-regulated in the final stage of the articular chondrocyte trajectory, in ATDC5 cells
 promotes a more chondrocyte-like shape and promotes differentiation <sup>45</sup>.

372 Next, we sought to identify the regulatory circuits that contribute to the overall 373 chondrocyte trajectory and to identify the transcription factors that directly regulate 374 articular chondrocyte specific genes. Therefore, we used Epoch to infer the dynamic GRNs associated with the chondrocyte differentiation trajectory. To identify the most 375 influential transcription factors at each stage, we computed betweenness and degree, 376 377 which measure the centrality and number of direct neighbors that a transcription factor 378 has in a GRN, respectively (Supp Fig 4). This analysis revealed identified PlagI1, which has previously been documented as being co-localized at sites of chondrogenesis <sup>46</sup>, as 379 380 a prominent regulator at all three stages, albeit as an activator of early stage genes such as Col3a1, Arid5b, and Sfrp2 but a repressor of late stage genes such as Timp1, 381 Slc1a5, and Hbegf (Supp Table 2). Tgif1 followed a similar pattern, as it is predicted to 382 383 promote expression of early stage genes such as Aspn, Clec3b, Osr1, Ptn, and Vim, but repress later stage genes such as Acan, Col11a1, Col2a1, and Col9a1 (Supp Table 3). 384 385 The top overall regulator of the final stage was the Wnt effector Lef1, consistent with its documented role in specifically promoting a superficial articular chondrocyte phenotype 386 47. 387

Finally, we sought to better understand how genes indicative of the progenitor stage and the later chondrocyte stage were directly regulated. We chose to examine the regulators of Clec3b, Col9a3, and Prg4 as exemplars of the progenitor and articular chondrocyte stages (**Fig 7B**). In the early stage, expression of Clec3b, which encodes a

392 heparin-bind protein associated with osteoarthritis <sup>48,49</sup>, is promoted by Atf3 and the mesenchymal regulator Twist1, suggesting that the up-regulation of Clec3b in OA is a 393 394 re-activation of a latent developmental program that contributes to collagen fibril 395 synthesis. Several other TFs that promote Clec3b expression are also predicted to 396 repress Col9a3, including Tgif1, Ebf1, and Klf6. The intermediate stage is characterized 397 by loss of regulatory interactions, both the activating influence of TFs on Clec3b and factors that repress expression of Col9a3. In the final stage, Clec3b is repressed by 398 399 several TFs including Sox5 and the transcriptional repressors Id1 and Id2. On the other 400 hand, the factors that repress Col9a3 are lost by the late stage whereas TFs that promote its expression, Foxa3, Atxn1, and Etv5, are all active in the last stage. Our 401 402 analysis did not predict any repressive factors for Prg4. Rather, its up-regulation seems 403 to be controlled by the activation of a cohort of TFs in the late stage, including Sox6 and Barx1, as well as several genes that encode proteins involved in chromatin remodeling 404 (e.g. Ino80, and Pih1d1) and nuclear paraspeckles (e.g. Pspc1), which would be 405 406 consistent with a model of repression by nucleosome occlusion of Prg4 regulatory regions. 407

Next, we performed a similar series of analyses to the differentiation trajectory of the lining cells (cluster 3). The early stage was enriched in largely the same GO categories as in the chondrocyte trajectory (e.g. extracellular matrix organization, collagen fibril organization, and skeletal system development), the intermediate stage also lacked enriched GO categories, but the final stage was enriched in negative regulation of mitotic cell cycle phase transition and negative chemotaxis (**Fig 7C**). There were similarities and differences in the most influential regulators of the lining trajectory 415 as compared to the articular chondrocyte trajectory, too. For example, as in the chondrocyte trajectory, Atf3 and Tgif were top regulators of the early stages of the lining 416 417 trajectory. However, Chbp, a transcription factor implicated in craniofacial development and predicted to promote proliferative programs <sup>50</sup>, was only found to be a top regulator 418 in the lining trajectory where it was predicted to up-regulate early and intermediate 419 420 stage genes. The top regulators of the final stage of the lining trajectory included Gata2, which was previously implicated as a repressor of MSC fate commitment <sup>51</sup>, Sox5, the 421 loss of which ablates Prg4 expression in lining cells <sup>52</sup>, and Creb5, which promotes 422 Prg4 expression in the superficial zone <sup>53</sup>. Finally, we sought to better understand how 423 genes indicative of the progenitor stage and the later lining stages were directly 424 425 regulated. We chose to examine the regulators of Ptn, Tspan15 and Prg4 as exemplars 426 of these stages (Fig 7D). Expression of the early stage marker Ptn was promoted by several TFs common to the early stage of the chondrocyte trajectory, including Tgif1 427 428 and Ets2. During the intermediate stage, the lining marker Tspan15 was remained 429 largely repressed by TFs such as Cebpd and Egr1, however, the Wht effector Tcf4, 430 which is predicted to promote Tspan15, became active. By the final stage, Ptn was 431 repressed by a cohort of TFs including Barx1 and Sox5, Tspan15 expression was promoted by Sox5, Tcf4, and Creb5, and Prg4 expression was promoted by Creb5, 432 433 Tbx18 and Gata2. The top predicted regulators of Prg4 in the lining cells (i.e. Creb5, 434 Tbx18, and Gata2) differed from those in chondrocytes (i.e. Barx1, Sox6, and Pih1d1), 435 consistent with the idea that the regulatory programs needed to activate transcription of 436 the same target gene vary by epigenomic context.

437

#### 438 4. Conclusions

In summary, we have identified nine groups of GLE cells by scRNA-seg, including 439 chondrocytes, superficial lining cells, ligamentocytes, synovial fibroblasts, fibrochondro-440 441 progenitors, stromal cells, and dividing cells. Differentiation from the early progenitor (Cluster 7) stage involved activation of WNT, FGF-MAPK, TGFb, and HIPPO signaling 442 443 pathways (Fig 6D), and targets of the Wnt effector Tcf7l2 were enriched in the fibrochondro-progenitors (cluster 8) whereas targets of Ctnnb1 were enriched in the 444 synovial fibroblast cluster. Furthermore, signaling through the same pathway had 445 446 distinct effects on these two lineages: the FGF-STAT cascade up-regulated Sox9 in cluster 8 cells but upregulated Ly6a in synovial fibroblasts. Many signaling pathways 447 448 were detected as enriched in differentiation of the fibrochondro-progenitor cluster 449 towards the ligamentocyte lineage and the lining cell lineage, whereas the articular chondrocyte lineage was enriched only in the FGF-STAT pathway suggesting that it is 450 451 the default fate of these progenitors. Finally, dynamic GRN reconstruction identified 452 Atf3, PlagI1, Tgif1 as major regulators of the chondrocyte differentiation trajectory, and 453 Cnbp, Fosl1, and Gata2 as major regulators of the lining cell differentiation trajectory. In 454 conclusion, our study will be a valuable resource for the community to further explore 455 the gene signatures, signaling pathways, and regulatory networks associated with 456 synovial joint development and how they relate to diseases such as osteoarthritis. We 457 have made our data and analysis results available for the community to explore at https://e17-mouse.herokuapp.com 458

459

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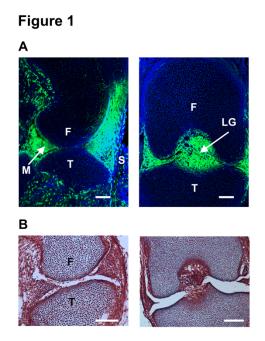
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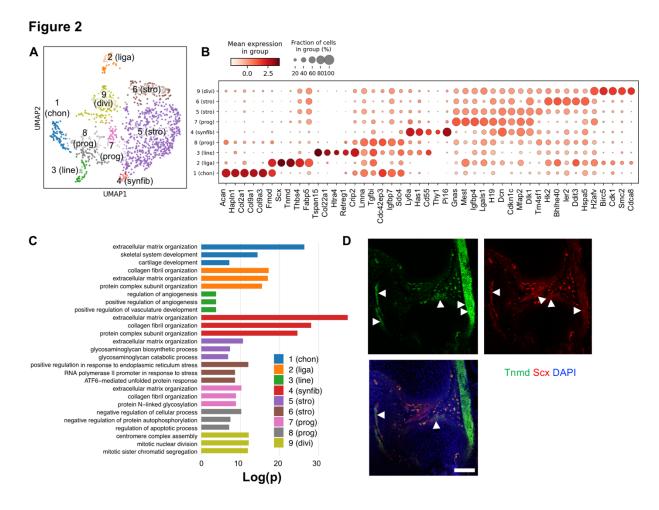
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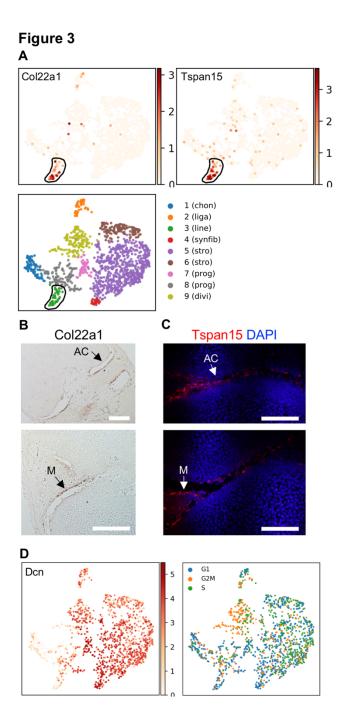


- 621 Figure 1: Localization of Gdf5-lineage cells. (A) IHC staining for GFP in sagittal section (left)
- and coronal section (right) of E17.5 knee joint. DAPI stains nucleus blue. (B) Morphology of
- E17.5 knee joint as indicated by Trichrome staining. Scale bar = 100  $\mu$ M. F: Femur, T: Tibia, M:
- 624 Meniscus, S: Synovium, CL: Crucial ligament

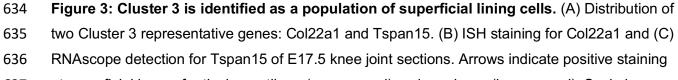
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- 625
- 626
- 627 Figure 2: Identification of nine groups of GLE cells. (A) Leiden clustering and UMAP
- 628 embedding of GLE cells, colored by cluster. (B) Dot plot of the top 5 differentially expressed
- 629 genes in each cluster. (C) Top three enriched categories per group by gene set enrichment
- analysis. (D) Coronal sections of E17.5 knee joint showing expression of Tnmd (green) and Scx
- 631 (red) marking cluster 2 (liga) cells. DAPI stains nucleus blue.

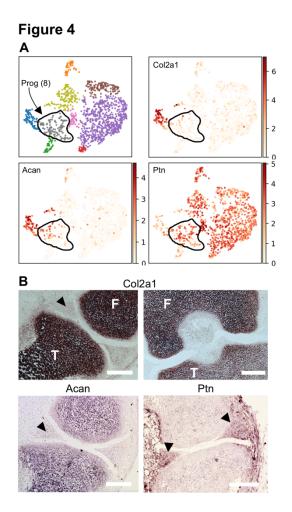


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- 637 at superficial layer of articular cartilage (upper panel) and meniscus (lower panel), Scale bar =
- $638 \qquad 100 \ \mu\text{M. AC: articular cartilage, M: meniscus. (D) Gene expression pattern of Dcn (left) and$
- 639 predicted phase of cell cycle in each group (right).

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640

- 642 Figure 4: Cluster 8 is composed of fibro-chondrogenic progenitors that are localized at
- 643 e17.5 in the meniscus. (A) Gene expression patterns of Col2a1, Acan, and Ptn. (B) IHC
- 644 detection for Col2a1, Acan, and Ptn. Arrows point meniscus. Purple represents positive. Scale
- 645 bar = 100 μM.

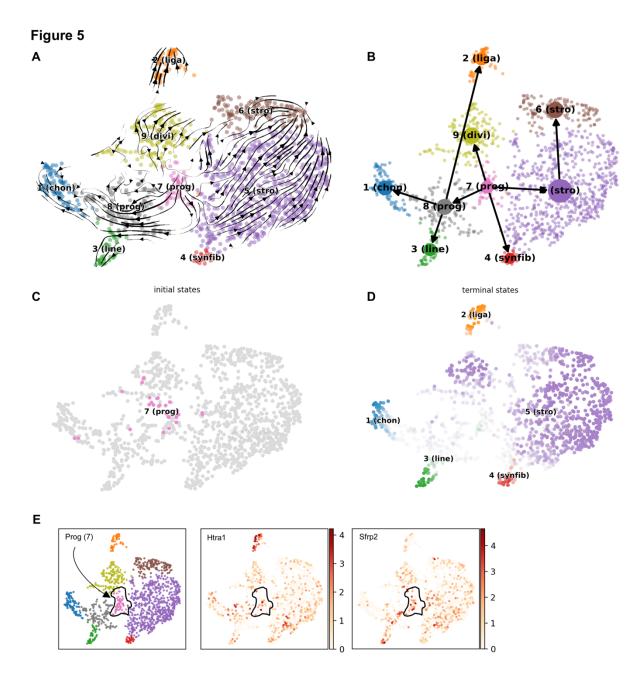
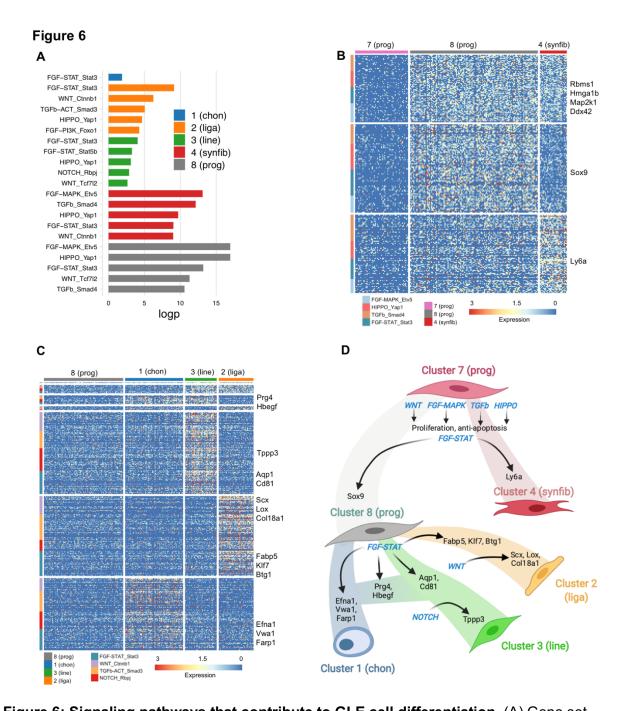




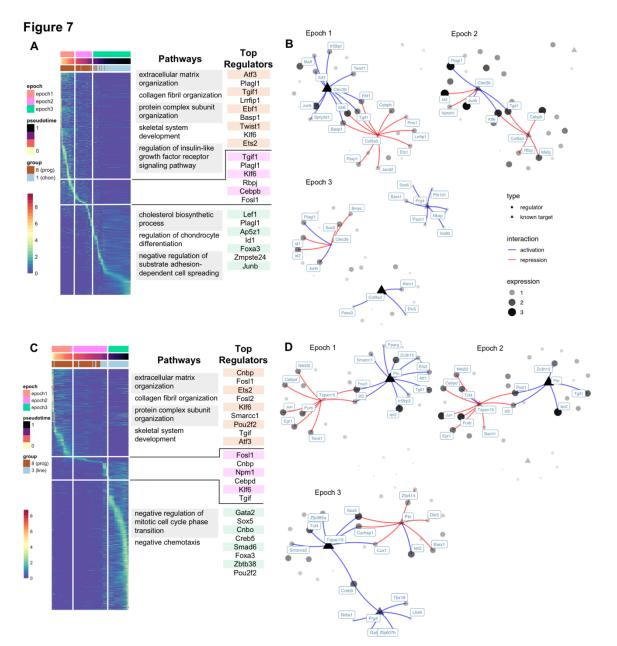
Figure 5: Developmental relationship among GLE cells. (A) RNA velocity analysis. Arrows
indicate the predicated future state of cells. (B) PAGA analysis. Arrows summarize the RNA
velocity results between clusters. CellRank identifies initial (C) and terminal (D) states of cell
fate potential. Cells are colored by states. (E) Expression of interzone genes Htra1 and Sfrp2 in
progenitor cluster 7.

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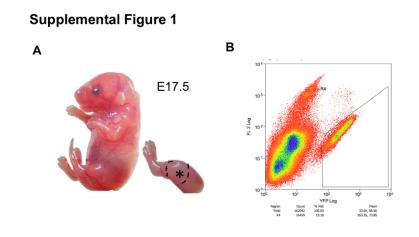


- Figure 6: Signaling pathways that contribute to GLE cell differentiation. (A) Gene set
   enrichment of genes up-regulated in each cluster relative to the clusters predicted progenitor
   state. Gene signatures tested were gene sets of signaling pathway effector targets as
- determined by ChIP-Seq. Clusters 4 and 8 were compared to cluster 7. Clusters 1, 2, and 3
- 658 were compared to cluster 8. (B-C) Heatmap showing the genes of enriched signaling pathways
- 659 in Cluster 8 vs 7 and Cluster 4 vs 7 (B), and Cluster 1, 2, or 3 vs cluster 8 (C). (D) Diagram of
- 660 signaling pathways regulating transitions between indicated cell states.

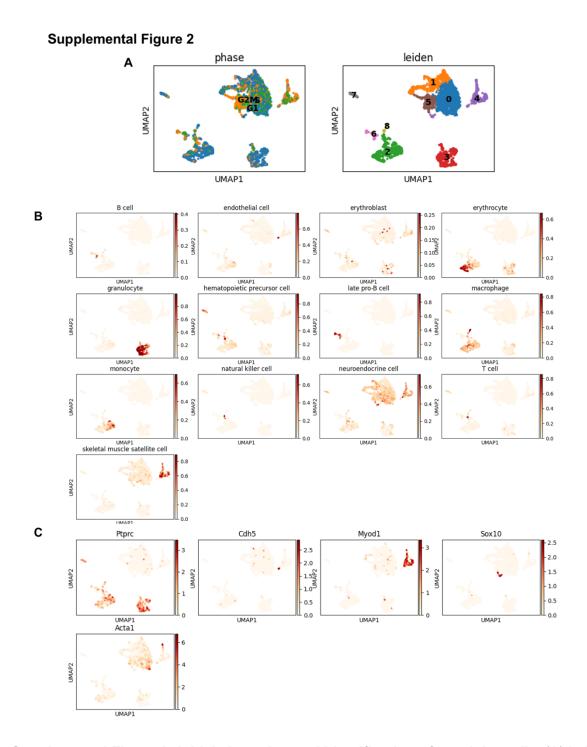
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662 Figure 7: Dynamic GRNs that govern the transition from progenitor to chondrocyte and 663 **lining cell.** (A) Heatmap of genes dynamically expressed along the chondrocyte trajectory. 664 Epoch divides cells (columns) and genes (rows) into stages or epochs. Results of enrichment 665 analysis of genes up-regulated in each epoch are shown to the right of the heatmap. The Epoch algorithm also reconstructs dynamic gene regulatory networks (GRNs). The top regulators of 666 667 each epoch, determined by the network importance metrics of centrality and betweenness, are 668 listed to the right of the enrichment results. (B) Sub-networks of that exemplify genes specific to 669 the early (Clec3b) and late (Col9a3 and Prg4), and their regulators. (C-D) Similar to (A and B) 670 but analysis performed on progenitor to lining cells trajectory.

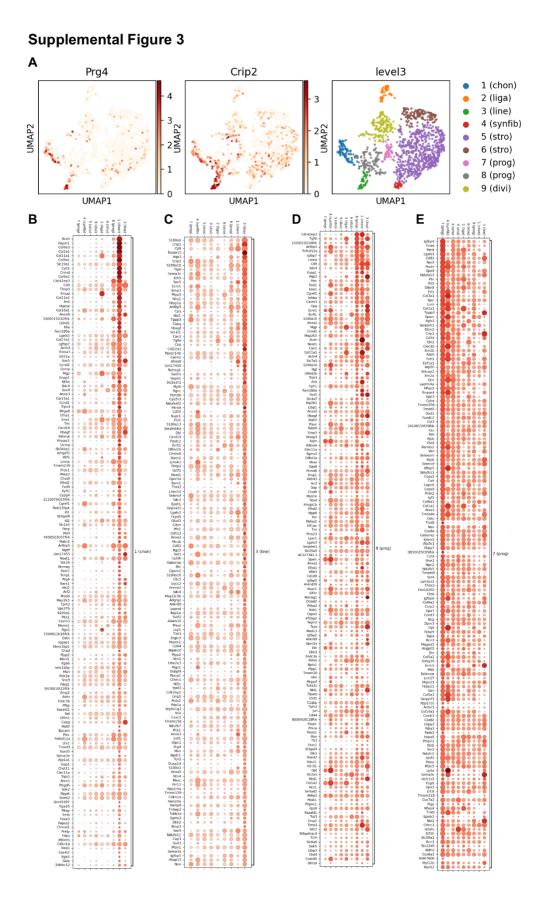


- **Supplemental Figure 1: YFP<sup>+</sup> cells collection.** (A) E17.5 mouse embryo and star labels the
- <sup>674</sup> region of hind limb dissected for cell isolation. (B) YFP<sup>+</sup> cell isolation by FACs.

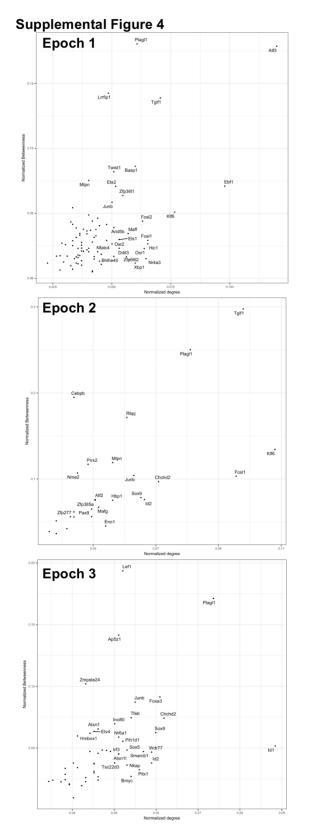


Supplemental Figure 2: Initial clustering and identification of non-joint cells. (A) Leiden
clustering and UMAP embedding of 9 groups of 2,468 cells, colored by mitosis phase (left),
groups (right). (B) Cell types annotated by SingleCellNet. (C) Expression of five marker genes
(Ptprc for blood cells; Cdh5 for endothelia cells; Myod1 for muscle cells; Sox10 for neural cells;

680 Acta1 for smooth muscle cells).

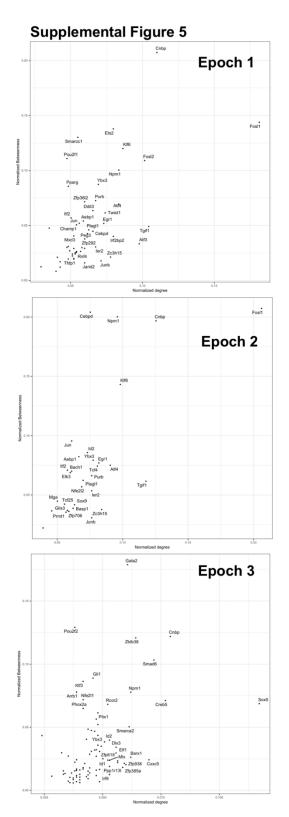


- 682 Supplemental Figure 3: Identification of each cluster. (A) Gene expression pattern of Prg4
- and Crip2. (B-E) Dot plots of 150 genes preferentially expressed in chondrocytes (B), lining cells
- 684 (C), progenitors (cluster 8) (D), and progenitors (cluster 7) (E).



686 Supplemental Figure 4: Regulators of Prog (cluster 8) to chondrocyte (cluster 1)

687 trajectory.



689 Supplemental Figure 5: Regulators of Prog (cluster 8) to lining cell (cluster 3) trajectory.

#### **Supplemental Table 1**

No. YFP+ cells	% YFP+ cells	No. Captured cells	No. GLE cells	No. reads	Median reads per cells	Median Genes per cell
100.88K	10.1%	2648	1306	365,925,644	168,241	2,882

690

Supplemental Table 1: Statistics on cells collected for scRNA-Seq. 'Cells captured' is
determined by 10X CellRanger. GLE cells indicate the number of cells remaining after excluding
cells unlikely to be GDF5-lineage, including hematopoietic cells, myoblasts, neural crest derived
cells, endothelial cells and smooth muscle cells.

695

# 696 Supplemental Table 2: GRNs of Prog (cluster 8) to chondrocyte (cluster 1). TG = target

gene, TF = transcription factor, zscore = context-sensitive metric of association between TF and
 TG, corr = Pearson correlation coefficient of expression between TF and TF. Offset = the
 amount of pseudotime that the TF profile must be shifted in order to reach a maximal correlation

- 700 with the TG.
- 701

702	Supplemental Table 3: GRNs of Prog (cluster 8) to lining cell (cluster 3). TG = target gene,
703	TF = transcription factor, zscore = context-sensitive metric of association between TF and TG,
704	corr = Pearson correlation coefficient of expression between TF and TF. Offset = the amount of
705	pseudotime that the TF profile must be shifted in order to reach a maximal correlation with the
706	TG.