1 FGF signaling dynamics regulates epithelial patterning and morphogenesis

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16 Summary

Single cell assays revealed that growth factor signaling dynamics is actively sensed by a cell and 17 ultimately controls cell fate. However, the effects of growth factor signaling dynamics at the tissue 18 19 level have been unknown. We used mammary epithelial organoids, time-lapse imaging, fibroblast 20 growth factor 2 (FGF2) variants of different stabilities, mathematical modeling, and perturbation 21 analysis to study the role of FGF2 signaling dynamics in epithelial morphogenesis. We found that 22 fluctuant and sustained FGF signaling dynamics induced distinct morphological and functional states 23 of mammary epithelium through differential employment of intracellular effectors ERK and AKT. ERK 24 activity domains determined epithelial branch size, while AKT activity drove epithelial stratification. 25 Furthermore, FGF signaling dynamics affected epithelial tissue mechanoresponsiveness to 26 extracellular matrix, thereby impinging upon branch elongation. Our study provides new insights into 27 regulation of epithelial patterning and branching morphogenesis by FGF signaling dynamics and into 28 downstream signaling effectors that regulate cellular outcomes.

29 Introduction

30 Orchestration of complex cell behaviors, such as proliferation, migration, differentiation, and death on 31 population level is essential for building functional tissues during morphogenesis. It is achieved 32 through cell-to-cell communication using core signaling pathways, including receptor tyrosine kinase 33 (RTK) signaling, transforming growth factor signaling, WNT, NOTCH and Hedgehog signaling. Spatial 34 and temporal distribution of various ligands and receptors forms the basic molecular infrastructure for 35 signaling. However, it has long been elusive how activation of a specific receptor translates into a 36 ligand-specific response using just a handful of downstream signaling modules that are common for all 37 receptors within particular signaling pathway family, such as ERK, AKT, STAT and PLCy in RTK signaling 38 pathways, and how these signaling modules are employed and coordinated in multicellular tissues 39 during formation of complex tissue shapes.

40 Seminal studies in PC12 cell line revealed that on cellular level, different growth factors acting 41 through different RTKs encode different cellular outcomes by inducing distinct temporal patterns of 42 ERK activity - transient or sustained (Gotoh et al., 1990; Nguyen et al., 1993; Santos et al., 2007). 43 Further works elaborated these observations and found that ERK activity dynamics, defined by 44 duration, magnitude, time-course and spatial localization of ERK activity (Muta et al., 2019), acts as a 45 signaling code that defines cell fates (Blum et al., 2019; Ryu et al., 2015). The patterns of ERK activity 46 dynamics are interpreted into cellular outcomes using hierarchical control of gene expression by ERK-47 regulated transcription factors (Gille et al., 1995; Murphy et al., 2002; Nakakuki et al., 2010). Moreover, 48 the variety of cellular outcomes in response to different growth factors is further increased by 49 differential employment of other downstream signaling pathways, such as AKT, which modulate 50 activity of the effector molecules (Sampattavanich et al., 2018). Current evidence suggests that the 51 sum effect of ligand identity, concentration, temporal dynamics, and combinations with other ligands 52 is sensed, processed and interpreted in a cell-type and context dependent manner(Li and Elowitz, 53 2019). However, it remains poorly understood how these signaling variables are interpreted and how 54 these cellular outcomes are coordinated on a tissue level during morphogenesis.

55 Fibroblast growth factor (FGF) signaling is a crucial pathway that regulates vertebrate 56 development from the earliest embryonic stages throughout lifetime. Regulating cell proliferation, 57 survival, differentiation and migration, it controls a wide range of biological functions (Turner and 58 Grose, 2010). Importantly, FGF signaling has a conserved role in regulation of branching 59 morphogenesis from Drosophila to vertebrates, governing development of branched organs such as 60 fly trachea or mammalian lung, kidney, and mammary glands (Lu and Werb, 2008). In mammals, canonical FGF signaling pathway comprises of 15 extracellularly secreted FGFs, which bind to seven 61 62 isoforms of FGF receptors (FGFRs). Binding of FGF ligand to FGFR results in receptor dimerization, 63 phosphorylation and activation of downstream signalling pathways, including ERK, AKT, PLCy and 64 STAT3 signaling pathways (Turner and Grose, 2010).

65 Changes in FGF ligand expression, retention, and diffusion, including formation of gradients, 66 and fluctuations in FGF signaling are inherent to mammalian development (Balasubramanian and 67 Zhang, 2016; Makarenkova et al., 2009; Niwa et al., 2007; Ornitz and Itoh, 2015; Wahl et al., 2007). 68 However, it remains incompletely understood how FGF signaling dynamics regulates morphogenesis. 69 Therefore, in this work, we used a well-established experimental model of FGF2-induced branching 70 morphogenesis of primary mammary epithelial organoids (Ewald et al., 2008) to study the role of FGF 71 signaling dynamics in epithelial morphogenesis. To induce various FGF ligand dynamics, we used two 72 variants of FGF2, the wild-type FGF2 (FGF2-wt) and its hyperstable mutant (FGF2-STAB) created by 73 protein engineering (Dvorak et al., 2018). While FGF2-wt is naturally unstable and undergoes fast 74 thermal unfolding and deactivation (half-life approximately 6 h at 37°C), FGF2-STAB exhibits high thermal stability and activity over 30 days at 37°C (Dvorak et al., 2018; Koledova et al., 2019). We applied these ligands in a range of concentrations and medium changing strategies, which created a variety of FGF ligand availability schemes according to mathematical modelling. Using these methodological approaches, we provide new insights into regulation of epithelial patterning and branching morphogenesis by FGF signaling dynamics and the specific roles of downstream signaling

80 components in regulation of distinct morphological outcomes.

81 Results

82 FGF signaling dynamics governs epithelial morphogenesis

83 To assess the role of FGF signaling dynamics in epithelial morphogenesis, we treated mammary organoids with 1 nM FGF2-wt, which we delivered in a range of different medium changing strategies 84 85 over 9 days of culture (Supplemental Figure 1A). The most commonly used strategy in cell culture, with 86 the medium change every three days (C3d), induced formation of thin branches (i.e. normal branching 87 of organoids) as expected (Figure 1A, B). When the fresh FGF2-wt was added only once at the beginning 88 of culture and was left for the duration of culture with no change (NC) of the medium, or was added 89 only for one- or three-hour pulse (p1h, p3h), no branching was observed, and organoids only mildly 90 grew and formed cysts (Figure 1A). Increasing frequency of medium change to every day (Ced) or every 91 6 hours (C6h) increased the percentage of branching organoids (Figure 1A, B) and the phenotype of 92 branching was the same as when the medium was changed every three days. But when we added fresh 93 FGF2-wt every 6 hours (A6h), which is the half-life of FGF2-wt, a new epithelial phenotype emerged, characterized by thick branches, that we named massive branching (Figure 1A, B). Mathematical 94 95 modeling of FGF2 concentration in the medium revealed that the condition of adding 1 nM FGF2 every 96 6 hours was the only condition when the concentration of FGF2-wt in the medium did not drop much 97 below 1 nM during the whole organoid culture period (Figure 1C). This suggested that sustained 98 signaling of 1 nM FGF2 is critical for formation of massive branches.

99 To test this finding, we employed a stabilized form of FGF2 with long-term thermostability, 100 FGF2-STAB (Dvorak et al., 2018). Unlike FGF2-wt, FGF2-STAB remains active after preincubation at 37°C 101 for 7 days and effectively induces branching in the mammary organoids system (Supplemental Figure 102 2A, B). We applied the same medium-changing or FGF2-adding strategies with FGF2-STAB as we had 103 done with FGF2-wt. In all these conditions, FGF2-STAB effectively induced epithelial branching, and in 104 most of the conditions FGF2-STAB induced the massive branching phenotype (Figure 1A-C). Only when 105 the FGF2-STAB was applied in a one- or three-hour pulse, the organoids developed thin branches 106 (Figure 1A, B). Importantly, these were the only two conditions in which the FGF2 concentration 107 dropped significantly below 1 nM over the organoid culture period (Figure 1C).

108 Mathematic modeling reveals a critical dose of FGF signaling for induction of massive branches

109 To express mathematically the amount of FGF signaling achieved by FGF2 supplied at a known 110 concentration by different medium-changing or FGF2-adding strategies over the organoid culture 111 period, we calculated a "cumulative dose" for each condition. The cumulative dose corresponds to the 112 area under the curve of the plot modeling FGF2 dynamics over time (see Methods). These calculations revealed that for FGF2-wt the cumulative dose of FGF signaling increased with increasing frequency of 113 medium change or FGF2 addition. In the case of FGF2-STAB, the cumulative dose of FGF signaling was 114 115 relatively stable from the no medium change to the medium change every 6 hours strategy (Figure 1D). Adding FGF2-STAB every 6 hours led to a major increase of the cumulative dose but it had no 116 117 further effect on the epithelial phenotype, suggesting that the system was already saturated. 118 Importantly, these calculations further showed that only the condition of adding FGF2-wt every 6 hours, which was the only one inducing massive branching with FGF2-wt, reached the cumulative dose
of FGF signaling similar to the dose achieved by FGF2-STAB at conditions when it induced massive
branching (Figure 1D).

122 Furthermore, we exposed the organoids to a wide range of FGF2-wt or FGF2-STAB 123 concentrations under the strategy of medium change every three days. With the increasing 124 concentration of FGF2 the percentage of branching organoids increased for both FGF2-wt and FGF2-125 STAB, and FGF2-STAB showed a ten times higher total branching inducing potency than FGF2-wt (Figure 1E). FGF2-STAB very effectively induced massive branching of organoids from 1 nM 126 127 concentration. FGF2-wt induced massive branching only at 20 nM or higher concentrations, yet still 128 only in a low percentage of organoids. The efficiency of induction of massive branching correlated with 129 the cumulative dose of FGF signaling (Figure 1F).

Taken together, we found that not only the FGF2 concentration per se, but the temporal dynamics of FGF2 signaling regulates distinct morphogenetic outcomes in the mammary epithelium. When 1 nM FGF2 is supplied, fluctuant FGF signaling induces normal branching, while sustained FGF signaling induces massive branching, as a result of the cumulative dose of FGF acquired over time.

134 FGF signaling dynamics regulates multiple epithelial cell functions that contribute to the 135 morphogenetic outcome

136 Next, we sought to characterize the new massive branching phenotype, induced by sustained FGF 137 signaling. To this end, we cultured organoids with 1 nM FGF2-wt or FGF2-STAB with medium changed 138 every three days. By careful analysis of time-lapse movies of growing organoids, we found that in 139 massively branching organoids, the branching occurs later than in normally branching organoids and 140 is preceded by an enormous growth of the epithelium (Figure 2A, B; Supplemental Figure 3A, 141 Supplemental Videos 1-3). Histological analysis of the organoids showed that the massive branches induced by sustained FGF signaling were formed by prominently stratified epithelium (Figure 2C; 142 Supplemental Figure 3B). Moreover, the normally and massively branched organoids differed in 143 epithelial cell type distribution. The normal branches of organoids exposed to fluctuant FGF signaling 144 145 lacked myoepithelial cells at the tips of the branches, a phenomenon previously reported for mammary 146 organoids cultured in Matrigel (Nguyen-Ngoc and Ewald, 2013). However, the massive branches of 147 FGF2-STAB-treated organoids were fully covered by myoepithelial cells (Figure 2C, D; Supplemental 148 Figure 4A, B).

149 Besides altering the shape of organoids, sustained FGF signaling also promoted formation of 150 bigger organoids (Figure 2E). Because in the bright field images the real difference in organoid growth could be masked by lumen enlargement, we also counted the total number of nuclei and the number 151 152 of BrdU+ nuclei per organoid section to measure organoid proliferation, and we assessed apoptosis using staining for cleaved caspase 3. We found significantly increased number of total nuclei as well as 153 154 BrdU+ nuclei in FGF2-STAB organoids in comparison to FGF2-wt organoids (Figure 2E, F; Supplemental Figure 5A) and decreased apoptosis in FGF2-STAB organoids (Supplemental Figure 5B, C). The most 155 156 significant difference in BrdU+ nuclei numbers was found on days 3 and 4, which is when the concentric 157 growth of FGF2-STAB-treated organoids is observed. On day 3 we detected an increased proportion of 158 myoepithelial cells among proliferating cells in FGF2-STAB-treated organoids (Figure 2G; Supplemental 159 Figure 6A), which helps to explain the supply of cells for the full myoepithelial coverage of massively 160 branched organoids (Figure 2C, D).

161 To assess the effect of different FGF signaling dynamics on cell renewal capacity, we 162 dissociated organoids exposed to either no, fluctuant, or sustained FGF signaling to single cells, which 163 we further tested in mammosphere formation assay (Supplemental Figure 7A) or organoid formation 164 assay (Supplemental Figure 7B). Cells derived from FGF2-STAB-treated organoids formed significantly 165 more mammospheres in the third generation (Figure 2H), indicating a higher content of stem cells in 166 FGF2-STAB-treated organoids. In the long-term organoid formation experiment, FGF2-STAB induced 167 formation of bigger and branched organoids, while organoids formed with FGF2-wt were smaller and cystic (Supplemental Figure 7B-D). This suggests that sustained FGF signaling is essential to retain 168 169 morphogenetic capacity of epithelial cells. Organoids subjected to sustained FGF signaling also showed 170 reduced epithelial polarity, as shown by β -catenin and E-cadherin staining and by ultrastructural 171 analysis of cell-cell connections (Supplemental Figure 8A-C). Additionally, ultrastructural analysis 172 revealed enlarged mitochondria and dilated endoplasmic reticulum in FGF2-STAB treated organoids 173 (Figure 2I; Supplemental Figure 8D), indicating increased metabolic activity of cells subjected to 174 sustained FGF signaling.

175 Together our data show that FGF signaling dynamics regulates a plethora of cell functions, 176 which on tissue level result in different morphogenic outcomes. In comparison to fluctuant FGF 177 signaling, sustained FGF signaling promotes more cell proliferation, including in myoepithelial cells, 178 which contributes to full myoepithelial coverage of massive branches, reduced apoptosis, higher 179 metabolism and increased epithelial cell regenerative and morphogenetic potential. However, while 180 these functions regulate cell number and tissue size, they do not explain how different tissue shapes 181 arise upon different FGF signaling dynamics. We hypothesized a role of downstream signaling 182 pathways, including ERK and AKT, in regulation of tissue architecture.

183 FGF signaling dynamics regulates epithelial branching via ERK signaling

184 Organoid branching and branch elongation were demonstrated to be regulated by ERK signaling in 185 response to FGF signaling (Huebner et al., 2016). We hypothesized that ERK signaling regulates branch 186 thickness depending on FGF signaling dynamics. Therefore, we analyzed the effect of ERK signaling 187 inhibition by U0126 on organoid branching morphogenesis upon fluctuant and sustained FGF signaling. 188 U0126 abrogated branching of organoids treated either with FGF2-wt or FGF2-STAB (Figure 3A, B). 189 Interestingly, epithelial stratification and full myoepithelial coverage in response to sustained FGF 190 signaling was not affected by U0126 (Figure 3C; Supplemental Figure 9A). A higher concentration of 191 U0126 was needed to inhibit branching in FGF2-STAB-treated organoids in comparison to FGF2-wt-192 treated organoids, suggesting higher ERK signaling activity in FGF2-STAB-treated organoids. This was 193 further corroborated by Western blot detection of higher amount of active ERK (phosphorylated ERK, 194 pERK) (Figure 3D) and higher expression of FGF-ERK signaling genes (Dusp6, Etv4 and Etv5) by qPCR in 195 FGF2-STAB organoids (Figure 3E).

Analysis of spatial distribution of pERK in the organoids revealed that in response to sustained as well as fluctuant FGF signaling, pERK is mosaically distributed early during the morphogenesis in round organoids, but forms distinct domains in the tips of the branches, while the necks of the branches are poor in pERK (Figure 3F). In the branches, pERK positive cells are localized mainly in layers of luminal cells (Figure 3G). Importantly, the domains of pERK were bigger in response to sustained FGF signaling, suggesting that the size of pERK domains determines the thickness of the branches (Figure 3F).

203 AKT signaling is crucial for epithelial stratification

204 Besides the ERK pathway, several other signaling pathways act downstream of FGFR, including AKT, 205 STAT and PLCγ pathways. To assess their contribution to the morphogenetic response upon different 206 dynamics of FGF signaling, we used inhibitors of AKT (Akti1/2), STAT3 (Stattic), or PLCγ (U73122). But 207 first as a control that the effects of both FGF2-wt and FGF2-STAB were mediated through FGFR, we 208 used BGJ398, an FGFR inhibitor. BGJ398 effectively inhibited organoid growth and branching 209 morphogenesis in both FGF2-wt- and FGF2-STAB-treated organoids. A higher concentration of BGJ398 210 was needed to significantly abrogate branching induced by FGF2-STAB than by FGF2-wt, suggesting a 211 higher level of FGFR signaling induced by FGF2-STAB (Supplemental Figure 10A-C). Inhibition of either 212 STAT3 or PLCy somewhat decreased normal branching by FGF2-wt and massive branching by FGF2-213 STAB, but without reaching statistical significance (Supplemental Figure 10A-C). However, inhibition of 214 AKT led to a significant decrease in both FGF2-wt- and FGF2-STAB-induced branching (Figure 4A, B) 215 and, importantly, caused a dramatic loss of massive growth and epithelial stratification induced by 216 sustained FGF signaling (Figure 4A-C). Additionally, we detected elevated amount of phosphorylated 217 AKT (pAKT, activated) in FGF2-STAB-treated organoids (Figure 4D), suggesting that sustained FGF 218 signaling leads to hyperactivation of this pathway.

219 Based on our data from time-lapse imaging (Figure 2A, B) we hypothesized that the concentric 220 massive growth of organoids around day 3 is crucial for subsequent massive branching because the 221 biggest differences in new branch development and proliferation occurs at that time. Therefore, to assess whether at that time the AKT signaling is important for the massive growth, we treated 222 223 organoids under sustained FGF signaling with Akti1/2 from either day 0, 3, or 6. When Akti1/2 was 224 added on day 6, massive branching occurred, similarly to organoids with no inhibitor (Figure 4E, G). 225 When Akti1/2 was added on day 3, the growth of the organoid was severely reduced, similarly to 226 Akti1/2 addition from day 0 (Figure 4E, F). Importantly, although the growth and stratification of the 227 organoid did not occur, development of new branches was not affected (Figure 4E, G). This suggested that AKT signaling is essential for epithelial stratification. 228

The basal organoid medium, in which the organoids are cultured and exposed to FGF signaling, contains a potent inducer of AKT signaling, insulin. To assess how this additional insulin-induced AKT signaling contributes to organoid morphogenesis, we cultured the organoids under FGF signaling without the insulin-containing component of the basal organoid medium (supplement ITS) or in the presence of insulin receptor inhibitor (BMS 536924). Loss of insulin signaling led to a similar phenotype as the AKT inhibition; total organoid branching was not affected, but the massive growth and epithelial stratification of FGF2-STAB treated organoids were lost completely (Supplemental Figure 11 A-C).

At last we inhibited both AKT and ERK signaling at the same time by combination of Akti1/2 and U0126. This combined inhibition completely abrogated any morphogenesis (Supplemental Figure 12A), similarly to FGFR inhibition (Supplemental Figure 10A-C), suggesting that ERK and AKT pathways are the major pathways orchestrating epithelial morphogenesis downstream of FGF.

Massive branches induced by sustained FGF2 signaling in ex vivo organoids phenocopy terminal end buds in vivo

242 During mammary gland development, soluble signals are integrated with mechanical signals to guide morphogenesis (Gjorevski and Nelson, 2011). Therefore, we investigated the effect of different FGF2 243 244 signaling dynamics on mammary epithelial morphogenesis in extracellular matrix (ECM) of increased 245 stiffness and fibrillarity – a mixture of Matrigel with collagen I – which is by composition and physical 246 properties closer to ECM in vivo (Nguyen-Ngoc and Ewald, 2013). Concordantly to previous reports 247 (Neumann et al., 2018; Nguyen-Ngoc and Ewald, 2013), we found that in the mixture of Matrigel with 248 collagen, organoids formed significantly longer branches when exposed to fluctuant FGF2 signaling. 249 However, when exposed to sustained FGF2 signaling, the organoid branches did not elongate (Figure 250 5A, B; Supplemental Videos 4 and 5). This suggested uncoupling of FGF2-STAB-treated organoids from 251 mechanical signals of the ECM. To test if the epithelial cells exert mechanical forces on the surrounding 252 ECM, we cultured the organoids in fluorescently labelled collagen. When cells pull on the collagen 253 fibers, the fibers are aligned closer together, increasing fluorescent signal intensity. Aligned collagen was visible around branch necks of the FGF2-wt-treated organoids, but not around the massively
 branched FGF2-STAB-treated organoids (Figure 5C), demonstrating lack of mechanotransduction
 between the FGF2-STAB-treated organoid and the surrounding ECM.

257 Furthermore, by histological examination we noticed that by their bulb shape and extensive 258 stratification, the massive branches of FGF2-STAB-treated organoids morphologically resembled 259 terminal end buds (TEBs) of mammary gland in vivo (Figure 5D), the structures that drive mammary 260 epithelial branching morphogenesis during puberty (Paine and Lewis, 2017). FGF2-wt-treated organoids contained branches formed mostly from a bi-layered epithelium and only some tips of the 261 262 branches contained more than two layers of cells. Thereby, they resembled side branches in the 263 mammary gland in vivo (Figure 5D). Immunohistological analysis of epithelial cell markers further 264 accentuated the similarities between the normal and massive branches ex vivo and side branches and 265 TEBs in vivo, respectively (Figure 5D). Moreover, the myoepithelial cells in massive branches of FGF2-266 STAB-treated organoids displayed a cuboidal shape similar to cap cells of TEBs, while the myoepithelial 267 cells in the FGF2-wt-treated organoids and in the mammary ducts/side branches in vivo were flatter, 268 based on their height to width ratio on organoid and tissue sections (Figure 5E, F). Collectively, the 269 histology, lack of massive branch elongation in collagenous ECM, and increased regenerative potential 270 of FGF2-STAB-treated organoids (Figure 2H; Supplemental Figure 7A-D) suggest that the massive 271 branches of FGF2-STAB-treated organoids are ex vivo counterparts TEBs in vivo. Thus, our findings 272 propose that distinct signaling dynamics encode different morphogenetic outcomes of physiological 273 relevance (Figure 5G).

274 Discussion

275 In this study, we investigated the role of FGF signaling dynamics in epithelial morphogenesis using the 276 model of mammary epithelial organoids. FGF signaling is a well-established regulator of mammary 277 gland branching morphogenesis (Ewald et al., 2008; Lu et al., 2008; Parsa et al., 2008; Pond et al., 2013; 278 Sumbal and Koledova, 2019; Zhang et al., 2014). In vivo studies using genetic mouse models revealed 279 roles of particular FGFRs in mammary gland morphogenesis (Lu et al., 2008; Parsa et al., 2008). Ex vivo 280 3D cultures of mammary epithelial organoids have elucidated the effects of individual FGF ligands on 281 mammary epithelium (Ewald et al., 2008; Fata et al., 2007; Simian et al., 2001; Zhang et al., 2014). 282 Thus, the role of FGF signaling in mammary epithelial morphogenesis has been well defined on the 283 qualitative level; however, the quantitative aspects of FGF signaling, including the role of FGF signaling 284 dynamics, have not been studied.

285 Using two variants of FGF2 with very different protein stabilities, and different medium 286 changing strategies we exposed organoids to various dynamics of FGF2 availability. We discovered that 287 fluctuant FGF2 signaling induces formation of thin branches, and that sustained FGF2 signaling leads 288 to formation of massive, wide branches. In comparison to fluctuant FGF2 signaling, sustained FGF2 289 signaling led to increased activity of all FGFR downstream signaling pathways. In particular, ERK activity 290 was increased and prolonged in FGF2-STAB-treated organoids in comparison to FGF2-wt-treated 291 organoids. ERK activity dynamics has been suggested to play a key role in regulating mammary 292 epithelial branching morphogenesis in response to different growth factors. In mammary organoid 293 culture, TGF α induced sustained ERK activation and epithelial branching, and FGF7 induced only 294 transient ERK activation and epithelial growth (Fata et al., 2007). Our study corroborates and extends 295 these findings by demonstrating that different ERK activity dynamics, induced downstream of the same 296 receptor, regulate mammary epithelial patterning and morphogenesis. Our study is, however, limited 297 by endpoint-type analytical approaches to ERK activity quantification (immunodetection on fixed 298 samples or Western blot and qPCR analysis at defined timepoints). Future studies using ERK activity 299 biosensors (de la Cova et al., 2017; Komatsu et al., 2011) would be very helpful to elucidate ERK 300 signaling dynamics during mammary epithelial morphogenesis in a much greater detail. Such studies 301 could also help to define the role of ERK signaling domains in epithelial branch patterning and 302 elongation. We found that domains of active ERK were larger in FGF2-STAB-treated organoids than in 303 FGF2-wt-treated organoids and coincided with branch formation sites, suggesting that the size of ERK 304 activity domains determines the diameter of nascent branches. Our experimental data are in 305 agreement with computational simulations of multicellular morphogenesis using reaction-diffusion 306 patterning, in which activator concentration and patterning determine morphological outcome of 307 branching (Okuda et al., 2018). It remains to be determined, how ERK signaling domains become 308 specified within the mammary epithelium.

309 Previous reports suggested that spatial enrichment of active ERK at the tips of the branches 310 drives branch elongation (Huebner et al., 2016). In our model, active ERK was spatially enriched in cells 311 in distal tips of the branches during both normal and massive branching. However, the branches 312 efficiently elongated only in the FGF2-wt-treated organoids. The phenotype was even more prominent 313 in ECM composed of Matrigel with collagen I that was previously demonstrated to promote formation 314 of significantly longer branches than pure Matrigel (Nguyen-Ngoc and Ewald, 2013). This suggests that 315 under sustained FGF2 signaling, epithelial stratification is dominant over epithelial cell intercalation 316 into basal surface, the mechanism required for epithelial tube elongation (Neumann et al., 2018). This 317 is probably due to changes in mechanosignaling in myoepithelial cells and/or changes in their mechanical properties, as suggested by changes in myoepithelial cell geometry and lack of force-318 319 mediated collagen I assembly under sustained FGF2 signaling.

320 ERK dynamics alone does not predict the cellular outcome. Rather, cell fate depends on a 321 combination of downstream signaling activities induced by particular growth factor dynamics (Chen et 322 al., 2012; Sampattavanich et al., 2018). On tissue level we detected contribution of AKT-mediated cell 323 activities to epithelial branching, and we identified AKT signaling as a crucial regulator of epithelial 324 stratification and massive branching phenotype. Furthermore, we pinpointed the important role of 325 "basal" AKT signaling, provided by insulin present in the basal medium during ex vivo culture. This is 326 consistent with essential role of insulin-like growth factor 1 in ductal morphogenesis and formation of 327 TEBs (Ruan and Kleinberg, 1999), the naturally occurring stratified mammary epithelial structures that 328 drive mammary branching morphogenesis during puberty. Furthermore, our data demonstrate that 329 inputs from several RTKs are integrated on downstream signaling nodes to regulate tissue 330 morphogenesis in concert.

331 Importantly, our work brings novel insights how intracellular signaling activities of ERK and AKT combinatory regulate distinct morphological and functional states of mammary epithelium. Increased 332 333 and prolonged ERK and AKT signaling promotes formation of TEB-like structures, while moderate and transient ERK and AKT signaling induces formation of thin branches. In our model these distinct 334 335 downstream signaling activities and morphogenetic outcomes were induced by different FGF2 336 signaling dynamics and are in concordance with the essential roles of FGF signaling in TEB formation 337 during puberty and in side branching and alveologenesis during pregnancy (Lu et al., 2008; Parsa et al., 338 2008). The potential mechanisms for regulation of FGF signaling dynamics in vivo include differential 339 production, retention and distribution of FGF ligands in the mammary stroma, differential expression 340 of FGFR isoforms, or differential use of downstream feedback loops (Soady et al., 2017). Furthermore, 341 in vivo the distinct ERK and AKT signaling activities most likely result from combinatorial effects of 342 several growth factors and other signals, such as matrix metalloproteinases, present in the mammary 343 stroma during postnatal mammary gland development, which collectively regulate mammary gland 344 morphogenesis (Gjorevski and Nelson, 2011; Mori et al., 2013).

Our study also revealed that the distinct morphological states of mammary epithelium differentially engage ECM to further support epithelial morphogenesis. The non-stratified, side branchlike epithelial structures exert mechanical forces on surrounding collagen, which promotes branch elongation. However, the highly stratified TEB-like epithelial structures do not engage collagen in the surrounding matrix. These findings are in agreement with substantial collagen organization around mammary ducts and necks of TEBs, and lack of organized collagen around TEBs in vivo (Brownfield et al., 2013; Hinck and Silberstein, 2005; Lilla and Werb, 2010).

Nevertheless, we acknowledge that by their high proliferation, decreased apoptosis, increased stem cell properties, and multi-layered architecture with intact myoepithelial cell layer, the massively branched epithelial structures induced by sustained FGF2 signaling resemble not only TEBs, but also early, non-invasive stages of breast tumors, including hyperplasia, and their in vitro models induced by oncogenic RTK-Ras signaling (Muthuswamy et al., 2001; Welm et al., 2002). This testifies to the common critical cellular and signaling mechanisms used in both morphogenesis and cancerogenesis.

358 Precise regulation of complex cell behaviors on population level is essential for building 359 functional tissues and organs. It is achieved by cell communication codes that we are only beginning 360 to unravel. Understanding of the signaling codes in development is required for our understanding of aberrant signaling in developmental defects and disease, including cancer, and development of 361 effective therapies. Moreover, it is an essential prerequisite for tissue engineering, stem cell therapy 362 and regenerative medicine. Our study brings insights on how FGF signal availability regulates epithelial 363 364 branched pattern formation. Future studies using multi-dimensional measurements of intracellular signaling activities on tissue scale with single-cell resolution shall help decipher the cell communication 365 366 codes, including the relationship between signal processing and cell fate decision-making, during organ 367 development and morphogenesis.

368 Methods

369 Mice

Nulliparous ICR females, 6-8 weeks old were used in this study. The animals were obtained from the
 Laboratory Animal Breeding and Experimental Facility of the Faculty of Medicine, Masaryk University.
 Experiments involving animals were approved in accordance with the Ministry of Agriculture of the
 Czech Republic, and the Expert Committee for Laboratory Animal Welfare at the Faculty of Medicine,
 Masaryk University.

375 Organoid isolation and culture

376 Organoid isolation was performed as previously described (Koledova and Lu, 2017). Briefly, the mice 377 were euthanized by cervical dislocation, the mammary glands were removed, mechanically 378 disintegrated and partially digested in a solution of collagenase and trypsin [2 mg/ml collagenase 379 (Sigma), 2 mg/ml trypsin (Thermo Fisher Scientific), 5 µg/ml insulin (Sigma), 50 µg/ml gentamicin 380 (Sigma), 5% fetal bovine serum (FBS; Hyclone) in DMEM/F12 (Thermo Fisher Scientific)] for 30 min at 381 37°C with shaking at 100 rpm. Resulting tissue suspension was treated with 20 U/ml DNase I (Sigma) 382 and exposed to five rounds of differential centrifugation at $450 \times g$ for 10 s, which resulted in separation of epithelial (organoid) and stromal fractions. The organoids were resuspended in basal 383 384 organoid medium [BOM; 1× ITS, 100 U/ml of penicillin, and 100 µg/ml of streptomycin in DMEM/F12 385 (all from Thermo Fisher Scientific)] and counted.

Subsequently, the organoids were mixed with ECM, either pure Matrigel or a mixture of Matrigel with collagen I. The mixture of Matrigel with collagen I was prepared as previously published (Koledova, 2017). Briefly, pre-assembled neutralized collagen I was prepared by combing 12.5 volumes of collagen type I (Corning) with 1 volume of 0.22 M NaOH, 5× collagen reconstitution buffer (5× MEM,
 20 µg/ml NaHCO₃, 0.1 M Hepes), and DMEM/F12 to the final concentration 2.58 mg/ml collagen and
 incubation of the neutralized collagen I for 1.5 h on ice. Then pre-assembled collagen was mixed with
 Matrigel at the ratio 7:3 and this mixture was immediately used to plate organoids. Fluorescently
 labelled collagen I was prepared according to a published protocol (Geraldo et al., 2013) using TAMRA
 (Sigma).

395 The organoids in ECM were plated in 50 µl domes at following densities: 250-300 organoids 396 per dome for time-lapse and whole mount immunofluorescent analysis, 300-500 organoids per dome 397 for histological and transcriptional analysis, 500-1,000 organoids per dome for Western blot analysis. 398 After setting the ECM for 45-60 min at 37°C, the cultures were overlaid with BOM supplied with no 399 FGF, or with FGF2-wt or FGF2-STAB (Enantis) according to the experiment. Unless stated otherwise, 400 concentration of FGF2 was 1 nM. The cultures were incubated in a humidified atmosphere of 5% CO₂ 401 at 37°C on Olympus IX81 microscope equipped with Hamamatsu camera and CellR system for time-402 lapse imaging. The organoids were photographed every 60 min for 9 days with manual refocusing every 403 day. For analysis of cell proliferation, 10 µM BrdU (Sigma) was added to the medium 3 h prior to 404 organoid culture fixation.

For long term culture, organoids were cultured for 30 days with media changed every 3 days.
 Then Matrigel with organoids was disrupted with a 1 ml pipette and treated with trypsin-EDTA for 5
 min, passed through a 25-gauge needle to obtain single cells. 30,000 cells were seeded in 50 μl Matrigel
 and treated with BOM with appropriate growth factors. The cells were cultured for 16 days with media
 changed every 3 days.

For inhibitor assays, the organoid cultures were treated with inhibitors in concentrations as indicated (Supplemental Table 1). Fresh medium with 1 nM FGF2 and/or inhibitors was changed every 3 days if not indicated otherwise.

413 Organoid morphology analysis

Organoid branching was evaluated in ImageJ from time-lapse videos and branching was defined as formation of a new bud/branch from the organoid. Branches wider than 150 μm were considered as "massive branches". 20 organoids per condition per experiment were analyzed, organoids that fused with another organoid or collapsed after attachment to the bottom of the well were excluded from the quantification.

419 Organoid histology, immunohistochemistry and immunofluorescence on histological sections

Organoid cultures were washed 3 times with PBS and fixed for 30 min in 4% paraformaldehyde
 (Electron Microscopy Sciences). After washing with PBS, the cultures were embedded in 3% low gelling
 temperature agarose (Sigma). After solidification, the samples were dehydrated and embedded in
 paraffin. Sections (5 µm thick) were cut and dewaxed for hematoxylin and eosin staining or
 immunostaining.

For immunohistochemistry, antigens were retrieved in Citrate buffer, pH 6 or Tris-EDTA buffer, pH 9 (both Dako), endogenous peroxidase activity was blocked using 3% hydrogen peroxide and sections were blocked in PBS with 10% FBS (blocking buffer) for 1 h. Then, sections were incubated with primary antibody in blocking buffer for 2 h. After washing, sections were incubated with secondary antibody in blocking buffer for 30 min. Nuclei were counterstained with Mayer's hematoxylin, sections were dehydrated and mounted in Pertex (Histolab Products). The samples were photographed using Leica DM5000 equipped with Leica DFC480 camera. To perform immunofluorescence staining, antigens were retrieved in Citrate buffer, pH 6 or Tris-EDTA buffer, pH9 (both Dako), blocked in PBS with 10% FBS (blocking buffer) for 1 h and incubated with primary antibodies in blocking buffer overnight. After washing, sections were incubated with secondary antibodies in blocking buffer for 2 h. Nuclei were counterstained with DAPI for 10 min and slides were mount with Mowiol (Sigma). The samples were photographed using Leica DM5000 equipped with Leica DFC480 camera or Zeiss Axioimager 2. Antibodies and their concentrations used in this study are listed in Supplemental Table 2.

439 Whole-mount organoid staining

440 For whole-mount imaging, organoids were 3D cultured in coverslip-bottom dishes (Ibidi). Organoid 441 cultures were fixed with 4% paraformaldehyde for 30 min, permeabilized in 0.05% Triton X-100 in PBS 442 for 1 h and blocked for 3 h with blocking buffer. Primary antibodies (Supplemental Table 2) diluted in 443 blocking buffer were incubated with samples overnight at 4°C. After washing, samples were incubated 444 with secondary antibodies (Supplemental Table 2) and 2 U/sample phalloidin-AlexaFluor488 (Thermo 445 Fisher Scientific) in blocking solution for 2 h in darkness. Subsequently, samples were stained with 0.5 446 µg/ml DAPI (Merck) for 10 min and stored in PBS in 4°C in darkness until analyzed. The organoids were 447 imaged using an LSM800 confocal microscope (Zeiss) and analyzed and exported using ZEN blue 448 software (Zeiss).

449 Mammary gland processing for histology

For histological analysis, 4th mammary glands were removed from euthanized mice, spread on
 microscopy slide and fixed overnight in 4% paraformaldehyde. After washing in tap water, mammary
 glands were moved to histological cassettes and processed via standard procedure for paraffin
 embedding. Paraffin sections were cut (5 μm thick), dewaxed using xylene and rehydrated for
 hematoxylin and eosin staining or immunostaining.

455 Tranmission electron microscopy

456 The samples were fixed with 3% glutaraldehyde in 100 mM sodium cacodylate buffer, pH 7.4 for 45

457 min, postfixed in 1% OsO₄ for 50 min, and washed with cacodylate buffer. After embedding in 1% agar

458 blocks, the samples were dehydrated in increasing ethanol series (50, 70, 96, and 100%), treated with

- 459 100% acetone, and embedded in Durcupan resin (Merck). Ultrathin sections were prepared using LKB
- 460 8802A Ultramicrotome, stained with uranyl acetate and Reynold's lead citrate (Merck), and examined
- 461 with FEI Morgagni 286(D) transmission electron microscope.

462 Mammosphere assay

To test primary mammosphere formation efficiency, organoids which had been treated with BOM 463 only, 1 nM FGF2-wt or 1 nM FGF2-STAB, were resuspended on day 4 of culture in 5 mM EDTA in PBS 464 465 and shaken at 200 rpm on orbital shaker on ice for 1 h to dissolve the Matrigel. After washing with PBS, 466 organoids were treated with HyQtase (Hyclone/GE Healthcare) for 10 min at 37°C and disintegrated 467 by passing through a 24-gauge needle to acquire single cell suspension. Cells were then resuspended 468 in mammosphere medium [1×B27 without vitamin A, 100 U/ml of penicillin, 100 µg/ml of streptomycin 469 (all Thermo Fisher Scientific), 4 µg/ml heparin (Sigma), 20 ng/ml epidermal growth factor (Peprotech), 470 10 ng/ml FGF2-wt (Enantis) in phenol red-free DMEM/F12 (Thermo Fisher Scientific)] and seeded in 471 polyHEMA-coated 6-well plates in concentration 20,000 cells per well. Fresh medium was provided 472 every 3 days. After 9 days of culture, mammospheres were counted and mammosphere formation 473 efficiency was calculated as number of formed mammospheres divided by number of cells seeded × 474 100. To assess secondary and tertiary mammosphere formation efficiency, primary or secondary mammospheres, respectively, were treated with HyQtase for 10 min at 37°C and disintegrated by
passing through a 24-gauge needle to acquire single cell suspension. 20,000 cells per well were seeded
in polyHEMA-coated 6-well plates in mammosphere medium and cultured and quantified similarly as
primary mammospheres.

479 Western blot

480 Organoid cultures were disintegrated by pipetting up and down in ice cold PBS with phosphatase 481 inhibitors (10 mM β -glycerophosphate, 5 mM NaF, 1 mM Na₃VO₄), spun down and lysed in RIPA buffer 482 (150 mM NaCl, 1.0% NP-40, 0.5% sodium deoxycholate, 0.1% SDS, 50 mM Tris, pH 8.0) supplied with proteinase and phosphatase inhibitors (10 mM β -glycerophosphate, 5 mM NaF, 1 mM Na₃VO₄, 1 mM 483 484 dithiotreitol, 0.5 mM phenylmethanesulphonylfluoride, 2 μ g/ml aprotinin, 10 μ g/ml leupeptin; all 485 Merck). Protein lysates were homogenized by sonication, cleared by centrifugation and protein 486 concentration was measured using the Bradford reagent. Denatured, reduced samples were resolved 487 on 10% SDS-PAGE gels and blotted onto PVDF membranes (Merck). Membranes were blocked with 5% 488 non-fat milk in PBS with 0.05% Tween-20 (Merck; blocking buffer) and incubated with primary 489 antibodies (Supplemental Table 2) diluted in blocking buffer overnight at 4°C. After washing in PBS 490 with 0.05% Tween-20, membranes were incubated with horseradish peroxidase-conjugated secondary 491 antibodies (anti-mouse antibody and anti-rabbit antibody, Cell Signaling Technology) for 1 h at room 492 temperature. Signal was developed using an ECL substrate (100 mM Tris-HCl, pH 8.5, 0.2 mM coumaric 493 acid, 1.25 mM luminol, 0.01% H₂O₂; all Merck) and exposed on X-ray films (Agfa), which were then 494 scanned, and band density was analyzed using ImageJ. Phosphorylated and total proteins and actin 495 were analyzed on a single blot.

496 **qRT-PCR**

497 Organoid cultures were disintegrated by pippetting up and down in RLT buffer (Qiagen) and RNA was 498 isolated using RNeasy Mini Kit (Qiagen) according to the manufacturer's instruction. RNA 499 concentration was measured using NanoDrop 2000 (Thermo Fisher Scientific). RNA was transcribed 500 into cDNA by using Transcriptor First Strand cDNA Synthesis Kit (Roche) or TaqMan Reverse 501 Transcription kit (Life Technologies). Real-time qPCR was performed using 5 ng cDNA, 5 pmol of the 502 forward and reverse gene-specific primers each (Supplemental Table 3) in Light Cycler SYBR Green I 503 Master mix (Roche) on LightCycler 480 II (Roche). Relative gene expression was calculated using the 504 $\Delta\Delta$ Ct method and normalization to two housekeeping genes, β -actin (*Actb*) and Eukaryotic elongation 505 factor 1γ (*Eef1g*).

506 Mathematical modeling of FGF2 concentration dynamics

507 Mathematical modeling of FGF2 concentration dynamics was based on half-lives of FGF2 variants: 6 h 508 for FGF2-wt and c.a. 720 h for FGF2-STAB) (Dvorak et al., 2018). Function describing change in 509 concentration (y) dependent on time (x) was determined as shown in (A1).

$$f(t) = c_0 \times \left(\frac{1}{2}\right)^{\frac{t}{t_1}}$$
 (A1)

510

- 511 In (A1) c_0 is initial concentration of FGF2, t is time in hours and $t_{1/2}$ is half-life of FGF2. For conditions of
- 512 1 nM FGF with media not changed, function of FGF2 concentration dynamics was determined for FGF2-
- 513 wt and FGF2-STAB, respectively, as shown in (A2).

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$$f_{FGF2-wt}(t) = \left(\frac{1}{2}\right)^{\frac{t}{6}} \qquad f_{FGF2-STAB}(t) = \left(\frac{1}{2}\right)^{\frac{t}{720}}$$
(A2)

515 The area under the curve (AUC) was calculated as a sum of definite integrals with defined intervals as 516 shown in (A3),

 $\sum_{1}^{N} \int_{0}^{T} c_{0} \times \frac{1}{\frac{t}{2}^{\frac{t}{t_{1}}}} \times dt$ (A3)

517

514

518 Where N is number of media changes (1 for NC; 3 for C3d; 9 for Ced; 36 for C6h); T is a time period 519 determining the duration between two media changes (216 for NC; 72 for C3d; 24 for Ced; 6 for C6h); 520 c_0 is initial concentration; t is time and $t_{1/2}$ is half-life of FGF2.

521 For experiments where medium with FGF2 was washed out, FGF concentration after the washout was 522 determined as zero. For experiment where FGF2 ligands were added every 6 h without changing the 523 medium, the AUC was calculated as a sum of definite integrals of single 6 h intervals with the $c_0=a$ 524 determined for each interval separately as a function of a sequence given as shown in (A4) and (A5).

wt:
$$a_1 = 1$$
; $a_{n+1} = 1 + \frac{1}{2}a_n$ (A4)

525

526

STAB: $a_1 = 1$; $a_{n+1} = 1 + \frac{1}{2} \times \frac{6}{720} a_n$ (A5)

527 Statistical analysis

Statistical analysis was performed using Prism software (GraphPad) using unpaired Student's t-test or
 ANOVA. *P < 0.05, **P < 0.01, ***P < 0.001, ****P < 0.0001. Line plots and bar graphs were generated
 by Prism or Microsoft Excel and show mean ± standard deviation (s.d.).

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542 Author Contributions

543 J.S. designed and performed the experiments, analyzed the data and wrote the manuscript. Z.K. 544 conceptualized the study, secured funding, designed and performed the experiments, analyzed the

- 545 data and wrote the manuscript. T.V. performed immunostainings and analyzed the data. All authors
- 546 approved the final manuscript.

547 Conflict of Interest

548 The authors declare that they have no conflict of interest.

549 Materials & Correspondence

550 Correspondence and requests for materials should be addressed to Z.K.

551 Data availability

- 552 Data supporting the findings of this work are available within the paper and its Supplemental
- 553 Information files. Other data are available from the corresponding author upon reasonable request.

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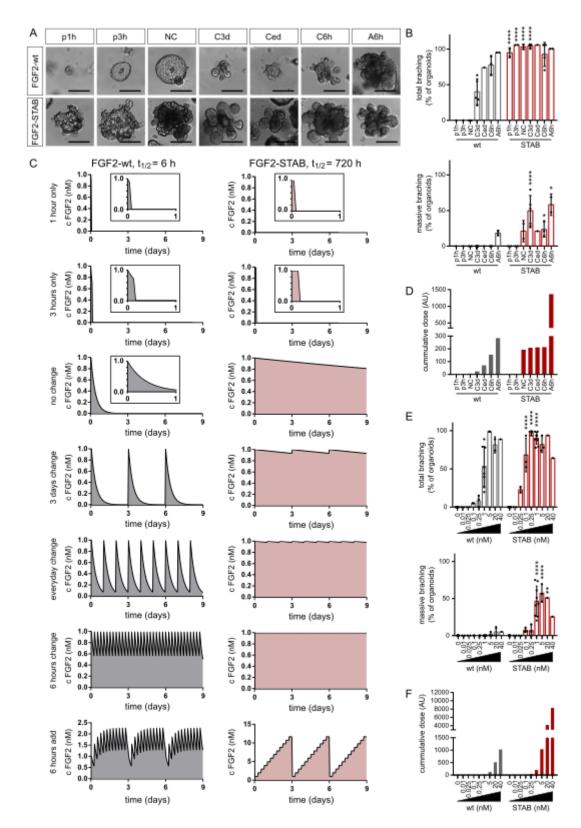
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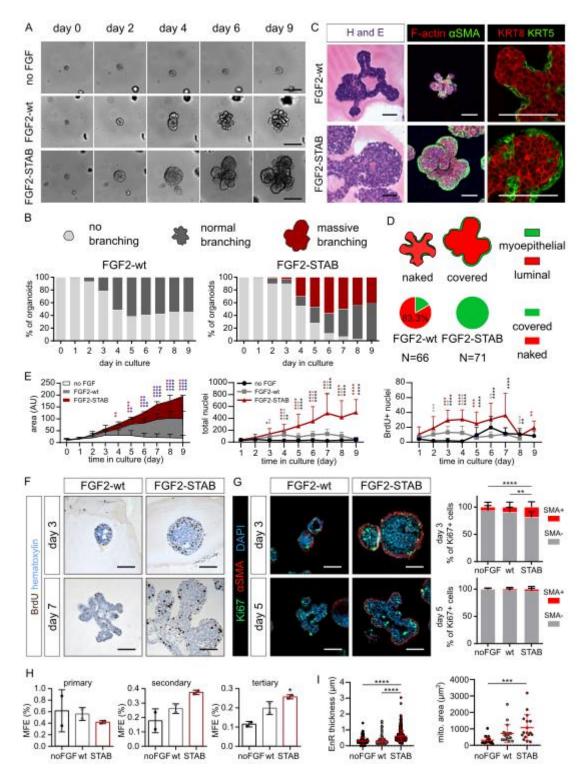


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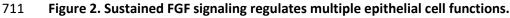
685 Figure 1. FGF signaling dynamics governs epithelial morphogenesis.

A. Organoids after 9 days of culture with different FGF signaling dynamics as depicted in C. Scale bars,
 200 μm. P1h, 1-hour pulse; p3h, 3-hour pulse; NC, medium was not changed during the whole 9-day
 culture of organoids; C3d, medium was changed every 3 days; Ced, medium was changed every day;
 C6h, medium was changed every 6 h; A6h, fresh FGF2 was added to the medium every 6 h and every
 3 days, the full medium volume was changed.

- 691 **B.** Total (normal + massive) branching and massive branching of organoids subjected to different 692 medium changing strategies. The plots show mean + s.d., N = 20-100 organoids, n = 1-5 independent 693 experiments; for exact numbers see Supplemental Table 4. The asterisks indicate significant difference 694 between FGF2-wt and FGF2-STAB per condition; *P < 0.05; ****P < 0.0001 (two-way ANOVA).
- 695 **C.** The graphs show mathematic models of FGF2 concentration dynamics in culture during different
- 696 medium changing strategies. The models are based on the FGF2 half-lives (6 h for FGF2-wt and 720 h
- 697 for FGF2-STAB). Potential active FGF2 degradation or production by the cells was not accounted for.
- FGF2-wt is depicted in grey, FGF2-STAB in pink. Insets show detail of FGF dynamic during the first dayof culture.
- **D.** The plot shows cumulative FGF2 dose, calculated from the mathematic model of FGF2
 concentration dynamics as the area under the curves shown in **C**.
- 702 **E.** Analysis of organoid morphogenetic response to a range of FGF2 concentrations. The plots show
- 703 quantification of total (normal + massive) branching and massive branching of organoids, respectively,
- in response to a range of FGF2 concentrations. The plots show mean + s.d., N = 20-180 organoids, n =
- 1-9 independent experiments; for exact numbers see Supplemental Table 4. The asterisks indicate
- significant difference between FGF2-wt and FGF2-STAB per condition; **P < 0.01; ****P < 0.0001 (two-
 way ANOVA).
- 708 **F.** The plot shows cumulative FGF2 dose, calculated from the mathematic model of FGF2 concentration
- 709 dynamics as the area under the curve.



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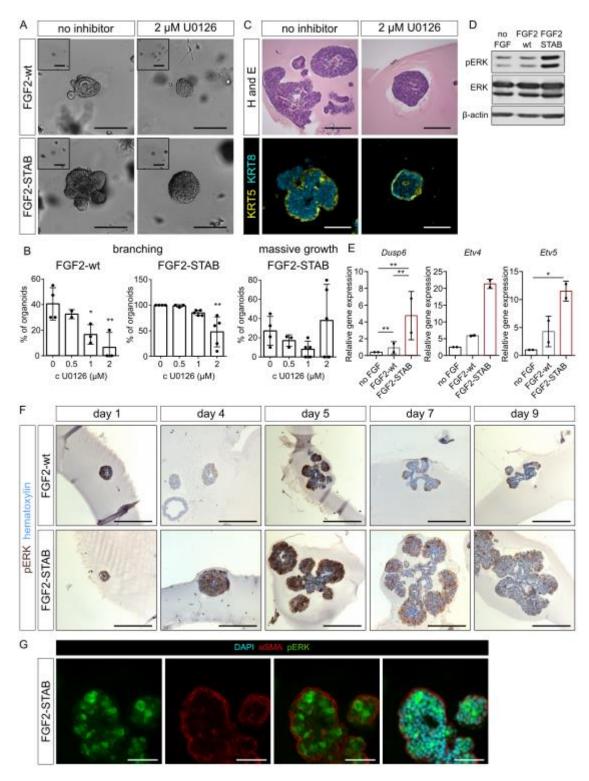
A. Morphogenesis of organoids with no FGF, 1 nM FGF2-wt, or 1 nM FGF2-STAB. Snapshots are from
 a time-lapse experiment (see also Supplemental Videos 1-3). Scale bars, 200 μm.

B. Temporal analysis of organoid morphogenetic phenotypes. Light gray, no branching; dark gray

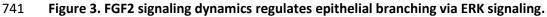
normal branching; dark red, massive branching. A sum of three independent experiments with 20

716 organoids tracked per condition per experiment.

- 717 **C.** Whole-mount, histology and immunofluorescence of FGF2-wt- or FGF2-STAB-treated organoids.
- αSMA, α smooth muscle actin; H and E, hematoxylin and eosin; KRT5, keratin 5; KRT8, keratin 8. Scale
 bars, 100 μm.
- 720 **D.** Quantification of branch coverage with α SMA+ cells.
- 721 E. Quantification of organoid growth from time-lapse experiments and from total number of nuclei or
- 722 BrdU+ nuclei (shown in **B** and Supplemental Figure 5A). The plot shows mean + s.d., n = 3, N = 60
- 723 organoids (time-lapse) and N = 3-40 organoids (histology) per condition; for exact numbers see
- Supplemental Table 5. Red asterisks indicate the difference between FGF2-STAB and no FGF, blue
- asterisks between FGF2-wt and no FGF, black asterisks between FGF2-wt and FGF2-STAB. *P < 0.05;
- **P < 0.01; ***P < 0.001; ****P < 0.0001 (two-way ANOVA for time-lapse experiment; multiple t-tests
 with Holm-Sidak's test for histology).
- **F.** BrdU staining of organoids treated with FGF2-wt or FGF2-STAB for 3 or 7 days. Scale bars, 50 μm.
- 729 **G.** Ki67 and αSMA staining of organoids treated with FGF2-wt or FGF2-STAB for 3 or 5 days and
- quantification of α SMA-/ α SMA+ cell proportion among Ki67+ cells. Scale bars, 50 μ m. The plots show
- 731 mean + s.d., N = 11-50 organoids per condition (see Supplemental Table 5). ** P < 0.01, ****P < 0.0001
- 732 (two-way ANOVA).
- 733 **H.** Endoplasmic reticulum (EnR) thickness and mitochondrial area of organoids. The plots show mean
- t s.d. N = 116, 234, and 436 of ER cisternae, and 17, 19, and 17 mitochondria from organoids treated
- with no FGF, FGF2-wt, or FGF2-STAB for 5 days, respectively. ***P < 0.001; ****P < 0.0001 (one-way
- 736 ANOVA).
- 737 I. Primary, secondary and tertiary mammosphere formation efficiency (MFE) of cells from organoids
- 738 cultured with no FGF, FGF2-wt, or FGF2-STAB for 5 days. The plots show mean + s.d., n = 2 independent
- 739 experiments. *P < 0.05 (one-way ANOVA).



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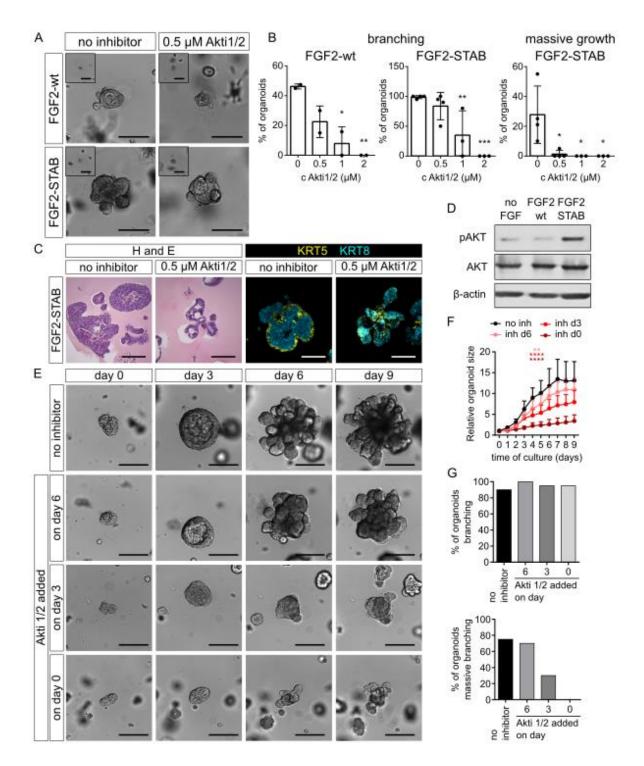


A. Organoids cultured with FGF2-wt or FGF2-STAB and with or without ERK inhibitor U0126 for 9 days.
 Insets show organoids on day 0. Scale bars, 200 μm.

- 744 **B.** Quantification of organoid morphogenetic response total branching or massive growth to ERK
- inhibitor at a range of concentrations. The plots show mean + s.d., n = 2-4 independent experiments,
- N = 20 organoids per experiment; for exact numbers see Supplemental Table 4. *P < 0.05; **P < 0.01;
- 747 ***P < 0.001 (one-way ANOVA).

- 748 **C.** Histological and immunofluorescence analysis of FGF2-STAB-treated organoid architecture upon
- ERK inihibitor treatment. H and E, hematoxylin and eosin; KRT5, keratin 5; KRT8, keratin 8. Scale bars,
 100 μm.
- **D.** Phosphorylated ERK (pERK) distribution in sections of organoids treated with 1 nM FGF2-wt or FGF2 STAB. Scale bars, 200 μm.
- **E.** Western blot analysis of pERK, total ERK, and β-actin amount in organoids on day 5 in culture, 48 h
 after FGF2 treatment.
- F. qPCR analysis of *Dusp6, Etv4* and *Etv5* gene expression in organoids on day 5 in culture, 48 h after
 FGF2 treatment. The plots show mean + s.d., n = 2. *P < 0.05; **P < 0.01 (one-way ANOVA).
- FGF2 treatment. The plots show mean + s.d., n = 2. P < 0.05; P < 0.01 (one-way ANOVA).
- **G.** Distribution of pERK in basal (α SMA+) and luminal (α SMA-) cells in a section of organoid treated with ECE2 STAP for E days. Scale bass, EQ um
- 758 with FGF2-STAB for 5 days. Scale bars, 50 $\mu m.$

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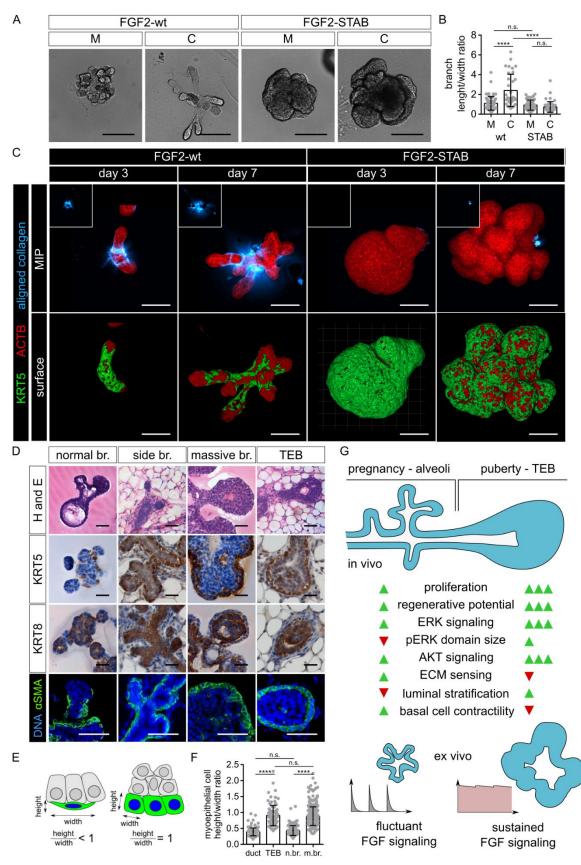
A. Organoids cultured with FGF2-wt or FGF2-STAB and with or without AKT inhibitor (Akti) for 9 days
 of culture. The images of organoids without inhibitor are the same as in Figure 3A because they are
 from the same experiment. Insets show organoids on day 0. Scale bars, 200 μm.

- 764 **B.** Quantification of organoid morphogenetic response total branching or massive growth to
- Akti1/2 at a range of concentrations. The plots show mean + s.d., n = 2-5 independent experiments,
- N = 20 organoids per experiment; for exact numbers see Supplemental Table 4. *P < 0.05; **P < 0.01;
- 767 ***P < 0.001 (one-way ANOVA).

- 768 C. Histological and immunofluorescence analysis of FGF2-STAB-treated organoid architecture upon
 769 Akti treatment. H and E, hematoxylin and eosin; KRT5, keratin 5; KRT8, keratin 8. Scale bars, 100 μm.
- **D.** Western blot analysis of phosphorylated AKT (pAKT), total AKT and β-actin level in organoids on day
- 5 of culture, 48 h after treatment with FGF2.
- 772 E. Organoid morphogenesis in response to FGF2-STAB and no inhibitor or AKT inhibitor (0.5 μM
- Akti1/2) added on day 0, 3 or 6 of culture. The images are snapshots from time-lapse imaging of the organoids. Scale bars, 200 μm.
- **F.** FGF2-STAB-treated organoid size upon no inhibitor or treatment with Akti1/2 on day 0, 3, or 6. The
- plot shows mean + s.d., n = 1 experiment, N = 20 organoids per condition. **P < 0.01; ****P < 0.0001
- 777 (one-way ANOVA). Pink aterisks: control (no inhibitor) to inhibitor on day 6; red aterisks control to
- inhibitor on day 3; dark red aterisks control to inhibitor on day 0).
- G. Quantification of organoid total branching and massive growth in cultures from D. N = 20 organoids
 per condition.

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2 Figure 5. Massive branches phenocopy TEBs.

A. Organoid morphogenesis in response to FGF2-wt and FGF2-STAB in Matrigel (M) or a mixture of
 Matrigel with collagen (C). Scale bars, 100 μm. Representative results of 3 independent biological

785 replicates.

- 786 **B.** Quantification of branch elongation in a mixture of Matrigel with collagen as branch length to width
- ratio. The plot shows mean + s.d., N = 71 (wt, M), 34 (wt, C), 48 (STAB, M) and 50 (STAB, C) branches.
- 788 **C.** Maximum intensity projection (MIP) and surface reconstruction images of organoids cultured in a
- mixture of Matrigel with collagen (fluorescently labelled) and imaged using a confocal microscope.
 Scale bars, 100 µm.
- 791 **D.** Hematoxylin and eosin (H and E; top row), immunohistochemical (second and third row), and 792 immunofluorescence (bottom row) staining on sections of organoids with normal or massive branches,
- and of side branches and TEB in mammary gland tissue. Scale bars, 100 μm.
- F. Scheme depicting morphology of myoepithelial cells (green) with height/width ratio lower or equalto 1. Luminal cells are shown as grey.
- 796 **F.** Quantification of myoepithelial cell height to width ratio of mammary gland side branches and TEBs,
- 797 and normal branches of FGF2-wt-treated organoid and massive branches of FGF2-STAB-treated
- organoids. The plot shows mean + s.d., N = 155 (duct), 98 (TEB), 128 (normal br.) and 423 (massive br.)
 myoepithelial cells. ****P < 0.0001; (one-way ANOVA).
- 800 G. Schematics of cell behaviors and underlying signaling activities in the mammary gland and in ex vivo
- 801 mammary organoid cultures upon different FGF signaling dynamics. MG, mammary gland; TEB,
- terminal end bud.