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Oncofetal reprogramming drives phenotypic plasticity in WNT-dependent colorectal cancer

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Targeting cancer stem cells (CSCs) is crucial for effective cancer treatment, yet resistance mechanisms to LGR5⁺ CSC depletion in WNT-driven colorectal cancer (CRC) remain elusive. In the present study, we revealed that mutant intestinal stem cells (SCs) depart from their canonical identity, traversing a dynamic phenotypic spectrum. This enhanced plasticity is initiated by oncofetal (OnF) reprogramming, driven by YAP and AP-1, with subsequent AP-1 hyperactivation promoting lineage infidelity. The retinoid X receptor serves as a gatekeeper of OnF reprogramming and its deregulation after adenomatous polyposis coli (APC) loss of function establishes an OnF 'memory' sustained by YAP and AP-1. Notably, the clinical significance of OnF and LGR5⁺ states in isolation is constrained by their functional redundancy. Although the canonical LGR5⁺ state is sensitive to the FOLFIRI regimen, an active OnF program correlates with resistance, supporting its role in driving drug-tolerant states. Targeting this program in combination with the current standard of care is pivotal for achieving effective and durable CRC treatment.

Colorectal cancer (CRC) is the second leading cause of cancer-related mortality worldwide¹. Treatment failure in WNT-driven CRC has traditionally been attributed to the malignant features of LGR5⁺ (leucine-rich repeat-containing G-protein-coupled receptor 5-positive) cancer stem cells (CSCs)²⁻⁵. However, recent evidence contests this notion, demonstrating that selective ablation of this population is insufficient for achieving durable tumor regression^{6,7}. Notably, phenotypic plasticity is increasingly recognized as a mechanism of tumor escape from targeted therapies in various cancers⁸⁻¹¹. Yet, it remains unclear whether tumor evolution and adaptability in CRC are driven by cellular plasticity,

distinct cell populations, or a combination of both. In the present study, we elucidate the evolution of neoplastic cell states and their underlying epigenetic mechanisms throughout CRC progression and provide a mechanistic foundation to enhance the effectiveness and durability of current therapies.

Results

A dynamic phenotypic continuum during CRC evolution The presence of an LGR5⁻ fetal-like population has been well documented in $BRAF^{mut}/MMRd$ (mismatch repair-deficient) CRC^{12,13}.

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Although considered a feature of WNT-independent tumors^{14,15}, recent work suggests that the fetal-like state can be adopted by LGR5⁺ stem cells in *Apc* mutant premalignant lesions¹⁶. As a similar aberrant state emerges only transiently in the regenerating epithelium^{17,18}, its persistence beyond the precancerous stage in WNT-driven CRC remains unclear. Without a comprehensive understanding of its temporal dynamics during tumor evolution and its biological importance, assessing the clinical relevance of this aberrant state is challenging.

To elucidate cell state dynamics along the entire malignancy continuum, we generated isogenic mouse organoid models that mimic the clinical progression of WNT-driven CRC (Fig. 1a and Extended Data Fig. 1a). Specifically, we induced common driver mutations in intestinal SCs using Lgr5-driven CreERT2 (Extended Data Fig. 1a). Transcriptome profiling of single cells from normal wild-type (WT) intestinal organoids, precancerous Apc^{null} (A) and advanced malignant Apc^{null}::Kras^{G12D}:: Smad4^{null}::Trp53^{null} (AKSP) tumoroids revealed the emergence of tumor-specific cell clusters (Extended Data Fig. 1b,c and Supplementary Table 1a,b). Notably, cells within this neoplastic metacluster re-expressed markers of fetal intestinal progenitors¹⁹ (Extended Data Fig. 1d and Supplementary Table 1c). We henceforth refer to this population as oncofetal (OnF) and define a 51-gene signature (Extended Data Fig. 1e and Supplementary Table 1d) to chart and track its dynamics during tumorigenesis. Changes in cellular composition along the CRC malignancy continuum were characterized by a significant reduction in enterocytes, indicative of a differentiation block in tumoroids (Fig. 1b, Extended Data Fig. 1f and Supplementary Table 1e). Moreover, although a burst of LGR5⁺ SCs was triggered by adenomatous polyposis coli (APC) loss of function (LoF), a subset of these mutant cells adopted an OnF state (Fig. 1b, Extended Data Fig. 1g,h and Supplementary Table 1e). This observation unveils a heterogeneous response to APC depletion, reconciling divergent claims regarding both the expansion of LGR5⁺ cells¹⁴ and fetal-like reprogramming¹⁶ in WNT-driven precancerous tumors. Intriguingly, the progression to a malignant stage (AKSP) was marked by a decline in canonical LGR5⁺ SCs and a noticeable expansion of OnF cells (Fig. 1b, Extended Data Fig. 1g,h and Supplementary Table 1e). These data indicate that, contrary to the transient emergence of fetal-like cells in response to injury¹⁷, the OnF state is perpetuated in CRC. This raises the question of whether OnF reprogramming generates a discrete, de novo cellular entity. Analysis of the evolution of SC phenotypes along the CRC malignancy continuum confirmed that healthy intestinal SCs are exclusively in an LGR5⁺ state (Fig. 1c.d). However, their neoplastic counterparts did not distinctly adopt either this canonical state or the OnF state but rather appeared to traverse a phenotypic spectrum delimited by these cellular states (Fig. 1c,d and Extended Data Fig. 1g-i). Although most cells along this spectrum retain Lgr5 expression, extreme OnF states are Lgr5- (Extended Data Fig. 1j). Collectively, these findings indicate that, although cell plasticity is tightly regulated in the healthy epithelia, APC LoF is sufficient to lift these restrictive barriers. The subsequent expansion of plastic potential during CRC progression suggests that accumulation of additional mutations may instruct cell state dynamics. To investigate the effects of various genetic events subsequent to APC LoF, we analyzed the transcriptome of dual mutant tumoroids (that is, Apc^{null}::Smad4^{null} = AS, Apc^{null}::Kras^{G12D} = AK and Apc^{null}::Trp53^{null} = AP). This analysis indicated that SMAD4 LoF has a limited effect on fate decision, whereas KRASGI2D mutation and TP53 LoF favor the OnF and canonical LGR5⁺ states, respectively (Extended Data Fig. 1k).

These genetically engineered models offer an ideal platform for accurately investigating cell state dynamics, free from confounding factors typically associated with human datasets, such as treatment exposure and inconsistent temporal sampling. Nevertheless, given the inherent genetic heterogeneity and microenvironmental diversity among patients, we defined a human OnF signature to investigate OnF reprogramming in patients with CRC (Methods and Supplementary Table 1f). Our analysis of matched normal colons and adenocarcinomas from the Cancer Genome Atlas Colon Adenocarcinoma (TCGA/COAD) dataset confirmed activation of the OnF program in CRC (Extended Data Fig. 2a). Moreover, single-cell analysis of the Broad and SMC/ KUL3 CRC cohorts^{20,21} unequivocally demonstrated that the OnF state is significantly enriched in tumors (Fig. 1e,f). Further examination of 27 samples of matched primary tumors and liver metastases from five patients with CRC²² confirmed its persistence in metastatic tumors (Fig. 1g). Notably, patient stratification based on both mismatch repair (MMR) and *APC* mutation status proved that OnF reprogramming is a common feature in *APC^{mut/}*MSS (microsatellite-stable) CRC (Extended Data Fig. 2b–d). These data address a long-standing ambiguity surrounding OnF reprogramming in WNT-driven CRC^{12–16,18,23,24} and indicate that lack of comparison to adjacent healthy tissue in previous studies led to inaccurate conclusions.

Despite the widespread occurrence of OnF reprogramming in CRC, its biological significance remains largely elusive. We reasoned that this developmental rewind may endow neoplastic cells with enhanced plasticity, enabling them to transcend their typical lineage restraints. Comparative transcriptomic analysis of CRC tumors and various developmental stages of the human gastrointestinal tract²⁵ revealed remarkable similarities across tumors, fetal intestines, and adult stomach tissues (Extended Data Fig. 2e). Overall, we noticed a discernible shift in neoplastic tissue identity from its posterior colonic origins toward more anterior regions of the gut tube (Extended Data Fig. 2f). Further examination of single-cell transcriptomic data using lineage-specific signatures²⁶ (Supplementary Table 1g) corroborated that CRC tumors have acquired a metaplastic multiregional identity (Fig. 1h,i). It is interesting that we noted a significant correlation between the OnF score and lineage plasticity, characterized by a loss of the original colonic identity and acquisition of noncanonical cell fates (Fig. 1j-l and Extended Data Fig. 2g-j).

Collectively, these findings reveal the prevalence of the OnF state in WNT-driven CRC and shed light on its functional significance. During tumor initiation, OnF reprogramming extends the plastic potential of neoplastic SCs beyond their normally restricted capability. The resulting phenotypic spectrum continues to broaden throughout disease progression, leading to lineage infidelity (Fig. 1m). These observations offer insights into why more advanced tumors often exhibit increased resistance to therapies.

Distinct roles of YAP and AP-1 in driving phenotypic plasticity

Despite the potential clinical relevance of OnF reprogramming, its molecular drivers remain poorly characterized. Activation of the Hippo pathway effector YAP (yes-associated pathway) in response to injury^{17,23} or tumor initiation^{23,24,27} induces fetal-like reprogramming. However, our data show a dynamic evolution of OnF states during CRC progression (Fig. 1c,d), indicating a more intricate regulation at play.

To investigate the molecular mechanisms underlying cell state dynamics in CRC, we analyzed the chromatin accessibility landscapes across its malignancy continuum (Extended Data Fig. 3a). Assay for transposase-accessible chromatin using sequencing (ATAC-seq) data revealed a striking evolution of chromatin landscapes across the adenoma-adenocarcinoma sequence. Although most changes induced by APC LoF at the premalignant stage were maintained, additional events emerged during the progression to cancer (Extended Data Fig. 3b). Unsupervised hierarchical clustering of ATAC-seq peaks identified two primary patterns of chromatin accessibility (Fig. 2a). Genomic regions in clusters 1 (c1) and 2 (c2) exhibited reduced and increased accessibility, respectively, in the mutant tumoroids (Fig. 2a and Supplementary Table 2a,b). The progressive nature of these changes reflects the dynamic evolution of neoplastic cell states in CRC (Fig. 1d). To examine their functional significance, we performed transcription factor (TF) footprinting analysis, using TOBIAS²⁸, and calculated a 'combined binding score' to assess TF activity across the malignancy continuum (Methods). C1 was enriched for footprints of



Fig. 1 | Evolution of neoplastic cell states during CRC progression. a, Schematics of the organoid models used to recapitulate the malignancy continuum of CRC. b, The percentage of various cell types and states in the indicated models (n = 3 independent organoid cultures per group). Cell numbers per group are given in Supplementary Table 1a. The bar plots are mean ± s.e.m. Linear regression tested for significant differences in log(transformed cell-type proportions) between genotypes, with P values adjusted using the Benjamini-Hochberg method. c, Percentage of cells in stem and OnF states along diffusion component 1 (DC1), grouped into 500 bins by increasing DC1 values. The bottom color bars show the percentage of cells from each genotype per bin. d, Scatter plot showing cell state distribution along the SC-OnF phenotypic spectrum across the CRC malignancy continuum. Horizontal and vertical box plots indicate OnF and LGR5⁺ SC module score enrichment, respectively (n = 3)independent organoid cultures per group). e-g, Scatter plot depicting cell state distribution along the SC–OnF phenotypic spectrum in the Broad (n = 36patients) (e), SMC/KUL3 (n = 10 patients) (f) and Guangzhou (n = 5 patients) (g) cohorts. The horizontal and vertical box plots indicate OnF and SC module score

the caudal-related homeobox (CDX) and hepatocyte nuclear factor family (HNF) members (Fig. 2b,c and Extended Data Fig. 3c) involved in establishing the caudal identity of intestinal cells and their maturation, respectively^{29–31}. The progressive reduction in activity of these TFs (Extended Data Fig. 3d,e) aligns with the gradual regression to a more primitive state and loss of intestinal identity during CRC evolution enrichment, respectively, PT, primary tumor; Met, metastasis, In d-g, box plots show the center line as the median, box limits as the interguartile range (IQR: 25th to 75th percentiles), the whiskers the $\pm 1.5 \times$ the IQR and individual points the outliers. The P values were calculated using two-sided, paired Student's t-test comparing sample means. h,i, Proportions of cells expressing lineagespecific signatures of the indicated gastrointestinal tract tissues, in individual patients from the Broad (h) and SMC/KUL3 (i) cohorts: J, junction; M, mucosa; S, small; Sig, sigmoid; Trans, transverse. j-l, Correlation between the OnF and lineage plasticity scores (Methods) in the Broad (j; n = 36 patients), SMC/KUL3 (k; n = 10 patients) and Guangzhou (l; n = 5 patients) normal CRC-matched cohorts, respectively. Two-sided Pearson's correlation for significance is used. m, Schematic model depicting the evolution of the phenotypic spectrum of neoplastic SCs throughout CRC progression. In b-d, WT = 4,058 cells, A = 5,890 cells and AKSP = 10,946 cells. *P* < 0.05, *P* < 0.01; *P* < 0.001; *P* < 0.001; exact Pvalues are given in Supplementary Table 7. Illustrations in a created using BioRender.com.

(Fig. 1). Intriguingly, we noted a significant decrease in the activity of several ligand-regulated nuclear receptors, including PPAR, RXR, LXR, VDR and FXR, all of which require retinoid X receptor (RXR) dimerization to become functional (Fig. 2b,c and Extended Data Fig. 3f–i).

In contrast, tumoroid-specific events in C2 were predominantly driven by three TF families (T cell factor/lymphoid enhancer factor



Fig. 2 | Distinct roles of YAP and AP-1 in OnF reprograming during CRC evolution. a, Heatmap of ATAC-seq signal in WT, A and AKSP organoids at genomic DARs (top). Average ATAC-seq signal profile ±2 kb is around the peak center in clusters c1 and c2 (bottom). RPKM, reads per kilobase million. b-e, Elbow plots showing TF activity in A versus WT (b and d) and AKSP versus WT (c and e) using DARs from clusters c1 (b and c) and c2 (d and e). For a-e, n = 2 independent organoid cultures per group. CEBP, CCAAT-enhancer-binding protein; NRs, nuclear receptors; BATF, basic leucine zipper transcription factor, ATF-like; JUND, JunD proto-oncogene, AP-1 transcription factor subunit. f,g, Relative OnF signature enrichment during tumor initiation following knockdown (kd) of YAP or FOS (f) or the ectopic expression of a dominant-negative (DN) FOS (g). Each data point is a gene in the OnE signature (n = 4 independent experiments: "P < 0.001, two-sided Wilcoxon's rank-sum test). h, Line plot of differential TF activity (combined score), from d and e, during CRC evolution. Two-sided, paired Student's t-tests were used for significance. JUN, Jun proto-oncogene, AP-1 transcription factor subunit; MAFK, v-maf avian musculoaponeurotic fibrosarcoma oncogene homolog K. i-k, Motif activity of ASCL2 (i), FOS/AP-1 (j) and TEAD1 (k) in AKSP single cells across the SC-OnF phenotypic spectrum

(TCF/LEF), transcriptional enhanced associate domains (TEADs) and activator protein 1 (AP-1)) (Fig. 2d,e). TCF/LEF operates under canonical WNT signaling and, together with ASCL2, sustains the canonical LGR5⁺ state³². TEADs, on the other hand, are the cognate DNA-binding

determined by chromVAR z-scores for the indicated TFs. The correlation coefficients between TF activity and the LGR5⁺ SC or OnF score are indicated in orange and green, respectively. Multiome data are from two independent organoid cultures (n = 11,030 cells). I-n, Relative enrichment of the OnF (I), esophagus (m) and small intestine (n) signatures in WT organoids following ectopic expression of YAP or YAP then FOS, sequentially. Each data point is a gene (n = 4 independent experiments: NS, not significant. P < 0.001, two-sided Wilcoxon's rank-sum test). EV, empty vector. o-q, GSEA of OnF (o), esophagus (\mathbf{p}) and small intestine (\mathbf{q}) gene signatures in YAP overexpression (OE) versus YAP + FOS sequential OE organoids, relative to I-n. Two-sided, permutation-based test was used for significance; P values were adjusted via the Benjamini-Hochberg method.r, Model of phenotypic spectrum evolution in neoplastic cells during CRC progression highlighting key TFs at play. Various gradients of ASCL2, YAP and FOS activity are pivotal to establishing a phenotypic continuum in neoplastic cells. In the box plots in **f**, **g** and **l**-**n**, the center line is the median, the box limits the IQR (25th to 75th percentiles) and the whiskers the highest and lowest values within $\pm 1.5 \times$ the IQR. P < 0.05; P < 0.001; exact P values are given in Supplementary Table 8. NES, normalized enrichment score; TPM, transcripts per million.

partners of YAP, recently implicated in transient activation of a fetal-like program after injury and in precancerous lesions^{16,18,23}. Meanwhile, although AP-1 has been associated with promoting aggressiveness in various cancer types, including CRC^{33,34}, its role in regulating neoplastic

cell states remains largely unexplored. To investigate its potential implication in OnF reprogramming, we initially conducted HOMER motif analysis on promoter regions of OnF markers compared with a set of random genes. This revealed a significant enrichment of both TEAD- and AP-1-binding motifs in the former (Extended Data Fig. 3j). Next, we examined the effects of YAP and FOS (Fos proto-oncogene, AP-1 transcription factor subunit) depletion on OnF reprogramming (Extended Data Fig. 4a) and found that both perturbations were sufficient to impede OnF reprogramming after APC LoF (Fig. 2f, Extended Data Fig. 4b–d and Supplementary Table 2c). Stronger inhibition of AP-1 using a dominant-negative form of FOS led to a complete repression of the OnF program (Fig. 2g, Extended Data Fig. 4e and Supplementary Table 2d). Together, these findings support a cooperative model whereby AP-1 acts in concert with YAP to drive OnF reprogramming during tumor initiation.

Notably, although binding sites of both TFs became more accessible in precancerous tumoroids (A), accessibility of AP-1 target regions further increased in the advanced AKSP model (Fig. 2h), suggesting a more intricate interplay during tumor evolution. The dynamic shift in the activity of these TFs supports a role of AP-1 in expanding the OnF state during CRC progression (Fig. 1d). To achieve a deeper understanding of the molecular mechanisms governing the establishment of a phenotypic spectrum in CRC, we performed single-cell multiome (single-cell (sc)ATAC-seq + scRNA-seq) analysis on AKSP tumoroids. This simultaneous examination of the transcriptome and chromatin accessibility landscape at single-cell resolution allowed us to chart TF activity across neoplastic cell states. We first ranked cells along the SC-OnF phenotypic spectrum using scRNA-seq (Extended Data Fig. 4f,g). Then, we projected scATAC-seq cells on to this continuum and used chromVAR³⁵ to map TF motif activity. This analysis revealed that the SC master regulator, ASCL2, and AP-1 (FOS) motif activities were most enriched at either extreme of the phenotypic spectrum, correlating with SC and OnF scores, respectively (Fig. 2i, j). It is interesting that TEADs exhibited a broader activity profile characteristic of transitional states (Fig. 2k). Moreover, we found a substantially higher correlation between AP-1 activity and lineage infidelity (Extended Data Fig. 4h,i). These data indicate that, although the transition to a continuum of hybrid states is predominantly facilitated by YAP, increased AP-1 activity reinforces the OnF state, enabling lineage plasticity.

To functionally validate the distinct roles of YAP and AP-1 in OnF reprogramming, we sequentially expressed a constitutively active YAP (S6A) and FOS in WT organoids (Extended Data Fig. 4j). It is interesting that ectopic YAP expression induced an upregulation of several AP-1 subunits (*Fos, Fosl1, Fosl2, Atf3* and *Batf2*) (Extended Data Fig. 4k and Supplementary Table 2e) and initiated OnF reprogramming (Fig. 2l and Extended Data Fig. 4l–n). The subsequent addition of FOS further enhanced the OnF program (Fig. 2l,o), triggering lineage infidelity (Fig. 2m,n,p,q).

Fig. 3 | Deregulation of an APC-RXR regulatory axis during tumor initiation establishes an OnF memory. a, RXRa expression in matched human normal colon and tumors from TCGA/COAD (n = 41 patients). P values were calculated using two-sided, paired Wilcoxon's test. **b**, Rxra expression during tumorigenesis (WT and A, n = 6 independent organoid cultures; AKSP, n = 3). The P values were calculated using two-sided, unpaired Wilcoxon's test. In the box plots, the center line is the median, the box limits the IQR (25th to 75th percentiles) and the whiskers the highest and lowest values within ±1.5× the IQR. c, Experimental approach for the comparative analyses of Anull and RXRi (+HX531) versus WT organoids. d,e, Spearman's correlation of the top 2,000 (d) or 1,000 (e) highly variable genes. READ, rectum adenocarcinoma. f,g, Elbow plots depicting TF activity in RXRi (f) versus WT organoids (g). TF combined binding score = $-\log_{10}(P \text{ value}) \times \log_2(\text{fold-change})$. Significantly more accessible or less accessible regions were used in f and g, respectively (WT, n = 2; RXR, n = 3independent ATAC-seq experiments). h, Experimental design summary for Fig. 2i. i, GSEA of OnF genes following the APC-RXR axis perturbation during

Collectively, these findings demonstrate that the phenotypic spectrum in CRC is governed by varying gradients of OnF and SC state drivers. They support an adaptive bet-hedging model in which the cooperative action of YAP and AP-1 serves as a molecular switch facilitating OnF reprogramming during tumor initiation. Further hyperactivation of AP-1 during CRC progression promotes phenotypic heterogeneity and unleashes lineage plasticity (Fig. 2r).

RXR is a gatekeeper of early OnF reprogramming

Next, we set out to determine the molecular mechanisms underpinning activation of the OnF drivers YAP and AP-1 in CRC. In the context of injury, inhibition of the nuclear receptor RXR sustains the typically transient fetal-like state by maintaining YAP in an active form²⁶. However, the role of RXR during intestinal tumorigenesis remains unexplored.

To address this, we first investigated RXR deregulation in CRC. TCGA/COAD dataset analysis indicated significantly lower *RXRa* levels in CRC tumors compared with matched healthy intestinal tissues (Fig. 3a). Our murine CRC models revealed an early downregulation of *Rxra* after APC LoF (Fig. 3b). Together with the reduced accessibility of RXR target sites and those of its partners in precancerous tumoroids (Fig. 2b), these data indicate that RXR operates downstream of APC in CRC.

Next, we conducted comparative analyses of RXR inhibition and APC LoF to determine whether RXR deregulation is responsible for activation of the OnF program during tumor initiation (Fig. 3c). Similar to APC depletion, treatment with the RXR antagonist HX531, hereafter referred to as RXRi, altered the budding structure of WT organoids, imposing a spheroid morphology (Extended Data Fig. 5a,b) reminiscent of fetal organoids¹⁹ and mutant tumoroids (Extended Data Fig. 5c). Transcriptomic analyses uncovered a striking resemblance between RXRi organoids and both human CRC and mouse tumoroids (Fig. 3d,e and Supplementary Table 3a). Furthermore, hallmarks of OnF reprogramming were significantly enriched in RXRi organoids (Extended Data Fig. 5d). Intriguingly, despite causing a similar block in differentiation, RXR inhibition induced a more prominent increase in OnF genes compared with APC depletion and did not result in the expansion of LGR5⁺ SCs (Extended Data Fig. 5e and Fig. 1b).

To better understand how RXR inhibition favors a complete reversion to an OnF-like state, we investigated its effects on global TF dynamics. Our ATAC-seq data revealed remarkable similarities in chromatin accessibility landscapes between *Apc* mutant tumoroids and RXRi organoids (Extended Data Fig. 5f-h). TF footprinting analysis (TOBIAS²⁸) demonstrated that RXRi recapitulated most TF activity changes induced by APC LoF in tumorigenesis (Fig. 3f,g and Supplementary Table 3b), including reduced activity of retinoid X receptor alpha (RXRa) itself, CDX2 and HNF4 (Extended Data Fig. 5i-k).

Notably, RXR blockade induced a significant hyperactivation of the OnF TFs AP-1 and TEADs (Extended Data Fig. 5l,m) without

tumor initiation (n = 4 independent experiments). **j**,**k**, GSEA of OnF genes in CRC tumoroids (AKSP), following RXR-OE (**j**) or inhibition (RXRi) (**k**) (n = 4 and 3 independent experiments, respectively). **J**, Experimental design summary for Fig. 2m-o. **m**, GSEA of OnF genes >5 weeks post-RXRi washout (n = 3 independent cultures). In **i**-**m**, a two-sided permutation-based test for significance was used; *P* values were adjusted via the Benjamini–Hochberg method. **n**, ATAC-seq signal intensity in RXRi, woRXRi (>5 weeks post-HX531 withdrawal), A and AKSP versus WT organoids. **o**, Elbow plot of more accessible regions in RXR versus WT organoids ranked by their log₂(fold-change) in woRXRi versus WT. Resolved peaks were subset to obtain the 1,342 regions (mean of number of suppressed and persistent regions) with log₂(fold-change) closest to 0. The HOMER motif enrichment analysis indicates the top enriched TFBSs of the persistent 'memory' regions (>5 weeks post-RXRi washout (right)). **n**,**o**, RXR and woRXRi (n = 3independent cultures; WT, A, AKSP, n = 2). FC, fold change. Illustrations in **c**, **h** and Icreated using BioRender.com. activating WNT-related TFs (Fig. 3f,g and Extended Data Fig. 5n). HOMER analysis confirmed enrichment of the TCF/LEF DNA-binding motif in less accessible regions in RXRi organoids (Extended Data Fig. 50 and Supplementary Table 3c). These findings support a divergent regulation of the WNT signaling pathway (Extended Data Fig. 6a–c) after RXR inhibition and APC depletion. While hyperactivation of WNT signaling is known to reinforce the canonical SC state^{32,36}, these data demonstrate that diminished RXR activity induces OnF reprogramming through activation of YAP and AP-1. Deregulation of both circuitries downstream of the gatekeeper APC (Fig. 2b,d and



Extended Data Fig. 50) elucidates the emergence of a continuum of neoplastic cell states during CRC tumorigenesis.

Consistent with these findings, blocking the APC-RXR regulatory axis through ectopic expression of RXRa impaired OnF reprogramming during tumor initiation (Fig. 3h.i and Supplementary Table 3d). Intriguingly, RXR perturbation in advanced AKSP tumoroids exhibited no significant effects on the OnF program (Fig. 3j,k and Supplementary Tables 3e, f), indicating its diminished relevance once the OnF state has been established. This suggests that early RXR deregulation, after APC LoF (Fig. 3b), is sufficient to epigenetically reprogram cells into an OnF state. Indeed, intestinal organoids temporarily exposed to RXRi largely maintained features of OnF reprogramming for >5 weeks post-inhibitor withdrawal (Fig. 31,m). Intriguingly, although transcriptional changes were largely maintained, only a small fraction of chromatin accessibility changes persisted (Extended Data Fig. 6d,e and Supplementary Table 3g,h). Notably, the persistently more accessible regions were also more accessible in A and AKSP tumoroids (Fig. 3n). HOMER analysis of these 'memory sites' revealed a significant enrichment of YAP- and AP-1-binding motifs (Fig. 30).

Together these findings indicate that RXR serves as a gatekeeper of OnF reprogramming during tumor initiation. Following its deregulation, YAP and AP-1 activation is sufficient to sustain the OnF state during tumor progression. Indeed, unlike RXR perturbation (Fig. 3j,k), knockdown of either YAP or AP-1 in VAKSP (Villin-Cre AKSP) tumoroids induced significant depletion of the OnF program (Extended Data Fig. 6f-h and Supplementary Table 3i).

Therapeutic relevance of the OnF state in CRC

In contrast to the well-characterized LGR5⁺ SC state in CRC, the functional relevance and potential therapeutic implications of the OnF state remain, to the best of our knowledge, unknown. Thus far, inference of the OnF state using transcriptional signatures has provided only a static snapshot of their presence. To comprehensively characterize the temporal dynamics of this cellular state, a well-defined and measurable tool is needed.

We have recently developed a new strategy to genetically trace cell fate transitions within a heterogeneous tissue^{37,38}. To this end, we leveraged our in-depth understanding of the molecular underpinnings of the OnF program (Figs. 2 and 3) to construct a synthetic locus control region (sLCR) that contains specific *cis*-regulatory elements (CREs) reflecting the transcriptional output and activity of OnF state-associated TFs (Extended Data Fig. 7a,b and Supplementary Table 4a). Then, we fused this genetic tracing cassette to an enhanced green fluorescent protein (eGFP; Fig. 4a) to allow visualization and tracking of this cellular state. Flow cytometry analysis of WT organoids expressing this phenotypic reporter confirmed that only a small fraction of cells exhibited low-to-moderate levels of GFP expression (Extended Data Fig. 7c). In contrast, WT organoids treated with RXRi and tumor-derived VAKSP organoids displayed a notable shift in reporter activity, evidenced by a higher proportion of GFP⁺ cells and increased mean fluorescence intensity (Extended Data Fig. 7c,d). Moreover, transcriptomic analysis of sorted GFP^{high} and GFP⁻ cells from VAKSP tumoroids confirmed the enrichment of the OnF signature and markers of lineage plasticity in the former (Fig. 4b, Extended Data Fig. 7e and Supplementary Table 4b). These data support the validity and specificity of our phenotypic reporter as an effective tool for tracing OnF cells.

Next, to investigate the intricacies of their potential interplay with LGR5⁺ SCs, we sought to develop a tracing system that enables simultaneous tracking of both populations. To this end, we replaced the OnF sLCR cassette with the STAR minigene³⁹ driving mCherry expression (Extended Data Fig. 7f) and generated a tumoroid line that expressed both reporters (VAKSP^{OnF/STAR}). This strategy allowed us to visualize the continuum of neoplastic phenotypes (Extended Data Fig. 7g).

To trace cell state dynamics under therapeutic pressure, we treated VAKSP^{OnF/STAR} tumoroids with FOLFIRI, a chemotherapy regimen commonly employed in clinical settings. Flow cytometry analysis of reporter activity revealed a significant enrichment of hybrid states at the expense of canonical SCs (Fig. 4c,d). This observation is consistent with the upregulation of key OnF markers and YAP or AP-1 target genes, alongside reduced expression of WNT-related genes (Fig. 4e, Extended Data Fig. 7h and Supplementary Table 4c). In contrast, the GFP^{high} OnF population was largely preserved, suggesting intrinsic resistance.

To further investigate the response of these cell states to current therapies, we sorted individual clones from each population (GFP^{high}, hybrid, and mCherry^{high}) (Extended Data Fig. 7i) and treated their respective cultures with FOLFIRI. Although cells with an active OnF program (GFP⁺–OnF state and GFP⁺/mCherry⁺–hybrid state) remained largely unaffected under therapeutic pressure (Extended Data Fig. 7j,k,m–p), we noted a significant depletion of LGR5⁺ cells, which coincided with the enrichment of hybrid cells (Extended Data Fig. 7l,q,r). These findings confirm the key role of the OnF program in driving drug-tolerant states (that is, pure OnF or hybrid states) in CRC. Intriguingly, in the absence of treatment, we observed marginal phenotypic fluctuations in the sorted clones, indicating plasticity among neoplastic states (Extended Data Fig. 7i,m,o,q). Therefore, it is possible that activation of the OnF program in canonical SCs may contribute to adaptive resistance.

To investigate resistance mechanisms in human CRC, we used three independent patient-derived organoids (PDOs) (colo13, colo31 and colo41) exhibiting varying sensitivity levels to treatment (Extended Data Fig. 8a). Consistent with our findings in mouse tumoroids,

Fig. 4 | Visualization and targeting of the OnF program in CRC. a, Schematic of the OnF phenotypic reporter structure. PGK, phosphoglycerate kinase promoter; NEO, neomycin resistance gene. b, Experimental flow diagram (top) and gene-set enrichment in GFP^{high} versus GFP⁻ cells sorted from VAKSP^{Ont} (Villin-Cre AKSP) tumoroids expressing the OnF reporter (bottom) (n = 3independent sorts). c, Representative pseudocolor plots from flow cytometry of VAKSP tumoroids co-expressing OnF-GFP (y axis) and stem/STAR-mCherry (x axis) phenotypic reporters. VAKSP^{OnF/STAR} tumoroids were treated with dimethyl sulfoxide or FOLFIRI for 3 days before analysis. d, Quantitative representation of flow cytometry data from c. In c and d, n = 3 independent experiments; error bars = s.d.; P values are by paired, two-sided Student's t-tests. e, Heatmap reporting log₂(fold-change) in WNT (left) and YAP or AP-1 (right) target gene expression (n = 3 independent experiments). f, Summary of the VAKSP tumoroid models used for functional studies. g, i, Schematic of the experimental strategy to genetically target the OnF state, stem state or both, either transiently (g) or persistently (i), relevant to h-j.h-j, Growth rate of subcutaneous VAKSP tumors with indicated reporter combinations, in response to DT treatment. Mean tumor volume ± s.e.m. The dotted lines indicate saline

treatment (all models, n = 6 tumors). **h**, Dashed lines indicate transient DT treatment (5 d; 3 doses on alternate days): OnF^{DTR} (n = 11), STAR^{DTR} (n = 9), $OnF^{DTR}/STAR^{DTR}$ (*n* = 10). **j**, The solid lines indicate persistent DT treatment, on alternate days, throughout the experiment: OnF^{DTR} (n = 12), $STAR^{DTR}$ (n = 11), $OnF^{DTR}/STAR^{DTR}$ (*n* = 9). Bottom, DT dosing schedule; the dashed red line indicates treatment duration. k, Schematic of the experimental strategy used in **1**. Dotted line, vehicle (n = 8 tumors): solid lines. DT (n = 6). FOI FIRI (n = 7)and DT + FOLFIRI (n = 8). Mice received three doses per week on alternate days. Values are mean tumor volume ± s.e.m. In h, j and l, the P values were calculated using a mixed-effects linear model with Tukey's adjustment for multiple comparisons (two sided). $\mathbf{m}-\mathbf{p}$, Heatmaps showing percentage viability of VAKSP tumoroids with the indicated drug combinations. A single dose of MRTX1133 and IAG933 was used in **n** and **p**, respectively. The effects of these single doses of each drug are highlighted in m (MRTX1133) and o (IAG933), respectively. IC, inhibitory concentration. q, Dot plot indicating the combination index from drug combinations in m-p. The P values were calculated using two-sided, paired Student's *t*-tests. In \mathbf{m} - \mathbf{q} , n = 3 independent experiments. Illustrations in \mathbf{b} , \mathbf{g} , \mathbf{i} and k created using BioRender.com.



exposure to FOLFIRI led to increased expression of OnF genes across all PDO lines, albeit to varying degrees (Extended Data Fig. 8b). Notably, colo13 displayed a more consistent upregulation of OnF markers and a conspicuous depletion of canonical SC markers and WNT target genes (Extended Data Fig. 8c), indicating a greater potential for adaptability. It is interesting that, although YAP activation levels were comparable across all PDOs, we observed a stronger activation of AP-1 targets in colo13 (Extended Data Fig. 8d). These data support a pivotal role of AP-1 in driving phenotypic plasticity and therapy resistance in CRC.

Although these findings underscore its potential therapeutic significance, the consequences of targeting the OnF state have yet to be uncovered. Previous studies provided unexpected evidence that ablation of the LGR5⁺ cells altogether is insufficient to achieve a durable regression of CRC^{6,7}, which suggests that targeting their phenotypic plasticity alone is not enough to overcome resistance. Our data from organoid models (Fig. 4c,d and Extended Data Fig. 7j-l) imply that, in such scenarios, the pre-existing OnF cells may play a crucial role in sustaining tumor growth. To test this hypothesis, we developed a diphtheria toxin (DT) receptor (DTR)-expressing version of the OnF and canonical (STAR⁺) SC-tracing cassettes. We then generated VAKSP tumoroids that express various combinations of these reporters to allow selective attrition of either or both cellular states (Fig. 4f). In the absence of DTR expression, DT treatment did not affect cellular composition or viability of VAKSP^{OnF/STAR} tumoroids (Extended Data Fig. 8e, f). However, the respective target populations, including hybrid cells, were efficiently ablated in the DTR⁺ models (Extended Data Fig. 8e,f).

To investigate the therapeutic potential of targeting the OnF state in CRC, we transplanted the different VAKSP reporter lines (Fig. 4f) into the flanks of immunocompromised mice. We first allowed tumors to reach a relatively large volume (350-400 mm³) before administering DT every other day for 5 days (Fig. 4g). Consistent with previous work^{6,7}, selective ablation of cells with an active LGR5⁺ program led to tumor stasis in the VAKSPSTAR-DTR model, followed by prompt regrowth on DT cessation (Fig. 4h). More importantly, attrition of OnF⁺ cells halted tumor growth transiently but was not sufficient to induce tumor regression (Fig. 4h). In contrast, co-targeting both cell states resulted in tumor shrinkage and delayed resurgence significantly (Fig. 4h). It is interesting that sustained depletion of either OnF⁺ or STAR⁺ cells alone using continuous DT treatment (Fig. 4i and Extended Data Fig. 8g) failed to maintain tumor stasis indefinitely (Fig. 4j), suggesting that either population can fuel tumor growth in the absence of the other. However, we noted a prominent tumor regression in the VAKSP^{OnF-DTR/STAR-DTR} model that was maintained for as long as DT treatment continued (Fig. 4j).

In the light of these findings, we reasoned that targeting the OnF program could sensitize tumors to chemotherapies, offering substantial clinical benefits. To test this hypothesis, we investigated the combined effects of FOLFIRI and DT on VAKSP^{OnF-DTR} tumoroids in vivo (Fig. 4k). Although each treatment alone reduced tumor growth, their combination resulted in a durable tumor regression throughout the treatment period (Fig. 4l).

It is interesting that pharmacological inhibition of either YAP– TEAD with IAG933–a potent first-in-class and selective disruptor of the YAP–TEAD interaction⁴⁰–or AP-1's upstream regulator KRAS with the selective KRAS^{GLDD} inhibitor MRTX1133 (ref. 41), marginally improved VAKSP tumoroid response to FOLFIRI (combination index (CI) = 0.96 and 0.94, respectively) (Fig. 4m,o,q). However, the trio combinations were highly synergistic (CI = -0.40) (Fig. 4n,p,q), indicating that concurrent inhibition of YAP and AP-1 is key to enhancing the effectiveness of FOLFIRI. These data further support the cooperative, yet distinct, functions of both TFs or pathways in regulating the OnF program (Fig. 2).

Collectively, our findings shed light on the functional interplay between the canonical (LGR5⁺) SC and noncanonical OnF states. Unexpectedly, we found that the LGR5⁺ state is sensitive to FOLFIRI and tumors require an active OnF program to survive treatment. Importantly, the clinical relevance of each population in isolation is limited by their functional redundancy. However, we provide evidence that targeting the OnF program is key to enhancing effectiveness and durability of the current standard of care (SOC) in mouse models and patient-derived CRC tumoroids.

Discussion

Despite notable advancements in CRC molecular classification^{42–44}, their translational significance remains unclear. We and others have recently described the existence of two CSC populations across CRC subtypes^{15,45}. In the present study, we revealed that the canonical LGR5⁺ SC and noncanonical OnF states are not distinct entities but rather extremes of a phenotypic continuum. This SC–OnF spectrum is prevalent among patients with CRC regardless of molecular characteristics, namely MMR and WNT mutation status.

We challenge the prevailing belief that canonical LGR5⁺ CSCs are the sole drivers of malignancy in WNT-driven CRC⁴⁶⁻⁴⁸, which assumes a rigid cellular hierarchy within tumors akin to that of the homeostatic intestinal epithelium. We demonstrate that, unlike their healthy counterparts, CSCs do not maintain a discrete state but traverse an evolving SC-OnF phenotypic spectrum. Extreme OnF states, prominent in advanced disease, are induced by AP-1 hyperactivation and exhibit features of lineage plasticity, contributing to therapy resistance. It is interesting that mixed lineage states have been observed in pancreatic^{49,50}, lung⁵¹⁻⁵³ and prostate cancers⁵⁴. Therefore, we propose that early OnF reprogramming may represent a potential universal mechanism of phenotypic plasticity in cancer. This hypothesis is further supported by the role of YAP and AP-1 as orchestrators of an aberrant pan-cancer enhancerome⁵⁵⁻⁶⁰. Although the molecular circuits at play may be context dependent, the activation of regenerative and inflammatory pathways emerges as a recurring mechanism promoting epigenetic plasticity^{50,54,61,62}. Our studies identify RXR as a master regulator of these pathways and a gatekeeper of OnF reprogramming in CRC, potentially linking statins' protective effects in patients with hyperlipidemia^{63,64} to an early blockade of this program through activation of the RXR::PPAR complex.

Targeting the OnF program in fully developed CRC has marginal effects as a result of functional redundancy with the canonical LGR5⁺ state. However, in tumors exposed to FOLFIRI, this leads to sustained CRC regression. Notably, unlike the OnF state, the recently described high relapse cell state is not triggered by FOLFIRI⁶⁵. Although these states differ in their dependence on YAP activity, both are induced by *KRAS* mutations, warranting further investigation of potential functional similarities, particularly in metastatic dissemination.

Collectively, our findings propose OnF reprogramming as a crucial driver of drug-tolerant states in CRC and indicate that success of the current SOC treatment hinges on effectively targeting this program. Notably, although our organoid data and recent in vivo data⁶⁶ suggest that OnF reprogramming in the tumor precedes that of its ecosystem^{67,68}, the mechanisms underlying such crosstalk remain to be determined.

Online content

Any methods, additional references, Nature Portfolio reporting summaries, source data, extended data, supplementary information, acknowledgements, peer review information; details of author contributions and competing interests; and statements of data and code availability are available at https://doi.org/10.1038/s41588-024-02058-1.

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Methods

Ethics statement

Mouse experiments to derive the VAKPS tumoroids followed UK Home Office regulations (project license no. 70/8646) and ARRIVE guidelines with ethical review at the University of Glasgow. Experiments to derive all other organoid models were approved by the Institutional Animal Care and Use Committee (A*STAR, Singapore). Experiments using the subcutaneous tumor models were approved by the Icahn School of Medicine at Mount Sinai (ISMMS) Institutional Animal Care and Use Committee (protocol no. 2018-0013).

Application to access patient tissue and organoids was authorized by the National Health Service (NHS) Greater Glasgow and Clyde Biorepository under their NHS Research Ethics Committee approval with ethical approval granted in biorepository application no. 602, following strict measures to ensure privacy and anonymity.

Mouse strains

To derive Lgr5-2a-CreERT2 organoids, mice were generated through homologous recombination with a 2a-CreERT2 cassette at the Lgr5-ORF stop codon⁶⁹. These mice were crossbred with Rosa26-tdTomato (Ai14)⁷⁰, LSL-KrasG12D⁷¹, Apc-loxP flanked⁷², Trp53-loxP flanked⁷³ and Smad4-loxP flanked⁷⁴ mice from the Jackson Laboratory. All were bred on to the C57B6/J background. Mice were maintained under a 12-h light:dark cycle, at 21 ± 1 °C, 55–70% humidity and placed in ventilated cages for pathogen-free conditions.

To derive the *villin-Cre^{ER}* tumoroids, a 12-week-old male *villin-Cre^{ER}Apc*^{fl/+}*Kras*^{G12D/+}*Trp53*^{fl/fl}*Smad4*^{fl/fl} mouse on a C57BL/6 background underwent intracolonic induction under general anesthesia. A single 70-µl dose of 100 µM4-hydroxytamoxifen (4-OH; Sigma-Aldrich, cat. no. H7904-5MG) was injected into the colonic submucosa. At clinical endpoint (weight loss), colonic tumor tissue was collected and organoid cell lines were generated as described previously⁷⁵.

Organoid derivation and culture

Organoids were generated as previously described⁷⁶. Briefly, small intestines were opened, washed with phosphate-buffered saline (PBS) and villi removed. The tissue was cut into ~2-mm fragments and incubated in 2.5 mM EDTA shaking at 4 °C for 30 min, then resuspended in advanced Dulbecco's modified Eagle's medium (DMEM)/F12 with 0.1% bovine serum albumin (BSA) and vigorously shaken. The suspension was then passed through a 70-um strainer. This process was repeated to collect four fractions, which were centrifuged (300g for 5 min at 4 °C) and pellets resuspended in 7 mg ml⁻¹ of Matrigel (Corning, cat. no. 35234). Matrigel was plated into 24-well plates and polymerized at 37 °C before adding mouse IntestiCult Medium (STEMCELL Technologies, cat. no. 06005) with Y-27632 (10 µM). Organoids were passaged every 3-4 days by trituration in Gentle Cell Dissociation Reagent (GCDR, STEMCELL Technologies, cat. no. 100-0485) before washing with basal medium (advanced (a)DMEM/F12, N2/B27, N-acetylcysteine, 1 mM Hepes and 100 μ g ml⁻¹ of penicillin–streptomycin). Cell pellets were then resuspended in Matrigel.

Isogenic tumoroid line generation and treatment

Apc^{KO} tumoroids were generated by treating *Lgr5*-2a-CreERT2::*Apc^{Rox}/tox* organoids with 4-OHT (500 nM; Sigma-Aldrich, cat. no. SML1666-1ML) for 24 h, activating tdTomato in recombined intestinal SCs. Tumoroids were then cultured in selection medium (basal medium, epidermal growth factor (EGF; 50 ng ml⁻¹) and Noggin (100 ng ml⁻¹) (PeproTech)) for 2–3 passages. AKSP tumoroids were generated by treating *Lgr5-2a-CreERT2::Apc^{Rox/flox}::Lox-Stop-Lox-Kras^{G12D}::Smad4^{flox/flox}* organoids with 4-OHT. After selection in basal medium, organoids were edited by clustered regularly interspaced short palindromic repeats (CRISPR)–Cas9 to knock out the *Trp53* gene. AKSP tumoroids were maintained in complete mouse IntestiCult medium.

RXR blockade: WT organoids were plated in HX531 (1.25 μ M) and maintained in half-dose after the first passage. FOLFIRI treatment: tumoroids were treated with 5 μ M 5-fluorouracil (5FU) and irinotecan (1:1) for 3 days before collection and analysis. DT treatment: VAKPS tumoroids were treated with 100 ng ml⁻¹ of DT or demi-water for 3 days before collection and analysis.

Patient-derived organoids

Models and genetic data were obtained from the Human Cancer Models Initiative (HCMI): https://ocg.cancer.gov/programs/HCMI, dbGaP accession no. phs001486. PDO lines were deposited at the American Type Culture Collection.

Phenotypic reporter design and generation

The OnF sLCR was designed using the logical design of synthetic cis-regulatory DNA (LSD) method (https://gitlab.com/ gargiulo lab/sLCR selection framework)³⁸, with customized deviations. First, we focused on three top OnF markers only-S100a6, Anxa1 and Ly6a-retrieving their genomic boundaries (S100a6: chr3:90,612,893-90,614,414; Anxa1: chr19:20,373,433-203,906,71; Ly6a: chr15:749,948,76-749,980,31) from mm10 genome. Second, transcriptional regulators were curated based on differential gene expression across OnF and SC populations, ingenuity pathway analysis and gene ontology. Finally, we queried their respective known TF-binding sites (TFBSs) and associated position weight matrices (PWMs). This allowed LSD to generate potential CREs with a fixed length (default is a 150-bp window sliding with a 50-bp step), determined by CTCF sites surrounding each marker. Next, LSD assigned TFBSs to CREs using FIMO (default --output-pthresh 1e-4 --no-qvalue), creating a matrix of putative CREs × TFBSs. Finally, LSD selected the minimal number of CREs representing the complete set of TFBSs by sorting and selecting the best CRE by the sum of the affinity score $(-\log_{10}(P))$ and TFBS diversity (number of different TFBSs). The first CRE was prioritized based on 5'-CAGE data (ENCODE) to increase the chances of successful transcriptional firing. The top seven CREs were synthesized in the same order, using the same strand for 'plus' and the reverse complement for 'minus'.

The OnF sLCR was synthesized and cloned into a third-generation pLV lentiviral backbone at VectorBuilder. To generate the STARmCherry reporter, eGFP was substituted by mCherry (VectorBuilder) and the OnF sLCR with the STAR minigene (Addgene, cat. no. 136255) using BamHI-based Gibson cloning.

Virus production and transductions

Lentiviral packaging plasmids (pCMV-D8.9 and pCMV-VSVG) and reporter plasmids were transfected into HEK293T cells using Lipofectamine 3000. Virus-containing supernatant was concentrated with Lenti-X Concentrator and titered using GoStix-Plus (Takara Bio, cat. no. 631280). For infection, organoids or tumoroids were dissociated, mixed with lentivirus and TransDux MAX (SBI-LV860A-1), centrifuged at 600g -32 °C for 15 min (organoids) and 60 min (tumoroids)–and incubated at 37 °C for 6 h. Cells were then washed and replated in Matrigel with IntestiCult medium and Y-27632 (10 μ M). Infected lines were selected with antibiotics. Plasmids and small hairpin RNA details are given in Supplementary Table 5.

Subcloning of dominant-negative FOS

A dominant-negative *Fos* was amplified by high-fidelity PCR from Addgene (cat. no. 33353) and subcloned into a lentiviral backbone (Addgene, cat. no. 25890), using Bmtl and Spel restriction enzymes.

Quantitative PCR

RNA was converted to complementary DNA using Maxima First Strand cDNA Synthesis Kit (Thermo Fisher Scientific, cat. no. K1642). Then quantitative reverse transcription PCR (RT-qPCR) was performed on

a QuantStudio5 (Applied Biosystems) in 10- μ l reactions containing 5 μ l of 2× SYBR Green Fast qPCR mix (Abclonal, cat. no. RK21203), 1 μ l of primer mix (4 μ M) and 8 ng of cDNA. Primer sequences are listed in Supplementary Table 6.

Flow cytometry

Matrigel-embedded organoids were collected in cold basal medium and centrifuged (500*g* for 5 min at 4 °C). Cells were dissociated in TrypLE at 37 °C, washed with cold basal medium (500*g* for 5 min at 4 °C), and stained with live or dead dye (Invitrogen, cat. no. L34957) at 1:2,000 in 1 ml of FACS buffer (PBS with 2% fetal bovine serum, 1 mM EDTA) for 10 min at room temperature (RT). In some experiments, Zombie NIR (BioLegend, cat. no. 423106) was used. Cells were washed with FACS buffer, passed through a 40-µm strainer and resuspended in 200 µl of FACS buffer, transferred to FACS tubes and acquired on a BDLSRFortessa (BD Biosciences). For sorting, a 35-µm filter was added and cells sorted on a CytoFLEX SRT (Beckman Coulter). Unstained cells and fluorescence – 1 controls were used to determine fluorescence intensity. Data were analyzed using FlowJo software (v.10.7.1).

Subcutaneous transplantation

Small clusters of VAKSP tumoroids were resuspended in a 1:1 Matrigel:basal medium mix; 5×10^5 cells were injected subcutaneously into both flanks of 7- to 8-week-old female NSG mice (Jackson Laboratory, cat. no. 005557). The tumor volume was calculated as $0.5 \times (\text{length} \times \text{width}^2)$. DT was administered Intraperitoneally (i.p.) at $50 \ \mu\text{g kg}^{-1}$ every other day. FOLFIRI (5FU 30 mg kg⁻¹, irinotecan 75 mg kg⁻¹ and leucovorin 90 mg kg⁻¹) was prepared as previously described⁷⁷ and given i.p. $3 \times a$ week alone or with DT. Controls received vehicle. Mice were monitored and euthanized following ISMM Institutional Animal Care and Use Committee regulations, including clinical signs of distress or pain, $\geq 20\%$ body weight, tumor size $\geq 1 \ \text{cm}^3$ or tumor ulceration.

Immunohistochemistry

Tumors were harvested from euthanized mice at a humane endpoint or experiment conclusion. A tumor piece was fixed in 10% formalin for 24 h (RT), then transferred to 70% ethanol. Samples were sent to HistoWiz, Inc., where they were in embedded in paraffin, sliced and stained with anti-mCherry (1:500; Rockland, cat. no. 600-401-379) and anti-GFP (1:100; abcam, cat. no. ab183734) antibodies.

RNA-seq library preparation

Organoids or tumoroids were grown in complete mouse IntestiCult medium for 3–4 d, before RNA extraction using TRIzol and PureLink RNA Mini Kit (Thermo Fisher Scientific, cat. no. 12183025). Treatments were applied as indicated in the figure legends. RNA quality was assessed with a bioanalyzer. Libraries were prepared using the PerkinElmer NextFlex Rapid Directional RNA-Seq Kit 2.0 (PerkinElmer, cat. no. NOVA-5198-02) and sequenced on a NovaSeq 6000 (SE75).

ATAC-seq library preparation

ATAC-seq was performed as described previously⁷⁸. In brief, organoids were extracted from Matrigel using GCDR, pretreated with 200 U ml⁻¹ of DNase (Worthington) for 30 min at 37 °C, then washed 3x with cold PBS. Viable cells, 50,000, were resuspended in cold lysis buffer (10 mM Tris-HCl, pH 7.4, 10 mM NaCl, 3 mM MgCl₂, 0.1% NP-40, 0.1% Tween-20 and 0.01% digitonin) and incubated on ice for 3 min. Nuclei were resuspended in 50 µl of transposition mix (nuclease-free water (22.5 µl), TD buffer (25 µl), Tn5 transposase (2.5 µl)) and incubated for 30 min at 37 °C. Transposed DNA fragments were then purified using MinElute PCR Purification Kit (QIAGEN), barcoded with Nextera dual indices (Illumina) and PCR amplified up to 11 cycles. Amplified libraries were purified using QIAGEN MinElute PCR Purification Kit (cat. no. 28004), checked for fragment sizes on a Bioanalyzer using D1000 DNA High-Sensitivity Chips (Agilent, cat. no. 5067-5585) and underwent size selection before

a second quality check and quantification (Qubit). Normalized libraries were then pooled and sequenced on a Novaseq 6000 (Illumina).

Sample preparation for scRNA-seq and multiome

Organoids were washed in cold basal medium, resuspended in Cell Recovery Solution (Corning, cat. no. 76332-050) and incubated on a shaker (15 min at 4 °C). Pellets were dissociated into single cells using TrypLE and washed twice in basal medium and resuspended in PBS with 0.04% BSA. Single-cell preparations were counted and processed per the manufacturer's instructions (10x Genomics, single-cell 3'v.3.1 protocol). In brief, single cells were resuspended in a master mix and loaded with gel beads and partitioning oil into the chip to generate gel bead-in-emulsions (GEMs). Poly(A) RNA from each GEM was retrotranscribed to cDNA, containing an Illumina R1 primer sequence, a unique molecular identifier (UMI) and the 10× barcode. Pooled barcoded cDNA was purified with Silane DynaBeads, amplified by PCR and appropriately sized fragments selected for library construction, which included adding Illumina R2 primer sequence, paired-end constructs (P5 and P7 sequences) and a sample index.

For the multiome experiments, after nuclei dissociation, scATACseq was performed using Chromium Next GEM Single Cell ATAC Library & Gel Bead Kit v.1.1 (10x Genomics, cat. no. 1000175) and single-nucleus (sn)RNA-seq was performed using Chromium Next GEM Single Cell 3' Reagent Kits v.3.1 (10x Genomics, cat. no. 1000121). Samples were sequenced on a NovaSeq 6000 (Illumina).

Bulk RNA-seq data processing and analysis

Quality control was conducted using FastQC (v.0.11.8,). Adapter sequences were trimmed using Trim Galore! (v.0.6.6) with a quality threshold of 20 (ref. 79). The mouse genome reference, GRCm38.p6 and GENCODE release M25 were used for alignment with STAR aligner (v.2.7.5b)⁸⁰. Gene-level read counts were obtained using Salmon (v.1.2.1)⁸¹. Sample normalization was performed using the median ratio normalization method from DESeq2 R (v.1.28.1) and differential expression analysis was conducted using DESeq2 (ref. 82). Genes with fewer than five reads across all samples were filtered out. A gene was considered differentially expressed if the Benjamini-Hochberg-adjusted P value (P_{adi}) < 0.01 and the absolute log₂(fold-change) > 1. The ggplot 2 (v.3.3.5) and VennDiagram (v.1.6.20) were used to plot and visualize differentially expressed gene data^{83,84}. Gene-set enrichment analysis (GSEA) was performed on gene lists sorted by $-\log_{10}(P) \times \log_2(\text{fold-change})$ using clusterProfiler (v.4.2.2) and enrichment or bubble plots visualized using gseaplot2 from enrichplot (v.1.14.2)^{85,86}. All bioinformatics analyses were conducted on R (v.4.1.0).

Bulk ATAC-seq data processing and analysis

Quality control was performed using FastQC (v.0.11.8). Adapter sequences were trimmed using Trim Galore! (v.0.6.6) with a quality threshold of 20. Paired-end 75-bp reads were aligned to the mouse genome (GRCm38.p6 and GENCODE release M25) using Bowtie2 (v.2.2.8). Reads were sorted with SAMtools (v.1.11), removing mito-chondrial alignments and retaining reads with MAPQ 30 (refs. 87,88). Duplicates were eliminated with Picard (v.2.2.4)⁸⁹. Post-filtering BAM files were merged using SAMtool and peaks were called using MACS (v.2.1.0)⁹⁰. Read quantification in significant peaks was conducted using BedTools multicov (v.2.29.2)⁹¹ and differential peak analysis was performed using DESeq2 ($P_{adj} < 0.01$; absolute log_2 (fold-change) ≥ 1.5). Coverage tracks (Bigwig files) were generated using deepTools (v.3.2.1) bamCoverage⁹². Hierarchical clustering of average accessibility in differentially accessible regions (DARs) was performed with R''hclust' function and visualized using deepTools plotHeatmap.

Motif enrichment and TF footprinting analysis

Motif analysis was performed using findMotifsGenome.pl from HOMER (v.4.10) on the peak summit (-size 200)⁹³. Footprinting analysis was

performed with Tobias (v.0.13.2) on aggregated BAM files per condition²⁸. The ATACorrect function was used to correct Tn5 insertion bias and ScoreBigwig to calculate TF-binding scores in peak regions. Differential binding fold-change and *P* value for each TF were determined using BINDetect function and selected TF results were visualized using PlotAggregate. Elbow plots were generated using the ggplot2 (ref. 84).

TCGA bulk RNA-seq data processing

STAR raw gene counts were downloaded for TCGA-COAD and TCGA-READ. Data were normalized using median ratios normalization and differential expression analysis was performed using DESeq2. GSEA was conducted on gene lists sorted by $-\log_{10}(P) \times \log_2(\text{fold-change})$ using clusterProfiler (v.4.2.2) and data visualized using gseaplot2 from enrichplot (v.1.14.2). To assess correlation, log(c.p.m.) counts were generated using the counts per min function from edgeR (v.3.36.0)⁹⁴⁻⁹⁶. Average expression was calculated for each gene in TCGA samples. The log(c.p.m.) values of TCGA samples and mouse organoids were merged and the top 2,000 most varied genes were selected for Spearman's correlation analyses.

Public human bulk RNA-seq data processing

FPKM (fragments per kilobase of transcript per million) data from the human gastrointestinal tract (https://github.com/hilldr/Finkbeiner_StemCellReports2015/tree/master/DATA)²⁵ were merged with TCGA FPKM data. Batch correction was applied using removeBatchEffect from limma R package (v.3.50.1), and principal components analysis (PCA) was performed using prcomp⁹⁷.

Sc- and snRNA-seq data processing

Sequenced FASTQ files were processed using Cell Ranger (v.7.0.1, scRNA-seq) and Cell Ranger (v.2.0.0, snRNA-seq) from 10x Genomics with mm10 as the mouse genome reference (RRID: SCR_017344). Cells with \geq 1,000 UMIs, \geq 400 genes expressed and <10% mitochondrial reads were retained. UMI counts were then normalized to a total of 10,000 UMIs per cell across all genes and log(transformed) using the 'LogNormalize' function in Seurat. The top 2,000 most highly variable genes were identified with 'FindVariableFeatures' and counts were scaled with 'ScaleData'. Datasets were processed using Seurat (v.4.0.3)⁹⁸.

PCA was performed on the top 2.000 variable features using 'Run-PCA' and the top 30 PCs were used for downstream analysis. Datasets were integrated using the 'RunHarmony' function (v.0.1.0)⁹⁹ to correct for multiplexed samples and biological replicates. The *k*-nearest neighbor graphs were created with 'FindNeighbors' and Uniform Manifold Approximation and Projection (UMAP) results were generated using 'RunUMAP'. The Louvain algorithm clustered cells based on expression similarity with a resolution set at 1.6.

Differential markers for each cluster in the scRNA-seq were identified using Wilcoxon's test ('FindAllMarkers'; $P_{adj} < 0.01$, absolute $log_2(fold-change) > 0.25$, $10\% \ge cells$ expressing the gene in comparison groups) using 1,000 random cells per cluster. Gene expression signature scores were calculated using 'AddModuleScore' and cells were annotated based on respective maximum module scores (Fig. 1b).

The mouse OnF signature was defined by overlapping genes upregulated in the neoplastic metacluster (clusters 6, 7, 10, 16, 19 and 20 combined) with mouse fetal genes from Mustata et al.¹⁹. Human tissue-type-specific signatures from Lukonin et al.²⁶ were used to calculate signature scores with Seurat AddModuleScore. Lineage plasticity score was calculated as the esophagus mucosa module score – colon module score.

Data processing of scRNA-seq human datasets

Raw count matrices for the SMC/KUL3 (ref. 20) and Broad²¹ cohorts were obtained from the Gene Expression Omnibus (GEO) (accession nos. GSE132465 and GSE178341). Seurat objects were created using

these matrices, with the SMC/KUL3 dataset filtered to retain cells from patients with matching normal and tumor tissues. Both datasets were subset to include only epithelial cells based on available annotations and data were analyzed following the same workflow as the mouse scRNA-seq above. Tissue-specific signatures from Lukonin et al.²⁶ were used for cell- or tissue-type assignment.

To identify human OnF (huOnF) gene signature, a Seurat object was created from Gao et al.'s¹⁰⁰ transcript per kilobase million counts and filtered to retain fetal (6- to 11-week-old embryos) and adult epithelial cells. Mouse OnF gene orthologues with normalized counts <0.5 in >98% of cells were filtered out. Human fetal and adult cells were then pseudobulked and orthologues highly expressed in fetal but low or not expressed in adult cells were selected as huOnF.

ScATAC-seq data processing and motif analysis

FASTQ files were processed using Cell Ranger ARC (v.2.0.0) with mm10 genome reference. Peaks were called using 'CallPeaks' (MACS2) function in Signac (v.1.3.0)¹⁰¹. Cells were filtered based on the following criteria: fragments in peaks >1,000 and <50,000, >20% reads in peaks, blacklist ratio < 0.002, nucleosome signal < 1.5 and transcription start site (TSS) enrichment score >2. The blacklist ratio = reads aligned to blacklist region or total reads. The nucleosome signal was calculated using 'NucleosomeSignal' in Signac and TSS enrichment score by 'TSSEnrichment'. Latent semantic indexing (LSI) was applied to the top 95% variable peaks, combining the term frequency-inverse document frequency used for normalization and singular-value decomposition used for dimensional reduction. The first LSI component was excluded due to correlation with sequencing depth. De novo clustering (resolution 1.6) was done with 'FindNeighbors' and 'FindClusters' (Signac). Motif position frequency matrices from JASPAR 2020 were added to the data and refs. 102,103. ChromVAR motif analysis was performed using 'RunChromVAR'. The results of selected TFs were visualized on UMAP using FeaturePlot³⁵.

Statistics and reproducibility

Experiments were reproduced as indicated in the figure legends, with data from representative panels reproduced at least two or three times. No blinding or predetermined sample size calculations were used, but our sample sizes align with those in previous studies^{6,7}. Animals or injection numbers were estimated based on the variability in tumor take rate and growth and are indicated in the respective figure legends. Animals were randomized among treatment groups once tumors reached the mean volume specified in Fig. 4h, j,l. Exclusion criteria included death or humane endpoints (for example, $\geq 20\%$ weight loss, respiratory distress, persistent hypothermia or tumor size >1 cm³). Data distributions were assumed to be normal, but this was not formally tested. Statistical analyses were conducted using R (v.4.1.0, RRID, accession no. SCR 001905)¹⁰⁴ and PRISM (v.9.5.1). Computational data figures were generated using ggplot2 (v.3.3.5, RRID, accession no. SCR 014601), ggpubr (v.0.4.0, RRID, accession no. SCR 021139) and patchwork (v.3.0.1)^{84,105,106}. All statistical tests are detailed in the figure legends. Significance levels are defined as follows: NS (not significant): P > 0.05, $*P \le 0.05$, $**P \le 0.01$, $***P \le 0.001$ and $****P \le 0.0001$.

Reporting summary

Further information on research design is available in the Nature Portfolio Reporting Summary linked to this article.

Data availability

All data needed to evaluate the conclusions in the present study are present in the paper and/or its Supplementary Information. RNA-seq, ATAC-seq, scRNA-seq and scATAC-seq data supporting the findings of the present study have been deposited into the National Center for Biotechnology Information, GEO under series accession no. GSE237954. The human reference genome GRCh38 GENCODE, release 36, and mouse reference genome GRCm38 GENCODE, release M25, were used to align raw data from human and mouse samples. They were accessed through https://www.gencodegenes.org/human/release_36.html and https:// www.gencodegenes.org/mouse/release_M25.html, respectively. Other datasets referenced in the study are available from the GEO database under the accession nos. GSE132465 (ref. 20) and GSE178341 (ref. 21). Data used from Finkbeiner et al.²⁵ are accessed through https://github. com/hilldr/Finkbeiner_StemCellReports2015/tree/master/DATA. Data from TCGA were accessed through the database of Genotypes and Phenotypes under accession no. phs000178.v11.p8 (TCGA-READ and TCGA-COAD). Source data are provided with this paper.

Code availability

This paper did not generate or use any custom code or software. All code and software packages utilized in the study are referenced in the Methods and Reporting Summary.

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Author contributions

S.M. and E.G. conceptualized the project, designed experiments and supervised research. They also wrote the manuscript, with critical input from all authors. S.M., M.S., H.Z., K.M. and F.D.T. performed the experiments and acquired the data. S.M. and K.M. prepared ATAC-seq and RNA-seq libraries, respectively. D.D., X.W., G.U., D.T., D.H., A.M.T. and B.G. performed computational and -omics analyses with input from S.M. and E.G. G.G. designed the OnF reporter with input from S.M., C.C. and Y.D. T.R.L. and O.J.S. generated the VAKSP tumoroids.

M.L. and N.B. generated the remaining genetic organoid models. R.S. and J.C.M. provided support for multi-omic data acquisition. D.L.O. provided guidance for flow cytometry data collection and acquisition. All authors provided scientific input and contributed to writing the materials and methods.

Competing interests

E.G.'s laboratory received research funds from AZ and Prelude Therapeutics (for unrelated projects). E.G. is a cofounder and shareholder of Immunoa Pte. Ltd and cofounder shareholder, consultant and advisory board member of Prometeo Therapeutics. G.G. is inventor on the patent application no. EP18192715 by the MDC for the design and use of sLCRs. R.S. is cofounder and CEO of Panacent Bio, Inc. and equity holder in GeneDx, neither of which has contributed to or been involved in the research in this publication. The other authors declare no competing interests.

Additional information

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Extended Data Fig. 1|See next page for caption.

Extended Data Fig. 1| Oncofetal reprogramming during intestinal

tumorigenesis. a, Schematics of the genetic approach used to generate isogenic mouse organoid models mimicking the adenoma-to-adenocarcinoma sequence. **b**, UMAP of scRNA-seq of the indicated models. **c**, Cells from the neoplastic metacluster are indicated in green on the UMAP. **d**, Volcano plot of differentially expressed genes (DEGs) in the neoplastic metacluster vs. all other clusters. *p*-values calculated using DESeq2, Wald test (two-sided, unpaired); Benjamini-Hochberg adjustments. **e**, Venn diagram depicting the strategy used to define the mouse oncofetal (OnF) signature. **f-h**, UMAPs showing enrichment scores of enterocytes (f), stem cell (g) and OnF (h) signatures throughout CRC progression. i, Heatmap of SC and OnF module scores across cell clusters and genotypes. In panels **b-c** and **f-h** WT = 4058 cells; A = 5890 cells; AKSP 10946 cells. j, Relative *Lgr5* expression along the SC-OnF continuum. **k**, Enrichment of the OnF and SC module scores across genotypes (n = 3 independent organoid cultures per group). boxplots: center line, median; box limits, interquartile range (IQR: 25th to 75th percentile); whiskers, ±1.5x IQR; individual points, outliers. *p*values calculated using two-sided unpaired t-test. Illustrations in **a** created using BioRender.com.



Extended Data Fig. 2 | **Enhanced oncofetal reprogramming triggers lineage plasticity in advanced human CRC. a**, Human OnF score enrichment in matched normal and tumors tissues (TCGA/COAD; n = 41 patients). Two-sided paired t-tests for significance. **b-d**, Scatter plots depicting cell state distribution along the SC-OnF spectrum in matched healthy colons and tumors stratified by APC mutation and MMR status, respectively. **b**; SMC/KUL3 cohort, n = 7 patients; **c-d**; Broad cohort, n = 15 MMRp patients (**c**) and n = 21 MMRd patients (**d**). Twosided paired t-tests for significance. **e**, Principal Component Analysis (PCA) of integrated bulk RNA-seq data from human gut developmental stages, definitive

endoderm (Def. end), embryonic stem cells (ESC) (Finkbeiner et al., 2015) normal colon and CRC (TCGA/COAD). **f**, Gene Set Enrichment Analysis (GSEA) of lineage-specific signatures in tumor (n = 455) vs. normal (n = 41) specimens (TCGA/COAD). NES: normalized enrichment score. **g-j**, Scatter plots (left) and boxplots (right) of lineage specific signature enrichment across the SC-OnF continuum in matched tumors and normal colons from the SMC/KUL3 (**g** and **h**, n = 10) and Broad (**i** and **j**, n = 36) cohorts. Two-sided paired t-tests for significance. In panels **a**, **b**-**d** and **g-j**, boxplots: center line, median; box limits, interquartile range (IQR: 25th to 75th percentile); whiskers, ±1.5x IQR; individual points, outliers.



Extended Data Fig. 3 | **A multi-omics approach elucidates the molecular determinants of cell state dynamics during CRC evolution. a**, Schematic of the experimental strategy, integrating multiomics with functional validation, and the genetic models used. **b**, Differentially accessible regions (DARs) in A vs. WT and AKSP vs. WT; shared DARs shown in faded colors (data from 2 independent organoid cultures per group). **c**, HOMER motif analysis for CDX2 and HNF4a, using DARs from cluster c1 in Fig. **2a. d-e**, TF occupancy strength for CDX2 (**d**) and HNF4a (e) shown as aggregated footprinting plot matrix centered around binding motifs. **f**, HOMER motif analysis using DARs from cluster c1 in Fig. 2a. **g-i**, TF occupancy strength for RXR (**g**), PPAR (**h**) and VDR (**i**) shown as aggregated footprinting plot matrix centered around binding motifs. **j**, HOMER motif enrichment analysis in promoter regions of OnF genes or random promoters (TSS +/-1kb). Illustrations in panel **a** created using BioRender.com.



Extended Data Fig. 4 | See next page for caption.

Extended Data Fig. 4 | Functional validation of YAP and AP-1 as drivers of OnF reprogramming. a, Schematic summary of the experimental design related to Fig. 2f, g. b-e, GSEA of OnF genes following YAP (b-c) depletion and FOS depletion (d) or inhibition (e) during tumor initiation, related to Fig. 2f, g. Two-sided permutation-based test for significance; p-values adjusted via the Benjamini-Hochberg method. f-g, Scatter plots showing enrichment of the SC (left) and small intestine (right) (f) and the OnF (left) and esophagus mucosa (right) module scores (g) along the SC-OnF continuum in scRNA-seq cells from the AKSP Multiome. h-i, Scatter plots showing the correlation between FOS (h) or TEAD (i) activity and lineage infidelity score. Two-sided Pearson correlation for significance. j, Schematic summary of the experimental design related to Fig. 2I-n and o-q. k, Log2 median-of-ratios (DESeq2) normalized counts of AP-1 genes following YAP (S6A) overexpression in WT organoids (n = 4 independent experiments). Boxplots: center line, median; box limits, interquartile range (IQR: 25th to 75th percentile); whiskers, highest and lowest values within ±1.5x IQR. *P*-values calculated via two-sided Student's t-test with multiple comparison adjustments. I-n, GSEA of OnF (I), esophagus (m) and small intestines (n) genes following YAP (S6A) overexpression in WT organoids, related to Fig. 2I-n. Two-sided permutation-based test for significance; p-values adjusted via the Benjamini-Hochberg method. Illustrations in **a** and **j** created using BioRender.com.



Extended Data Fig. 5 | Comparative analyses of RXR inhibition versus APC depletion. a-c, Representative images of WT organoids treated with DMSO (a) or RXR antagonist HX531 (RXRi) (b), and A tumoroids (c). Scale bars, 1 mm. Lower panels show close-ups of dashed line areas, highlighting morphological changes. d, GSEA of OnF genes in RXRi vs. WT organoids (n = 3 independent cultures). e, Heatmap of differentially expressed marker genes of the indicated markers in RXRi vs. WT and A vs. WT (n = 3 independent cultures per group). f, g, Venn diagrams showing overlaps of the more (f) and less (g) accessible regions in RXRi and A organoids. Punctuated areas represent changes in the same direction but

not meeting the log2 fold change cutoff \geq 1.5. **h**, ATAC-seq signal heatmap in WT, A and RXRi organoids at differentially accessible regions (upper panel). Average ATAC-seq signal within a \pm 2Kb region around the peak center (lower panel). **i-n**, TF occupancy strength (aggregated footprinting plot matrix) for the RXRa (**i**), CDX2 (**j**), HNF4a (**k**), FOS (**l**), TEAD3 (**m**) and TCF7 (**n**) in WT, A and RXRi organoids. Plots are centered around binding motifs. **o**, HOMER motif enrichment analysis of the indicated TFs in A and RXRi models vs. WT. In **f-o**, RXRi, n = 3; WT, n = 2 and A, n = 2 independent cultures.



Extended Data Fig. 6 | RXR inhibition phenocopies APC depletion excluding WNT activation. a-b, Venn diagrams showing overlap of up-regulated (a) and down-regulated (b) genes following RXR inhibition and APC depletion in WT organoids. Punctuated areas represent changes not meeting the log2 fold change ≥1 cutoff. KEGG pathway analysis reveals common regulation in both models, except for WNT. c, GSEA of KEGG pathway enrichment in RNA-seq data from RXRi vs. WT and A vs. WT. NES, normalized enrichment score. In a-c n = 3 independent cultures per group. d-e, Differentially expressed genes (DEGs) (d) and regions (DARs) **(e)** in RXRivs. WT and woRXRivs. WT organoids. Faded colors indicate persistent DEGs and DARs. Log2 fold change (f.c) and *p*-values thresholds for DEGs and DARs are indicated in the figure. *p*-values calculated using DESeq2, Wald test (two-sided, unpaired); Benjamini-Hochberg adjustments. **f-h**, GSEA of OnF genes following YAP (**f-g**) or FOS (**h**) depletion in CRC tumoroids (AKSP) (n = 3-4 independent experiments). Two-sided permutation-based test for significance; *p*-values adjusted via the Benjamini-Hochberg method.



Extended Data Fig. 7 | See next page for caption.

Extended Data Fig. 7 | Design and functional validation of the oncofetal phenotypic reporter. a, Design method the oncofetal (OnF) synthetic locus control regions (sLCR). **b**, Genome Browser view of cis-regulatory elements used in the OnF sLCR. **c**, Normalized distribution of OnF-GFP⁺ cells and eGFP fluorescence intensity measured by flow cytometry. **d**, eGFP geometric mean fluorescence insensitivity (MFI) quantification. Error bars, s.d; n = 3 independent cultures, p-values calculated using Fisher/s LSD post-hoc test after one-sided ANOVA (p < 0.05). **e**, Scaled OnF gene expression in GFP^{high} and GFP^{Neg} cells sorted from VAKSP^{OnF} tumoroids, n = 3 independent sorts. **f**, Schematic of the OnF sLCR substitution with the STAR minigene. **g**, Representative fluorescence microscopy images of VAKSP tumoroids co-expressing both reporters (VAKSP^{OnF/STAR}). Scale bars, 200μm. **h**, Volcano plot of differentially expressed genes (DEGs) in VAKSP tumoroids post-3-day FOLFIRI treatment (n = 3 independent experiments). Significant DEGs are on both sides of dashed lines (log2FC > 1; p-value < 0.01); *p*-values, DESeq2, Wald test (two-sided, unpaired); Benjamini-Hochberg adjustments. **i**, The GFP/mCherry gating strategy to sort clones used in (**j**-**I**).**j**-**I**, Quantification of predominantly cell states in response to FOLFIRI in 3 independent clones sorted from GFP^{high} (**j**), mCherry^{high} (**k**) or GFP/mCherry^{high} (hybrid) (**I**) populations. p-values calculated using paired two-sided t-tests. **m-r**, Representative pseudocolor plots of flow-cytometry analysis of GFP^{high} (**m-n**) mCherry^{high} (**o**-**p**) and hybrid clones (**q-r**) before (**m**, **o** and **q**) and after FOLFIRI tretament for 3 days (**n**, **p** and **r**), related to (**j-I**).

Article



STAR^{DTR} +DT +DT Saline Saline Saline +DT mCherry 2mm 2mm 2mm 2mm 2mm GFP 2mm 2mm 2mm 2mm 2mn

Extended Data Fig. 8 | A dual phenotypic reporter system to trace and target the OnF and Stem Cell states. a, Heatmap of day 5 FOLFIRI dose-response in patient-derived organoids (PDOs); n = 3 independent experiments. b-d, DEGs in response to FOLFIRI. b, OnF genes; c, stem cell and WNT-related genes; d, YAP and AP-1 target genes. PDOs treated with their respective IC70 for 5 days. Data are log2 fold change in FOLFIRI vs. DMSO; n = 3 independent experiments. e, Fluorescence microscopy images of the indicated models treated with demi-water or DT for 3 days. Scale bars, 400 µm. f, Quantification of the

predominantly stem, OnF and hybrid states post-DT treatment (day3); n = 4-7 independent experiments per group. p-values calculated using paired twosided t-tests, adjusted for multiple comparisons using Benjamini-Hochberg method. Center, median; boxes, lower and upper quartiles; whiskers min and max values. **g**, Representative immunohistochemistry staining of GFP and mCherry in tumors from mice treated with saline or DT (n = 2 tumors for the saline; n = 3 tumors for DT), relative to Fig. 41. Scale bars, 2 mm.

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Last updated by author(s): Oct 30, 2024

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| | \square | The exact sample size (n) for each experimental group/condition, given as a discrete number and unit of measurement |
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| \ge | | For Bayesian analysis, information on the choice of priors and Markov chain Monte Carlo settings |
| \boxtimes | | For hierarchical and complex designs, identification of the appropriate level for tests and full reporting of outcomes |
| | \square | Estimates of effect sizes (e.g. Cohen's d, Pearson's r), indicating how they were calculated |
| | | Our web collection on <u>statistics for biologists</u> contains articles on many of the points above. |
| | | |

Software and code

| Policy information | about <u>availability of computer code</u> |
|--------------------|---|
| Data collection | Flow Cytometry and cell sorting: LSRFortessa Cell Analyzer (BD Bioscences); CytoFLEX SRT (Beckman Coulter). NovaSeg 6000 and NextSeg2000 were used for Bulk RNA-seg, Bulk ATAC-seg, Single cell RNA-seg and Single cell Multiome. |
| Data analysis | Limma v3.50.I; FastQC v0.11.8; Trim Galore! v0.6.6; STAR aligner v2.7.5b; Salmon vl.2.1; DESeq2 vl.28.1; clusterProfiler v4.2.2; gProfiler; Bowtie2 v2.2.8; SAMtools v.1.11; Picard v2.2.4; Deeptools v3.2.1; Seurat package v4.0.3; TOBIAS v0.13.2 ;HOMER v4.10; RunHarmony v0.1.0; scanpy vl.9.3;Muscat vl.12.1; Cell Ranger ARC v2.0.0; chromVAR Signac vl.3.0; rtracklayer vl.54.0; Gviz vl.38.4; Prism 9.5.1, FlowJo vl0.7.1 |

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Data

Policy information about availability of data

All manuscripts must include a data availability statement. This statement should provide the following information, where applicable:

- Accession codes, unique identifiers, or web links for publicly available datasets

- A description of any restrictions on data availability
- For clinical datasets or third party data, please ensure that the statement adheres to our policy

RNA-seq, ATAC-seq, scRNA-seq, scATAC-seq data supporting the findings of this study have been deposited into the National Center for Biotechnology Information

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(NCBI) Gene Expression Omnibus under series accession GSE237954. Additional data reported in this study are available in the supplementary source data. The human reference genome GRCh38 GENCODE release 36 and mouse reference genome GRCm38 GENCODE release M25 were used to align raw data from human and mouse samples. They were accessed through https://www.gencodegenes.org/human/release_36.html and https://www.gencodegenes.org/mouse/ release_M25.html, respectively. Other datasets referenced in the study are available from the GEO database under the accession codes GSE178341 (Pelka et al.) and GSE132465 (Lee et al.). Data used from Finkbeiner et al. is accessed through https://github.com/hilldr/Finkbeiner_StemCellReports2015/tree/master/DATA. Data from TCGA were accessed through the database of Genotypes and Phenotypes under accession ID phs000178.v11.p8 (TCGA-READ and TCGA-COAD).

Research involving human participants, their data, or biological material

Policy information about studies with human participants or human data. See also policy information about sex, gender (identity/presentation), and sexual orientation and race, ethnicity and racism.

| Reporting on sex and gender | Not applicable. |
|--|-----------------|
| Reporting on race, ethnicity, or other socially relevant groupings | Not applicable. |
| Population characteristics | Not applicable. |
| Recruitment | Not applicable. |
| Ethics oversight | Not applicable. |

Note that full information on the approval of the study protocol must also be provided in the manuscript.

Field-specific reporting

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Life sciences study design

All studies must disclose on these points even when the disclosure is negative.

| Sample size | No predetermined sample size calculations were used. Animal/tumor numbers were based on the variability in tumor take rate and growth; our sample sizes align with those in previous studies (PMID: 28358093 and PMID: 28355176). For in vitro experiments, sample sizes (n=2-7) were based on previous experience and publications with similar experiments (PMID: 28358093, PMID: 35773527 and PMID: 28355176). |
|-----------------|---|
| Data exclusions | Exclusion criteria included death or humane endpoints (e.g., ≥20% weight loss, respiratory distress, persistent hypothermia, or tumor size >1cm3). |
| Replication | All data were replicated in at least 2 independent experiments with consistent results. Multiple members of the research project independently validated results. |
| Randomization | Mice were randomized between treatment groups. Mathematically equivalent grouping distributions were confirmed (tumor volumes). If equivalence was not achieved, random shuffling was done again to ensure approximately equal initial mean tumor volume per condition before the start of treatment. |
| Blinding | The investigators were not blinded to allocation during experiments and outcome assessment. Data collection and analysis were not performed blind to the conditions of the experiments. Researchers involved in experimental allocation and analyses were commonly the same researchers performing the experiment - as such, blinding was not conducted. |

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We require information from authors about some types of materials, experimental systems and methods used in many studies. Here, indicate whether each material, system or method listed is relevant to your study. If you are not sure if a list item applies to your research, read the appropriate section before selecting a response.

Methods

| Materials & experimental sys | | |
|------------------------------|-------------|------------------------|
| n/a Involved in the study | n/a | Involved in the study |
| Antibodies | \boxtimes | ChIP-seq |
| Eukaryotic cell lines | | Flow cytometry |
| Palaeontology and archaeolog | gy 🛛 🖂 | MRI-based neuroimaging |
| Animals and other organisms | | |
| Clinical data | | |
| Dual use research of concern | | |
| Plants | | |
| | | |

Antibodies

| Antibodies used | mCherry (Rockland #600-401-379) 1:500. GFP (abcam #ab183734); dilution 1:100. |
|-----------------|--|
| Validation | These antibodies were used for immunohistochemistry on mouse tumors according to the manufacturer's recommendations and optimized/validated on negative and positive controls form mouse origin by HistoWiz, Inc |

Eukaryotic cell lines

| Policy information about <u>cell lines and Sex and Gender in Research</u> | | |
|---|---|--|
| Cell line source(s) | Mouse: All organoids and tumoroids were derived from genetic mouse models described in the methods section. Patient- derived organoids were obtained from the Human Cancer Models Initiative(HCMI) https://ocg.cancer.gov/programs/HCMI; dbGaP accession number phs001486, these lines were de-identified and deposited at ATCC. HEK-293T cells were obtained from ATCC. | |
| Authentication | Mouse organoids and the source mouse models were genotyped by PCR. Human organoids underwent whole-genome sequencing. HEK293T were authenticated by ATCC and are widely used in the field. | |
| Mycoplasma contamination | All cell lines were tested and remained mycoplasma-free. | |
| Commonly misidentified lines (See <u>ICLAC</u> register) | None. | |

Animals and other research organisms

Policy information about <u>studies involving animals</u>; <u>ARRIVE guidelines</u> recommended for reporting animal research, and <u>Sex and Gender in</u> <u>Research</u>

| Laboratory animals | Lgr5-2A-CreERT2 (Leushacke et al., 2017) mice were generated through homologous recombination in embryonic stem cells, specifically targeting the insertion of the 2A-CreERT2 cassette at the stop codon of the Lgr5-ORF. To obtain the experimental mice, Lgr5-2A-CreERT2 mice were crossbred with Rosa26-tdTomato (Ai14) (Madisen et al., 2010), LSL-KrasG12D (Johnson et al., 2001), Apc-loxP flanked (Shibata et al., 1997), Trp53-loxP flanked (Jonkers et al., 2001) and Smad4-loxP flanked (Yang et al., 2002) mice, which were acquired from the Jackson Laboratory. All mice were bred onto the C57Black6/J background and were 6-8week-old on average. Experimental mice were at least 8-weeks-old. To ensure pathogen-free conditions, all mice were bred and housed in ventilated cages. Intracolonic induction in a 12-week-old male mouse villinCreER Apcfl/+ KrasG12D/+ Trp53fl/fl Smad4fl/fl on a C57BL/6 background was performed under general anesthesia. A single 70µl l00uM dose of 4-hydroxy tamoxifen (H7904-5MG from Sigma) was injected into the colonic sub-mucosa via a colonoscope (Karl Storz TELE PACK VET X LED endoscopic video unit). At clinical endpoint (weight loss with or without the presentation of hunching) colonic tumor tissue was collected, and organoid cell lines were generated as previously described (Jackstadt et al., 2019). 7-8 week old female NSG mice (Strain #:005557, Jackson Laboratory) were used for subcutaneous transplantation experiments. Mice were closely monitored by the authors, facility technicians and by a veterinary scientist responsible for animal welfare. They were euthanized when they reached a humane endpoint as determined by the Institutional Animal Care and Use Committee (IACUC). Some of these criteria include clinical signs of persistent distress or pain, significant loss of body weight(> 20%), and tumor size exceeding 1000mm3. |
|-------------------------|--|
| Wild animals | The study did not involve wild animals. |
| Reporting on sex | Female mice were used for the subcutaneous transplantation experiments. |
| Field-collected samples | The study did not involve field-collected samples. |
| Ethics oversight | All mouse studies were approved by the Icahn School of Medicine at Mount Sinai (ISMMS) Institutional Animal Care and Use Committee (protocol number 2018-0013). |

Note that full information on the approval of the study protocol must also be provided in the manuscript.

Plants

| Seed stocks | Non-applicable. |
|-----------------------|-----------------|
| Novel plant genetypes | Non-applicable |
| Novel plant genotypes | |
| | |
| Authentication | Non-applicable. |
| | |

Flow Cytometry

Plots

Confirm that:

The axis labels state the marker and fluorochrome used (e.g. CD4-FITC).

The axis scales are clearly visible. Include numbers along axes only for bottom left plot of group (a 'group' is an analysis of identical markers).

 \bigotimes All plots are contour plots with outliers or pseudocolor plots.

A numerical value for number of cells or percentage (with statistics) is provided.

Methodology

| Sample preparation | Matrigel drops containing organoids/tumoroids were collected in cold basal media. Following centrifugation (500g for 5 mins at 4"C), cells were incubated in TrypLE at 37 C and then mechanically dissociated by pipetting. After washing with 5 ml of cold basal medium (500g for 5 minutes at 4 C), samples were resuspended in 1ml of FACS buffer (PBS with 2% FBS and ImM EDTA) containing a live/dead dye diluted 1:2000 (Live/Dead Fixable Aqua, Invitrogen #L34957) and incubated for 10 min at RT. In some experiments, cells were resuspended in 1ml of PBS and live/dead dye used at 1:500 (Zombie NIR, Biolegend #423106). Cells were washed with 5ml of FACS buffer, passed through a 40uM cell strainer into a new 15ml conical tube, and centrifugated (500g for 5 minutes at 4 C). Pellets were resuspended in 200ul of FACS buffer, transferred to 5ml polystyrene FACS tube, and immediately acquired on a BD LSRFortessa Cell Analyzer (BD Bioscences). For sorting experiments, unstained cells and FMO controls were included to determine basal levels of fluorescence intensity. Data were analyzed using FlowJo software (version 10.7.1, Tree Star, Ashland, OR, USA). |
|---------------------------|--|
| Instrument | CytoFLEX SRT (Beckman Coulter) and BD LSRFortessa Cell Analyzer (BD Bioscences) |
| Software | FlowJo software (version 10.7.1, Tree Star, Ashland, OR, USA). |
| Cell population abundance | The enrichment of GFP+ cells in the sorted samples was validated by analysis of GFP expression in the RNA-sequencing. |
| Gating strategy | The first gates were based on FSC-A/SSC-A live cells» SSC-W, SSC-H singlets»FSC-H, FSC-W singlets» then GFP+ and mCherry+ cells were gated based on an unstained (not transduced parental line) and FMO controls. |

Tick this box to confirm that a figure exemplifying the gating strategy is provided in the Supplementary Information.