






Pparg signaling controls bladder cancer subtype and immune exclusion

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Pparg, a nuclear receptor, is downregulated in basal subtype bladder cancers that tend to be muscle invasive and amplified in luminal subtype bladder cancers that tend to be non-muscle invasive. Bladder cancers derive from the urothelium, one of the most quiescent epithelia in the body, which is composed of basal, intermediate, and superficial cells. We find that expression of an activated form of *Pparg* (*VP16;Pparg*) in basal progenitors induces formation of superficial cells in situ, that exit the cell cycle, and do not form tumors. Expression in basal progenitors that have been activated by mild injury however, results in luminal tumor formation. We find that these tumors are immune deserted, which may be linked to down-regulation of *Nf-kb*, a *Pparg* target. Interestingly, some luminal tumors begin to shift to basal subtype tumors with time, down-regulating *Pparg* and other luminal markers. Our findings have important implications for treatment and diagnosis of bladder cancer.

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Bladder cancers are the 9th most common form of cancer worldwide, and the 4th most common among men (Sung et al., ACS 2021). Estimates from the CDC indicate that in 2021, there are ~83,730 new cases of bladder cancer (~64,280 in men and ~19,450 in women) in the United States and 17,200 deaths from bladder cancer (~12,260 men and ~4940 women), with smoking accounting for almost half (47%) of all cases in the United States¹. Bladder cancers tumors arise from the urothelium, a water-proof barrier lining the urinary outflow tract that extends from the renal pelvis to the bladder. The urothelium protects against infection, damage from toxins and prevents the exchange of fluids. It is one of the slowest cycling epithelia in the body², but undergoes a rapid sequence of exfoliation and regeneration in response to acute injury or infection. However, persistent or repeated damage and inflammation can lead to permanent changes, including loss of endogenous urothelial populations and bladder pain disease^{3,4}, which has limited treatment options.

The urothelium is pseudostratified, containing two populations of basal cells; K14-Basal cells (K14+ K5+) that are rare and reside exclusively in the basal layer, and K5-Basal cells (K5+ K14-), which reside in the basal and suprabasal layers. Lineage studies suggest that K14-Basal cells are progenitors that can repopulate the urothelium *de novo*⁵⁻⁹, and are also cells of origin that can produce tumors¹⁰⁻¹². Intermediate cells (I-cells) and superficial cells (S-cells), which reside in upper urothelial layers, express luminal markers, including Krt20, Krt18, and Upks. I-cells (P63+ UPKs+) are direct progenitors that replace S-cells when they die off^{7,13}. They are attached to the basement membrane by a long cytoplasmic tail, and they can either divide or undergo failed cytokinesis producing binucleated I-cells (2n+2n) that undergo endoreplication, doubling DNA content without entering mitosis to produce 4n+4n S-cells⁹. S-cells (UPK+ K20+ P63-) reside in the top layer; they are large, binucleated, and are critical for the synthesis and transport of uroplakins, a family of proteins that assemble into tough crystalline plaques that line the apical surface of the urothelium. Although S-cells are post-mitotic, they are functionally very active since apical plaque is continuously degraded and replaced in response to stretch, as the bladder fills and empties¹⁴⁻¹⁸.

Bladder cancers arise from the urothelium and were initially classified based on histology and clinical behavior¹⁹. In all, 51% of diagnosed cases are non-muscle-invasive bladder cancer (NMIBC) and 49% are muscle-invasive bladder cancer (MIBC)²⁰. Approximately 10–20% of NMIBC cases eventually progress to MIBC²¹. More recent studies from a number of groups have identified distinct subtypes of bladder cancer based on mutations and transcriptional profiles that cluster with the luminal and Basal tumor types in MIBC. Approximately 47% of the cases are of the luminal subtype and 35% are of the Basal subtype²¹⁻²⁸. These subtypes have grown in number and now include (LumP), luminal nonspecified (LumNS), luminal unstable (LumU), stroma-rich, basal/squamous (Ba/Sq), and neuroendocrine-like (NE-like)²¹. Tumors with a basal/squamous subtype express a set of markers including KRT14, KRT5, CD44, and KRT6A. Basal/squamous tumors are generally immune infiltrated and responsive to immune checkpoint inhibitors^{21,23,29,30}. Bladder cancer of the luminal subtype expresses a set of markers found in urothelial I-cells and S-cells, including GATA3, FOXA1, and PPARG^{23,31,32}. Luminal tumors are comparatively less invasive, but generally grow back after resection, and also tend to be immune poor and tend not to respond well to immune checkpoint blockers^{21,33-35}.

PPARG-dependent transcription is important for a wide range of functions in different cell types, including adipogenesis, metabolism, and immunity (reviewed in refs. ^{36,37}). PPARG agonists have profound effects on urothelial differentiation and

PPARG mutations and amplifications contribute significantly to bladder cancers. PPARG is a member of the nuclear receptor superfamily of ligand-activated transcription factors that bind to response elements in regulatory regions of genes^{37,38}. PPARG regulates transcription by forming heterodimers with RXR, a second nuclear receptor family member. PPARG/RXR heterodimers are activated when PPARG is bound by natural ligands (fatty acids and prostaglandins) or synthetic ligands including troglitazone and rosiglitazone. PPARG/RXR heterodimers bind to peroxisome proliferator response elements, and without ligand, are maintained in an inactive state, in complexes with co-repressors (NCOR2, SMRT). Ligand binding induces a conformational change in the PPARG/RXR heterodimer causing the release of co-repressors and the recruitment of co-activators [CREBBP, PPARGC1A, and HAT³⁹⁻⁴¹].

Studies in knockout mice indicate that PPARG regulates urothelial differentiation both in the ureter and bladder^{42,43}. In urothelial cell culture, PPARG agonists troglitazone and rosiglitazone in combination with an EGFR inhibitor, suppress squamous differentiation and induce expression of luminal markers, including *Upk1a*, *Upk2*, and *Krt20*^{44,45}.

PPARG mutations and genomic alterations are common in bladder cancer. PPARG expression is downregulated in basal/squamous subtype tumors, suggesting that loss of signaling may promote bladder tumor formation. To address this, we previously generated mice lacking *Pparg* throughout the urothelium using the *ShhCre* driver. These studies revealed a number of profound changes in the urothelium, including squamous metaplasia and loss of endogenous urothelial populations, likely owing to alterations in the differentiation program of K14-Basal progenitors that produced squamous epithelial cells instead of urothelial cells. These observations suggest that *Pparg* is normally important for the specification of K14-basal cells, however, inactivation of *Pparg* alone during homeostasis is not sufficient to drive bladder cancer⁴³.

Activation of *Pparg*-dependent transcription either owing to mutations in its binding partner RXR, or amplification of the PPARG gene occur in 20–25% of luminal tumors⁴⁶. These observations prompted us to examine whether gain-of-function mutations in PPARG could induce luminal subtype bladder cancer in mice. To do this, we inserted a cassette containing the HSV VP16 activator fused to the amino-terminal of *Pparg1*⁴⁷ into the *Rosa26* locus where it is activatable in cells expressing Cre recombinase.

The urothelium is an epithelial barrier that extends from the renal pelvis to the urethra. This stratified epithelium is nearly quiescent but can rapidly regenerate in response to injury. Here we show that *Pparg* signaling drives a luminal differentiation program in the urothelium during homeostasis as well as in tumor formation. Expression of constitutively active *VP16;Pparg* in basal progenitors during homeostasis drives them to differentiate into luminal (I-cells/S-cells) in situ; however, newly formed luminal cells are post mitotic, and do not form tumors. Expression of *VP16;Pparg* in basal progenitors that have been injured by a short exposure to BBN, a carcinogen found in tobacco smoke, results in activation of the basal population, which differentiate into luminal tumors, whereas in controls lacking *VP16;Pparg*, basal subtype tumors form. Injury of basal urothelial progenitors is accompanied but increased proliferation, a robust inflammatory response, and upregulation of *Krt6a* and *Krt16*, defensins that are not expressed in the healthy urothelium; a state that is quite similar to that observed in activated basal progenitors in the skin and airways⁴⁸⁻⁵⁰. Our findings suggest that basal cell activation may be a critical step in the genesis of urothelial carcinoma. Interestingly, we observed a shift at the base of some luminal lesions that increased with time, where tumor

cells downregulate luminal markers and begin to express basal markers, suggesting that these tumors can undergo a luminal to basal shift. Together our studies provide a model for studying luminal tumor formation in vivo and may also shed light on the mechanisms underlying tumor evolution, a phenomenon that has been reported in recent studies^{51,52}.

Results

***Pparg* activation in basal cells induces an S-cell differentiation program.** The *PPARG* gene is amplified in tumors of the luminal subtype, which also express high levels of FABP4, a direct transcriptional target of *PPARG*²³. This suggests that *PPARG* is both overexpressed and transcriptionally active, most likely by endogenous ligands. To generate a gain-of-function model that mirrors the increased *PPARG* activity in luminal tumors, we generated mice harboring a constitutively active form of *Pparg1* that is tamoxifen-inducible. We inserted a cassette containing the HSV *VP16* activator fused to the N-terminal of *Pparg1* into the *Rosa26* locus where it is activatable in cells expressing Cre recombinase [Fig. 1]⁵³. Unlike endogenous *Pparg*, *VP16;Pparg* is transcriptionally active without ligand binding^{47,53}. K14-Basal cells have been shown to be progenitors that can produce tumors in mice¹⁰. To target this population, *VP16;Pparg* mice were crossed with the *Krt5Cre^{ERT2}* line generating *Krt5Cre^{ERT2};VP16;Pparg* mutants (hereafter, referred to as *K5VP16;Pparg* mutants), in which tamoxifen-inducible Cre driven by the K5 promoter drives recombination in the basal cell population⁵⁴.

Tamoxifen was administered intraperitoneally three times over the course of 1 week which induced recombination in 80% of basal cells. To determine whether the *VP16;Pparg* mutant protein was transcriptionally active, we analyzed the distribution of *Fabp4*, a direct transcriptional target of *Pparg* in *K5VP16;Pparg* mutants and *VP16;Pparg^{fl/fl}* controls 4 days after Tamoxifen induction. In controls *Fabp4* and *Pparg* were co-expressed in S-cells as expected (Fig. 1a), however in *K5VP16;Pparg* mutants, *Fabp4* and *Pparg* were expressed both in S-cells in the luminal layer and in K14-basal cells in the basal layer (Fig. 1f, k, Supplementary Fig. 1r) indicating that the *VP16;Pparg* transgene is active. Further analysis revealed *Krt18* and *Krt20*, which are selectively expressed in S-cells of controls (Fig. 1b,c), co-localized with *Fabp4* and *Pparg* in K14-BC-positive cells in the basal layer (Fig. 1g–k), suggesting that the *VP16;Pparg* transgene is inducing K14-Basal cells to differentiate into S-cells in situ. Consistent with this, we observed binucleated cells co-expressing K14 and *Fabp4* in the basal layer suggesting that this newly formed population has undergone failed cytokinesis, a process observed when I-cells differentiate into S-cells, which normally occurs in the luminal layers of the urothelium (Fig. 1d,i,⁹).

Lineage tracing confirmed that K14+/*Fabp4*+/*Krt20*+ cells that formed in *K5VP16;Pparg* mutants were derived from basal cells. The *R26RmTmG* reporter⁵⁵ was introduced into mutants and controls to generate *K5VP16;Pparg;mTmG* mice and *VP16;Pparg^{fl/fl};mTmG* mice, respectively. In controls, Gfp-expression was confined to the basal layer as expected (Supplementary Fig. 1m–p), whereas in *K5VP16;Pparg* mutants, Gfp-expressing cells which were observed in the basal layer 1 day after tamoxifen induction, expanded to encompass the entire urothelium by one month (Supplementary Fig. 1q–t)

To identify changes in the transcriptional program of basal cells induced by expression of the *VP16;Pparg* transgene, we performed bulk RNA-seq analysis on Gfp+ cells collected from *K5VP16;Pparg;mTmG* mutants and *K5;mTmG* controls (Supplementary Fig. 5). Pathway analysis revealed upregulation of *Pparg* signaling in basal cells of mutants, confirming that the transgene was active (Fig. 1n). This analysis also revealed upregulation of

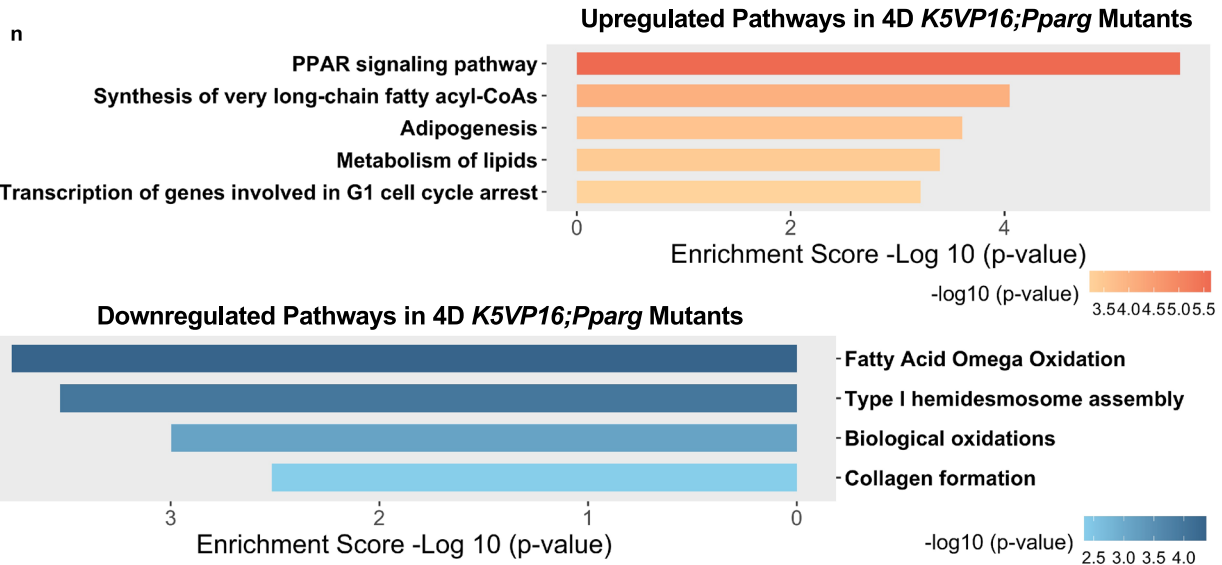
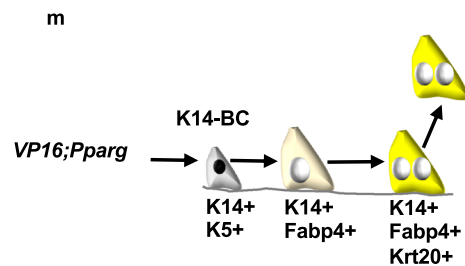
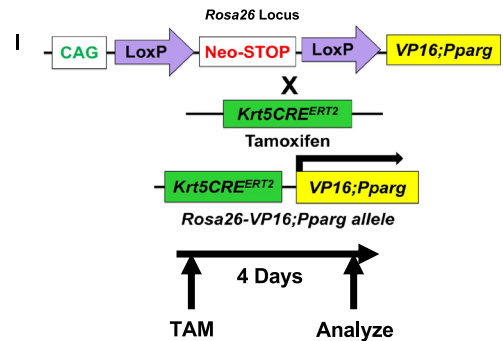
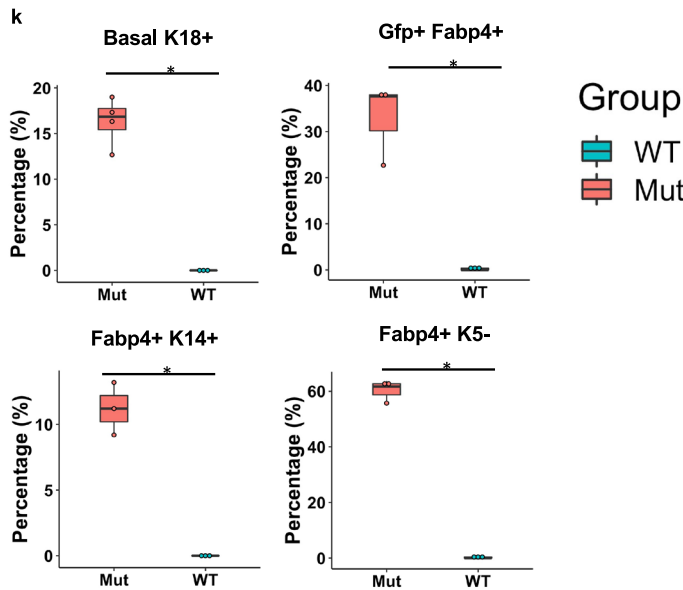
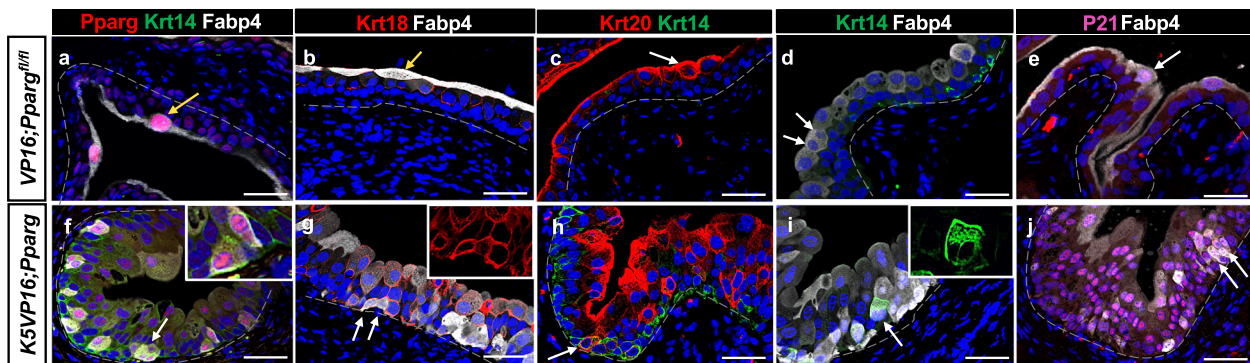
S-cell markers in basal cells of mutants compared with controls, whereas *Krt5*, *Col17a1*, and *Trp63* which are highly expressed in basal cells of controls were downregulated (Supplementary Fig. 1y), which was confirmed by immunostaining (Fig. 1k, Supplementary Fig. 1u–x). *Col17a1* is required for anchoring basal cells to the cell membrane, hence its downregulation may enable newly S-Cells to move from the basal layer up to the superficial layer of the urothelium where S-cells normally reside. RNA-seq analysis also revealed changes in cell cycle genes including p21 (*Cdkn1a*), which was upregulated in basal cells from *K5VP16;Pparg* cells compared to *VP16;Pparg* controls and confirmed by immunostaining (Fig. 1e, j), indicating that expression of the *VP16;Pparg* transgene-induced S-cell like daughters to leave the cell cycle, as is the case with endogenous S-cells. Together these results suggest that the expression of the *VP16;Pparg* transgene in basal cells alters the normal differentiation program, resulting in the production of S-like cells in situ.

Squamous metaplasia in the airways, bladder, and prostate is induced by Vitamin A-deficiency^{56,57}. In this case, the urothelium is populated by cells expressing markers found in the skin, *Krt13*, *Krt1*, *Krt10*, similar to the phenotype induced in the urothelium in *Pparg* mutants, which is characterized by an increase in K14-progenitors accompanied by a decrease in I-cells and S-cells⁴³. Retinoids have also been shown to be required for urothelial differentiation and regeneration, specifically for the formation of I-cells and S-cells¹³. We observed increased retinoid signaling in *K5VP16;Pparg* mutants compared with *VP16;Pparg^{fl/fl}* controls (Supplementary Fig. 1z). Upregulated genes include *Rbp4*, a lipocalin family member that transports retinol (the inactive form of Vitamin A) from the liver to tissues, *Stra6*, a receptor that transports retinol into the cell, *Rdh11* which synthesizes retinaldehyde from retinol in the first step of RA synthesis and *Aldh1a3*, a retinaldehyde dehydrogenase that converts retinaldehyde to RA, in the second step of RA synthesis [Supplementary Fig. 1z^{58,59}]. These data suggest that *Pparg*-dependent RA-signaling is likely important for differentiation of luminal cell types, and for suppression of squamous differentiation.

Consistent with the known role of *Pparg* as a regulator of fatty-acid transport and metabolism, we observed an increase in genes important in lipid metabolism (Fig. 1n). These include *Scd1*, *Elovl*, *AcsL4*, *Cpt1*, *Fabp5*, *Fabp1*, *Lpl*, and *Cd36*. Genes involved in pancreatic secretion, protein digestion and absorption, digestion of dietary lipid, and triacylglycerol degradation were downregulated (Fig. 1n). These pathways are similarly altered in non-alcoholic fatty liver disease (NAFLD)^{60–64}, which is thought to be linked to high-fat diet-induced *Pparg* signaling⁶⁵. Oil-Red-O staining of mutants 1 day, 4 days, and 1 month after Tamoxifen induction, revealed neutral triglyceride and lipid accumulation in mutant S-cells at 1 month, but staining was not detectable at earlier stages or in controls (Supplementary Fig. 1a–l). These observations raise the possibility that the urothelium may respond to a high-fat diet in a similar manner as observed in hepatocytes in steatosis, which turn on an adipocyte differentiation program in response to increased *Pparg* signaling.

Together, these studies suggest that constitutive activity of *Pparg* in K14-basal cell progenitors induces the formation of S-cell daughters instead of K5-Basal cells and I-cells, as normally occurs, a process that may depend on RA-signaling. With time, these S-cells appear to turn on an adipocyte differentiation program as occurs in NAFLD. These *VP16;Pparg*-expressing S-cells are post-mitotic however and hence did not form tumors.

Short-term treatment with carcinogens primes K14-basal cells for tumor formation by inducing an activated state. Currently, the most established system for modeling MIBC in mice is *N-*



butyl-*N*-(4-hydroxybutyl)-nitrosamine (BBN)⁶⁶. BBN is a nitrosamine that is metabolized in the liver to *N*-butyl-*N*-(3-carboxypropyl)nitrosamine, which is found in tobacco products^{66–68}. Five months of exposure to BBN induces basal subtype tumors, however short exposure induces a potent inflammatory response that resolves by ~1 month and recedes as tumors form⁶⁹. An interesting possibility is that this transient response to BBN might

be important for priming urothelial cells, which are largely quiescent, to re-enter the cell cycle and produce tumors. To address this question, BBN was administered to wild-type mice in water for 4 weeks, then we analyzed the urothelium from treated and untreated mice to determine the effects on urothelial populations as well as immune infiltration (Fig. 2a). Histological analysis revealed edema and immune infiltration in the bladder of

Fig. 1 Expression of VP16;Pparg in basal cells induces an S-cell differentiation program. a–j Immunostaining showing expression of Pparg, Krt14, and Fabp4 in the urothelium of VP16;Pparg control (a) and K5VP16;Pparg mutants (f). Expression of Krt18 and Fabp4 in the urothelium of control (b) and a K5VP16;Pparg mutant (g). Expression of Krt20 and Krt14 in the urothelium of control (c) and a K5VP16;Pparg mutant (h). Expression of Krt14 and Fabp4 in the urothelium of control (d) and K5VP16;Pparg mutant (i). Expression of P21 and Fabp4 in the urothelium of control (e) and a K5VP16;Pparg mutant (j). **k** Quantification of the percentages of Basal cells undergoing luminal differentiation in VP16;Pparg controls ($n = 3$) versus K5VP16;Pparg mutants 4 days ($n \geq 3$) after tamoxifen induction; expression of cell-type-specific markers in mutants and controls: Krt18 in the basal layer ($p = 0.021$), Gfp and Fabp4 in the basal layer ($p = 0.038$), Fabp4 and K14 ($p = 0.031$), Fabp4 but not K5 ($p = 0.038$). Box plots display minima, maxima, and interquartile range (IQR). Significance was calculated by one-sided Mann-Whitney U test. $*p \leq 0.05$. **l** Schematic showing the mouse models and timing of analysis. The VP16;Pparg cassette was inserted in the *Rosa26 Locus* to generate VP16;Pparg mutant mice, where expression is activatable in cells expressing Cre recombinase. VP16;Pparg mice were then crossed with the *Krt5Cre^{ERT2}* line, which drives Cre-dependent recombination in Basal cells after Tamoxifen induction, activating the expression of the transgene. Tamoxifen was administered 3 \times over the course of 1 week, and bladders were harvested 4 days after the last Tamoxifen induction. **m** Schematic of the S-cell differentiation program induced by VP16;Pparg expression in basal cells. **n** Upregulated and downregulated pathways from RNA-seq analysis of controls and K5VP16;Pparg mutants 4 days after Tamoxifen induction. p values were calculated by hypergeometric test and corrected for multiple testing. Yellow arrows in a–e denote superficial cells. White arrows in f–j denote mutant cells undergoing a basal to luminal shift. Scale bars, 50 μ m. Source data are provided as a Source Data file.

BBN-treated mice which was not observed in controls, indicating the presence of inflammation (Fig. 2b, c). Consistent with this, immunostaining revealed significant leukocyte infiltration in BBN-treated mice, as well as upregulation of p65 subunit of Nf- κ b, a complex, that controls both innate and adaptive immunity (Fig. 2d–g). These observations were confirmed by RNA-seq analysis, which revealed upregulation of T-cell markers (Cd4 and Cd8), proinflammatory cytokines (*Il1a*, *Il6*, *Il18*, *IFN γ* , and *TNFA*), and transcription factors, including *Nfkb*, *Foxp3*, *Stat3* and *Jun*, *Batf*, and *Fosl1*, which are *Ap1* family members that are important regulators of the immune response⁷⁰ (Fig. 2p, Supplementary Fig. 2a).

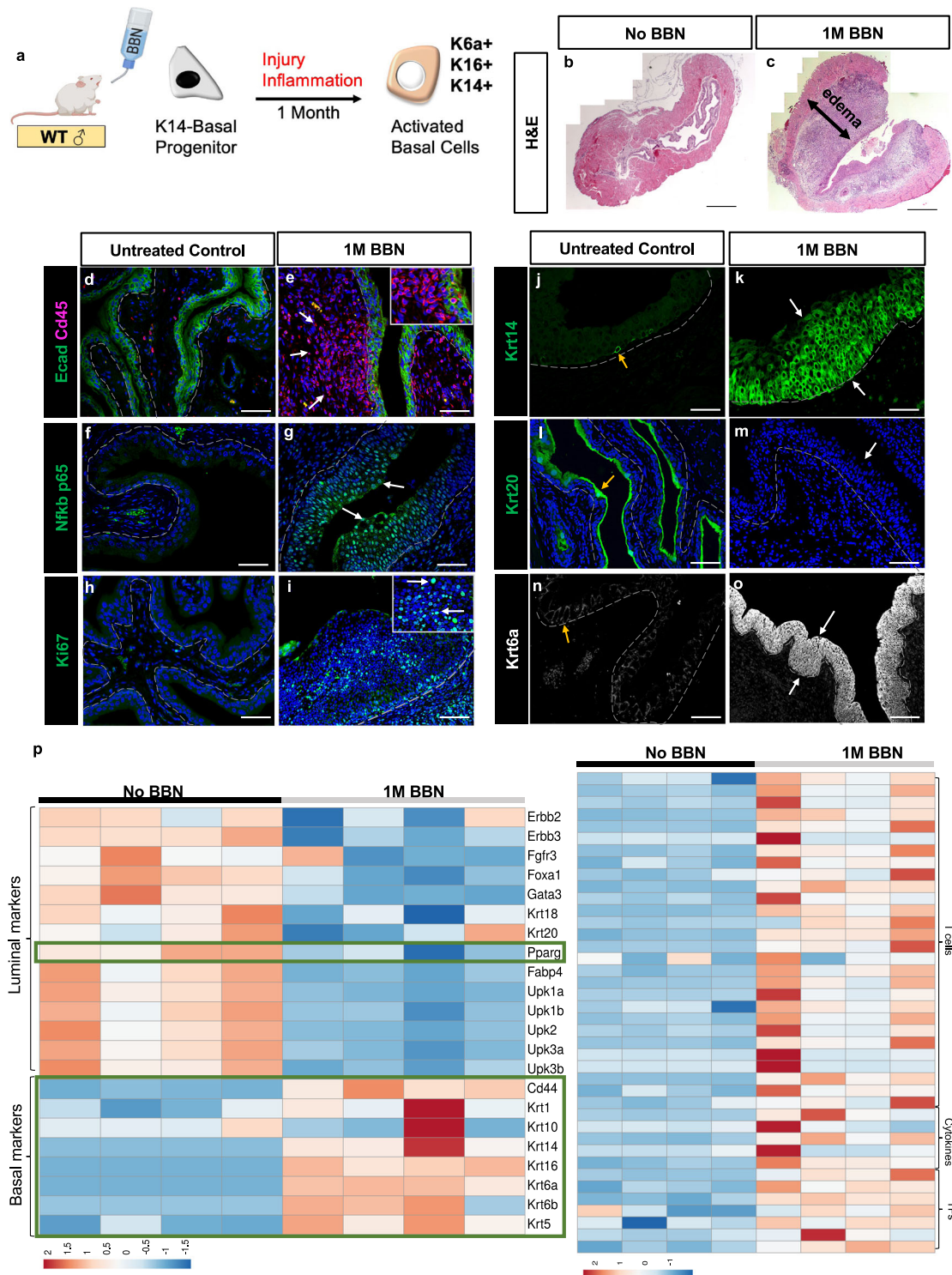
Further analysis by immunostaining and RNA-seq revealed widespread proliferation in the urothelium of BBN-treated compared with untreated controls, where proliferating cells were rare (Fig. 2h, i). This short BBN treatment also caused profound alterations in urothelial populations: K14-Basal cells, which are rare in controls and are confined to the basal layer, now populated most of the urothelium in BBN-treated mice (Fig. 2j, k). Consistent with the massive expansion of the K14-population, we observed depletion of I-cells and S-cells in BBN-treated mice, evidenced by downregulation of Krt20 (Fig. 1, m) as well as *Fgfr3*, *Foxa1*, *Gata3*, *Krt18*, and *Upks* (Fig. 2p). On the other hand, BBN exposure induced upregulation of *Krt6a* which is barely detectable in the urothelium of healthy mice (Fig. 2n, o) as well as keratins expressed in squamous epithelia including *Cd44*, *Krt1*, *Krt16*, *Krt6b*, and *Krt5* (Fig. 2p). In addition to BBN, we found that exposure to another urotoxin cyclophosphamide⁷¹ induces similar activation of the K14-Basal cells (Supplementary Fig. 2b–m). K14-progenitors in the skin and airways, which are also barriers, upregulate *Krt14*, *Krt16*, and *Krt6a* and undergo squamous differentiation. Hence, this activation state may be a conserved reaction to injury, perhaps maintaining the barrier by regenerating a layer of squamous tissue in response to injury.

VP16;PPARG expression in activated basal cells induces luminal tumor formation. Long-term BBN treatment of wild-type mice results in basal subtype tumors^{35,72}; however, a short BBN exposure activates the urothelium, which becomes proliferative and is populated almost exclusively with K14-Basal cells compared with untreated mice (Fig. 2h–o). We tested whether expression of the VP16;Pparg protein after activation could alter the pathway of tumor formation from basal subtype to luminal subtype (Fig. 3a). K5VP16;Pparg mutants and controls were exposed to BBN for 1 month, after which tamoxifen was administered intravesically under ultrasound guidance. Ultrasound analysis after 4 months revealed thickening of the bladder wall in controls and protrusions in the lumen of mutants (Fig. 3b, c).

Hematoxylin and eosin stain (H&E) revealed papillary-like structures in K5VP16;Pparg mutants and invasive lesions in VP16;Pparg^{fl/fl} controls (Fig. 3d, e). The pathological evaluation suggested that lesions in K5VP16;Pparg mutant mice were consistent with a human papillary luminal subtype of bladder cancer, whereas tumors in controls lacking the transgene presented features of the human basal/squamous subtype, as expected. Lesions in the K5VP16;Pparg mutant bladders were enriched with Ta and T1 (exophytic) lesions (Fig. 3l), whereas control bladders without the VP16;Pparg transgene contained invasive T3 (basal) lesions (Fig. 3t, x). Laminin and smooth muscle actin (SMA) staining allowed us to clearly visualize the fibrovascular core of luminal lesions, a hallmark of papillary (luminal) tumors while in controls, vasculature was widespread (Fig. 3f, g). To confirm that lesions derived from basal cells in mutants and controls, we analyzed bladders from K5VP16;Pparg;*mTmG* mutants and K5;*mTmG* controls 4 months after tamoxifen induction when lesions were clearly visible. In both cases, lesions were almost completely Gfp-positive (Supplementary Fig. 3a, b), indicating that they are derived from Gfp+ basal cells.

Comparison of BBN-induced lesions in K5VP16;Pparg luminal lesions with human luminal tumors from patients revealed a similar branched exophytic structure and a fibrovascular core in both. Conversely, BBN-treated control lesions were invading into the submucosa and muscle, similar to the human basal tumor (Fig. 3h, l, p, t). Immunostaining of human and mouse lesions with markers expressed in basal subtype lesions (Krt14 and Krt6a) revealed robust expression in the BBN-treated controls and human basal tumor, whereas there was little if any expression in lesions from mouse K5VP16;Pparg mutants or luminal lesions from human patients (Fig. 3i, m, q, u). Analysis with markers expressed in luminal subtype tumors (Krt20, Pparg, Foxa1) revealed little expression in control BBN-induced basal lesions and human basal tumors, whereas expression was prominent in luminal human tumors and K5VP16;Pparg tumors (Fig. 3j, k, n, o, r, s, v, w). Expression of Ki67, which marks proliferating cells, was distinct in basal and luminal tumors. In basal tumors, Ki67 expression was in cells adjacent to the basement membrane of lesions, while in luminal tumors proliferating cells were scattered (Fig. 3k, o, s, w).

RNA-seq analysis of laser-captured cells from K5VP16;Pparg and control mice revealed co-clustering with genes expressed in tumors with luminal and basal subtypes, respectively. Comparison of the transcriptomes of BBN-induced tumors with subtypes from Cancer Genome Atlas (TCGA) human tumors ($n = 408$) and known luminal bladder cancer model *Upk3a-CreERT2*; *Trp53L/L*; *PtenL/L*; *Rosa26LSL-Luc* (UPPL) tumors and controls reveal that the K5VP16;Pparg mutant lesions co-clustered with



luminal and luminal Papillary TCGA samples, which express a set of markers including *Pparg*, *Foxa1*, *Krt18*, and *Krt20* (Supplementary Fig. 3e). Control basal lesions from BBN-treated *VP16;Pparg^{fl/fl}* mice co-clustered with the Basal Squamous TCGA samples, which express a set of markers including *CD44*, *Krt5*, *Krt14*, and *Krt6a* (Supplementary Fig. 3e). Pathway analysis revealed upregulation of genes related to metabolism in *K5VP16;Pparg* mutant lesions (Fig. 3y), which is not surprising given the known role of *Pparg* as a regulator of mitochondrial biogenesis and fatty-acid metabolism. Oil-red-O staining showed

accumulation of lipid droplets in the urothelium of *K5VP16;Pparg* 1 month after Tamoxifen induction, however, we did not observe lipid droplets in the *K5VP16;Pparg* mutant luminal tumors (Supplementary Fig. 3c, d). Pathways related to cell cycle, T-cell activation, and cytokine signaling are down-regulated in the *K5VP16;Pparg* mutant lesions, suggesting the immune response is dampened in the *Pparg* activated luminal tumors (Supplementary Fig. 3e). Taken together, these findings suggest activating *Pparg* in activated basal cells can induce basal tumors to adopt a luminal fate.

Fig. 2 Short BBN treatment induces a wound-healing response in the urothelium that primes basal cell progenitors for tumorigenesis. **a** Schematic representation showing activation of K14-progenitors. **b–c** Histology of bladders from untreated mice (**b**) and from mice treated with BBN for 1 month (**c**); the black double-headed arrow denotes edema. Scale bars, 200 μm . **d–i** Immune infiltration visualized by Cd45 staining in bladders from untreated controls (**d**) and mice treated with BBN for 1 month (**e**). Expression of p65 in controls (**f**) and in mice treated with BBN for 1 month (**g**). Expression of Ki67 in controls (**h**) and in bladders from mice treated with BBN for 1 month (**i**). White arrows denote cells positive for Cd45 (**e**), p65 (**g**), and Ki67 (**i**) in bladders from BBN-treated animals. The inserts in **e** and **i** show images at higher magnification. **j–o** Loss of normal urothelial populations and gain of squamous populations in bladders from a mouse treated with BBN for 1 month. Krt14 expression in control (**j**) and in urothelium from a mouse treated with BBN for 1 month (**k**). Yellow arrows in **j** denote a Krt14-expressing cell. Krt20 expression in a control (**l**) and in the urothelium from a mouse treated with BBN for 1 month (**m**). The yellow arrow in **l** denotes a Krt20-expressing S-cell. The white arrow in **m** denotes the loss of Krt20-positive S-cells after BBN treatment. Krt6a expression in control (**n**) and in urothelium from a mouse treated with BBN for 1 month (**o**). The yellow arrow in **n** denotes the absence of detectable Krt6a expression in the untreated urothelium. White arrows in **o** denote activated basal cells expressing Krt6a, a squamous marker not present in the healthy urothelium. Scale bars, 50 μm . **p** Heatmaps of luminal/basal gene signatures and immune cell signatures generated from pathway analysis of RNA-seq performed on the urothelium of control and BBN-treated bladders.

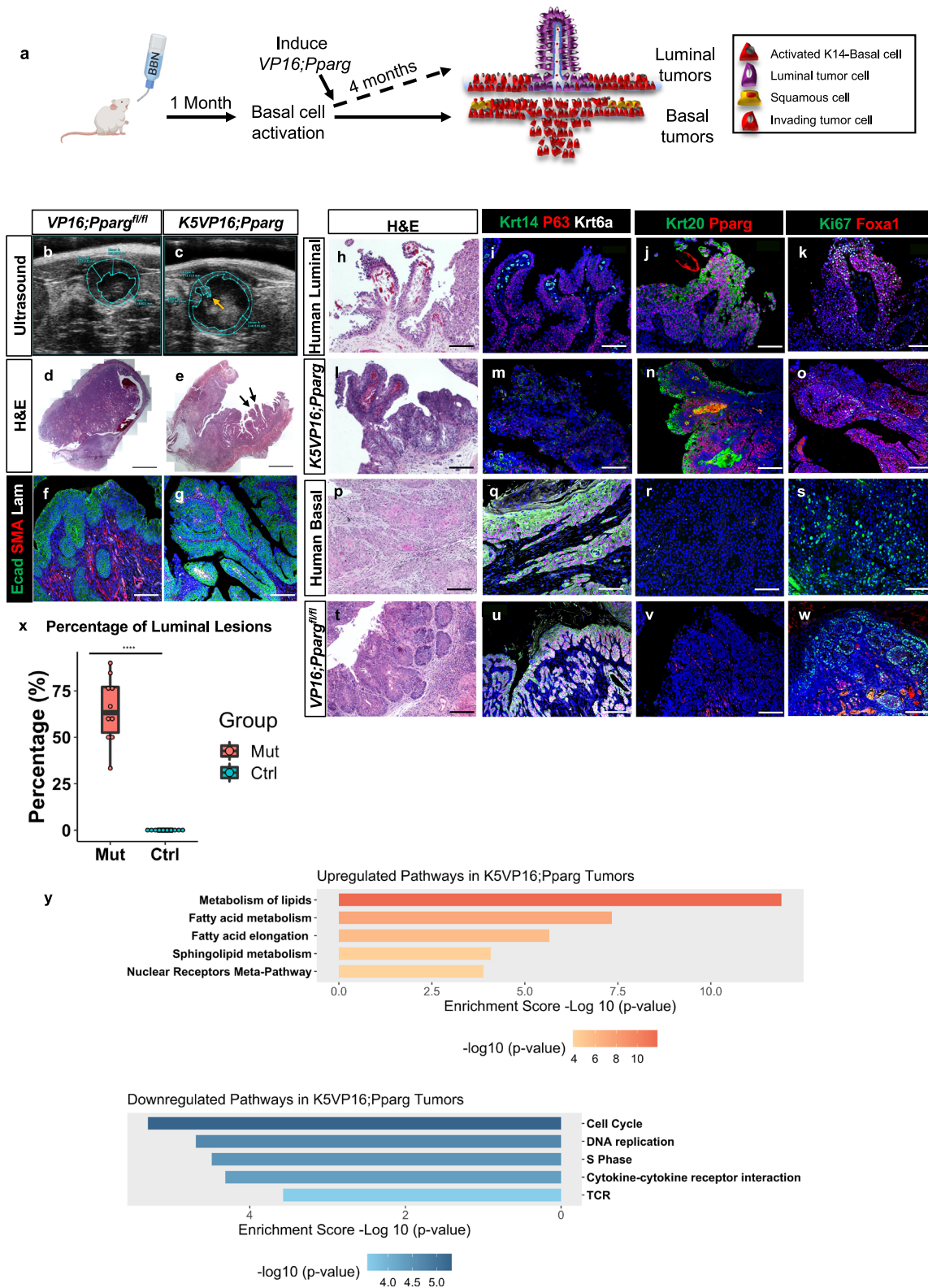
Pparg induced luminal tumors are immune cold. An important distinction in the classification of tumors is whether the tumor is immune “hot” or immune “cold.” Hot tumors are characterized by increased immune cell trafficking, an abundance of inflammatory cytokines and antigen-presenting cells, increased T-cell activation, and increased major histocompatibility complex expression. Cold tumors have low to no immune cell trafficking, impaired T-cell activation, an abundance of myeloid-derived suppressor cells, and regulator T cells that release immunosuppressive cytokines^{73,74}. Human basal and luminal MIBCs demonstrate varying degrees of immune infiltration and respond differently to checkpoint inhibitors. Immune infiltration is mostly associated with the basal/squamous and stroma-rich subtypes of MIBC, whereas the luminal subtypes are often immune cold²¹, suggesting that the tumor microenvironment in bladder cancer is driven by subtype-specific differences. However, whether the immune exclusion phenotype is due to active immune suppression in the luminal subtypes largely unknown. *Pparg* is known to regulate a number of immune responses, including NF- κ B suppression and interactions with the AP1 pathways^{75–78}. Unsupervised clustering of *K5VP16;Pparg* mutants and *VP16;Pparg^{fl/fl}* control tumors using previously established immune gene signature demonstrated overall low levels of the immune response, similar to the UPPL luminal bladder cancer model (Fig. 4a,³⁵). In contrast, the control tumors showed very active immune signatures (Fig. 4a). To further investigate these findings, we compared expressions of Nf-kb subunit p65 and Cd45 in *K5VP16;Pparg* mice and *VP16;Pparg^{fl/fl}* controls (Fig. 4b–e). Immunostaining of control basal tumors revealed widespread nuclear expression of p65, indicating that Nf-kb is activated throughout the tumor. In addition, we observed numerous infiltrating Cd45+ leukocytes (Fig. 4c, e). Analysis of p65 expression in *K5VP16;Pparg* mutant tumors, reveal little if any nuclear expression, suggesting that Nf-kb is inactive in the mutants. Likewise, we did not observe infiltrating immune cells in these lesions based on Cd45 expression. *Pparg* actively represses Nf-kb expression, suggesting that *Pparg* is likely to be important for inducing the immune cold phenotype in luminal tumors.

A subset of luminal tumors in *K5VP16;Pparg* mutants undergo a shift toward the basal subtype. During the course of our analysis, we observed a domain in a few luminal tumors that appear to be more basal in character than luminal (Fig. 5a, e). Mixed subtypes were observed in 15/70 lesions in *K5VP16;Pparg* mutants 4 months after Tamoxifen induction (Table 1, Supplementary Fig. 4a). However, these mixed subtype tumors were rare in animals analyzed 1 month earlier, where only 1/28 lesions displayed a mixed subtype (Table 1, Supplementary Fig. 4a), suggesting that the shift increases with time. Analysis with Krt6a and Krt14, markers that stain basal subtype tumors, revealed

robust expression throughout basal lesions in controls that were exposed to BBN for 5 months but do not express the *VP16;Pparg* transgene (Fig. 5b). Analysis of Krt6 and K14 expression in tumors with mixed histology revealed little staining in the luminal compartment (Fig. 5f, green line), whereas staining was increased in the basal-like compartment (Fig. 5f, blue line). *Pparg* expression was undetectable in basal control tumors (Fig. 5c), whereas expression was maintained at high levels in the mutant luminal upper domain (Fig. 5g). In the basal-like portion of these mixed lesions, however, levels were lower compared with the luminal domain (Fig. 5g).

Lineage tracing of *K5;mTmG* controls, revealed Gfp expression throughout Basal subtype tumors (Fig. 5d). Analysis of *K5VP16;Pparg;mTmG* mice revealed Gfp-labeling both in the luminal domain and in the basal-like domain of mixed subtype tumors, indicating that both luminal and basal-like compartments arose from cells expressing the *K5VP16;Pparg;mTmG* transgene (Fig. 5h). The observations that (i) number of tumors with the mixed basal/luminal subtype increases with time, (ii) that these tumors express *Pparg* both in luminal and basal-like domains (iii) that both luminal and basal domains are Gfp positive, suggests that lower basal-like domain derived from the upper luminal tumor, and had begun to shift from a luminal to a basal subtype.

To further characterize changes in the mixed subtype lesions, we performed RNA-seq analysis using laser capture to collect tissue from the luminal and basal-like domains separately, as well as from basal subtype controls. Analysis of basal subtype controls revealed high levels of expression of basal subtype markers, including *CD44*, *Krt6a*, *Krt14*, and *Krt16*, whereas expression of luminal markers was low (Fig. 5k, Supplementary Fig. 4b). Analysis of the upper luminal domain of mixed subtype lesions revealed a pattern of expression typical of luminal tumors; basal markers were downregulated and luminal markers including *Pparg*, *Upks*, *Krt20*, *Gata3*, and *Foxa1* were upregulated (Fig. 5i, Supplementary Fig. 4b). Expression of most luminal markers was low in the basal-like portion of the tumor compared with the luminal upper portion (Fig. 5j, Supplementary Fig. 4b) while a subset of basal markers was upregulated, consistent with the results of immunostaining (Fig. 5j, Supplementary Fig. 4b). Pathway analysis revealed increases in genes important for metabolism and lipid synthesis, as well as glutathione-mediated detoxification, a likely response to BBN exposure and the *Ppar* signaling pathway. Genes upregulated in the basal portion of the mixed subtype tumors include those important for cell cycle regulation, T-cell signaling, and inflammation, which is consistent with the immune infiltrated phenotype of basal subtype tumors (Supplementary Fig. 4c). Taken together, our observations suggest that advanced luminal tumors lose *Pparg* expression, display increased expression of basal markers, and develop invasive basal



domains. This shift in phenotype has recently been reported in patient-derived organoids⁵² as well as in human tumors⁵¹. We have established a mouse model that undergoes a phenotypic shift from a luminal subtype towards a basal subtype. Luminal tumors are often classified as NMIBC, however, muscle-invasive lesions develop in 10–20% of patients diagnosed with luminal NMIBC. An important question is whether the invasive lesions develop from the original luminal tumor in a similar way as observed here

since luminal tumors are generally removed by transurethral resection of tumors (TURBT), which may leave behind the basal-like invasive portion of the tumor.

Discussion

Pparg has the capacity to regulate numerous cellular functions, including metabolism, fatty-acid transport, and cell-type specification. *PPARG* expression is downregulated in the basal subtype

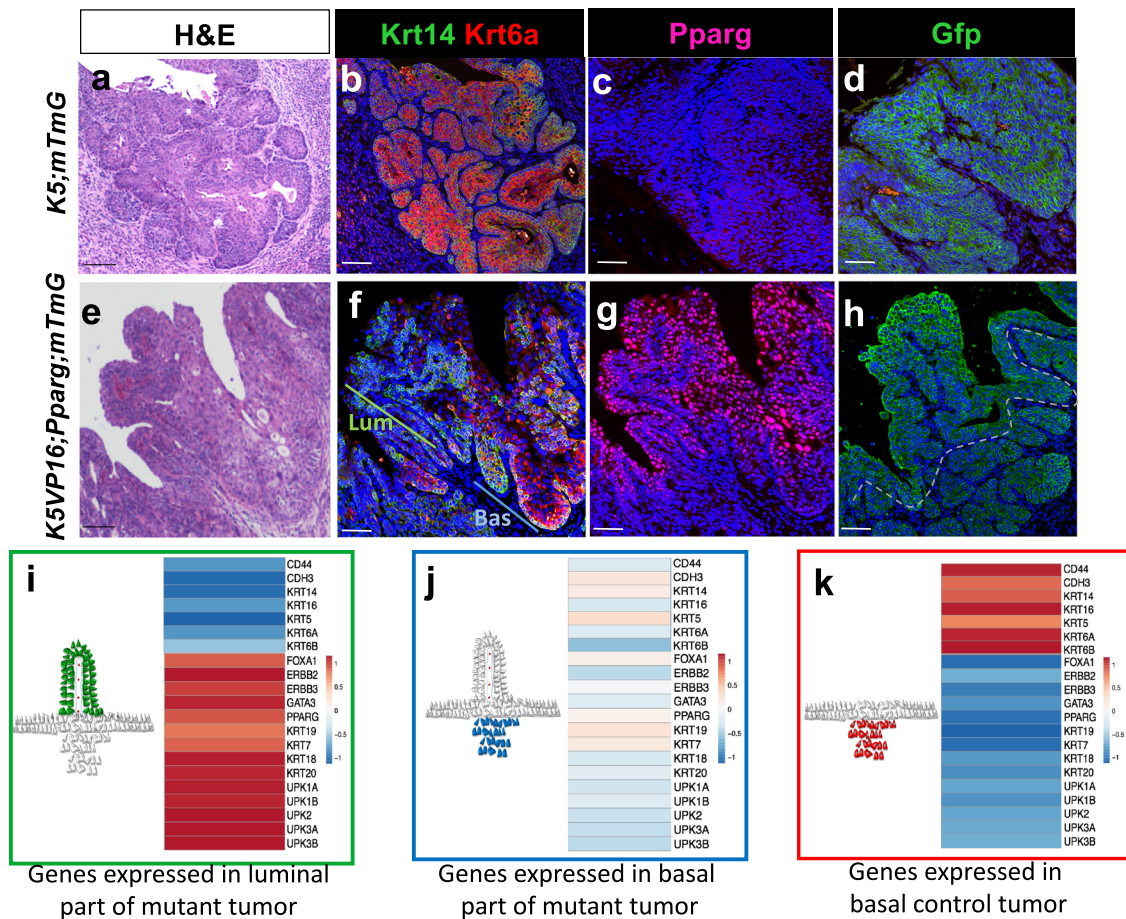


Fig. 5 *K5VP16;Pparg;mTmG* luminal tumors develop basal domains. **a–k** H&E images of a *K5;mTmG* control tumor (**a**) and a *K5VP16;Pparg;mTmG* mutant tumor (**e**) 4 months after induction. Expression of Krt14 and Krt6a in a *K5;mTmG* control tumor (**b**) and *K5VP16;Pparg;mTmG* mutant tumor (**f**) 4 months after induction. Expression of Pparg in a *K5;mTmG* control tumor (**c**) and a *K5VP16;Pparg;mTmG* mutant tumor (**g**) 4 months after induction. Expression of Gfp in a *VP16;Pparg;mTmG* control tumor (**d**) and in a *K5VP16;Pparg* mutant tumor (**h**) 4 months after Tamoxifen induction. **i–k** Heatmaps and schematic representation showing tumor evolution. The luminal portion of a *K5VP16;Pparg* mutant tumor is shown in green (**i**) and the basal domain is depicted in blue (**j**). **k** shows a schematic representation of a control basal tumor, which is depicted in red. Scale bars, 100 μ m.

layers, and I-cells daughters that differentiate into S-cells. We find that 1 month of BBN exposure or repeated exposure to cyclophosphamide induces an activation state in K14-basal cells similar to that observed in the epidermis and airways. The K14-basal population becomes proliferative, expands, and ceases producing endogenous urothelial cell types (K5-basal cells and I-cells), instead K14-basal progenitors produce squamous cell daughters that express *Krt6a* and *Krt16*, which are not detected in the healthy urothelium.

The activation process in the skin is initiated by secretion of IL-1 and TNF α ^{84,85}, and is thought to be sustained by TNF α and TGF signaling, leading to activation of the NF- κ B-signaling pathway and the associated inflammatory responses^{86–89}. Consistent with this, we also observed upregulation of IL-1, TNF, IFN γ , and NF- κ B signaling in the bladder after short-term BBN treatment. Inflammatory reactions have long been implicated as a precursor prior to the formation of tumors in several types of cancer⁹⁰, which in this case may be a response to neoantigen production. The basal cell activation program and squamous differentiation observed in response to injury in the urothelium and other epithelial barriers may have evolved as a mechanism for temporary repair; our studies suggest that this injury response may also be a hallmark of tumor formation in urothelial carcinoma.

RNA-seq analysis reveals downregulation of a large number of immune mediators in luminal tumors in *K5VP16;Pparg* mutants

that based on the distribution of immune cells, are immune cold. In some types of cancer, with immune suppression, immune cells are observed near tumors but fail to penetrate. In luminal tumors of *K5VP16;Pparg* mutants, however, immunostaining reveals few if any immune cells in or near tumors, whereas control basal subtype tumors are immune infiltrated. Nf- κ B is a master regulator of the immune response, and the *Rela* subunit p65, is transcriptionally regulated by *Pparg*^{75,91}. We find abundant nuclear p65 in basal subtype tumors in controls lacking *VP16;Pparg* indicating active Nf- κ B signaling, but p65 is barely detectable in luminal tumors of *K5VP16;Pparg* mutants. Although other possibilities exist, these observations raise the interesting possibility that *Pparg*-dependent suppression of Nf- κ B activity may contribute to the immune cold phenotype in luminal tumors.

Intra-tumor heterogeneity and evolution have been observed in bladder cancer studies of tumor-derived organoids and mutational analysis of human tumors^{52,92,93}. We observe altered histology at the base of luminal tumors in *K5VP16;Pparg* mutants that appears 4 months after Tamoxifen induction, but not before, suggesting that this phenotype is acquired over time. These domains express basal markers including Krt6a, and downregulate luminal markers. It is likely that new mutation acquisition from sustained exposure to BBN after tamoxifen induced expression of the *VP16;Pparg* transgene may be a driver of these

Table 1 Quantification of tumor class in VP16;Pparg controls and K5VP16;Pparg mutants.

Time point	Sample	No. of luminal lesions		No. of basal lesions	Time point	Sample	No. of luminal lesions		No. of basal lesions
		Luminal only	Luminal with basal bottom				Luminal only	Luminal with basal bottom	
4 Months K5VP16;Pparg	Het 72	5	1	2	4 months control	WT 5	0	0	2
	Het 74	8	1	1		WT 3	0	0	5
	Het 51	6	3	6		WT 88	0	0	1
	Het 1	18	4	4		WT 54	0	0	3
	Het 53	2	4	3		WT 55	0	0	1
	Het 56	1	0	1		WT 2	0	0	3
	Het 57	3	0	3		WT 83	0	0	5
	Het70	5	1	4		WT 20	0	0	2
	Het 9	1	0	2		WT 19	0	0	1
	Het 75	6	1	2		WT 56	0	0	2
Total	55	15	28	Total	0	0	25		
3 Months K5VP16;Pparg	Het 44	8	1	3	3 months control	WT61	0	0	3
	Het 62	6	0	3		WT58	0	0	4
	Het 50	2	0	0		WT59	0	0	4
	Het 4	7	0	1		WT 5	0	0	4
	Het 7	4	0	3		WT81	0	0	3
Total	27	1	10	WT22	0	0	2		
2 Months K5VP16;Pparg	Het70	4	0	0	2 months control	Total	0	0	20
	Het 56	1	0	0		WT50	0	0	1
	Het 62	2	0	0		WT49	0	0	1
	Total	7	0	0		WT40	0	0	2
1 Month K5VP16;Pparg	Het 8	0	0	0	1 month control	Total	0	0	4
	WT 66	0	0	0		WT 70	0	0	0
	Het 50	0	0	0		WT 79	0	0	0
	Het 10	0	0	0		Total	0	0	28
Total	0	0	0						

Overall classification and quantification of lesions observed in VP16;Pparg controls and K5VP16;Pparg mutants at the indicated timepoints. Pathologic classification is based on the analysis of H&E-stained samples.

changes, as bladder cancer has one of the highest tumor mutational burden. However, the observation that they form, and are in a basal position suggests that they may not be observed in biopsies of luminal subtype tumors taken from patients, or may remain after TURBT treatment, thus contributing to recurrence and progression from NMIBC to MIBC.

Methods

Mice. To generate an inducible VP16;Pparg mouse line, a VP16;Pparg cDNA was cloned into the AscI site of the CTV vector (Addgene #15912) via Gibson assembly method to generate pCTV-VP16PPARG gene-targeting vector placing a CAG promoter, a STOP cassette (Loxp-Neo-Loxp), the VP16PPARG cDNA and an IRES-EGFP into intron 1 of the ROSA26 gene. The VP16PPARG is expressed from a synthetic CAG promoter after the removal of the STOP cassette by Cre recombinase. The pCTV-VP16PPARG gene-targeting vector was linearized by AolI and electroporated into KV1 (129B6 hybrid) ES cells to generate targeted ES cells with modified ROSA26-CAG-STOP-VP16Pparg allele. The targeted ES cells were injected into the C57BL/6N blastocysts to generate germline chimeras. The male chimeras were bred to wild-type C57BL/6N females to transmit the ROSA26-CAG-STOP-VP16PPARG-IRES-EGFP allele. For conditional tissue-specific expression of the VP16;Pparg, the master ROSA26-CAG-STOP-VP16PPARG-IRES-EGFP mouse line was crossed to Krt5Cre^{ERT2} and induced by Tamoxifen. mTmGfl/fl (Gt(ROSA)26Sortm4(ACTB-tTomato,-EGFP)Luo/J) mice were obtained from Jackson Laboratory (stock #007576). K5Cre^{ERT2} mice (FVB.Cg-Tg(KRT5cre/ERT2)2Ipc/JeldJ) were obtained from D. Metzger and P. Chambon. Primers used for genotyping are detailed in Supplementary Table 1. All work with mice was approved by and performed under the regulations of the Columbia University Institutional Animal Care and Use Committee. Animals were housed in the animal facility of Irving Cancer Research Center, Columbia University. Animals were housed in a standard cage of 75 square inches at or below the maximum cage density permitted by IACUC protocol. The temperature was maintained between 68 and 79 °F. Humidity was maintained between 30 and 70%. A timed-controlled lighting system was used for a uniform diurnal lighting cycle.

Human specimens. Bladder tumors were obtained from patients undergoing TURBT at Columbia University Irving Medical Center. All patients gave informed consent under the Columbia University Institutional Review Board-approved protocols.

Intraperitoneal tamoxifen induction. Mice (8–12 weeks of age) were injected with tamoxifen (Sigma cat#T5648) dissolved in corn oil, at a dose of 5 mg per 30 g body weight for three times over the course of one week.

Ultrasound-guided tamoxifen induction. Mice (8–12 weeks of age) were injected with 150 µL of 4-OHT dissolved in DMEMF12/Tween 80 at a dose of 80 µg/mL every other day for two dosages using a VEVO 3100 Ultrasound Imaging System (FUJIFILM VisualSonics, Toronto, Canada) located within the mouse barrier in the Herbert Irving Cancer Center Small Animal Imaging facility.

BBN treatment. BBN (0.05%; Sigma cat#B8061-1G) was administered in the water supply daily for 3.5–24 weeks to induce bladder cancer. Mice were euthanized at 3.5 or 24 weeks. All bladders were removed and embedded for sectioning and staining.

Laser capture microdissection (LCM). Five-month BBN K5VP16;Pparg and control bladders were flash-frozen sagittally in OCT and stored at –80°C. The specimen blocks were placed in the Leica CM3050 cryostat chamber for 5–10 min to temperature equilibrate. The tissue was sectioned at 5 µm on Arcturus PEN Membrane glass slides (Applied Biosystems cat#LCM0522) and the slides were immediately stored at –80°C. In all, 1 h prior to LCM, slides were removed from the –80°C and stained with Arcturus HistoGene Staining Solution (ThermoFisher Scientific cat#KIT0415) according to the manufacturer’s protocol. Tissue was then laser captured on a Zeiss AxioObserver.Z1 inverted microscope into AdhesiveCap 200 opaque caps (Zeiss cat#000830-19). In total, 240 µL of RLT Lysis Buffer (Qiagen cat#1015750) was then added to the captured tissue. The suspension was then processed for total RNA extraction. Samples with a RIN (regulation identification number) >6.5 were used for RNA-seq. These samples then were sequenced according to the steps listed in the RNA-Sequencing method.

Single-cell dissociation. Cold active protease (CAP), was prepared and stored on ice (5 mM CaCl₂, Sigma cat#21115, 10 mg/mL Bacillus Licheniformis protease, Sigma cat#P5459, 12.5 U/mL DNase, Sigma cat#4716728001). Mice were perfused with 20 mL of CAP using a small vein infusion set (Kawasumi cat#D3K2-23G) and two 10 mL syringes per mouse. Bladders were dissected and immediately put in a 60 mm × 15 mm petri dish (Fisherbrand cat#FB0875713A) containing CAP on ice for 10 min. The bladders were then transferred to HBSS media (ThermoFisher cat#14170-112) containing 1% bovine serum albumin (Sigma cat#A2058) and 0.1% glucose, where they were inverted and the urothelium was manually separated from the stroma. The cell suspension was then collected into a 1.5 mL Eppendorf tube on ice and gently triturated until the cells were in a single-cell suspension.

RNA-sequencing. For homeostasis experiments, *K5VP16;Pparg;mTmG* and *K5;mTmG* single-cell suspensions were filtered through a 70 µm filter (Fisherbrand cat#22363548) and then sorted on a BD Aria II Cell Sorter using a 130 µm nozzle aperture and 13 psi pressure to collect GFP-positive cells. Gating strategy was performed on BD FACSDiva Software v 8.0. Cells were then centrifuged at 500 × g for 30 min at 4°C. The supernatant was discarded, and the pellet was processed for total RNA extraction. Samples with a RIN (regulation identification number) >8 were used for RNA-seq. The libraries were prepared using the SMART-Seq[®] v4 Ultra[®] Low Input RNA Kit for Sequencing (TaKaRa) followed by Nextera XT (Illumina), both according to manufacturer's instructions. They were sequenced to a targeted depth of 40 M × 100 bp reads on a NovaSeq 6000 (Illumina). Differential expression analysis was performed by reading kallisto counts files into R using the R packages tximport (v.1.10.1) and biomaRt (v.2.34.2), and running DESeq2 (v.1.18) to generate log fold change values and *p* values between the two experimental groups. The heatmap and PCA plots were visualized after transforming the counts using VST (variance stabilizing transformation). Gene set analysis by ConsensusPathDB (Kamburov, A. et al. 2013) was used to identify significantly changed pathways.

Heatmaps. RNA reads were aligned to the mouse reference genome (mm10) using STAR (v2.5.3a). The transcript levels were then quantified using SALMON (v0.9.1). Count data were extracted from SALMON output using Tximport (Bioconductor), and normalized and log₂-transformed using DESeq2 (Bioconductor). Heatmaps were generated by ComplexHeatmaps⁹⁴. Box plots of selected genes were generated by ggplot2 (R 3.6.2). Significance was calculated using Mann–Whitney *U* test. Heatmaps used unsupervised clustering of *VP16;Pparg* mouse tumors and BBN/UPPL mouse tumors across previously established immune gene signatures³⁵. Each gene signature was calculated as the *z* score of the average value of all genes included in the signature. Gene expression of murine tumors and human tumors from The Cancer Genome Atlas (TCGA; *n* = 408) was combined using upper quantile normalization and co-clustered using basal/luminal marker genes.

Statistics and reproducibility. All quantitation was performed on at least three independent biological samples, using the ImageJ software. Data presented in box plots are mean values ± s.e.m. Statistical analysis was performed using the R version 4.0.4. In two group comparisons, statistical significance was determined using Mann–Whitney *U* test, considering a value of *p* < 0.05 as significant. The number of samples used in the experiments is included in figure legends. All immunostainings and H&E experiments were performed with at least three biological replicates and three technical replicates for each condition.

Immunostaining. Bladders were embedded in paraffin and serial sections were generated. For immunohistochemistry, paraffin sections were deparaffinized using HistoClear and rehydrated through a series of Ethanol and 1× phosphate-buffered saline (PBS) washes. Antigen retrieval was performed by boiling slides for 15 min in pH 9 buffer or 30 min in pH 6 buffer. Primary antibodies in 1% horse serum were incubated overnight at 4°C. The next day, slides were washed with PBST three times for 10 min each, and secondary antibodies were applied for 90 min at room temperature. DAPI (4',6-diamidino-2-phenylindole) was either applied as part of the secondary antibodies cocktail or for 10 min, for nuclear staining and then the slides were sealed with coverslips. The conditions of antibodies used are detailed in Supplementary Table 1.

Fluorescent microscopy. Zeiss Axiovert 200 M microscope with Zeiss Apotome were used to collect immunofluorescent images. Bright-field images were collected using a Nikon Eclipse TE200 microscope. Data were analyzed using the Fiji package of ImageJ (v.1.0) and Photoshop screen overlay method (v. 21.1.0).

Cartoon schematics. Schematics were adapted from “Oral Tolerance Experiment”, by BioRender.com (2021). Retrieved from <https://app.biorender.com/biorender-templates>.

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

Data availability

The data sets generated during and/or analyzed during the current study are available in the Gene Expression Omnibus (GEO) repository under GEO accession number [GSE172656](https://www.ncbi.nlm.nih.gov/geo/query/acc.cgi?acc=GSE172656). The TCGA bladder cancer data set can be accessed from The Cancer Genome Atlas at <https://www.cancer.gov/about-nci/organization/ccg/research/structural-genomics/tcga>. The remaining data are available within the Article and Supplementary Information Source data are provided with this paper.

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Author contributions

T.T. designed experiments and analyzed the phenotypes in *K5;VP16;Pparg* mutant mice, prepared figures, and wrote the paper. T.X. assisted in designing experiments and analyzed the phenotypes in *K5;VP16;Pparg* mutant mice, prepared figures, and wrote the paper. S.E.W. performed pathological grading of tumors. M.Z. performed the TCGA and immune signatures analyses. W.Y.K. and C.L. helped interpret results. X.C. assisted in interpreting sequencing results. H.K. assisted in laser capture microdissection. E.B. performed immunostaining. C.S.L. created the *VP16;Pparg* mouse construct. J.M.M. provided human tumor samples. C.L.M. helped design experiments, interpret results, and wrote the paper.

Competing interests

The authors declare no competing interests.

Additional information

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