

# Abrogation of TGF-β signaling enhances chemokine production and correlates with prognosis in human breast cancer

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In human breast cancer, loss of carcinoma cell–specific response to TGF- $\beta$  signaling has been linked to poor patient prognosis. However, the mechanisms through which TGF- $\beta$  regulates these processes remain largely unknown. In an effort to address this issue, we have now identified gene expression signatures associated with the TGF- $\beta$  signaling pathway in human mammary carcinoma cells. The results strongly suggest that TGF- $\beta$  signaling mediates intrinsic, stromal-epithelial, and host-tumor interactions during breast cancer progression, at least in part, by regulating basal and oncostatin M–induced *CXCL1*, *CXCL5*, and *CCL20* chemokine expression. To determine the clinical relevance of our results, we queried our TGF- $\beta$ -associated gene expression signatures in 4 human breast cancer data sets containing a total of 1,319 gene expression profiles and associated clinical outcome data. The signature representing complete abrogation of TGF- $\beta$  signaling correlated with reduced relapse-free survival in all patients; however, the strongest association was observed in patients with estrogen receptor–positive (ER-positive) tumors, specifically within the luminal A subtype. Together, the results suggest that assessment of TGF- $\beta$  signaling pathway status may further stratify the prognosis of ER-positive patients and provide novel therapeutic approaches in the management of breast cancer.

### Introduction

TGF- $\beta$  ligands are key factors in the regulation of tumor initiation, progression, and metastasis. In human breast cancer, alterations in the carcinoma cell response to TGF-β signaling have been linked to tumor progression. It has been shown, using tissues from women with mammary epithelial hyperplasia lacking atypia, that decreased immunohistochemical staining for the type II TGF- $\beta$ receptor (TBRII) correlated with an increased risk of developing invasive breast cancer (1). In this study, a 3-fold reduction in the number of T $\beta$ RII-positive carcinoma cells correlated with an approximately 3-fold increase in the risk of developing subsequent invasive breast cancer (1). The loss of  $T\beta RII$  expression has also been correlated with high-grade human carcinoma in situ and invasive breast cancer (2). These observations are consistent with previously reported data demonstrating that human breast cancer cells with deficient TßRII expression were more tumorigenic than the same tumor cells in which the receptor was experimentally reintroduced (3). Notably, it has been shown that loss of TGFBR2 gene expression can occur through promoter hypermethylation in human breast carcinoma cells (4). In addition, the presence of an activating T29 $\rightarrow$ C polymorphism in the *TGFB1* gene increased the serum levels of TGF-B1 ligand and correlated with a reduced risk of developing breast cancer (5).

**Conflict of interest:** The authors have declared that no conflict of interest exists. **Nonstandard abbreviations used:** EMT, epithelial-mesenchymal transition; ER, estrogen receptor; MFS, metastasis-free survival; OSM, oncostatin M; PyVmT, polyoma virus middle T antigen; RFS, relapse-free survival; TβRII, type II TGF-β receptor. **Citation for this article**: *J. Clin. Invest.* **119**:1571–1582 (2009). doi:10.1172/JCI37480.

However, the effect of TGF- $\beta$  signaling is known to be context specific; TGF- $\beta$  is thought to be an early tumor suppressor and late tumor promoter during disease progression. Recently, gene expression profiling was used to identify a signature in established human cell lines indicative of TGF- $\beta$  stimulation (6). In this study, the TGF-β response gene expression signature was shown to predict for increased lung metastasis in human breast cancer, whereas no significant correlation was made with metastasis to bone. Further, the correlation between TGF-β signaling and increased lung metastasis was more significant in association with estrogen receptor-negative (ER-negative) tumors. Interestingly, this effect was functionally validated using late-stage breast cancer cells, originally derived from a pleural effusion, wherein it was shown that TGF-β signaling primed the cells for lung metastasis through upregulation of angiopoietin-like 4 (ANGPTL4) gene expression (6). The context specificity is further supported by a recent finding that there is a synergy between TGF-β and other transforming oncogenes such as HER2. Constitutive activation of T $\beta$ RI in the presence of HER2 amplification enhanced cell survival and migration and desensitized the cells to trastuzumab, while the signature was associated again with ER-negative tumors (7). This may partially explain the correlation among TGF-β signaling, ER negativity, and poor prognosis, since a significant number of ER-negative tumors have HER2 amplification (8, 9). To experimentally determine the impact of TGF-ß signaling on tumor initiation, progression, and metastasis in vivo, we and others have used several mouse models of mammary tumorigenesis with engineered alterations in TGF-β pathway signaling components. Using this approach, it was shown that enhanced TGF-β signaling could suppress early tumor progression (10, 11). The observations related to suppression of tumor growth were later paralleled by results obtained through

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expression of a dominant negative type II TGF-β receptor in mammary epithelium (MMTV-DNIIR) (12). However, expression of the MMTV-DNIIR transgene also resulted in decreased carcinoma cell invasion (12). This correlated with previous results demonstrating that systemic inhibition of TGF-β signaling, through administration of an Fc-conjugated TBRII (Fc:TBRII), resulted in resistance to spontaneous metastasis in the MMTV-Neu mouse mammary tumor model and in a model in which metastasis was achieved through tail vein injection of carcinoma cells (13). Several subsequent studies further illustrated the link between enhanced TGF-B signaling and enhanced metastasis in vivo (14–17). Together, the results suggested that secretion of TGF-\beta and thereby stimulation of all cells in the mammary tumor microenvironment could result in enhanced tumor metastasis, while the effect on tumor growth was context dependent. Further, the data suggested that at least some of the invasion and metastasis effects were dependent upon direct carcinoma cell-specific responses to TGF-ß stimulation in vivo. However, it has now been shown, in the MMTV-polyoma virus middle T antigen (MMTV-PyVmT) model of mammary tumorigenesis, that there may be a substantial difference between attenuation and complete abrogation of TGF-β signaling with regard to the regulation of metastasis (18). This study was the first to clearly demonstrate in vivo that a complete loss of TGF-β response in mammary carcinoma cells could significantly increase the occurrence of spontaneous pulmonary metastases (18).

In recent studies, we have been able to further validate pulmonary metastasis increases when carcinoma cell-specific TGF-β signaling is ablated (19). Further, we have identified a decrease in apoptosis, increased abundance of adjacent smooth muscle actin-positive fibrovasculature stroma, increased carcinoma cell heterogeneity, and increased inflammatory gene expression that correlated with bone marrow-derived myeloid cell infiltration in TßRII-ablated mammary carcinoma tissues when compared with controls (19, 20). However, it was difficult to understand precisely how TGF-β regulated these effects due to the complex nature of our observed compound phenotypic differences. Therefore, to address the mechanistic role for TGF-β signaling associated with regulation of tumorigenesis in this context, we have now isolated and established multiple parallel, independent polyclonal carcinoma cell lines from control and TBRII-ablated MMTV-PyVmT-derived tumor models  $[T\beta RII^{(fl/fl;PY)} and T\beta RII^{(WKO;PY)} respectively]$  (19). The two models differ in the ability to respond to TGF-ß signaling. The TßRII<sup>(fl/fl;PY)</sup> model expresses TβRII, while the TβRII<sup>(WKO;PY)</sup> model is deficient in the ability to express  $T\beta RII$  as a result of Cre-mediated deletion of exon 2 from the Tgfbr2 gene. Using these cell lines, we performed microarray analyses to determine the differences in gene expression between the models and in response to TGF- $\beta$  stimulation. These analyses were conducted in an effort to identify mechanisms that mediate TGF-\beta-dependent regulation of tumorigenesis in vivo, and the results indicated that a major function for TGF-β signaling is the regulation of chemokine expression.

The strength of functional analyses associated with mouse modeling is balanced by limitations in interpretation of individual observations with regard the direct impact on human disease. However, molecular profiling offers the ability to directly assess the prognostic value of results obtained from genome scale pathway interactions identified in experimental model systems. The power associated with molecular profiling of tumor subtypes and clinical outcome has been highlighted in recent years (8, 9, 21). We have been able to obtain high-quality microarray profiles from 1,319 human breast cancer tissues with well-documented clinical data related to tumor size, LN involvement, ER status, treatment regimen, and time of relapse detection over a 10-year period if present (Gene Expression Omnibus ID: GSE10886, GSE4922, GSE6532, and GSE2845) (22–28). Using the clinical data and gene expression profiles represented by these 4 data sets, we have been able to determine that the signature associated with our T $\beta$ RII-deficient carcinoma cells predicted poor relapse-free survival (RFS). Further, the patients presenting with ER<sup>+</sup> or luminal A subtype breast cancer demonstrated a significant increase in the risk of recurrence if they had a gene

expression profile that was similar to the TβRII-deficient carcinoma

cell signature at the time of diagnosis.

# Results

PyVmT mammary carcinoma cells exhibit an epithelial-mesenchymal transition in response to TGF-β stimulation. To determine functional and molecular roles for TGF-β signaling in mammary carcinoma cells, we established individually derived polyclonal carcinoma cell lines from TBRII<sup>(fI/fI;PY)</sup> control and TBRII<sup>(WKO;PY)</sup> mammary tumors. Three of the cell lines from each model were selected for analysis. The cell lines were screened for T $\beta$ RII recombination (Figure 1A). The  $T\beta RII^{(fl/fl;PY)}$  control cells demonstrated the presence of the floxed allele without any evidence of recombination. The  $T\beta RII^{(WKO;PY)}$ cells were 100% recombined, with no evidence of a loxP-flanked TβRII allele. The recombination efficiency was functionally validated using a TGF-ß growth response assay 24 hours after stimulation. The  $T\beta RII^{(fl,fl;PY)}$  control cells demonstrated a dose-dependent response to TGF- $\beta$  stimulation that resulted in reduced tritiated thymidine incorporation (Figure 1B). As expected, the TβRII<sup>(WKO;PY)</sup> cells did not demonstrate a significant difference in tritiated thymidine incorporation after TGF- $\beta$  treatment. It has recently been shown that some, but not all, epithelial cell lines respond to TGF-β with an epithelial-mesenchymal transition (EMT) (29). The EMT process has been linked to increased carcinoma cell motility, invasion, and metastasis (30–33). In vitro, the TβRII<sup>(fl/fl;PY)</sup> control cell lines were predominantly present in clusters of cells with an epithelial morphology (Figure 1C). In response to TGF-β, the TβRII<sup>(fl/fl;PY)</sup> control cell lines exhibited an elongated, fibroblast-like morphology and cell scattering – hallmarks of EMT (Figure 1D). The changes in cell morphology correlated with reduced cell-surface tethering of E-cadherin and F-actin (Figure 1, E-H). In TGF-β-treated cells, E-cadherin appeared to be degraded rather than accumulate in the cytoplasm (Figure 1F). In complete medium, F-actin was detected in the cytoplasm and tethered to the cell membrane (Figure 1G). However, when TGF- $\beta$  was added to the medium, F-actin was predominantly associated with stress fibers in the cytoplasm (Figure 1H). Interestingly, N-cadherin was not significantly upregulated in the EMT-like carcinoma cells after the observed TGF-β-dependent response (data not shown). Due to the enhanced rate of metastatic spread observed in our TβRII<sup>(WKO;PY)</sup> model, we also hypothesized that the mammary carcinoma cells lacking TβRII expression may have an increased sensitivity to growth factors or a predisposition toward spontaneous EMT. However, the rate of growth in response to serum was similar for the TβRII<sup>(fl/fl;PY)</sup> control and TβRII<sup>(WKO;PY)</sup> cell lines. In addition, the TβRII<sup>(WKO;PY)</sup> cells did not exhibit spontaneous EMT under complete culturing conditions or when cultured in the presence of TGF- $\beta$  (Figure 1, I and J). Together, the data indicated that our T $\beta$ RII<sup>(fl/fl;PY)</sup> control and T $\beta$ RII<sup>(WKO;PY)</sup> cell lines were suitable for comparison. Further, differences in response to growth factor stimulation or spontaneous EMT could not account for the



Recombination of T $\beta$ RII and induction of TGF- $\beta$ -dependent EMT in MMTV-PyVmT mammary carcinoma cells. (**A**) Analysis of Southern blot hybridization demonstrated that the independently derived polyclonal T $\beta$ RII<sup>(IIII)</sup>, PY)</sup> control mammary carcinoma cells (FL1, FL2, and FL3; biological replicates) had intact floxed *Tgfbr2* alleles, with no evidence of recombination. Alternatively, the independently derived polyclonal T $\beta$ RII<sup>(IIII)</sup>, PY)</sup> carcinoma cells (KO1, KO2, and KO3; biological replicates) were completely recombined, with no evidence of a remaining floxed *Tgfbr2* allele. (**B**) The growth of T $\beta$ RII<sup>(IIII)</sup>, PY)</sup> control carcinoma cell lines, measured by tritiated thymidine incorporation 24 hours after stimulation, was markedly inhibited by TGF- $\beta$  stimulation, whereas the T $\beta$ RII<sup>(IIII)</sup>, carcinoma cell growth was not altered. Results represent median transformed mean values ± SEM. (**C** and **D**) In response to TGF- $\beta$  stimulation (10 ng/ml) for 48 hours, the T $\beta$ RII<sup>(IIII)</sup>, PY)</sup> control carcinoma cells demonstrated consistent changes in morphology and cell scattering that suggested that EMT had occurred (original magnification, ×10). (**E**–**H**) Loss of E-cadherin (**E** and **F**) and changes in F-actin localization from the cell membrane (**G**) to predominant association with stress fibers (**H**) further confirmed an EMT-like state in T $\beta$ RII<sup>(IIII)</sup>, PY)</sup> cells that had been treated with 10 ng/ml of TGF- $\beta$  for 48 hours (**E**–**H**; original magnification, ×40). (**I** and **J**) Loss of TGF- $\beta$  signaling in T $\beta$ RII<sup>(IIII)</sup>, PY)</sup> cells did not result in a spontaneous state of EMT, as determined by the presence of membrane-bound E-cadherin, in the presence or absence of TGF- $\beta$  ligand at 10 ng/ml after 48 hours of stimulation (original magnification, ×40).

enhanced metastatic spread observed in the  $T\beta RII^{(WKO;PY)}$  model when compared with the  $T\beta RII^{(fl/fl;PY)}$  controls.

Molecular profiling revealed a difference in expression of genes that are known to regulate tumor progression. To understand how TGF- $\beta$ could regulate carcinoma cell-associated gene expression, which ultimately regulates tumor progression and metastasis, we performed Affymetrix microarray analyses. T $\beta$ RII<sup>(WKO;PY)</sup>, T $\beta$ RII<sup>(f)(f];PY)</sup>, and TGF- $\beta$ -treated T $\beta$ RII<sup>(f](f];PY)</sup> cell lines were hybridized for subsequent analyses. We identified 108 genes that were upregulated and 48 genes that were downregulated in T $\beta$ RII<sup>(WKO;PY)</sup> cell lines when compared with the T $\beta$ RII<sup>(f](f];PY)</sup> controls (Supplemental Table 1; supplemental material available online with this article; doi:10.1172/JCI37480DS1). To determine the genes that were acutely regulated by TGF- $\beta$ , we performed pairwise analyses using T $\beta$ RII<sup>(f](f];PY)</sup> mammary carcinoma cells in the presence or absence of TGF- $\beta$  treatment for 1 hour prior to collection. Genes were selected if they were consistently differentially regulated in the same direction in all 3 cell lines. Using the paired analysis strategy, we identified 41 genes that were consistently upregulated and 16 that were consistently downregulated in response to TGF- $\beta$  treatment (Supplemental Table 1). Real-time PCR validation was performed using a common pool of genes selected from both experiments with T $\beta$ RII<sup>(WKO;PY)</sup>, T $\beta$ RII<sup>(fl/fl;PY)</sup>, T $\beta$ RII<sup>(WKO;PY)</sup> plus TGF- $\beta$ , and T $\beta$ RII<sup>(fl/fl;PY)</sup> plus TGF- $\beta$  samples.

We observed significant differences (P < 0.05) in the expression of 11 genes identified by microarray in the T $\beta$ RII<sup>(WKO;PY)</sup> and T $\beta$ RII<sup>(fl,fl;PY)</sup> dataset using real-time PCR analyses (Table 1, top; clustered in Supplemental Figure 1A). Among these 11 genes, one (*Junb*) was in fact identified in the real-time PCR experiment, but it did not meet the filtering criteria for our T $\beta$ RII<sup>(fl,fl;PY)</sup> versus T $\beta$ RII<sup>(WKO;PY)</sup> microarray analyses. This suggested that our conservative filtering approach likely excluded some genes that were

# Table 1

 $T\beta RII^{(WK0;PY)}$  carcinoma cell gene expression relative to  $T\beta RII^{(fl/fl;PY)}$  controls

Gene symbol	Fold change	Р
Complete medium		
S100a6	2.6	0.04
Ctsa	2.4	0.03
Bst2	2.0	0.01
Junb	1.7	0.03
Pdgfb	-1.6	0.05
Itgb3	-1.9	0.02
Tbx15	-2.1	0.05
Tspan7	-2.5	0.01
F2r	-2.8	0.03
Pcdh21	-3.6	0.003
Vim	-22.3	0.03
Complete medium + TGF- $\beta$		
Cxcl1	14.8	0.04
Cxcl5	7.6	0.03
Bst2	2.8	0.02
Ctsa	2.0	0.03
Bcl2l11	-3.5	0.04
Tspan7	-3.9	0.03
F2r	-4.1	0.008
Itgb3	-4.2	0.02
Wnt9a	-4.2	0.03
Pdgfb	-4.8	0.001
Pcdh21	-4.8	0.001
Cxcl12	-5.7	0.03
Camk2n1	-6.2	0.03
Ctgf	-6.7	0.04
Smad6	-6.8	0.02
Gadd45a	-7.3	0.004
Cxcr4	-8.0	0.03
Wisp1	-10.7	0.02
Lmcd1	-13.4	0.03
Vim	-24.4	0.02
Serpine1	-62.5	0.01

Real-time PCR validation of differences in gene expression associated with T $\beta$ RII<sup>(WKO,PY)</sup> and T $\beta$ RII<sup>(WK,PY)</sup> mammary carcinoma cells. Real-time PCR was performed using the biological replicates for each model, and the 1/ $\Delta$ Ct values were used to determine the significance using 2-tailed, unpaired *t* tests. Validation was performed using T $\beta$ RII<sup>(WKO,PY)</sup> and T $\beta$ RII<sup>(WKO,PY)</sup> mammary carcinoma cells cultured in complete medium. To further stratify the differences between the cell populations and more accurately model the situation likely encountered in vivo, validation was also performed using T $\beta$ RII<sup>(WKO,PY)</sup> cells cultured in complete medium compared with T $\beta$ RII<sup>(WKO,PY)</sup> cells cultured in complete medium containing TGF- $\beta$  ligand at 10 ng/ml 1 hour after stimulation. No differences in gene expression were observed when T $\beta$ RII<sup>(WKO,PY)</sup> cells cultured in complete medium containing TGF- $\beta$  ligand at 10 ng/ml 1 hour after stimulation. Values were normalized to *Gusb*, *Hprt1*, *Hsp90ab1*, *Actb*, and *Ppia*.

differentially regulated; however, for the purpose of determining a gene expression signature, this was preferable. TGF- $\beta$  was present in the complete cell culture medium, but not at a sufficient level to allow detection of downstream Smad pathway activation when comparing serum-free and complete medium conditions. Therefore, to better model the stimulation likely experienced by the carcinoma cells during tumor progression, we also performed validation in the presence of TGF- $\beta$ . When samples were stimu-



lated with TGF- $\beta$ , we were able to detect a significant difference (P < 0.05) in the expression of 21 genes using the pooled gene validation approach (Table 1; clustered in Supplemental Figure 1B). Importantly, we identified differences in expression of genes that are known to be TGF- $\beta$ -responsive, including *Serpine1* (PAI-1), *Smad6*, *Pdgfb*, *Gadd45a*, *Ctgf*, *Lmcd1*, and *Bcl2l11* (Bim). Notably, *Cxcl1*, *Cxcl5*, *Bst2*, and *Csta* were significantly upregulated in the T $\beta$ RII(<sup>WKO;PY)</sup> cells when compared with the TGF- $\beta$ -treated controls. Previous studies have demonstrated a significant association between Cxcl1 or Cxcl5 and lung metastasis (20, 34); therefore, we selected these chemokines for further validation.

To determine whether Cxcl1 and Cxcl5 mRNA expression correlated with protein secretion, we performed cytokine antibody array analyses with conditioned medium from the TBRII(WKO;PY) and control TBRII<sup>(fl/fl;PY)</sup> cell lines. Cxcl1 and Cxcl5 were the only secreted cytokines, of 62 represented on the array, that were consistently differentially regulated when comparing the 2 models (Figure 2A and Supplemental Table 2). The results paralleled those obtained in our real-time PCR validation of the microarray analyses. Previously we have shown that signaling through the Cxcr2 receptor, which is activated by both Cxcl1 and Cxcl5, was responsible for part of an enhanced inflammatory cell recruitment observed in association with the TβRII<sup>(WKO;PY)</sup> tumor microenvironment as compared with TβRII<sup>(fl/fl;PY)</sup> controls (20). However, the literature suggested that in addition to recruitment of inflammatory cell populations, Cxcr2 signaling may enhance the migration of carcinoma cells (35-37). To test this in mammary carcinoma cells, we stimulated the highly metastatic murine 4T1 and human MDA-MB-231 cell lines with Cxcl1 at increasing doses in wound closure assays (Figure 2B). The wound closure results were supported by previous studies demonstrating CXCR2 expression by MDA-MB-231 cells (38-40) and Western blot verification of Cxcr2 protein production by the 4T1 cell line in our laboratory (Figure 2B). Our results indicated that carcinoma cell migration was enhanced in the presence of Cxcl1 stimulation, thereby providing another potential mechanism for enhanced metastasis when chemokine expression is elevated in vivo.

TGF-β-responsive genes were identified in TβRII<sup>(fl/fl;PY)</sup> mammary carcinoma cells. Grouped analyses of the microarray results identified genes that differed between the models; however, the genes that differed between the models were not necessarily TGF-β-responsive genes. Of the genes that we identified as differentially regulated by TGF- $\beta$  (Supplemental Table 1), we were able to validate 23 by real-time PCR (Table 2). Among the differentially expressed genes that were validated by real-time PCR, *Tnfrsf1b* (TNF-α receptor) was initially identified in the  $T\beta RII^{(WKO;PY)}$  versus  $T\beta RII^{(fl/fl;PY)}$ profile. As previously mentioned, this suggested that our conservative approach was effective in filtering genes for our TGF-β response signature. We were able to identify, in addition to known TGF- $\beta$  target genes, novel TGF- $\beta$ -responsive genes that may play a major role in tumorigenesis. Importantly, the chemokines Cxcl1, Cxcl5, and Ccl20 were consistently suppressed by TGF-β. The suppression of chemokine expression by TGF-β suggested that loss of TGF-β signaling could result in selective enhancement of chemokine expression. These data further substantiated and extended our previous preliminary analyses regarding TGF-β-dependent regulation of host-tumor interactions associated with differential chemokine expression in vitro and in vivo (19, 20).

TGF- $\beta$  suppressed basal and oncostatin M-induced Cxcl1, Cxcl5, and Ccl20 expression in established mammary epithelial cell lines. TGF- $\beta$  was able to suppress Cxcl1, Cxcl5, and Ccl20 expression in carcinoma



TGF- $\beta$ -dependent chemokine protein secretion by mammary carcinoma cells and the effect of Cxcl1 stimulation on metastatic mammary carcinoma cell migration. (**A**) Conditioned medium from T $\beta$ RII<sup>(WKO;PY)</sup> and T $\beta$ RII<sup>(II/II;PY)</sup> mammary carcinoma cells revealed increased secretion of Cxcl1 and Cxcl5 protein by the T $\beta$ RII<sup>(WKO;PY)</sup> populations according to cytokine antibody array. Quantitation of Cxcl1 and Cxcl5 expression was performed and represented as the median transformed mean values ± SEM. *P* < 0.05, T $\beta$ RII<sup>(WKO;PY)</sup> (KO) vs. T $\beta$ RII<sup>(II/II;PY)</sup> (Ctl), 2-tailed unpaired *t* test. (**B**) Wound closure assays were used to determine the effect of Cxcl1 presence on metastatic carcinoma cell migration. Cxcr2 protein production by the 4T1 cell line was observed by Western blot (WB), and the expression of CXCR2 by MDA-MD-231 cells has been previously reported (38–40). Values are reported as mean percentage ± SEM. For the 4T1 carcinoma cell line, *P* = 0.5018 at 5 ng/ml, *P* = 0.0853 at 20 ng/ml, *P* = 0.00588 at 40 ng/ml, *P* < 0.005 at 80 ng/ml, 2-tailed unpaired *t* test. For the MDA-MB-231 cell line: *P* = 0.0019 at 5 ng/ml, *P* = 0.0411 at 20 ng/ml, and *P* = 0.0068 at 40 ng/ml, 2-tailed, unpaired *t* test.

cells derived from the MMTV-PyVmT mouse model. However, it was unclear whether this regulation was specific for MMTV-PyVmT-driven carcinoma cells or alternatively a general feature of TGF- $\beta$  signaling in mammary epithelial cell populations. Therefore, we selected the nontransformed HC11 and NMuMG cell lines for analysis to address this issue. To stimulate chemokine expression, we selected the oncostatin M (OSM) ligand due to its previously reported ability to upregulate *Cxcl1* and *Cxcl5* expression without a significant increase in *Ccl2* expression (41). As opposed to TNF- $\alpha$ , a ligand that is known to potently activate NF- $\kappa$ B and thereby upregulate a large number of chemokines, OSM stimulation was shown to be more selective for regulation of the *Cxcl1* and *Cxcl5* chemokines

that we had identified in our analyses. In addition, the presence of OSM in breast cancer is clinically relevant (42, 43). OSM expression has been shown to be present in 66% of breast tumors (44). Further, immunohistochemical analyses have been used to demonstrate that 35% of breast carcinomas and 88% of inflammatory breast cancers express this ligand (43). Inflammatory breast cancer is often highly aggressive and is associated with poor patient prognosis (45).

HC11 cells were responsive to OSM as determined by reduced tritiated thymidine uptake (Supplemental Figure 2) and increased phosphorylation of Stat3 after stimulation. The HC11 cells were also responsive to TGF- $\beta$  as determined by reduced tritiated thymidine uptake (Supplemental Figure 2) and increased phosphor-

### Table 2

TGF- $\beta$ –responsive gene expression in T $\beta RII^{(ft/ft;PY)}$  mammary carcinoma cells

Gene symbol	FL1	FL2	FL3
Upregulated by TGF- $\beta$			
Camk2n1	7.3	4.7	3.3
Cxcl12	5.7	2.6	1.8
Cxcr4	3.9	3.4	1.7
Edn2	13.5	3.8	2.5
Egr2	3.1	2.7	2.0
Egr3	4.1	2.4	1.8
Fosb	4.3	5.4	2.2
Foxq1	7.8	2.6	1.7
Gadd45a	6.1	7.8	2.8
Gja3	6.7	8.9	3.4
Lmcd1	26.9	3.9	5.0
Map3k14	15.2	3.0	2.5
Pdgfb	2.7	3.7	2.8
Serpine1	12.0	16.8	8.3
Smad6	12.9	4.3	4.1
Tnfrsf1b	3.4	3.1	1.7
Wisp1	3.8	4.7	2.8
Wnt9a	3.2	3.1	2.5
Downregulated by TGF- $\beta$			
Adamts1	-14.3	-7.5	-3.1
Ccl20	-2.0	-2.3	-2.4
Cxcl1	-33.4	-2.9	-9.3
Cxcl5	-2.0	-2.0	-1.7
Epgn	-16.0	-3.7	-2.0

Real-time PCR validation of TGF- $\beta$ -responsive genes in T $\beta$ RII<sup>(UIII,PY)</sup> mammary carcinoma cells. Each column represents 1/ $\Delta$ Ct values associated with an individually derived polyclonal control T $\beta$ RII<sup>(UIII,PY)</sup> carcinoma cell line in the presence or absence of TGF- $\beta$  at 10 ng/ml for 1 hour. Genes that demonstrated the same direction of regulation were reported if all values were 1.5-fold or higher with a 2.0-fold or greater change in 2 of 3 of the cell lines. Values were normalized to *Gusb*, *Hprt1*, *Hsp90ab1*, *Actb* and *Ppia*.

ylation of Smad2 after stimulation. Importantly, TGF-β had no effect on OSM-induced Stat3 phosphorylation, and OSM had no effect on TGF-β-dependent Smad2 phosphorylation. In HC11 cells, TGF- $\beta$  and OSM treatment for 1 hour in vitro had a significant effect on Cxcl1 expression (Figure 3A). In response to TGF-β for 1 hour, Cxcl1 expression was significantly decreased in HC11 cells. OSM treatment for 1 hour resulted in a significant upregulation of Cxcl1 expression. Importantly, TGF-β treatment significantly attenuated the effect of OSM with regard to regulation of Cxcl1 expression. The results in HC11 cells were similar for Cxcl5 (Figure 3C) and Ccl20 (Figure 3E). The NMuMG monoclonal cell line that we have used for analysis responded well to TGF- $\beta$  with regard to growth inhibition, induction of EMT, and Smad2 phosphorylation. However, this clone did not respond to OSM stimulation with a growth response or Stat3 activation. Accordingly, TGF-β treatment for 1 hour significantly decreased the expression of Cxcl1, Cxcl5, and Ccl20 in the NMuMG cell line, and OSM had no significant effect (Figure 3, B, D, and F). To determine whether the observed regulation of Cxcl1, Cxcl5, and Ccl20 was selective, or alternatively a general chemokine effect, we analyzed the expression of *Ccl5* in response to TGF- $\beta$  and OSM stimulation. Ccl5 mRNA was expressed by both cell lines;



however, no significant differences were observed in response to TGF- $\beta$ , OSM, or both ligands together (Figure 3, G and H; HC11 and NMuMG, respectively).

The  $T\beta RII^{(WKO;PY)}$  gene expression signature correlated with reduced RFS in human breast cancer. To determine the impact of our gene expression signatures in human breast cancer, we initially compared our  $T\beta RII^{(WKO;PY)}$  and  $TGF-\beta$ -treated gene expression signatures to the profiles obtained from 4 previously published datasets (22-28). The detailed clinical data from these studies were previously published, and the clinical data pertinent to this study are summarized in Supplemental Tables 3 and 4. Briefly, the Ivshina dataset in this study included 249 unselected breast cancer patients from Sweden, 34% with LN<sup>+</sup> and 86% with ER<sup>+</sup> tumors. The Loi dataset included 414 breast cancer patients from the United Kingdom and Sweden, 36% with LN<sup>+</sup> and 89% with ER<sup>+</sup> tumors, with LN stage and ER characteristics similar to those in the Ivshina dataset. The van de Vijver dataset included 295 patients from The Netherlands, 49% with LN<sup>+</sup> and 76% with ER<sup>+</sup> tumors. The University of North Carolina (UNC) dataset included 361 patents, 57% with LN<sup>+</sup> and 56% with ER<sup>+</sup> tumors, being the population with the worst prognosis compared with the other 3 studies based on LN stage and number of ER<sup>+</sup> tumors. In individual analyses of the 4 datasets, the Ivshina dataset revealed a correlation with reduced RFS when tumors had a gene profile similar to the TβRII<sup>(WKO;PY)</sup> signature (Supplemental Figures 3 and 4). Compared with the others, this dataset was characterized by a high number of ER<sup>+</sup> tumors, and the majority of patients with LN- disease did not receive systemic adjuvant therapy (Supplemental Table 3). In addition, clinical information regarding metastasis-free survival (MFS) was available for 2 of the 4 datasets (van de Vijver and Loi). Patients in the van de Vijver dataset with gene profiles correlating with the  $T\beta RII^{(fl/fl;PY)}$  plus TGF- $\beta$  treatment signature had significantly worse MFS than those without the correlation, whereas no significant difference in MFS in association with the signatures was observed for the Loi dataset (Supplemental Figure 5). The correlation was probably due to the high number of ER-positive and LN-positive patients who did not receive adjuvant endocrine therapy in the van de Vijver dataset and further suggested that the effect of TGF-β signaling may differ depending on the context of ER status, LN status, and distant metastases.

Therefore, to further extend and increase the power of our subset analyses, we subsequently combined the 4 independent datasets and examined the association of our  $T\beta RII^{(WKO;PY)}$ and TGF- $\beta$ -treated T $\beta$ RII<sup>(fl/fl;PY)</sup> carcinoma cell signatures with tumor subtype and RFS. There was total of 1,319 human breast cancer tumor samples in the combined dataset, and the RFS was chosen as the survival parameter because the data were available in all 4 datasets (Figure 4A). The analyses revealed that the  $T\beta RII^{(WKO;PY)}$  carcinoma signature positively correlated with a reduced 10-year RFS (Figure 4A, left). In contrast, a significant difference in RFS was not observed when the TGF-β treatment signature was used for correlation (Figure 4A, right). Multivariate analyses were conducted for the 2 TGF-β-associated signatures, ER status, tumor size, node status, 3 treatment variables, and 4 patient cohorts (using the Ivshina cohort as a reference) using the multivariate Cox model with spline because of the nonlinear property of the signature (Supplemental Tables 4 and 5 and Supplemental Figure 10). The analyses showed that the  $T\beta RII^{(WKO;PY)}$  signature was highly significant as an independent prognostic marker of survival (P = 0.015, second tertile hazard



Cxcl1

Α

Median transformed 1/ΔCT

С

Median transformed 1/ΔCT

Ε

Median transformed 1/ΔCT

Median transformed 1/ACT **D** 

Ccl5

normalized to Gapdh

Ccl20

normalized to Gapdh

Cxcl5

normalized to Gapdh

normalized to Gapdh

1.4

1.0

0.8

0.6

04

1.7

1.4

1.1

0.8

0.5

1.3

1.1

0.9

0.7

1.2

0.9

0.6

0.3

0.0

Control

Control



0.7

1.2

0.9

0.6

0.3

0.0

Median transformed 1/ACT **±** 

normalized to Gapdh

Control

Control

TGF-β

TGF-β

ОŚМ

OSM

and OSM-induced expression of Cxcl1, Cxcl5, and Ccl20 in mammary epithelium. TGF- $\beta$  (10 ng/ml) and OSM (100 ng/ml) stimulation was performed for 1 hour in vitro. Real-time PCR was performed using HC11 (A, C, E, and G) and NMuMG (B, D, F, and H) cell lines. The median transformed 1/ACt values are reported as mean ± SEM. TGF-β significantly decreased Cxcl1 and Cxcl5 expression in HC11 and Cxcl1, Cxcl5, and Ccl20 in NMuMG cells (A-F). In the OSM-responsive HC11 cell line, OSM significantly upregulated Cxcl1, Cxcl5, and Ccl20 expression (A, C, and E). TGF- $\beta$ significantly attenuated the effect of OSM with regard to Cxcl1, Cxcl5, and Ccl20 expression in the HC11 cell line. The NMuMG cell line, which did not respond to OSM in growth response assays or analysis of phospho-Stat3 by Western blot, did not demonstrate chemokine regulation by OSM (B, D, and F). Ccl5 expression was not altered by TGF- $\!\beta$  or OSM treatment in the HC11 or NMuMG cell lines (G and **H**, respectively). \*\*P < 0.05. T + O. combined administration of TGF- $\beta$  and OSM.

ratio 1.29, 95% CI, 1.07-1.56, and third tertile hazard ratio 1.16, 95% CI, 0.89-1.52, using first tertile as a reference).

TGF-β

TGF-β

OSM

OSM

T + O

T + O

In further subset analyses, a strong positive correlation between the  $T\beta RII^{(WKO;PY)}$  signature and reduced RFS was observed in the patients with positive LNs (Figure 4B, left), whereas the TGF- $\beta$ treatment signature did not correlate with a difference (Figure 4B, right). No significant difference was observed for either signature in LN<sup>-</sup> patients (Figure 4C), suggesting that abrogation of TGF-β signaling may be more relevant in LN metastasis. We further stratified the data based on primary tumor size at the time of diagnosis (Supplemental Figure 6, A and B); however, no significant correlation with survival was observed for either signature.

Importantly, we observed a significant correlation between the TβRII<sup>(WKO;PY)</sup> signature and reduced ten year survival in human

ER+ breast cancer (Figure 5A, left). In the human luminal A group, which are ER<sup>+</sup> tumors, our TβRII<sup>(WKO;PY)</sup> signature significantly correlated with a reduction in 10-year RFS (Figure 5B, left). A significant correlation was not observed with regard to survival for either signature in association with treatment with adjuvant hormonal therapy alone; human luminal B tumors; ER- tumors; or lack of treatment with a systemic adjuvant chemotherapy (Figure 5C and Supplemental Figure 7, A–C, respectively). RFS in the basal and Her2 breast cancer subtype patient populations did not significantly correlate with either signature (Supplemental Figure 8, A and B). Together, our results suggest that TGF- $\beta$  signaling may interact with the ER signaling network to regulate tumor recurrence and metastasis during human breast cancer progression.

T+0

T + O





Loss of TGF- $\beta$  signaling in mammary carcinoma cells resulted in a signature that correlated with increased risk of relapse during human breast cancer progression. (A) The TGF- $\beta$ signature correlation with breast cancer RFS in all patients. T<sub>β</sub>RII(WKO;PY) and TβRII<sup>(fl/fl;PY)</sup> mammary carcinoma gene expression signatures were compared with profiles from 1,319 human breast cancer tissues. The TβRII(WKO;PY) and TβRII(fl/fl;PY) plus TGF-β treatment signatures were also used to determine the correlation with RFS (left and right columns, respectively). The T<sub>β</sub>RII<sup>(WKO;PY)</sup> signature significantly correlated with decreased RFS. No significant difference in RFS was observed in correlation with the TGF-ß treatment gene expression signature. (B) In human LN+ breast cancer patients. the TβRII<sup>(WKO;PY)</sup> signature correlated with reduced RFS (left), whereas the TGF-β treatment signature did not have a significant correlation (right). (C) In LN- patients, no significant correlations were observed. Red, high correlation (r > 0); black, low correlation (r < 0). The "high versus low" model is based on transforming the TGF- $\beta$  signature correlation into a dichotomous variable (high: r > 0; low: r < 0), and the "continuous" model uses the untransformed correlation as a continuous variable. Association of these groups with RFS was evaluated with the log-rank test.

# Discussion

TGF- $\beta$  is a well-known regulator of tumor progression and metastasis; however, it remains unclear how TGF- $\beta$  actually regulates these processes. In early work, the focus of TGF- $\beta$  signaling was on the tumor cell, and a large amount of data supported an early tumor-suppressive role for TGF- $\beta$  in this context. However, it was also shown that TGF- $\beta$  signaling within the carcinoma cell could promote tumor progression and metastasis. This dual role for TGF- $\beta$  signaling has been referred to as the TGF- $\beta$  paradox, and it is not known how TGF- $\beta$  signaling switches from tumor suppressor to tumor promoter. However, our recent work demonstrating the recruitment of metastasis-enhancing bone marrow-derived cells to the tumor microenvironment could help explain this paradox. In addition to TGF- $\beta$  signaling within the tumor cell, strong experimental evidence has also shown that an excess of secreted TGF- $\beta$  could promote tumor progression. In our T $\beta$ RII<sup>(WKO;PY)</sup> model of mammary carcinoma cell-specific TGF- $\beta$  signaling deficiency, we observed a role for TGF- $\beta$  as a suppressor of tumor initiation, progression, and metastasis. We observed differences in overall tumor burden, apoptosis, interaction with the adjacent fibrovascular stroma, angiogenesis, tumor cell heterogeneity, and inflammation involving bone marrow-derived myeloid cell populations (19, 20). However, due to the complexity of the compound phenotype, it was difficult to assess the molecular mechanisms of





Loss of TGF- $\beta$  signaling in mammary carcinoma cells resulted in a signature that may further differentiate ER-positive tumors and risk of relapse in breast cancer patients. Increased risk of poor RFS when human ER<sup>+</sup> and luminal A breast cancer (A and B, respectively; left) was associated with a TGF- $\beta$  signaling-deficient mammary carcinoma cell gene expression signature. The TGF- $\beta$  treatment signature did not correlate with a difference in RFS (A and B, right). Although a trend toward reduced RFS was present when the  $T\beta RII^{(WKO;PY)}$ signature was associated with hormone only-treated breast cancer (C), neither signature was statistically significant. Red, high correlation (r > 0); black, low correlation (r < 0). Association of these groups with RFS was evaluated with the log-rank test.

TGF- $\beta$  signaling within the carcinoma cells that ultimately regulated the observed effects. Therefore, we established polyclonal carcinoma cell lines from our primary tumor tissues in order to more precisely determine the molecular differences between the T $\beta$ RII<sup>(WKO;PY)</sup> and T $\beta$ RII<sup>(fl/fl;PY)</sup> models.

We subjected the carcinoma cells to microarray analyses and identified a relatively small number of genes that were differentially regulated when the T $\beta$ RII<sup>(WKO;PY)</sup> and T $\beta$ RII<sup>(fl/fl;PY)</sup> models were compared. Within this subset of genes, some of those we identified were previously described TGF- $\beta$ -responsive target genes. The identification of previously described TGF- $\beta$ -responsive genes in this analysis further substantiated the validity of our approach. Importantly, we were able to identify many genes that were differentially regulated between the two models that had not been previously reported. In addition, we were able to identify genes that were TGF- $\beta$ -responsive within 1 hour of stimulation. Together, these results provide an initial step toward identification of the essential molecular details related to mechanisms, including regulation of chemokine expression, that mediate TGF- $\beta$ -dependent control of tumor progression and metastasis in vivo.

Our previous work has shown that TGF- $\beta$  within the carcinoma cell can regulate adjacent stromal-epithelial and host-tumor interactions within the tumor microenvironment (19, 20). In addition, our previously reported results and preliminary gene expression data suggested that the chemokines Cxcl1, Cxcl5, and Ccl20 were regulated by TGF- $\beta$  in mammary carcinoma cells (19, 20). Functionally, we were able to demonstrate that signaling through Cxcr2, a common receptor for Cxcl1 and Cxcl5, was responsible for a significantly greater proportion of the enhanced immature bone marrow-derived myeloid cell (myeloid immune suppressor cell [MISC]) recruitment to the  $T\beta RII^{(WKO;PY)}$  compared with the TβRII<sup>(fl/fl;PY)</sup> tumor microenvironment (20). In our current study, we have been able to demonstrate that these gene products are consistently suppressed by TGF-β in multiple independently derived TβRII<sup>(fl/fl;PY)</sup> mammary carcinoma cell lines. Suppression of Cxcl1, *Cxcl5*, and *Ccl20* expression upon TGF-β stimulation proved to be a key feature distinguishing the  $T\beta RII^{(WKO;PY)}$  and  $T\beta RII^{(fl/fl;PY)}$  models. We have also been able to determine that the regulation of this chemokine subset by TGF-β is not specific for the MMTV-PyVmT transformed cell populations. In the nontransformed HC11 and NMuMG mammary epithelial cell lines, TGF-β significantly suppressed Cxcl1, Cxcl5, and Ccl20 expression. In the absence of TGF-β treatment, OSM stimulation increased the expression of these chemokines. Since the presence of OSM is clinically relevant in breast cancer (42–44), the link we have identified with TGF- $\beta$  signaling is likely important. Specifically, it has been shown that a majority of inflammatory breast cancers express this ligand (43), and our current results suggest that TGF-β- and OSM-dependent chemokine production may have a functional role in the regulation of this type of breast cancer that is often aggressive and associated with poor patient prognosis (45). Further, Cxcl1 expression was recently correlated with a metastasis gene expression signature in human breast cancer (46). Together, the data suggest that TGF- $\beta$  can suppress basal and OSM-induced Cxcl1, Cxcl5, and Ccl20 expression in nontransformed mammary epithelium and in carcinoma cells, thereby regulating inflammation that is known to promote tumor progression and metastasis.

The power of molecular profiling has been highlighted in recent years, since it has been shown to effectively predict for breast tumor subtypes and RFS over time (8, 9, 21-27). According to the literature, many of the genes that we identified in this study may have a significant role in the regulation of tumor progression and metastasis (Supplemental Table 1). However, the literature at the level of gene-by-gene analysis often lacks the ability to predict interactions between signaling networks that ultimately regulate the process of tumor progression and metastasis in vivo. Further, it is not feasible to concurrently upregulate roughly 200 genes and downregulate 70 others in a single cell to experimentally model the compound interacting pathways in vivo. Therefore, we compared the gene expression signatures obtained in our current study with the individual profiles obtained in 4 previously described human breast cancer datasets representing 1,319 breast cancer patients (22-28). The patient data included tumor subtype classification, size, LN status, ER status, treatment regimen, and survival over a 10-year period. Importantly, we were able to determine that the  $T\beta RII^{(WKO;PY)}$  signature predicted for reduced RFS in the entire dataset and in subsets including ER<sup>+</sup>, luminal A, or LN<sup>+</sup> patients. Notably, our TGF-β treatment gene expression signature did not predict for a difference in RFS in any of the correlate analyses that we conducted (Figures 4 and 5 and Supplemental Figures 4-8). This demonstrated that there are clear biological differences between complete abrogation of TGF- $\beta$  signaling and enhanced TGF-β stimulation. Our study and statistical models have limitations related to combining biologically and clinically heterogeneous datasets, and further studies are required to reveal the exact mechanism of ER and TGF- $\beta$  pathway interactions. However, our results and those recently reported by Padua et al. (6) suggest that abrogation and stimulation of TGF- $\beta$  signaling correlate with poor prognosis in human ER<sup>+</sup> and ER<sup>-</sup> breast cancer, respectively (Supplemental Figure 9).

In summary, we have now been able to identify significant molecular differences in mammary carcinoma cells lacking the ability to respond to TGF- $\beta$  when compared with mammary carcinoma cells that are capable of a TGF- $\beta$  response. The molecular signatures suggested that intrinsic, stromal-epithelial, and host-tumor interactions together mediate tumor progression and metastasis as a result of the tumor cell response to TGF- $\beta$  stimulation. Further, at the time of diagnosis in human breast cancer, if a molecular signature that resembles the carcinoma cell-specific TGF- $\beta$  signaling deficiency is detected in luminal A subtype and ER<sup>+</sup> tumors, the corresponding patients may benefit from an aggressive postoperative treatment regimen to increase their chance for RFS.

### Methods

Cell line derivation and culturing conditions. PyVmT carcinoma cell lines were derived from TBRII<sup>(WKO;PY)</sup> and TBRII<sup>(fl/fl;PY)</sup> primary tumors, established and cultured in DMEM/F12 with 5% adult bovine serum as previously described (19). The NMuMG cell line has been previously described (28). NMuMG cells were cultured in DMEM with 10% FCS and 150  $\mu l$ insulin per 500 ml of medium. HC11 cells were a gift from Jeffery Rosen (Baylor College of Medicine, Houston, Texas, USA) on behalf of Bernd Groner (Georg-Speyer-Haus, Institute for Biomedical Research, Frankfurt am Main, Germany) and were grown in RPMI 1640 medium containing 10% bovine calf serum, 5 mg/ml insulin (Sigma-Aldrich), 10 ng/ml EGF (Sigma), 2 mM L-glutamine, 100 U/ml penicillin, and 100 mg/ml streptomycin. Medium was changed 23 hours before collection for microarray and real-time PCR analyses. One hour before collection, the medium was aspirated, and complete medium or complete medium containing TGF-β was added to the cells. Cell lines were approximately 70% confluent at the time of RNA isolation. Chemokine expression studies were carried out in the presence or absence of 10 ng/ml TGF- $\beta$  or 100 ng/ml OSM that was added 1 hour prior to RNA isolation as indicated.

Analysis of DNA recombination. Southern blots were performed as previously described (47). Briefly, DNA was isolated by phenol-chloroform extraction, and 10  $\mu$ g was digested with *Bg*III and resolved on a 1% agarose gel, then transferred to a nylon membrane. The membranes were then prehybridized and hybridized at 65 °C using a buffer containing 4× SSC phosphate (SSCP), 1× Denhardt's solution, 1% SDS, and 100  $\mu$ g/ml of sheared salmon sperm DNA with the previously described <sup>32</sup>P-labeled 3' probe to detect *Tgfbr2* recombination (47).

TGF- $\beta$  growth response analyses. Tritiated thymidine incorporation was performed using 4 × 10<sup>4</sup> cells that were plated in a 24-well dish and allowed to grow overnight. The next day, when cells were approximately 50% confluent, the medium was aspirated and replaced with complete medium or complete medium containing 0.1, 1.0, or 10.0 ng/ml TGF- $\beta$ . Twenty-two hours later, cells were pulsed with 4  $\mu$ Ci of tritiated thymidine per well (PerkinElmer). After 2 hours, the cells were fixed with 1 ml 10% trichloroacetic acid for 30 minutes at room temperature (RT), followed by 2 additional 30-minute washes with 10% trichloroacetic acid. DNA was solubilized by incubation in 300  $\mu$ l 0.2N NaOH for 30 minutes. Radioactivity was counted using 100  $\mu$ l of solubilized DNA in 4 ml scintillation fluid.

H&E staining and immunofluorescence. H&E staining and immunofluorescence were performed using standard techniques. Briefly, medium was aspirated, and cells were washed with PBS then fixed in 10% neutral buffered formalin for 30 minutes at RT. Cells were washed (twice) with PBS plus 10 mM glycine, then permeabilized PBS plus 0.2% Triton X-100 for 5 minutes at RT. Slides were washed (twice) with PBS plus 10 mM glycine. Slides were blocked with PBS containing 3% milk for 10 minutes at RT. Primary antibody (diluted in PBS plus 3% milk) was added for 30 minutes at RT. Texas red-conjugated phalloidin (T7471; Invitrogen) was used at 1:200 diluted in PBS plus 3% milk. Slides were washed (3 times) for 5 minutes in PBS and blocked for 3 minutes in 3% milk. Secondary antibodies were added at 1:800 for 30 minutes in the dark, then washed (3 times) for 5 minutes with PBS. Slides were mounted using ProLong Antifade Gold with DAPI (Invitrogen). Texas red-conjugated phalloidin images were displayed in the green channel for the purpose of illustration.

*RNA isolation.* Cells were grown and treated in T-75 flasks prior to collection. One milliliter of TRIzol per T-75 flask was used to lyse the cells. The lysates were incubated at RT for 5 minutes, then 0.2 ml chloroform was added. The samples were shaken vigorously by hand for 15 seconds, incubated at RT for 3 minutes, and centrifuged at 13,000 *g* for 15 minutes at 4°C. Three hundred microliters from the aqueous phase was removed, and an equal volume of 70% RNA-free EtOH was added slowly while mixing with a pipette tip to avoid localized precipitation. The samples were loaded into an RNeasy column (QIAGEN) and centrifuged for 30 seconds at 8,000 *g*. Buffer RW1 (700  $\mu$ l) was added to the column and centrifuged for 30 seconds at 8,000 *g*. RPE buffer (500  $\mu$ l) was added to the column and centrifuged for 30 seconds at 8,000 *g* twice; column was placed in a new collection tube for the second wash). The column was centrifuged for 1 minute at 8,000 *g* to eliminate the remaining buffer. RNA was eluted in a fresh RNase-free microfuge tube using 30  $\mu$ l RNase-free water, then stored at -80°C until use.

Affymetrix DNA microarray and real-time PCR validation. Samples were checked for integrity and subjected to microarray hybridization using the Affymetrix Mouse 430 2.0 gene chip according to standard protocols. Briefly, Agilent's Bioanalyzer microfluidic assay (Agilent Technologies) was used to assay RNA integrity. Spectrophotometric and fluorometric methods were combined to quantitate protein and nucleic acids present in the sample and to ensure quality control of each sample. Following quality control, the RNA was prepared for microarray analysis using the GeneChip One-Cycle Target Labeling and Control Reagents kit (Affymetrix). Briefly, 1.5 µg of total RNA was reverse transcribed to ds cDNA using an oligo-dT primer coupled to a T7 promoter. In vitro transcription from the ds cDNA was then carried out using T7 polymerase and incorporating biotin-modified CTP and UTP ribonucleotides. The biotinylated cRNA (20 µg) was fragmented and hybridized to an Affymetrix GeneChip Mouse Genome 430 2.0 Array containing 45,000 sets of 11- to 25-mer oligomers, representing 39,000 mouse transcripts (34,000 are annotated as well-defined genes). Hybridized cRNA was detected using streptavidin coupled to phycoerythrin. GeneChips were scanned using GeneChip Scanner 3000 7G Plus 2 and GeneChip Operating System (GCOS; Affymetrix). Default values were used to grid images (.DAT) and generate .CEL and .CHP files. CEL files (raw Affymetrix data) were transformed by Robust Multichip Analysis (RMA) (48) prior to filtering. Validation for microarray data was conducted using real-time PCR according to the manufacturer's instructions (Super-Array) with a custom template and proprietary primer sets for the reported gene products (custom template CAPM-0439; SuperArray). Genes included for validation from the  $T\beta RII^{(WKO;PY)}$  and TGF- $\beta$  treatment signatures were analyzed using TβRII<sup>(WKO;PY)</sup>, TβRII<sup>(WKO;PY)</sup> plus TGF-β (10 ng/ml), TβRII<sup>(fl/fl;PY)</sup>, and TβRII<sup>(fl/fl;PY)</sup> plus TGF-β (10 ng/ml) samples. *Cxcl1*, *Cxcl5*, and Ccl20 expression analyses in HC11 and NMuMG cells were conducted using the primer sets and conditions previously reported (19).

*Cytokine antibody array and Western blot analysis.* The cytokine antibody array was performed using conditioned medium as previously described (19). Western blots were performed as previously described (19), using

Cxcr2 (SC-7304; Santa Cruz Biotechnology Inc.) and actin (A-2066; Sigma-Aldrich) primary antibodies and ECL detection (GE Healthcare).

Statistics. Six replicates were performed for thymidine incorporation analyses. Results were reported as the mean ± SEM, and 2-tailed unpaired t tests were used to determine significance (P < 0.05). In the microarray experiment, genes were selected if they met all of the following criteria: signal was up- or downregulated at least 1.5-fold in all experimental samples when compared with the controls; at least 2 of the 3 experimental samples represented a 2.0-fold or higher change in expression when compared with the controls; and the coefficient of variance (CV) value for the control group was less than 2.0. In grouped analyses, results with a 2-tailed, unpaired t test P values less than 0.05 were reported as significant. In paired analyses, results were reported if the fold change moved in the same direction for all samples and was at least 1.5 in all 3 samples with at least a 2.0-fold change in 2 of 3 samples. Results for the real-time PCR validation of microarray data were reported as mean of the median transformed  $1/\Delta Ct$  values ± SEM. Two-tailed unpaired t tests were used to determine significance, and a P value less than 0.05 was reported as significant. Results for the cytokine array, wound closure assays, and validation of Cxcl1 expression in response to ligand stimulation were reported as mean ± SEM. Two-tailed unpaired t tests were used to determine significance (P < 0.05). Correlative analyses for our gene expression signatures with human gene profiling and clinical status data were performed using normalized data representing 1,319 patients from 4 independent, previously reported studies (Gene Expression Omnibus ID: GSE10886, GSE4922, GSE6532, and GSE2845) (22-28). Probes were median centered across each dataset to minimize platform effects. Gene symbols were assigned using the manufacturer-provided annotation, and duplicate gene symbols were collapsed by averaging within each sample. Breast cancer subtypes were assigned based on a nearest centroid classifier (28). ANOVA was used to test the null hypothesis that the mean correlation to a signature is equal across the breast cancer subtypes. The similarity of each human breast cancer test case to the  $T\beta RII^{(WKO;PY)}$  or  $TGF-\beta$ -treated  $T\beta RII^{(fl/fl;PY)}$  carcinoma cell signatures was computed using Pearson correlation. Correlations were associated with RFS and MFS using the univariate Cox proportional hazard regression model. The "high versus low" model is based on transforming the TGF- $\beta$  signature correlation into a dichotomous variable (high: r > 0; low: r < 0), and the "continuous" model uses the untransformed correlation as a continuous variable (Figures 4 and 5). Association of these groups with RFS was evaluated with the log-rank test and visualized with Kaplan-Meier plots. The multivariate analysis was performed using the 2 TGF-β-associated signatures, ER status, tumor size, node status, 3 treatment variables, and 4 patient cohorts (Ivshina cohort as a reference) using the multivariate Cox proportional hazard model with spline. All statistical analyses used a P value cutoff of 0.05 to determine significance. All data analysis for human breast cancer correlation was performed in R (www.r-project.org/).

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