Transcriptome analysis of SerpinB2-deficient breast tumors provides insight into deciphering SerpinB2-mediated roles in breast cancer progression

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Abstract

Background: SerpinB2 is highly expressed in immune and tumor cells and is involved in multiple biological functions, including cell survival and remodeling for disease progression. This study prepared SerpinB2-deficient mice and analyzed the differentially expressed genes (DEGs) to determine if loss of this protein delays mammary tumor progression.

Results: A total of 305 DEGs (75 upregulated and 230 downregulated; > 1.5-fold difference, \( P < 0.05 \)) were identified in SB2\(^{-/-}\);PyMT tumors compared with PyMT tumors. The DEGs were mainly involved in immune and inflammatory responses related to T cell differentiation, IFN-\( \gamma \) production, and lymphocyte chemotaxis based on 61 enriched GO terms, hierarchical clustering, KEGG pathways, and a functionally grouped annotation network. The significantly changed DEGs (Anxa3, Ccl17, Cxcl13, Cxcr3, IFN-\( \gamma \), Nr4a1, and Sema3a) annotated with at least two GO categories in SB2\(^{-/-}\);PyMT tumors was validated by qRT-PCR.

Conclusions: SerpinB2 deficiency alters the expression of multiple genes in mammary tumors, which might cause a delay in PyMT-induced mammary tumor progression.

Keywords: RNA sequencing, SerpinB2-deficient mouse, MMTV-PyMT transgenic mouse, Breast cancer, Differentially expressed genes

Background

SerpinB2 or plasminogen activator inhibitor-2 (PAI-2) is an inhibitor of extracellular urokinase plasminogen activator (uPA) and is expressed in a number of cell types, especially tumor cells and immune cells [1]. SerpinB2 is involved in diverse cellular functions including cell survival, cell differentiation, inflammation, immunity, cell adhesion, migration, and extracellular matrix (ECM) remodeling in diseases including cancer by interacting with intracellular and extracellular proteins [2–4]. This implies that SerpinB2 is associated with tumorigenesis, invasion, and metastasis in the complex tumor system. SerpinB2 is a protumorigenic or antitumorigenic gene depending on the cancer type [5–7]. Mouse models of SerpinB2-deficient mammary tumors are useful for addressing various scientific questions regarding the in vivo functions of SerpinB2 during breast cancer progression.

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We generated SerpinB2-deficient MMTV-PyMT (SB2−/−;PyMT) mice by intercrossing SerpinB2-deficient (SB2−/−) mice with C57BL/6 strain background MMTV-PyMT (PyMT) mice widely used to study human breast cancer. Mammary tumor onset and progression were significantly delayed in SB2−/−;PyMT mice compared with those in PyMT mice. We aimed to analyze transcriptome profiles and networks of mammary tumor tissue samples collected from age-matched PyMT and SB2−/−;PyMT mice using RNA-Sequencing (RNA-Seq) technology to understand the underlying mechanism by which SerpinB2 deficiency is involved in delayed breast cancer development and metastasis. Gene Ontology (GO) terms, pathway enrichment, and a functionally organized GO/pathway network of differentially expressed genes (DEGs; 1.5-fold change (FC) and \( P < 0.05 \)) identified in SB2−/−;PyMT tumors relative to PyMT tumors were analyzed. This work provides insights into the biological functions and regulatory mechanisms of SerpinB2 in mammary tumors.

**Results**

**SB2−/−;PyMT mice exhibit delayed onset and growth of mammary tumors**

To investigate the potential in vivo role of SerpinB2 in breast cancer development and progression, SerpinB2-deficient PyMT (SB2−/−;PyMT) mice were produced by crossing SB2−/− female mice with C57BL/6 strain background PyMT males, and the PyMT transgene and SerpinB2-deficient genotype in all female offspring were analyzed by PCR (Fig. 1A). The protein expression level of ERα was not detected in 25-week-old SB2−/−;PyMT and PyMT mice tumors, while the HER2 protein level was comparably lower in SB2−/−;PyMT tumors \((1.31 \pm 0.17)\) than in PyMT tumors \((2.15 \pm 0.28)\), suggesting that SerpinB2 deficiency may be associated with reduced HER2 expression status (Fig. 1B). The raw data of Fig. 1A, B are shown in Supplementary data 1. The time-to-first appearance of a palpable tumor per mouse (mean±standard error), number of palpable tumor-bearing mice per group (%), as well as multifocal tumor numbers per mouse per time point (mean±standard error) were investigated. The first appearance of palpable tumors in PyMT mice and SB2−/−;PyMT mice was observed at 79.53±2.98 days and 92.47±3.75 days after birth, respectively \((P=0.011, \text{Fig. } 1 \text{ C})\). Palpable mammary tumors developed within 9–14 weeks of birth in 20–100% of PyMT mice and 11–50% of SB2−/−;PyMT mice. At 20 weeks of age, 100% of the PyMT mice and 88.24% of the SB2−/−;PyMT mice had palpable mammary tumors \((P<0.0001, \text{Fig. } 1 \text{ D})\). Prior to 12 weeks of age, multifocal tumors arose more slowly in the mammary glands of SB2−/−;PyMT mice than in those of PyMT mice, and the number of multifocal palpable primary tumors in PyMT mice and SB2−/−;PyMT mice at 20 weeks of age were 7.05±0.34 and 4.6±0.60, respectively (Fig. 1E). Among 10 mammary glands, SB2−/−;PyMT mice exhibited a remarkably slower tumor growth rate in 4th and 5th mammary glands, and the volume of tumors generated from the 4th and 5th mammary glands of SB2−/−;PyMT mice was smaller at 20 weeks compared with those of PyMT mice (Fig. 1F).

**Identification of DEGs between SB2−/−;PyMT and PyMT**

The Venn diagram shows that 11,928 genes overlapped between SB2−/−;PyMT and PyMT tumors. Genes with expression changes at an average of normalized RC (log2) > 5 in both groups showed that 167 and 226 genes did not overlap in SB2−/−;PyMT tumors and PyMT tumors, respectively. (Fig. 2A). DEGs between SB2−/−;PyMT and PyMT tumors were selected by ranking genes with a log10 \( P \) value < 0.05 and plotting against the log2 (FC) in scatter and volcano plots (Fig. 2B, C). We identified 305 DEGs including 75 upregulated (FC ≥ 1.5) and 230 downregulated genes (FC ≤ 1.5) in SB2−/−;PyMT tumors (Supplementary Table 1) and the largest variations in DEGs are shown in Tables 1 and 2.

**GO enrichment analysis**

Hierarchical clustering of 75 upregulated and 230 downregulated DEGs in SB2−/−;PyMT tumors compared to PyMT tumors (FC ≥ 1.5, FC ≤ 1.5, \( P < 0.05 \)) (Fig. 3A) was followed by GO enrichment analysis. DEGs were enriched in the following GO terms: biological processes (BP; 34), molecular function (MF; 18), and cellular compartment (CC; 9) (Supplementary Table 2), and the top ten subclasses of GO enrichment terms are shown in Fig. 3B.

**Pathway enrichment analysis**

The DEGs were mapped to three terms in the Kyoto Encyclopedia of Genes and Genomes (KEGG) database (http://www.genome.ad.jp/kegg/) [5–7]; cytokine-cytokine receptor interaction pathways, neuroactive ligand-receptor interaction, and pancreatic secretion (Table 3).

**Functionally grouped annotation network**

Cytoscape software functionally organized the GO network for DEGs in SB2−/−;PyMT tumors. Overall, 51 GO terms in the BP, MF, and CC categories were significantly enriched, and these categories were organized into 18 annotation networks that reflected the relationships between the terms based on the integration of their associated genes (Fig. 4). The main networks were endopeptidase inhibitor activity, lymphocyte...
chemotaxis, proteinaceous extracellular matrix, CD8-positive α-β T-cell differentiation, and positive regulation of interferon-γ production.

Selection of genes associated with the 9 functional GO categories

Finally, we selected 82 genes belonging to nine functional categories (cell cycle, cell proliferation, cell death, cell migration, cell adhesion, wound healing, ECM, immunity, and inflammation) from 305 DEGs identified in SB2−/−;PyMT tumors. Overall, 12 of these DEGs (17.14%) were downregulated and 58 (82.86%) were upregulated (Fig. 5A). These genes were involved in the cell cycle (7.29%), cell death (7.29%), ECM modification (18.75%), cell proliferation (4.17%), wound healing (4.17%), cell migration (14.58%), immunity (16.67%), inflammation (3.12%), and cell adhesion (23.96%) (Fig. 5B). Several DEGs were annotated with at least two GO categories (Fig. 5C and Table 4). Hierarchical clustering and detailed information on these genes belonging to the nine functional categories are shown in Fig. 5D and Supplementary Table 3.
Quantitative real-time RT-PCR (qRT-PCR) analyses of DEGs annotated with at least two functional categories
Anxa3, Ccl17, Cxcl13, Cxcr3, INF-$\gamma$, Nr4a1, and Sema3a mRNA levels were significantly changed in SB2−/−;PyMT tumors compared with PyMT tumors. The gene of Anxa3 and Nr4a1 $\Delta$Ct values which normalized with the $\gamma$-actin housekeeping gene were significantly decreased (Anxa3: 3.394 ± 0.094 vs. 2.961 ± 0.142, $P = 0.025$; Nr4a1: 9.898 ± 0.133 vs. 9.213 ± 0.245 $P = 0.028$), which means that the mRNA levels of Anxa3 and Nr4a1 were significantly increased in SB2−/−;PyMT tumors compared with PyMT tumors. The $\Delta$Ct values of Ccl17, Cxcl13, Cxcr3, INF-$\gamma$, and Sema3a were significantly increased in SB2−/−;PyMT tumors compared with PyMT tumors (Ccl17: 11.35 ± 0.509 vs. 13.08 ± 0.324 $P = 0.01$; Cxcl13: 10.51 ± 0.591 vs. 12.18 ± 0.368 $P = 0.028$; Cxcr3: 10.04 ± 0.222 vs. 11.56 ± 0.169 $P = 0.0003$; INF-$\gamma$: 13.94 ± 0.266 vs. 14.85 ± 0.217 $P = 0.024$; Sema3a: 11.24 ± 0.381 vs. 12.56 ± 0.348 $P = 0.021$; Tnfsf14: 13.16 ± 0.385 vs. 14.67 ± 0.336 $P = 0.0124$).

While no significant differences were noted in Cxcl2, Itgad, Tnfsf14, and Trem1 (Cxcl2: 10.59 ± 0.314 vs. 10.73 ± 0.409 $P = 0.787$; Itgad: 17.18 ± 0.359 vs.
Table 1  Top 10 upregulated mRNAs in SB2−/−;PyMT tumors compared to PyMT tumors

| Entrez ID | Gene symbol | Description | Fold change | P value |
|-----------|-------------|-------------|-------------|---------|
| 654       | SerpinB8    | Serine or cysteine peptidase inhibitor, clade B (ovalbumin), member 8 | 4.771       | 0.016   |
| 650       | SerpinB11   | Serine (or cysteine) peptidase inhibitor, clade B (ovalbumin), member 11 | 4.758       | 0.006   |
| 690       | Gpr39       | G protein-coupled receptor 39 | 3.014       | 0.003   |
| 17,492    | Clec2f      | C-type lectin domain family 2, member f | 2.909       | 0.049   |
| 10,729    | Stbsia6     | STB alpha-N-acetyl-neuraminide alpha-2,8-sialyltransferase 6 | 2.661       | 0.005   |
| 1378      | Slc35d3     | Solute carrier family 35, member D3 | 2.457       | 0.050   |
| 643       | SerpinB5    | Serine (or cysteine) peptidase inhibitor, clade B (ovalbumin), member 5 | 2.352       | 0.000   |
| 620       | Ptcnt2      | Pluripotency-associated noncoding transcript 2 | 2.324       | 0.003   |
| 13,538    | Col25a1     | Collagen type XXV alpha 1 | 2.216       | 0.036   |
| 6348      | Fam167a     | Family with sequence similarity 167, member A | 2.172       | 0.031   |

Table 2  Top 10 downregulated mRNAs in SB2−/−;PyMT tumors compared to PyMT tumors

| Entrez ID | Gene symbol | Description | Fold change | P value |
|-----------|-------------|-------------|-------------|---------|
| 657       | Cdh19       | Cadherin 19 | 0.089       | 0.033   |
| 15,652    | Amtn        | Amelotin    | 0.178       | 0.022   |
| 14,992    | Car6        | Carbonic anhydrase 6 | 0.253       | 0.014   |
| 19,606    | Dmbt1       | Deleted in malignant brain tumors 1 | 0.256       | 0.024   |
| 19,845    | Rtn         | Resistin    | 0.289       | 0.048   |
| 15,727    | Cxcl13      | C-X-C motif chemokine ligand 13 | 0.332       | 0.034   |
| 4882      | Akr1c14     | Aldo-keto reductase family 1 member 14 | 0.347       | 0.040   |
| 14,217    | Elavl2      | ELAV like RNA binding protein 2 | 0.356       | 0.050   |
| 607       | D2hgdh      | D-2-hydroxymalate dehydrogenase | 0.363       | 0.000   |
| 16,113    | Tmem132c    | Transmembrane protein 132C | 0.363       | 0.035   |

17.32 ± 0.181  P = 0.735; Tnfsf14: 14.67 ± 0.336 vs. 14.03 ± 0.262  P = 0.159; Trem1: 17.40 ± 0.443 vs. 16.56 ± 0.489 P = 0.221) (Fig. 6).

Discussion

SerpinB2 is expressed by a variety of cells and is implicated in various diseases including cancer, inflammation, and immune-associated diseases [8]. Dougherty et al. produced SerpinB2-deficient (SB2−/−) mice to examine the potential in vivo functions of SerpinB2 in murine development [9]. MMTV-PyMT transgenic (PyMT) mice are widely used for studying breast cancer development and metastasis, especially the luminal B subtype [10]. There is a lack of studies analyzing the in vivo role of SerpinB2 in transgenic and knock-out animal models of breast cancer. We generated SerpinB2-deficient MMTV-PyMT (SB2−/−;PyMT) mice by crossing SB2−/− mice with PyMT mice to provide insights into the in vivo function of SerpinB2 in mammary tumor development and progression and found that SerpinB2 deficiency resulted in a delay in PyMT-induced mammary tumor initiation and progression. RNA-Seq is a valuable method for quantifying transcriptome signatures and deciphering the regulatory network underlying breast tumor progression from primary tumor development to metastasis [11, 12]. Transcriptome profiling using RNA-Seq was performed in mammary tumors of PyMT and SB2−/−;PyMT mice to obtain the DEGs, the genetic network, and understand how SerpinB2 deficiency affects delayed breast cancer development and metastasis.

Three hundred and five DEGs were observed in SB2−/−;PyMT tumors, including 75 upregulated genes and 230 downregulated genes compared with PyMT tumors. SerpinB2 subfamily members (SerpinB1–13) inhibit activity of cytotoxic and apoptotic proteases and papain-like enzymes and non-inhibitory molecules [13]. SerpinB8, SerpinB11, and SerpinB5 were among the top 10 upregulated DEGs in SB2−/−;PyMT tumors. Particularly, SerpinB5 (maspin) is a tumor suppressor that inhibits metastasis in human mammary epithelial cells.
Fig. 3  Hierarchical clustering of DEGs and GO enrichment analysis. (A) Gene expression heatmap based on hierarchical clustering in two groups. (B) Histogram of the top 10 enriched GO terms obtained from 305 DEGs. Yellow: biological process (BP); green: molecular function (MF); blue: cellular component (CC)
Cdh19 (cadherin 19) was one of the top 10 down-regulated DEGs identified in SB2−/−;PyMT tumors; however, there are no reports on the role of this gene in adherent junction formation associated with breast cancer progression. It is important to investigate whether Cdh19 can induce invasion or dissemination in the

Table 3  KEGG pathway enrichment in SB2−/−;PyMT tumors based on GO terms from DEGs

| Term                                                | Count | Percentage of DEGs | P value | Log10 (P value) | Genes                                                                 |
|------------------------------------------------------|-------|--------------------|---------|-----------------|----------------------------------------------------------------------|
| mmu04060: Cytokine-cytokine receptor interaction     | 9     | 0.03               | 0.005   | 2.261           | Lep, Il12rb1, Cxcl13, Cxcr6, Cxcl2, IFN-γ, Tnfsf14, Cxcr3, Cc17     |
| mmu04080: Neuroactive ligand-receptor interaction    | 9     | 0.03               | 0.014   | 1.853           | Lep, Avpr2, P2rx3, P2ry1, Mc2r, Htr4, Adra1b, Htr1d, Sctr            |
| mmu04972: Pancreatic secretion                        | 5     | 0.02               | 0.025   | 1.595           | Pla2g1b, Cpa2, Prkcg, Pla2g2d, Sctr                                 |

[14]. Cdh19 (cadherin 19) was one of the top 10 down-regulated DEGs identified in SB2−/−;PyMT tumors; however, there are no reports on the role of this gene in adherent junction formation associated with breast cancer progression. It is important to investigate whether Cdh19 can induce invasion or dissemination in the
Fig. 5 Extraction of genes annotated with at least two GO functional categories. (A-C) Pie charts of the genes annotated with nine functional categories stated in the legend of panel. (D) Gene expression heatmap based on hierarchical clustering of the genes annotated with nine functional categories.
mammary epithelium. Amtn (amelotin) may play a role in the controlled mineralization of hydroxyapatite that is an early diagnostic marker for breast cancer, is involved in enhancing breast cancer progression, and is associated with poor breast cancer prognosis [15]. Therefore, upregulated SerpinB5 and downregulated Amtn may be involved in suppressing mammary cancer development and lymph node metastasis in $SB2^{-/-}$;PyMT mice.

The role of SerpinB2 expression by diverse types of cells in cancer growth and metastasis is controversial. High SerpinB2 expression is noted in mouse melanoma cell line of B16 cells, and human melanoma cell line of M24met inhibiting metastasis [16, 17]. In addition, perivascular expression of SerpinB2 in C8161 human melanoma cells promotes brain metastasis [18]. The SerpinB2-deficient human lung cancer cell line H2030-BrM3 and human breast cancer cell line MDA231-BrM2 do not form brain metastases because the deleterious effects of SerpinB2 on the vascular attachment and survival of cancer cells are inhibited [19]. Recently, Jin et al. showed that SerpinB2 knockdown in MDA-MB-231 breast cancer cells suppressed their migratory activity and lung

**Table 4** DEGs annotated with at least two functional categories

| Gene symbol | Description                                      | Fold change | $P$ value |
|-------------|--------------------------------------------------|-------------|-----------|
| Anxa3       | Annexin A3                                       | 1.58        | 0.0008    |
| Ccl17       | Chemokine (C-C motif) ligand 17                  | 0.413       | 0.0008    |
| Cxcl2       | Chemokine (C-X-C motif) ligand 2                 | 1.957       | 0.0048    |
| Cxcl13      | Chemokine (C-X-C motif) ligand 13                | 0.332       | 0.0034    |
| Cxcr3       | Chemokine (C-X-C motif) receptor 3               | 0.608       | 0.0047    |
| IFN-γ       | Interferon gamma                                 | 0.575       | 0.0038    |
| Itgad       | Integrin, alpha D                                | 0.522       | 0.0045    |
| Nrl4a1      | Nuclear receptor subfamily 4, Group A, member 1  | 2.019       | 0.0038    |
| Semaphorin3a| Semaphorin 3A                                    | 0.455       | 0.0004    |
| Tnf-sf14    | Tumor necrosis factor (ligand) superfamily, member 14 | 0.63        | 0.0043    |
| Trem1       | Triggering receptor expressed on myeloid cells 1 | 1.856       | 0.0039    |

**Fig. 6** Relative expression analysis of DEGs annotated with at least two functional categories by qRT-qPCR. The expression levels of these genes in individual tumor samples of PyMT mice (black bars) and $SB2^{-/-}$;PyMT mice (white bars) were normalized by γ-actin. The relative mRNA levels were ∆Ct, which is the difference in Ct values for genes of interest and internal reference gene γ-actin.
metastasis [20]. SerpinB2-deficient mouse embryonic fibroblasts exhibit increased pancreatic tumor growth and local invasion with reduced collagen deposition [4], whereas fibroblasts overexpressing SerpinB2 reduce human breast tumor cell apoptosis. MDA-MB-231 promotes breast tumor growth and lung metastasis and reduces tumor apoptosis [21]. SerpinB2 upregulation in monocytes/macrophages following infection or stimulation with inflammatory mediators is involved in a cellular response to delay cell death, possibly allowing cells to complete vital functions such as lymphocyte activation and antigen presentation [22]. SerpinB2-deficient mice produce more IgG2c and OVA-specific IFN-γ-secreting T cells than wild-type mice suggesting that SerpinB2 regulates adaptive immunity [3]. In the aforementioned studies [19, 20], SerpinB2 expression substantially mediates physiological and pathological functions including inhibitory activity against serine protease plasminogen activators, ECM remodeling, cell survival and migration, inflammation, and immunity. Thus, the role of SerpinB2 in cancer development and aggressive progression may depend on the cancer type.

Our results showed that SerpinB2 plays roles in immunity, inflammation, chemotaxis, and ECM modulation. GO enrichment and functional network analysis of DEGs identified from SB2−/−;PyMT tumors revealed multiple biological processes including T cell differentiation, INF-γ production, lymphocyte chemotaxis, ECM, and peptidase inhibitor activity which is consistent with previous studies [2, 3, 13, 23, 24]. Eleven DEGs (Anxa3, Ccl17, Cxcl2, Cxcl13, Cxcr3, INF-γ, Itgad, Nr4a1, Sema3a, Tnfsf14, and Trem1) were annotated with at least two GO categories. We here validated quantitative expression levels of these genes between PyMT and SB2−/−;PyMT tumors using qRT-PCR. Seven of the 11 genes (Anxa3, Ccl17, Cxcl13, Cxcr3, IFN-γ, Nr4a1, and Sema3a) exhibited identical RNA-Seq and qRT-PCR results, whereas four genes (Cxcl2, Itgad, Tnfsf14, and Trem1) did not. Thus, the RNA-Seq and qRT-PCR findings agreed on 63.6% of the genes. RNA-Seq is a strong tool, however variations in starting quantities or cDNA quality can obscure quantitative differences between two samples [25]. As a result, more precise methods are needed to confirm the exact copy counts of specific mRNAs. The only approach to avoid this error is to use internal standard-normalized qRT-PCR.

Gene of Ccl17, Cxcl13, Cxcr3, IFN-γ, and Sema3a, were significantly decreased while the Anxa3 and Nr4a1 were significantly upregulated in SB2−/−;PyMT mammary tumors. High levels of Ccl17, Cxcl13, and Cxcr3 in mammary tumors or tumor-associated macrophages induce cancer cell migration which is associated with metastasis disease [26–29]. Ccl17 and Cxcr3 increased in mammary tumors that protects cancer cell survival and induce tumor growth to promote breast cancer lung metastasis [28, 29] Hypoxia-induced chemokine Sema3a stimulates tumor-associated macrophages to the alternative type (M2), leading to pro-tumor immunity [30]. And the tumor suppressor gene of Nr4a1 in TNBC was decreased cancer cell proliferation and invasiveness [31]. These studies support our findings that low levels of Ccl17 and Cxcl13, Cxcr3, and Sema3a as well as high levels of Nr4a1 in SB2−/−;PyMT tumors may delay mammary tumor development and may lead to decreased metastasis. However, in SB2−/−;PyMT tumors, a high levels of IFN-γ, which activates the antitumor immune response [32], and a low levels of Anxa3, which controls cancer cell invasion and lung metastasis [33], do not support SerpinB2 deficiency causing a delay in PyMT-induced mammary tumor progression. Given these results, the crosstalk between the immune system and cancer cells mediated by these cytokines and chemokines in SB2−/−;PyMT tumors during tumor initiation and progression in breast cancer requires further study.

Conclusion
SerpinB2-deficient MMTV-PyMT mice (SB2−/−;PyMT) exhibited altered expression of multiple genes related to many aspects of immunity, inflammation, chemotaxis, cell adhesion, ECM modulation, peptidase activity, and cell proliferation suggesting that they delay PyMT-induced mammary cancer development and metastasis. Further studies are required to understand the complex roles of multiple genes identified in our study in tumor microenvironments.

Methods
Animals
PyMT mice originally generated by Bill Muller’s laboratory [10] on a C57BL/6 background were kindly provided by Dr. Sandra Gendler (Mayo Clinic, Scottsdale, AZ, USA). SerpinB2-deficient (B6.129S1-Serpbinb2tm1Dgi/J) (SB2−/−) mice were provided by Jackson Laboratory (Bar Harbor, ME, USA). Male PyMT mice were mated with female SB2−/− mice to generate progeny with the SB2−/− or SB2+/− genotype. Female SB2+/− and male SB2+/−;PyMT mice were mated against each other to generate SB2−/−;PyMT female littermates. The mice used in the RNA-Seq experiment were age-matched PyMT and SB2−/−;PyMT females (20–25 weeks). Animal care and experimental procedures were conducted according to the guidelines on the ethical use of animals. The study protocol was approved by the Institutional Animal Care and Use Committee of Seoul National
University (SNU-150210-3-4). All methods are reported in accordance with ARRIVE guidelines (https://arriveguidelines.org) for the reporting of animal experiments.

**Genotyping**
Chromosomal DNA was isolated from a 2-mm piece of the tail tip of mice. Mice were genotyped for the PyMT allele by polymerase chain reaction (PCR) using previously described primers [34]: forward primer, 5'-AGT CACTGCTACTGCACCCCAG-3'; reverse primer, 5'-CTC TCCTCAGTTCTTGGCTCC-3'. The genotypes of SB2+/− mice were confirmed by additional multiplex PCR using previously described primers [9]: 5 (SerpinB2 exon 8 5'-TTTGTAGGCCGGTTGTTCCTCTGT-3'), 6 (nonspecific 5'-CAGCGCAACTGGCCGCAGG-3'), and 7 (3 sequence flanking SerpinB2 5'-GGTTGTTCGAATGCTCCCCTCTA-3'). Primers 5 and 7 amplified a 500-bp product from the endogenous SerpinB2 allele, and primers 6 and 7 amplified a 650-bp product from the targeted allele.

**RNA extraction from tumor tissues**
Mammary tumor tissues were collected from age-matched SB2+/−;PyMT (n = 10) and PyMT (n = 10) mice (20 weeks old [n = 2], 22 weeks old [n = 2], and 25 weeks old [n = 6] per group). Total RNA content was extracted from a 20-mg piece of the tumor using TRIzol reagent (Invitrogen, Carlsbad, CA, USA) according to the manufacturer’s instructions. RNA concentration was measured using a NanoDrop 2000 spectrophotometer (Thermo Fisher Scientific, Waltham, MA, USA). RNA integrity number (RIN) was determined using an Agilent RNA 6000 Nano kit following the manufacturer’s protocol on an Agilent 2100 bioanalyzer (Agilent, Santa Clara, CA, USA).

**RNA-Seq and DEG analysis**
Sequencing libraries were constructed using the QuantSeq 3' mRNA-Seq library prep kit (Lexogen, South Morang Victoria, Austria) according to the manufacturer’s instructions. High-throughput RNA-Seq was performed for 75 single-end sequences using the NextSeq 500 system (Illumina, San Diego, CA, USA). DEGs between SB2+/−;PyMT, and PyMT tumors were determined based on counts from unique and multiple alignments using coverage in BEDTools [35]. The read count data were processed based on the quantile normalization method using EdgeR within R (R Development Core Team, 2016) by Bioconductor [36]. Genes with a P-value < 0.05 were ranked by the log10 P value and plotted against the log2 (FC) in a “volcano” plot. Genes that were upregulated and downregulated with a P-value < 0.05 and log ratio >1.5 were considered DEGs.

**GO, KEGG pathway, enrichment, and functional network analysis**
Biological functional categories enriched in DEGs were identified using the functional annotation and clustering tool of the Database for Annotation, Visualization, and Integrated Discovery v6.7 (https://david.ncifcrf.gov/) [37–39]. Significant GO terms were identified after multiple testing adjustments using the Benjamini–Hochberg method; Benjamini < 0.05, which indicated a statistically significant difference and GO term lists BP, MF, and CC were matched [40]. KEGG pathway enrichment analyses was performed using the KEGG pathway software (https://www.kegg.jp/kegg/) from the Kanehisa laboratory and the threshold value was set at P<0.05. The functionally organized GO/pathway network was created using Cytoscape software version 2.6.2 (http://www.cytoscape.org/) with the ClueGO plugin (http://www.ici.upmc.fr/cluego/cluegoDownload.shtml) [41].

**qRT-PCR**
Experiments were performed using the same samples extracted from the tumor tissues of age-matched PyMT and SB2+/−;PyMT mice for RNA-Seq. qRT-PCR was performed using an ABI PRISM 7900 system, SYBR Green PCR master mix (Applied Biosystems, Foster City, CA), and specific primer sets for Anxa3, Ccl17, Cxcl2, Cxcl13, Cxcr3, INF-γ, Itgad, Nr4a1 Sema3a, Tnfsf14, and Trem1 (Supplementary Table 4). The results were analyzed using the comparative ∆Ct method with the relative gene expression normalized to the β-actin housekeeping gene [42].

**Statistical analysis**
Statistical analyses were performed by GraphPad Prism 8.0 (GraphPad Software, Inc., La Jolla, CA). Statistical significance was determined by Student t-test to compare tumor size and number differences, and gene expression between two groups. For all tests, a P-value less than 0.05 was considered statistically significant.

**Supplementary Information**
The online version contains supplementary material available at https://doi.org/10.1186/s12864-022-08704-4.

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**Additional file 1: Supplementary Table 1.** 305 DEGs including upregulated and downregulated genes in SB2+/−;PyMT tumors.

**Additional file 2: Supplementary Table 2.** Subclasses of GO terms in the biological process (BP), molecular function (MF), and cellular compartment (CC) categories in SB2+/−;PyMT tumors compared to PyMT tumors.

**Additional file 3: Supplementary Table 3.** Detailed information of the DEGs associated with the functional categories regulated by SerpinB2 in SB2+/−;PyMT tumors compared to PyMT.

**Additional file 4: Supplementary Table 4.** Specific primer sequences for qRT-PCR.

**Additional file 5: Supplementary Data 1.** Whole gel and membrane images for Fig. 1A, B.
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Authors’ contributions
YJP, HSK, WSH, and WKM conceived the ideas and wrote the manuscript. YJP carried out most of the experiments and the analysis of all experiment data. WSH contributed to the analysis of RNA-Seq and qRT-PCR. HSK and WKM contributed to the analysis and interpretation of data and edited the manuscript.

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Availability of data and materials
The raw transcriptome sequencing data (RNA-Seq) have been deposited in the BioProject under the accession number of PRJDB13249. The datasets supporting the conclusions of this article are included within the additional files. And any tumor samples and additional information about this study, are available from the corresponding authors on reasonable request.

Declarations

Ethics approval and consent to participate
All mice were housed in an animal care facility at the Biomedical Center for Animal Resource Development of Seoul National University. Animal care and experimental procedures were conducted according to the guidelines set by the Institutional Animal Care and Use Committee of Seoul National University (SNU-150210-3.4). All methods are reported in accordance with ARRIVE guidelines (https://arriveguidelines.org) for the reporting of animal experiments.

Consent for publication
Not applicable.

Competing interests
The authors declare that they have no known competing financial interests.

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References
1. Mikus P, Urano T, Liljestrom P Ny T. Plasminogen-activator inhibitor type 2 (PAI-2) is a spontaneously polymerising SERPIN. Biochemical characterisation of the recombinant intracellular and extracellular forms. Eur J Biochem. 1993;218(3):1071–82.
2. Medcalf RL, Stasinopoulos SJ. The undecided serpin. The ins and outs of plasminogen activator inhibitor type 2. FEBS J. 2005;272(19):4858–67.
3. Schroder WA, Le TT, Major L, Street S, Gardiner J, Lambley E, et al. A physiological function of inflammation-associated SerpinB2 is regulation of adaptive immunity. J Immunol. 2010;184(5):2663–70.
4. Harris NLE, Vennin C, Conway JRW, Vane KL, Pinse M, Cowley MJ, et al. SerpinB2 regulates stromal remodelling and local invasion in pancreatic cancer. Oncogene. 2017;36(30):4288–98.
5. Kanehisa M, Goto S. KEGG: Kyoto encyclopedia of genes and genomes. Nucleic Acids Res. 2000;28(1):27–30.
6. Kanehisa M. Toward understanding the origin and evolution of cellular organisms. Protein Sci. 2019;28(1):1947–51.
7. Kanehisa M, Furumichi M, Sato Y, Ishiguro-Watanabe M, Tanabe M. KEGG: integrating viruses and cellular organisms. Nucleic Acids Res. 2021;49(D1):D545–d551.
8. Croucher DR, Saunders DN, Lobov S, Ranson M. Revisiting the biological roles of PAI2 (SERPINB2) in cancer. Nat Rev Cancer. 2008;8(7):535–45.
9. Dougherty KM, Pearson JM, Yang AV, Westrick RJ, Baker MS, Ginsburg D. The plasminogen activator inhibitor-2 gene is not required for normal murine development or survival. Proc Natl Acad Sci U S A. 1999;96(2):686–91.
10. Guy CT, Cardiff RD, Muller WI. Induction of mammary tumors by expression of polyomavirus middle T oncopgene: a transgenic mouse model for metastatic disease. Mol Cell Biol. 1992;12(13):954–61.
11. Costa V, Aprile M, Esposito R, Ciccocioppola A. RNA-Seq and human complex diseases: recent accomplishments and future perspectives. Eur J Hum Genet. 2013;21(2):134–42.
12. Zhao W, He X, Hoadley KA, Parker JS, Hayes DN, Perou CM. Comparison of RNA-Seq by poly (a) capture, ribosomal RNA depletion, and DNA microarray for expression profiling. BMC Genomics. 2014;15:419.
13. Law RH, Zhang Q, McGowan S, Buckle AM, Silverman GA, Wong W, et al. An overview of the serpin superfamily. Genome Biol. 2006;7(5):126.
14. Zou Z, Anisowicz A, Hendrix MJ, Thor A, Neveu M, Sheng S, et al. Maspin, a serpin with tumor-suppressing activity in human mammary epithelial cells. Science. 1994;263(5146):526–9.
15. Cox RF, Hernandez-Santana A, Ramdass S, Mvulaon G, Harmey JH, Morgan MP. Microcalcifications in breast cancer: novel insights into the molecular mechanism and functional consequence of mammary mineralisation. Br J Cancer. 2012;106(3):255–37.
16. Mueller BM, Yu YB, Laug WE. Overexpression of plasminogen activator inhibitor 2 in human melanoma cells inhibits spontaneous metastasis in scid/scid mice. Proc Natl Acad Sci U S A. 1995;92(21):205–9.
17. Schroder WA, Major LD, Le TT, Gardiner J, Sweet MJ, Janciauskiene S, et al. Tumor cell-expressed SerpinB2 is present on microplates and inhibits metastasis. Cancer Med. 2014;3(3):500–13.
18. Bentolila LA, Prakash R, Mihic-Probst D, Wadehra M, Kleinman HK, Carmichael TS, et al. Imaging of Angiotropism/vascular co-option in a murine model of brain melanoma: implications for melanoma progression along extravascular pathways. Sci Rep. 2016;6:23834.
19. Vallentine M, Obenauf AC, Jin C, Chen Q, Zhang XH, Lee DJ, et al. Serpins promote cancer cell survival and vascular co-option in brain metastasis. Cell. 2014;156(5):1002–16.
20. Jin T, Suk Kim H, Ki Choi S, Hye Hwang E, Woo J, Suk Ryu H, et al. microRNA-200C/141 upregulates SerpinB2 to promote breast cancer cell metastasis and reduce patient survival. Oncotarget. 2017;8(20):32769–82.
21. Castello-Cros R, Bonuccelli G, Molchanys A, Capozza F, Wlukiewicz AK, Brbe RC, et al. Matrix remodeling stimulates stromal autophagy, “fueling” cancer cell mitochondrial metabolism and metastasis. Cell Cycle. 2011;10(12):2021–24.
22. Dickinson JL, Bates EJ, Ferrante A, Antalis TM. Plasminogen activator inhibitor type 2 inhibits tumor necrosis factor alpha-induced apoptosis: Evidence for an alternate biological function. J Biol Chem. 1995;270(46):27894–904.
23. Kruithof EK, Baker MS, Bunn CL. Biological and clinical aspects of plasminogen activator inhibitor type 2. Blood. 1995;86(11):4007–24.
24. Hsieh HH, Chen YC, Jhan JR, Lin JJ. The serine protease inhibitor serpinB2 binds and stabilizes p21 in senescent cells. J Cell Sci. 2017;130(18):3272–81.
25. Lovén J, Orlando DA, Sigova AA, Lin CY, Rahl PB, Burge CB, et al. Revisiting global gene expression analysis. Cell. 2012;151(3):476–82.
26. Panse J, Friedrichs K, Marx A, Hildebrandt Y, Luetkens T, Barrels K, et al. Chemokine CXCL13 is overexpressed in the tumour tissue and in the peripheral blood of breast cancer patients. Br J Cancer. 2008;99(6):930–8.
27. Maolake A, Izumi K, Shigehara K, Natsagdorj A, Iwamoto H, Kadomoto S, et al. Tumor-associated macrophages promote prostate cancer migration through activation of the CCL22-CCR4 axis. Oncotarget. 2017;8(6):9739–51.
28. Olkhanud PB, Baatar D, Bodogai M, Hakim F, Gress R, Anderson RL, et al. Breast cancer lung metastasis requires expression of chemokine receptor CCR4 and regulatory T cells. Cancer Res. 2009;69(14):5996–6004.
29. Pein M, Inusa-Rodriguez J, Hongu T, Riedel A, Meier J, Wiedmann L, et al. Metastasis-initiating cells induce and exploit a fibroblast niche to fuel malignant colonization of the lungs. Nat Commun. 2020;11(1):1494.
30. Lin Y, Xu J, Lan H. Tumor-associated macrophages in tumor metastasis: biological roles and clinical therapeutic applications. J Hematol Oncol. 2019;12(1):76.
31. Wu H, Bi J, Peng Y, Huo L, Yu X, Yang Z, et al. Nuclear receptor NrfA1 is a tumor suppressor down-regulated in triple-negative breast cancer. Oncotarget. 2017;8(33):54364–77.
32. Jorgovanovic D, Song M, Wang L, Zhang Y. Roles of IFN-γ in tumor progression and regression: a review. Biomark Res. 2020;8:49.
33. Du R, Liu B, Zhou L, Wang D, He X, Xu X, et al. Downregulation of annexin A3 inhibits tumor metastasis and decreases drug resistance in breast cancer. Cell Death Dis. 2018;9(2):126.
34. Spicer AP, Rowe GJ, Lidner TK, Gendler SJ. Delayed mammary tumor progression in Muc-1 null mice. J Biol Chem. 1995;270(50):30093–101.
35. Quinlan AR, Hall IM. BEDTools: a flexible suite of utilities for comparing genomic features. Bioinformatics. 2010;26(6):841–2.
36. Gentleman RC, Carey VJ, Bates DM, Bolstad B, Dettling M, Dudoit S, et al. Bioconductor: open software development for computational biology and bioinformatics. Genome Biol. 2004;5(10):R80.
37. Huang da W, Sherman BT, Lempicki RA. Systematic and integrative analysis of large gene lists using DAVID bioinformatics resources. Nat Protoc. 2009;4(1):44–57.
38. Huang da W, Sherman BT, Lempicki RA. Bioinformatics enrichment tools: paths toward the comprehensive functional analysis of large gene lists. Nucleic Acids Res. 2009;37(1):1–13.
39. Veitenhansl M, Stegner K, Hiefel FX, Dieterle C, Feldmeier H, Gutt B, et al. 40th EASD annual meeting of the European Association for the Study of diabetes: Munich, Germany, 5–9 September 2004. Diabetologia. 2004;47(Suppl 1):A1–A464.
40. Bunda S, Heir P, Metcalf J, Li ASC, Agnhotri S, Pusch S, et al. CIC protein instability contributes to tumorigenesis in glioblastoma. Nat Commun. 2019;10(1):661.
41. ClueGO: a Cytoscape plug-in to decipher functionally grouped gene ontology and pathway annotation networks. Bioinformatics. 2009;25(8):1091–3.
42. Silver N, Best S, Jiang J, Thein SL. Selection of housekeeping genes for gene expression studies in human reticulocytes using real-time PCR. BMC Mol Biol. 2006;7:33.

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