Multi-omics of the expression and clinical outcomes of TMPRSS2 in human various cancers: A potential therapeutic target for COVID-19

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Abstract
Growing evidence has shown that Transmembrane Serine Protease 2 (TMPRSS2) not only contributes to the severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2) infection, but is also closely associated with the incidence and progression of tumors. However, the correlation of coronavirus disease (COVID-19) and cancers, and the prognostic value and molecular function of TMPRSS2 in various cancers have not been fully understood. In this study, the expression, genetic variations, correlated genes, immune infiltration and prognostic value of TMPRSS2 were analysed in many cancers using different bioinformatics platforms. The observed findings revealed that the expression of TMPRSS2 was considerably decreased in many tumour tissues. In the prognostic analysis, the expression of TMPRSS2 was considerably linked with the clinical consequences of the brain, blood, colorectal, breast, ovarian, lung and soft tissue cancer. In protein network analysis, we determined 27 proteins as protein partners of TMPRSS2, which can regulate the progression and prognosis of cancer mediated by TMPRSS2. Besides, a high level of TMPRSS2 was linked with immune cell infiltration in many tumour tissues. In the prognostic analysis, the expression of TMPRSS2 was considerably linked with the clinical consequences of the brain, blood, colorectal, breast, ovarian, lung and soft tissue cancer. In protein network analysis, we determined 27 proteins as protein partners of TMPRSS2, which can regulate the progression and prognosis of cancer mediated by TMPRSS2. Besides, a high level of TMPRSS2 was linked with immune cell infiltration in many tumour tissues. Furthermore, according to the pathway analysis of differently expressed genes (DEGs) with TMPRSS2 in lung, breast, ovarian and colorectal cancer, 160 DEGs genes were found and were significantly enriched in respiratory system infection and tumour progression pathways. In conclusion, the findings of this study demonstrate that TMPRSS2 may be an effective biomarker and therapeutic target in various cancers in humans, and may also provide new directions for specific tumour patients to prevent SARS-CoV-2 infection during the COVID-19 outbreak.

KEYWORDS
bioinformatics, cancer progression, multi-omics analysis, prognostic analysis, prognostic biomarkers, TMPRSS2
1 | INTRODUCTION

Cancer is considered the most serious and prevalent disease in human beings around the world. The morbidity and mortality rate of cancer is the highest in the world. The 2020 cancer report estimates 19.3 million new cancer cases and 10.0 million cancer-associated deaths.\(^1\) Owing to the increasing and ageing world population, the global cancer burden is expected to be 22.2 and 28.4 million new cases in 2030 and 2040, respectively, as depicted by the current trends.\(^1,2\) In recent years, great efforts have been made for cancer prevention, screening, early detection, standardized treatment and regular follow-up, however, the world still bears a large tumour burden due to the unclear pathogenesis of most tumours and the unavailability of potential biomarkers.\(^3\) It is crucial to extensively explore the pathogenesis of tumours and effective screening markers can be exploited as therapeutic targets.

Since the first case of severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2) infections occurred in December 2019, the number of global coronavirus disease (COVID-19) cases is still steadily increasing. As of 1 November 2021, the global COVID-19 pandemic has led to 246,929,884 confirmed cases and 5,003,404 deaths over 188 countries/regions across the world.\(^6\) Clear evidence exists that patients with co-morbidities are more susceptible to the COVID-19, and are more likely to manifest complications and mortality after infection.\(^5,6\) During the epidemic period, due to ageing, decreased immunity, delay in diagnosis, treatment and follow-up, surgery, radiotherapy and chemotherapy and tumour-related multiple co-morbidities, cancer has been identified as an individual risk factor for COVID-19.\(^6–9\) A cohort study from China showed that the overall prevalence of COVID-19 in cancer patients was considerably elevated than the overall incidence in the general population (1% vs. 0.29%).\(^10,11\) In addition, various studies have reported that cancer patients are more likely to have serious clinical outcomes after suffering from COVID-19.\(^7,10,12–14\) This might provide a clue that pays attention to the internal relationship between tumour and COVID-19, which can lead to the preventing as well as controlling of COVID-19 in cancer patients.

Transmembrane Serine Protease 2 (TMPRSS2) is a multifunctional encoding gene and is considered one of the members of the serine protease family. TMPRSS2 contains four domains, that is, protease domain, type II transmembrane domain, receptor class A domain and

\begin{figure}[h]
\centering
\includegraphics[width=\textwidth]{figure1.png}
\caption{Expression pattern of TMPRSS2 mRNA in many cancers by Oncomine, UALCAN and GEPIA databases. (A) The expression pattern of TMPRSS2 mRNA in various cancers was searched in the Oncomine database. The underlined graphic was generated from the Oncomine database, revealing the number of datasets \((p < 0.01)\) mRNA over (red) or under expression (blue) of TMPRSS2 (tumour tissue vs. corresponding normal tissue). The threshold was considered with the underlined parameters: \(p\) and fold-change were equal to 0.001 and 1.5, respectively, and the data type was mRNA. (B) The expression of TMPRSS2 mRNA in many cancers was searched in the UALCAN database. Boxes represent the median and the 25th and 75th percentiles; green and red boxes indicate normal and tumour tissues respectively. (C) The expression level of TMPRSS2 mRNA in many cancers was searched in the TIMER database. Boxes indicate the median and the 25th and 75th percentiles; blue and red boxes indicate normal and tumour tissues respectively. Blue and red dashed lines indicate the average value of normal and tumour tissues respectively. \(p = 0.05, **p = 0.01, ***p = 0.001\) }\end{figure}
scavenger receptor cysteine-rich domain.\textsuperscript{15} Among them, the serine protease domain of the underlined protease cleaves, followed by secretion into the cell culture medium after being autocleavage. Thus, it participates in viruses in host cell processes.\textsuperscript{15,16} TMPRSS2 has been reported for its contribution to the process of human influenza viruses, coronaviruses including SARS-CoV, SARS-CoV-2, Middle East respiratory syndrome coronavirus (MERS-CoV) and human coronavirus 229E (HCoV-229E) and entering host cells.\textsuperscript{17,18} Currently, modulating the expression or activity of TMPRSS2 is considered a potential intervention against human influenza viruses and coronaviruses including COVID-19.\textsuperscript{19} On the other hand, multiple studies revealed that the expression of TMPRSS2 was found to be considerably down-regulated in tumour tissues compared to non-tumorous ones, and abnormal expression of TMPRSS2 was closely related to tumour growth, invasion, metastasis and prognosis in various cancers, especially prostate cancer.\textsuperscript{19,20} More importantly, the Inhibition of TMPRSS2 expression can reduce prostate or head and neck cancer cell invasion and metastasis, and reduce human lung Calu-3 cells infection with SARS-CoV-2.\textsuperscript{21,22} In addition, the TMPRSS2 knockout mouse model in the cancer study showed that TMPRSS2 inhibition is safe and effective for molecular therapy of tumours with few off-target side effects.\textsuperscript{23} Therefore, a systematic and in-depth investigation of the function of TMPRSS2 in multiple tumours and COVID-19 could pave the way for precision medicine and TMPRSS2-targeted strategies.

Herein, to investigate the potential relationship between tumours and COVID-19, and assess the expression level of TMPRSS2 and its prognostic value in different carcinomas, we systematically studied the expression of TMPRSS2 and its medical consequences in different types of carcinomas while employing multiple recognized online network databases. Furthermore, we examined the co-altered genes with TMPRSS2 for common cancer types and performed functional enrichment analysis. Therefore, the analyses may provide the potential value of TMPRSS2 expression for the survival of patients associated with cancer, and give potential direction to prevent COVID-19 pandemic for specific tumour patients.

2 | MATERIALS AND METHODS

2.1 | Analyses of Oncomine dataset

In this study, a public web-based microarray database Oncomine (www.oncomine.org) was employed for the analysis of the TMPRSS2 transcription levels in cancerous specimens followed by
FIGURE 3  Legend on next page
comparing the obtained results with the healthy specimens (controls). The thresholds were restricted in the following manner: fold-change = 1.5; p = 0.001; data type: mRNA.

2.2 Analysis of GEPIA dataset

Gene Expression Profiling Interactive Analysis (GEPIA) (http://gepia.cancer-pku.cn) offers significant interactive and customizable tasks, such as profile plotting, differential expression analysis, correlation analysis, estimating RNA sequencing expression data based on 8587 healthy and 9736 cancer samples in Genotype–Tissue Expression (GTEx) and TCGA projects. We used GEPIA to verify the differences in TMPRSS2 gene expression in both healthy and different types of cancer tissues. In addition, profile plotting based on cancer pathological stage or type of cancer, survival rate of patient, similar gene detection, correlation analyses and dimensionality reduction analysis can be carried out via the GEPIA dataset.

2.3 UALCAN database analysis

UALCAN (http://ualcan.path.uab.edu/index.html) is a user-friendly integrated data-mining platform and is used for the extensive analysis of data obtained from cancer OMICS. It is built on PERL-CGI and can also be employed for gene expression analysis, methylation of promoter, prognosis and correlation. In this study, the UALCAN database was employed for analysing the expression pattern and promoter methylation profiling of TMPRSS2 mRNA.

2.4 cBioPortal dataset and muTarget database analysis

TCGA (cancergenome.nih.gov/) is a comprehensive database, which has both sequencing and pathological data of 30 various forms of carcinomas. For cancer genomics, cBioPortal (http://www.cbioportal.org/) is an open-access platform, which can be utilized for the multi-functional visualization of complex cancer genomics,
integrative analysis and clinical profiling.\textsuperscript{27} We employed cBioPortal to evaluate the TMPRSS2 alterations frequency, mRNA expression z-scores (RNA Seq V2 RSEM) and copy number variance via subtypes of each carcinoma from the TCGA PanCanAtlas dataset. To further clarify the relationship between TMPRSS2 gene mutation and protein expression, we used the muTarget database (https://www.mutarget.com/) to analyse the effect of TMPRSS2 gene mutation on protein expression levels in different tumour types. The cut-off p-value was regarded as <0.01.\textsuperscript{28}

2.5 | TIMER analysis

TIMER (https://cistrome.shinyapps.io/timer/) database was employed to validate the TMPRSS2 expression level in different forms of carcinomas,\textsuperscript{29} followed by estimating the Spearman’s correlation analysis between the TMPRSS2 expression levels and six immune infiltrates, such as CD8+ T cells, CD4+ T cells, B cells, macrophages, dendritic cells (DCs) and neutrophils obtained from four common carcinomas. The expression scatter plots were formed between a pair of user-defined genes in a given cancer type by using a correlation module, followed by revealing the level of gene expression via log2 RSEM.

2.6 | PrognoScan database analysis

An online database PrognoScan (http://dna00.bio.kyutech.ac.jp/PrognoScan/) provides a platform to assess effective tumour biomarkers and their significant therapeutic targets.\textsuperscript{30} PrognoScan

\textbf{FIGURE 5} Interaction and co-occurrence functional protein partners of TMPRSS2. (A) Expected functional partners of TMPRSS2 generated from GeneMANIA. Circles displayed depicting nodes. Predicted functional partners are indicated post observing co-localization, co-expression, genetic and physical interactions, cascades and shared protein domains (predicted). (B) Predicted functional partners of TMPRSS2 generated from STRING. Circles revealed indicating nodes. Predicted functional partners are indicating post considering physical and functional associations. (C) The alteration frequency of 27 partners gene signature using cBioPortal web. The highest alteration frequency was observed in lung squamous carcinoma (>30%). Green depicts the mutations in alteration frequency, while violet, red, deep blue and grey colours depict fusions, amplifications, deep deletions and multiple alterations respectively. (D) The enrichment analysis of 27 partners gene signature. The obtained results revealed that the underlined genes are largely enriched in PID AR TF and PID HNF3A pathways, transcriptional misregulation in cancer, regulation of hormone levels, signalling by nuclear receptors, regulation of growth and positive regulation of hydrolase activity (p < 0.05)
was employed for exploring the correlation between the TMPRSS2 expression and survival rate of patients in different carcinomas. According to the obtained results, the threshold was found to be Cox \( p < 0.05 \).

2.7 | The Kaplan–Meier plotter analysis

A web-based online database Kaplan–Meier plotter (www.kmplot.com) is used to study prognostic implications of genes in various forms of carcinoma. The underlined database comprised data, associated with the rate of survival and gene expression in 7461 samples, obtained from 21 different types of tumour.\(^{31}\) We employed this database for the validation of the \( \text{TMPRSS2} \) prognostic value in different types of cancers, with an HR with 95% CI and log-rank \( p \)-value.

2.8 | Protein–Protein interaction analysis

An online interface GeneMANIA (https://genemania.org/) is a user-friendly data mining platform. It can be used for the generation of genes correlated to a set of input genes, based on protein and genetic interactions, pathways, co-localization, co-expression and protein domain similarity.\(^{32}\) STRING (https://string-db.org/) is associated with protein–protein interactions.\(^{33}\) Herein, we employed both the GeneMANIA and STRING servers to explore the related genes of \( \text{TMPRSS2} \).

2.9 | Co-expressed and pathway analysis

The R2: Genomics Analysis and Visualization Platform-V-3.2.0 (https://hgserver1.amc.nl/) was employed for the integrative analysis of the positively and negatively co-expressed genes of

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**FIGURE 6** Association between the expression level of \( \text{TMPRSS2} \) and prognosis in four common kinds of cancers, that is, lung, breast, ovarian and colorectal cancer by PrognoScan database. The survival curve comparing patients with an elevated (red) and reduced (blue) expression in the breast (A), colorectal (B), lung (C) and ovarian cancer (D) that were retrieved from the PrognoScan database. Survival curve analysis was carried out by threshold Cox \( p < 0.05 \). The dotted lines indicate maximum and minimum values of the survival average.
| Dataset      | Cancer type | Endpoint | Cohort              | Contributor     | Probe ID       | N    | Cox p       | Ln (HR)   | HR (95% CI) |
|--------------|-------------|----------|---------------------|-----------------|----------------|------|-------------|------------|-------------|
| GSE31210     | Lung cancer | RFS      | NCCRI               | Okayama         | 1570433_at     | 204  | 8.8048E-07  | -0.525474 | 0.59 (0.48–0.73) |
| GSE31210     | Lung cancer | OS       | NCCRI               | Okayama         | 1570433_at     | 204  | 0.000115681 | -0.551071 | 0.58 (0.44–0.76) |
| GSE31210     | Lung cancer | RFS      | NCCRI               | Okayama         | 205102_at      | 204  | 0.000358629 | -0.527135 | 0.59 (0.44–0.79) |
| DUKE-OC      | Ovarian cancer | OS | Duke    | Bild             | 205102_at      | 133  | 0.00473586  | 1.68887   | 5.41 (1.68–17.48) |
| GSE31210     | Lung cancer | OS       | NCCRI               | Okayama         | 205102_at      | 204  | 0.00581929  | -0.520625 | 0.59 (0.41–0.86) |
| GSE13213     | Lung cancer | OS       | Nagoya              | Tomida          | A_23_P29067    | 117  | 0.00614575  | -0.3926   | 0.68 (0.51–0.89) |
| GSE31210     | Lung cancer | RFS      | NCCRI               | Okayama         | 226553_at      | 204  | 0.0070726   | -0.267109 | 0.77 (0.63–0.93) |
| GSE9893      | Breast cancer | OS | Montpellier, Bordeaux, Turin | Chanrion        | 13277          | 155  | 0.0108505   | 0.388917  | 1.48 (1.09–1.99) |
| GSE17536     | Colorectal cancer | OS | MCC                 | Smith           | 205102_at      | 177  | 0.0109941   | -0.945643 | 0.39 (0.19–0.81) |
| GSE7390      | Breast cancer | RFS | Uppsala, Oxford, Stockholm, IGR, GUYT, CRH | Desmedt        | 205102_at      | 198  | 0.0111074   | 0.255479  | 1.29 (1.06–1.57) |
| GSE9891      | Ovarian cancer | OS | AOCS, RH, WH, NKI-AVL | Tothill         | 205102_at      | 278  | 0.0123117   | -1.00512  | 0.37 (0.17–0.80) |
| GSE14333     | Colorectal cancer | DFS | Melbourne           | Jorissen        | 226553_at      | 226  | 0.0131981   | -0.240839 | 0.79 (0.65–0.95) |
| Jacob-00182-UM | Lung cancer | OS | UM                 | Shedden         | 211689_s_at    | 178  | 0.0143181   | -0.262144 | 0.77 (0.62–0.95) |
| GSE30929     | Soft tissue cancer | DRFS | MSKCC (1993–2008) | Gobble          | 205102_at      | 140  | 0.0166028   | -2.50239  | 0.08 (0.01–0.63) |
| GSE6532-GPL570 | Breast cancer | RFS | GUYT               | Loi             | 1570433_at     | 87   | 0.0189748   | 2.63604   | 13.96 (1.54–126.26) |
| GSE6532-GPL570 | Breast cancer | DMFS | GUYT                | Loi             | 1570433_at     | 87   | 0.0189748   | 2.63604   | 13.96 (1.54–126.26) |
| GSE26712     | Ovarian cancer | DFS | MSKCC               | Bonome          | 211689_s_at    | 185  | 0.0255409   | 0.573233  | 1.77 (1.07–2.93) |
| GSE4412-GPL96 | Brain cancer | OS | UCLA               | Freije          | 211689_s_at    | 74   | 0.0271724   | 0.46614   | 1.59 (1.05–2.41) |
| GSE14333     | Colorectal cancer | DFS | Melbourne           | Jorissen        | 1570433_at     | 226  | 0.0276288   | -0.274568 | 0.76 (0.60–0.97) |
| GSE17536     | Colorectal cancer | DSS | MCC                 | Smith           | 205102_at      | 177  | 0.0300716   | -0.926539 | 0.40 (0.17–0.91) |
| GSE2658      | Blood cancer | DSS | Arkansas            | Zhan            | 211689_s_at    | 559  | 0.0317345   | -0.416225 | 0.66 (0.45–0.96) |
| GSE4412-GPL97 | Brain cancer | OS | UCLA               | Freije          | 226553_at      | 74   | 0.0361025   | 1.22568   | 3.41 (1.08–10.72) |
| Jacob-00182-UM | Lung cancer | OS | MSK               | Shedden         | 205102_at      | 104  | 0.0362315   | -1.0361   | 0.35 (0.13–0.94) |
| GSE26712     | Ovarian cancer | OS | MSKCC               | Bonome          | 211689_s_at    | 185  | 0.0395535   | 0.574689  | 1.78 (1.03–3.07) |
| Jacob-00182-HLM | Lung cancer | OS | HLM                | Shedden         | 211689_s_at    | 79   | 0.0419985   | -0.290393 | 0.75 (0.57–0.99) |
| GSE4573      | Lung cancer | OS | Michigan           | Raponi          | 211689_s_at    | 129  | 0.0421505   | -0.181691 | 0.83 (0.70–0.99) |
| GSE12276     | Breast cancer | RFS | EMC             | Bos             | 211689_s_at    | 204  | 0.0479541   | 0.9062522 | 1.10 (1.00–1.21) |

Abbreviations: 95% CI, confidence interval; DFS, disease-free survival; DMFS, distant metastasis-free survival; DRFS, distant recurrence-free survival; DSS, disease-specific survival; HR, hazard rate; OS, overall survival; RFS, relapse-free survival.
**3 | RESULTS**

**3.1 | The expression level of TMPRSS2 in many cancers**

Databases including Oncomine and TCGA were employed for the evaluation of TMPRSS2 differential expression patterns in many kinds of cancer by UALCAN and GEPIA. The results obtained from the Oncomine database indicated that relative to normal tissues, the expression level of TMPRSS2 was reduced in many tumour tissues and cancers including breast, bladder, gastric, colorectal, lung, kidney, prostate, ovarian and sarcoma cancer. There is only one dataset study that shows an elevated expression of TMPRSS2 in breast, kidney and liver cancer, respectively, as depicted in Figure 1A. The UALCAN, TIMER and GEPIA were used to further explore the TMPRSS2 expression in various cancers. The results of the UALCAN and TIMER databases indicated that the expression of TMPRSS2 was decreased in many kinds of cancer, that is, colon adenocarcinoma (COAD), head and neck squamous cell carcinoma (HNSC), breast invasive carcinoma (BRCA), kidney renal papillary cell carcinoma (KIRP), oesophageal cancer (ESCA), lung adenocarcinoma (LUAD), kidney renal clear cell carcinoma (KIRC), rectum adenocarcinoma (READ), liver hepatocellular carcinoma (LIHC), sarcoma (SAEC), lung squamous cell carcinoma (LUSC), thyroid carcinoma (THCA), skin cutaneous melanoma (SKCM), stomach adenocarcinoma (STAD) and thymoma (THYM). However, elevated expression of TMPRSS2 was reported in bladder urothelial carcinoma (BLCA), cervical squamous cell carcinoma and endocervical adenocarcinoma (CESC), cholangiocarcinoma (CHOL), glioblastoma multiforme (GBM), kidney chromophobe (KICH), pancreatic adenocarcinoma (PAAD), prostate adenocarcinoma (PRAD) and uterine corpus endometrial carcinoma (UCEC; Figure 1B,C, Figure S1). The results of the GEPIA database are similar to the results of Oncomine, suggesting that the expression of TMPRSS2 was considerably reduced in COAD, KICH, BRCA, HNSC, KIRP, LUAD, KIRC, LUSC and LIHC tumour tissues, however, TMPRSS2 expression was considerably elevated in the UCEC, as depicted in Figure S2.

**3.2 | TMPRSS2 promoter methylation in many cancers**

Due to the lower expression of TMPRSS2 in a variety of tumour tissues, we evaluated the gene promoter of TMPRSS2. UALCAN database was used to verify the level of methylation of TMPRSS2 promoter in various cancers. The results of the UALCAN database showed that the methylation levels of TMPRSS2 promoter in BRCA, CESC, ESCA, HNSC, KIRC, KIRP and UCEC were considerably elevated relative to that in normal tissue, as depicted in Figure 2. In contrast, the methylation levels of TMPRSS2 promoter in COAD, PRAD, READ and testicular germ cell tumours (TGCT) were relatively decreased than those in normal tissue. TMPRSS2 promoter methylation level was negatively correlated with gene expression level, it is indicated that TMPRSS2 promoter hypermethylation in various cancers may trigger itself and elevates its level accordingly.

**3.3 | TMPRSS2 genetic variation in various cancers**

The gene mutations of TMPRSS2 were explored in 32 common types of the tumour by the TCGA PanCancer Atlas database, mainly including mutation and copy number mutation. As showed in Figure 3, TMPRSS2 was only altered in 371 (3%) of 10,953 queried patients and 371 (3%) of 10,967 queried samples. Total 329 mutations were present within amino acids 1 to 492aa of TMPRSS2. Among them, there are 7 missense mutation sites, 19 truncating sites, 11 inframe mutation sites and 242 fusion mutation sites respectively. Mutation sites were located in a hotspot in SRCR_2 domain and trypsin domains. Among the 32 datasets, the percentage of TMPRSS2 alteration frequency varied from 0% to 42.7% in various cancers. The highest alteration frequency was found in prostate cancer (42.7%), whereas other types of tumours exhibited very low mutation alteration (<10%) among all of the query cancer samples. In addition, our research found that the gene mutation of TMPRSS2 cannot cause changes in its own expression, but it can lead to the differential expression of multiple genes in melanoma and uterine cancer. The most significant differences in melanoma are NOMO1, PIGT, VKORC1, PDIAS and DDX11, and the most significant differences in uterine cancer are CTU2, EMCB, TUBG1, CLP1 and LONP1. The details are shown in Figure 4. The mutation frequency of the TMPRSS2 gene is not high in most tumour types, suggesting that the mutation of the TMPRSS2 gene itself may have little effect on the TMPRSS2 gene function.

**3.4 | TMPRSS2 gene and protein partners in various cancers**

GeneMANIA web was used for the prediction of the functionally similar genes including TMPRSS2, which accumulates data on co-localization, co-expression, genetic interactions, involved cascades, prediction of physical interactions and shared protein domains, as depicted in Figure 5A. The predicted functionally similar genes of TMPRSS2 were KDM3A, POU2F1, SLC37A1, Ctrfl116, SLC44A4, RASEF, TRPM4, ACPP, KLK4, KLK3, KLK2, PDE9A, CX3CL1, NGF, EMX2, AR, ALDOB, RBM47, KCNK5 and SLC45A3. At the same time,
the protein–protein interaction network of the TMPRSS2 was predicted by the STRING database (Figure 5C). It was found that 11 proteins interacted with TMPRSS2 proteins. The predicted protein partners of TMPRSS2 were FKBP5, AR, NKX3-1, TMPRSS4, ETV1, ERG, SLC45A3, PTEN, ETV4, and FAM3B. Hence, 27 predicted genes and proteins associated with TMPRSS2 might have a role in regulating cancer development (mediated by TMPRSS2) and prognosis.

The mutations and copy number alterations (CNAs) were analysed in the 27 predicted–associated genes of TMPRSS2 via the cBioPortal database. There was an alteration in queried genes of 3225 (38%) out of 10,953 queried patients. The highest alteration frequency was observed in lung squamous carcinoma (>30%), while the lowest alteration (<10%) was observed in colorectal cancer among all of the query cancer samples, as depicted in Figure 5B. Enrichment analysis revealed that the underlined genes were commonly enriched in PID AR TF and PID HNF3A pathways, transcriptional misregulation in cancer, regulation of hormone levels, signalling by nuclear receptors, regulation of growth and positive regulation of hydrolase activity, as depicted in Figure 5D.

3.5 | Prognostic analysis of TMPRSS2 in many cancers

We explored the prognostic value of TMPRSS2 mRNA expression in many types of cancers by PrognoScan and Kaplan–Meier plotter databases. The PrognoScan database results revealed that the TMPRSS2 expression level was considerably linked with the prognosis of brain, blood, colorectal, breast, ovarian, lung and soft tissue cancer. In breast cancer, GSE9893, GSE7390, GSE12276 and GSE6532 datasets revealed that the patients with up-regulated TMPRSS2 expression had significantly poor overall survival (OS), relapse-free survival (RFS) and distant metastasis-free survival (DMFS) compared to patients with lower TMPRSS2 expression (Figure 6A and 6B).
Table 1). The opposing results were found in colorectal cancer datasets. The GSE17536, GSE14333 and GSE17536 datasets revealed that the patient’s group with an elevated level of TMPRSS2 mRNA expression had significantly better OS and disease-free survival (DFS) than the low expression group (Figure 6B and Table 1). Analysis of GSE31210 and GSE13213 datasets of PrognoScan revealed considerably poor OS and RFS of lung cancer patients in the down-regulated TMPRSS2 mRNA expression group relative to their elevated expression counterparts (Figure 6C and Table 1). High OS and DFS ratio were shown in the low expression group (Figures 6 and 7 and Table 2). In addition, the Kaplan–Meier plot indicated that reduced expression of TMPRSS2 has been linked with poor RFS prognosis in liver hepatocellular carcinoma, ovarian cancer, pheochromocytoma, stomach adenocarcinoma, paraganglioma, testicular germ cell tumour and uterine corpus endometrial carcinoma (Figure S3 and Table 2).

Table 2 Confirmation of the relationship between TMPRSS2 expression and prognosis in various cancer patients (Kaplan–Meier plotter (Kaplan–Meier plotter database))

| Cancer Type                          | n  | OS   |         | PFS   |         |
|--------------------------------------|----|------|---------|-------|---------|
|                                      |    | HR   | 95% CI  | HR    | 95% CI  |
| Bladder carcinoma                    | 405| 0.0297| 0.72   | 0.54-0.97 | 0.0895 | 0.55 | 0.27-1.11 |
| Breast cancer                        | 1090| 0.0047| 1.59   | 1.15-2.19 | 0.1543 | 0.73 | 0.48-1.13 |
| Cervical squamous cell carcinoma     | 304| 0.4036| 0.82   | 0.51-1.32 | 0.155 | 1.75 | 0.80-3.81 |
| Oesophageal adenocarcinoma           | 80 | 0.3012| 0.7    | 0.36-1.37 | 0.0826 | 0.21 | 0.03-1.48 |
| Oesophageal squamous cell carcinoma  | 81 | 0.2081| 0.6    | 0.27-1.34 | 0.1914 | 0.44 | 0.13-1.55 |
| Head–neck squamous cell carcinoma    | 500| 0.0098| 0.67   | 0.49-0.91 | 0.263 | 0.65 | 0.31-1.38 |
| Kidney renal clear cell carcinoma    | 530| 0.2005| 1.23   | 0.90-1.67 | 0.0902 | 0.42 | 0.15-1.18 |
| Kidney renal papillary cell carcinoma| 288| 0.0188| 0.49   | 0.27-0.90 | 0.1444 | 1.75 | 0.82-3.74 |
| Liver hepatocellular carcinoma       | 371| 0.0321| 0.67   | 0.46-0.97 | 0.0144 | 0.65 | 0.46-0.92 |
| Lung adenocarcinoma                  | 513| 0.0002| 0.58   | 0.44-0.78 | 0.2405 | 0.78 | 0.51-1.18 |
| Lung squamous cell carcinoma         | 501| 0.2355| 1.18   | 0.9-1.55  | 0.4403 | 0.82 | 0.50-1.36 |
| Ovarian cancer                       | 374| 0.0118| 1.48   | 1.09-2.02 | 0.022 | 0.65 | 0.44-0.94 |
| Pancreatic ductal adenocarcinoma     | 177| 0.1197| 1.52   | 0.89-2.59 | 0.1001 | 2.28 | 0.83-6.25 |
| Pheochromocytoma and paraganglioma  | 178| 0.28   | 2.56   | 0.44-14.88 | 0.0503 | 0   | 0-Inf |
| Rectum adenocarcinoma                | 165| 0.0433| 2.2    | 1-4.84   | 0.4488 | 0.54 | 0.1-2.75 |
| Sarcoma                              | 259| 0.0051| 1.8    | 1.19-2.73 | 0.3045 | 1.32 | 0.78-2.23 |
| Stomach adenocarcinoma               | 375| 0.0218| 0.66   | 0.47-0.94 | 0.0422 | 0.51 | 0.27-0.99 |
| Testicular germ cell tumour          | 134| 0.168 | 4.33   | 0.45-42.02 | 0.0167 | 3.91 | 1.17-13.02 |
| Thymoma                              | 119| 0.0246| 0.18   | 0.03-0.93 | -       | -    | -    |
| Thyroid carcinoma                    | 502| 0.155 | 2.42   | 0.69-8.51 | 0.1234 | 0.55 | 0.25-1.19 |
| Uterine corpus endometrial carcinoma| 543| 0.0002| 0.46   | 0.31-0.70 | 0.0503 | 0.59 | 0.35-1.01 |

Abbreviations: 95% CI, confidence interval; HR, hazard rate; OS, overall survival; PFS, progression-free survival.

3.6 The expression of TMPRSS2 was associated with the immune infiltration in many carcinomas

Due to the abnormal expression and prognostic value of TMPRSS2 in the lung, ovarian, breast and colorectal cancer, the underlined particular types of cancer were chosen to further identify that whether the expression level of TMPRSS2 was associated with the level of immune infiltration via TIMER databases. The obtained results indicated that the expression level of TMPRSS2 has a considerable association with tumour purity, neutrophils, CD8+ T cell and dendritic cell in BRCA; CD4+ T cell, B cell, DCs and neutrophils in COAD; B cell, macrophages, CD4+ T cell and dendritic cell in LUAD; and tumour purity and dendritic cell in OV respectively (Figure 8).
3.7 | The association of differentially expressed genes with the expression of TMPRSS2 in many cancers

We further explored the potential signalling mechanism and pathway linked with TMPRSS2 in four common types of cancers (breast, lung, colorectal and ovarian) through the R2 platform and Reactome tool. The results revealed that 160 differentially expressed genes (DEGs) were found in four selected cancers derived from the Venn diagram, as depicted in Figure 9A. The Reactome diseases analysis revealed that these 160 co-expressed differential genes are considerably associated with the occurrence as well as the development of diseases including cell cycle monitoring, cell death, DNA repair, immune response, stress response and infection (Figure 9B). In terms of infectious diseases, their participation in respiratory infections, such as influenza, SARS-CoV, tuberculosis and HCMV was particularly gaining attention (Figure 9C). In addition, the Reactome pathway analysis indicated that particularly associated genes were classified in FGFR3 point mutants, constitutive signalling by aberrant PI3K, PI3K/AKT, NOTCH1 PEST domain mutants, NOTCH1, FGFR3 fusions, NOTCH1 HD + PEST domain mutants and ERBB2 in cancer, as depicted in Figure 9D.

4 | DISCUSSION

As the number of confirmed and death cases caused by COVID-19 far exceeds any viral infection in the past, it has become a global pandemic and public health emergency of international concern. Epidemiological studies have shown that the population is generally susceptible to COVID-19, but people with a low immune function, such as patients with cancer, diabetes, hypertension, autoimmune diseases, chronic obstructive pulmonary disease, organ transplants receiving anti-immune therapy, the elderly and pregnant women are more susceptible to infection. The death rate of cancer patients infected with COVID-19 is as high as 5.6%. The death rate of cancer patients infected with COVID-19 is as high as 5.6%. Current efforts have been directed towards studying the early screening, isolation measures and treatment of COVID-19, but the relationship and mechanism between COVID-19 and cancer remain unclear.

Cumulative studies have reported that the process of SARS-CoV-2 entering the host alveolar epithelial cells is closely related to angiotensin-converting enzyme 2 (ACE2) and TMPRSS2. Among them, TMPRSS2 is a key molecular target that enhances the invading capacity of SARS-CoV-2, has been earmarked as candidate drug targets for interventions against the viral pathologies. Besides its role in COVID-19, TMPRSS2 considerably contributes to several physiological and pathological processes, included in tumour biology.
was worth noting that TMPRSS2 is not only closely associated with the occurrence and progression of prostate cancer, but also can be used as an attractive therapeutic target.\textsuperscript{20} It has been reported that TMPRSS2 has a key role in many kinds of cancers in vitro and in vivo including breast,\textsuperscript{38} colorectal,\textsuperscript{39} head and neck,\textsuperscript{22} ovarian,\textsuperscript{40} stomach and lung cancer.\textsuperscript{41} However, the expression and prognostic value of TMPRSS2 in many cancers have not been clearly defined. In this study, we evaluated the expression of TMPRSS2 that might be responsible for the COVID-19 condition in patients with different types of cancers. Analysis of datasets indicated that the expression level of TMPRSS2 was considerably reduced in many tumour tissues, relative to their normal counterparts, and the level of TMPRSS2 expression was considerably associated with the prognosis of the brain, blood, colorectal, breast, ovarian, lung and soft tissue cancer. Although a large number of studies on the TMPRSS2, ERG fusion gene are considered to be new biomarkers, therapeutic targets, diagnostic and prognostic indicators for prostate cancer, and two recent studies have used public databases to explore the expression pattern, prognostic value and immune infiltration of TMPRSS2 in prostate cancer, but these studies are limited to prostate cancer and cannot fully reflect all tumours.\textsuperscript{42,43} Unfortunately, neither of the PrognoScan and Kaplan–Meier plotter databases used in our research are involved prostate cancer data.\textsuperscript{44} In the future, we will further explore the difference between the TMPRSS2: ERG fusion gene and the TMPRSS2 gene through basic and clinical research, as well as the prognostic role in prostate cancer. Based on the above conclusions, we chose four common cancer types to further investigate the expression, promoter methylation, prognosis, mutation, protein–protein interaction analysis and immune infiltration levels of TMPRSS2.

In the case of breast cancer, our analysis showed that TMPRSS2 had significantly low expression and low mutation frequency in tumour tissues, but its promoter methylation level was significantly increased. In addition, multiple datasets showed that patients with up-regulated TMPRSS2 expression had significantly bad OS, RFS and DMFS in patients with most tumour types. The underlined results are in favour of the earlier results where Chi et al.\textsuperscript{38} revealed that dexmedetomidine may contribute to the regulation of the migration of breast cancer cells by up-regulation of TMPRSS2. Meanwhile, a recent study pointed out that lower expression of TMPRSS2 is a prognostic marker for OS and DFS in breast cancer.\textsuperscript{45} In colorectal cancer, the results of previous studies are similar to those of our study. For example, the study of Liu et al.\textsuperscript{39} found an elevated expression of TMPRSS2 in colorectal tumour and normal tissue samples, relative to other tumours, such as lung, oesophagus, stomach and liver; Bao et al.\textsuperscript{46} revealed that the TMPRSS2 expression was considerably
elevated in normal tissues than colorectal cancers using across several existing databases. As for lung cancer, one single nucleus and single-cell RNA sequencing study showed a strong expression level of TMPRSS2 in lung tissue and cells derived from subsegmental bronchial branches, and smoking may be susceptible to COVID-19 by affecting the expression of TMPRSS2. In addition, both our study and previous studies believed that TMPRSS2 as a cancer suppressor gene was significantly down-regulated in two types of tumour tissues of LUAD and LUSC, the expression of TMPRSS2 have an impact on the prognosis of lung cancer. As for ovarian cancer, Huang et al. observed the oncogenic gene fusion TMPRSS2: ERG has not been present in ovarian cancer. Therefore, ERG cannot be used as a potential diagnostic or prognostic indicator for ovarian cancer, unlike prostate cancer. Unfortunately, there is little known on the prognostic value and molecular mechanism of TMPRSS2 in ovarian cancer. In our analysis, we found that higher OS and DFS were indicated in the low TMPRSS2 expression group of ovarian cancer relative to the elevated expression group, based on DUKE-OC, GSE9891 and GSE26712 dataset, but the specific mechanism needs further verification and discussion in the future.

To better explore the internal connection of TMPRSS2, COVID-19 and tumour, we exploited GeneMANIA and STRING webserver to predict the functional protein partners of TMPRSS2. A total of 27 genes or proteins were determined as gene and protein partners of TMPRSS2, which might contribute to regulating the progression of carcinoma mediated by TMPRSS2 and its survival rate. Then, the mutations and CNAs were analysed in the 27 predicted protein-related coding genes of TMPRSS2 via the cBioPortal database, the results showed that these genes were altered in 38% (3225/10,953) queried cancer patients. Furthermore, the association between TMPRSS2 expression and the level of immune infiltration was also determined; our results indicated that an elevated level of TMPRSS2 was linked with infiltration of immune cells in BRCA, COAD, LUAD and OV. The underlined results showed similarity with the results of Luo et al., which revealed that elevated expression levels of TMPRSS2 mRNA were linked with an elevated immune infiltration in PRAD. Next, we evaluated the genes associated with TMPRSS2 in several types of cancer, that is, lung, breast, colorectal and ovarian cancer by using the R2 platform. Our analysis has shown that 160 co-expressed differential and positively correlated genes were found in the above four common cancers. According to the pathway analysis, these genes are significantly enriched in associated cascades including respiratory system infection and tumour progression, especially the multiple viral infection pathways and PI3K/AKT signalling pathways are worthy of attention.

5 | CONCLUSIONS

In our study, the expression, promoter methylation, genetic variation, protein partners, associated genes, immune infiltration and prognostic value of TMPRSS2 were systematically analysed in many kinds of cancer in humans. These results indicated that TMPRSS2 expression was decreased in many tumour tissues distinctly and was significantly related to the clinical outcomes in the brain, blood, colorectal, breast, lung, soft tissue and ovarian cancer. The multomics analysis also revealed the significance of TMPRSS2 expression and possible cascades associated with TMPRSS2 in several kinds of cancers (human) and progression of COVID-19. Hence, the underlined results may help to explore TMPRSS2 as an effective biomarker and therapeutic target for many kinds of cancer in humans, and also provide directions for the prevention of COVID-19 pandemic for particular tumour patients.
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SUPPORTING INFORMATION
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