Original Research

Novel Signaling Pathway and NSC689534 as a Potential Drug Candidate for Cutaneous Squamous Cell Carcinoma

Ying Miao¹,†, Cheng Shen²,‡, Xin Zhang¹, Qi-Qi Li³, A-Ying Pang¹, Wen-Min Zhao¹, Xiao-Yan Wu¹, Hong-Yan Qian⁴,*, Xiao-Dong Chen¹,∗

¹Department of Dermatology, Affiliated Hospital of Nantong University, Medical School of Nantong University, 226001 Nantong, Jiangsu, China
²Department of Computer Science and Engineering, Tandon School of Engineering, New York University, Brooklyn, NY 11201, USA
³Medical School of Nantong University, 226019 Nantong, Jiangsu, China
⁴Cancer Research Center Nantong, Nantong Tumor Hospital & Tumor Hospital Affiliated to Nantong University, 226361 Nantong, Jiangsu, China

*Correspondence: qhy672041647@163.com (Hong-Yan Qian); dermatochen@ntu.edu.cn (Xiao-Dong Chen)
†These authors contributed equally.

Abstract

Background: Cutaneous squamous cell carcinoma (cSCC) is the second most common malignancy of the skin, and its incidence is increasing annually. Once cSCC becomes metastatic, its associated mortality rate is much higher than that of cSCC in situ. However, the current treatments for progressive cSCC have several limitations. The aim of this study was to suggest a potential compound for future research that may benefit patients with cSCC. Methods: In this study, we screened the following differentially expressed genes from the Gene Expression Omnibus database: GSE42677, GSE45164, GSE66359, and GSE98767. Using strategies such as protein-protein interaction network analysis and the CYTOSCAPE plugin MCODE, key modules were identified and then verified by Western blotting. Subsequently, related signalling pathways were constituted in the SIGNOR database. Finally, molecular docking analyses and cell viability assay were used to identify a potential candidate drug and verify its growth inhibition ability to A431 cell line. Results: Fifty-one common differentially expressed genes were screened and two key modules were identified. Among them, three core genes were extracted, constituting two signalling pathways, both of which belong to the module associated with mitotic spindles and cell division. A pathway involving CDK1, the TPX2-KIF11 complex, and spindle organization was validated in a series of analyses, including analyses for overall survival, genetic alteration, and molecular structure. Molecular docking analyses identified the pyridine 2-carbaldehyde thiosemicarbazone (NSC689534), which interacts with TPX2 and KIF11, as a potential candidate for the treatment of cSCC. Conclusions: NSC689534 might be a candidate drug for cSCC targeting TPX2 and KIF11, which are hub genes in cSCC.

Keywords: computational biology; drug testing; molecular docking simulation; molecular structure; skin neoplasms

1. Introduction

Cutaneous squamous cell carcinoma (cSCC) is the second most common form of non-melanoma skin cancer and results from abnormal proliferation of keratinocytes from the epidermis or skin appendages [1,2]. It accounts for 20% of all skin malignancies [3], has an increasing incidence [4], and is expected to continue to increase in the future with the aging population. cSCC is a malignant tumor that can progress from actinic keratosis and cSCC in situ to invasive or metastatic cSCCs [5,6]. The majority of patients with primary cSCC, if treated early and appropriately, have an excellent prognosis with surgical excision and a 5-year cure rate of 90% [7]. However, a large single-center study of more than 900 patients with cSCC who were followed for approximately 10 years showed that the rates of recurrence, lymph node metastasis, and disease-related mortality were 4.6%, 3.7%, and 2.1%, respectively [8]. Factors, such as old age, male sex, immunosuppression, and lesions localized in the ear or lip, may increase the risk of recurrence and metastasis [9]. Once metastasis occurs, the prognosis is poor and there is a 70% mortality rate [10]. For the treatment of progressive cSCC, surgery in combination with radiotherapy is commonly applied in clinical practice. Obviously, there are limited options of treatment for progressive cSCC. For example, the choice of radiotherapy should take into account the lesion’s location, conventional chemotherapy led to limited therapeutic efficacy as well as high side effects [11], and the use of EGFR inhibitors in cSCC lacks evidence-based support because of unsatisfactory therapeutic outcomes [12]. To summarize, a better understanding of high-risk cSCC is necessary for the development of more effective treatments [13].

Based on previous basic research, cSCC frequently exhibits alterations in multiple important genes (e.g., TP53, CDKN2, and NOTCH1), as well as the activation of signaling pathways, such as the EGFR signaling pathway, RAS-Raf-MEK-ERK signaling, and PI3K/AKT/mTOR pathway [14]. Hence, the detection of hub genes and their involvement in signaling pathways is of great value in the investigation of therapeutic drugs for advanced cSCC.
Gene expression analysis using microarray datasets from the public Gene Expression Omnibus (GEO) database provides an efficient method for studying the differences in gene expression between different classified samples [15]. Molecular docking analysis can help predict and match potential small-molecule compounds by constructing binding models and evaluating the binding capacity through computer simulation of the interaction between small-molecule compounds (ligands) and target molecules (receptors) [16], thus, discovering and confirming new drugs.

In this study, we used datasets from the GEO database to screen for differentially expressed genes (DEGs) between cSCC and adjacent normal tissue. Then, we constructed a protein-protein interaction (PPI) network and used two modules to identify hub genes among them. Finally, three core genes (targeting protein for Xklp2 [TPX2], cyclin-dependent kinase [CDK]1, and kinesin family member [KIF]11) that interact with each other were identified using the BioCancerGenomicsPortal (cBioPortal). These genes may constitute a pathway that plays a role in mitosis and DNA repair. Based on this pathway, NC689534 was selected as a suitable small-molecule compound capable of acting on TPX2 and KIF11. Our results suggest that TPX2 and KIF11 could be therapeutic targets for cSCC, and NC689534 might be a potential candidate drug targeting TPX2 and KIF11.

2. Materials and Methods

2.1 Dataset Collection from the GEO Database and DEG Screening

Datasets containing samples of both cSCC and normal skin tissue were downloaded from the NCBI GEO database (https://www.ncbi.nlm.nih.gov/geo/). Four datasets based on the GPL571 platform, including GSE42677 (https://www.ncbi.nlm.nih.gov/geo/query/acc.cgi?acc=GSE42677), GSE45164 (https://www.ncbi.nlm.nih.gov/geo/query/acc.cgi?acc=GSE45164), GSE66359 (https://www.ncbi.nlm.nih.gov/geo/query/acc.cgi?acc=GSE66359), and GSE98767 (https://www.ncbi.nlm.nih.gov/geo/query/acc.cgi?acc=GSE98767), were finally selected for this study. After removing samples, in which systemic treatments, such as immunosuppression or chemotherapy, were used, a total of 46 cSCC samples and 27 healthy skin tissue samples were included in the subsequent analysis (Table 1). DEGs between the cSCC and control groups were identified in the downloaded data matrices using the R package Limma (version 3.40.6; R Software for Statistical Computing, Vienna, Austria). The screening criteria were set as follows: fold change (FC) >2 and p-value < 0.05. The results were visualized using volcano plots and heat maps. The Venn diagram was drawn using an online Draw Venn Diagram tool (https://bioinformatics.psb.ugent.be/webtools/Venn/).

### Table 1. Microarray datasets of patients with cutaneous squamous cell carcinoma.

<table>
<thead>
<tr>
<th>Accession No.</th>
<th>No. of cases</th>
<th>Normal</th>
<th>Cancer</th>
</tr>
</thead>
<tbody>
<tr>
<td>GSE42677</td>
<td>10</td>
<td>10</td>
<td></td>
</tr>
<tr>
<td>GSE45164</td>
<td>3</td>
<td>10</td>
<td></td>
</tr>
<tr>
<td>GSE66359</td>
<td>5</td>
<td>8</td>
<td></td>
</tr>
<tr>
<td>GSE98767</td>
<td>9</td>
<td>18</td>
<td></td>
</tr>
</tbody>
</table>

2.2 Functional Enrichment Analysis

Gene Ontology (GO) functional enrichment analysis, pathway enrichment analysis (including the Kyoto Encyclopedia of Genes and Genomes, Reactome Gene Sets, and WikiPathways), and disease enrichment analysis based on the DisGeNET database were used, and data were plotted as bar graphs using METASCAPE (https://metascape.org/gp/). A threshold of the enrichment number of genes ≥3 and a p-value < 0.01 were selected.

2.3 Establishment of the PPI Network and Identification of its Key Modules

Interactions between the DEG-encoded proteins were analytically mapped using STRING 12.0 (https://www.string-db.org/) with a threshold of a combined score >0.4 (i.e., medium confidence level). The obtained protein-protein interaction network was analyzed using MCODE, a CYTOSCAPE plugin (https://apps.cytoscape.org/apps/mcode) for the acquisition of functionally relevant key modules with a degree cut-off >2, node score cut-off >0.2, k-score of 2, and maximum depth of 100. The resulting module genes were verified by another plug-in, CYTOHUBBA (https://apps.cytoscape.org/apps/cytohubba), utilizing the Matthews Correlation Coefficient (MCC) algorithm.

2.4 Construction of Signaling Pathways

The SIGnaling Network Open Resource (SIGNOR3.0), a repository of manually annotated causal relationships between human proteins, biologically relevant chemicals, stimuli, and phenotypes, provides advanced graphical tools to explore human cellular networks. By searching the hub genes in the key modules using SIGNOR3.0 database (https://signor.uniroma2.it/), we created networks of potential signaling pathways. The causal relationships and mechanisms of how these proteins in the pathway act on the development of cSCC were further determined by searching the literature and analysing the molecular structure of functional domains obtained from the cBio Cancer Genomics Portal (cBioPortal).
2.5 Validation of Differential TPX2, KIF11, PTTG1, and CDKI Expression and Overall Survival Curves in Multi-Databases

The expression levels of TPX2, KIF11, CDKI, and pituitary tumor transforming gene (PTTG1) in squamous cell carcinoma of skin and other organs were validated using Gene Expression Profile Interaction Analysis (GEPIA; http://gepia.cancer-pku.cn/) based on The Cancer Genome Atlas (TCGA) dataset. Kaplan–Meier plots were generated online (http://kmplot.com/analysis/index.php?p=service&cancer=pancancer_rnaseq) to plot overall survival curves based on the expression of four core genes in head and neck squamous cell carcinoma (HNSC); the best cut-off value was selected automatically. The Human Protein Atlas (HPA) (https://www.proteinatlas.org/) provided immunohistochemical expression maps of protein expression patterns in eSCC and normal skin tissues.

2.6 Cancer Genome Exploration through cBioPortal

Genetic information, such as mutation rate, prognostic information, molecular structure and mutations, and post-translational modification sites for patients with eSCC were obtained from cBioPortal (https://www.cbioportal.org/). Samples were downloaded from two studies: Cutaneous Squamous Cell Carcinoma (MD Anderson, Clin Cancer Res 2014) and Cutaneous Squamous Cell Carcinoma (UCSF, NPJ Genome Med 2021).

2.7 Prediction of Small Molecule Compound-Gene Interaction and Molecular Docking Analysis

Small molecule compound-gene interaction analyses were based on the Comparative Toxicogenomics Database (CTD) (downloaded in November 2016), and the network was visualized using the NetworkAnalyst website (https://www.networkanalyst.ca/).

The SDF format of NSC689534 was downloaded from the PubChem database, subsequently imported into ChemDraw 3D for energy minimization using the MM2 module to obtain the lowest energy advantage concept, and then saved as a mol2 file. Protein structures were downloaded from the UniProt database and visualized separately using the PyMOL Molecular Graphics System (Version 2.5, Schrödinger, LLC). Afterward, the ligands (NSC689534) and receptors (TPX2 and KIF11) were saved as pdbqt files using MGTTools (Version 1.5.6, Center for Computational Structural Biology, Scripps Research, USA) after processing for dehybridation, hydrogen addition, charge calculation, merging of non-polar hydrogens, and others. The ligands and receptors were docked using AutoDock Vina 1.1.2, [17,18] with the docking parameters shown in Table 2. Then, concepts with higher scores were visualized using PyMOL and Discovery Studio (BIOVIA, Dassault Systèmes, FR). Pharmacokinetics, drug-likeness, and medicinal chemical analyses of NSC689534 were performed using the SwissADME algorithm. We analyzed drug-likeness on the basis of the Lipinski (Pfizer Inc., New York, NY, USA) rule of five [19], whereas the Abbot bioavailability score and gastrointestinal absorption were used to estimate the oral bioavailability of the drug [20].

2.8 Cell Culture and Western Blotting

The A431 (National Collection of Authenticated Cell Cultures, Beijing, China) and HaCaT (Newgainbio, Wuxi, China) cells were grown in Dulbecco’s modified Eagle’s medium (SH30022.01, HyClone, Logan, UT, USA) supplemented with 10% fetal bovine serum (SH30074.03, HyClone) in 5% CO₂ at 37 °C. Cell lines were authenticated with Short Tandem Repeat profiling (MicroreaderTM21 ID System, Applied Biosystems®, Waltham, MA, USA). Mycoplasma test was performed in all cell lines every other week using the Mycoplasma Real-Time PCR Detection Kit (Cat. No.4460623, MycoSEQTM Applied Biosystems®, Warrington, Cheshire, UK).

Cells were washed twice in cold phosphate buffered saline and, then, lysed in radioimmunoprecipitation assay buffer for 30 min. After being boiled for 10 min, equal amounts of protein were separated via SDS-PAGE and transferred to polyvinylidene fluoride membranes. The membranes were blocked with 5% skim milk and 0.1% Tween 20 (P1379, Sigma-Aldrich, St Louis, MO, USA) in tris-buffered saline with Tween-20 (TBST) and were then incubated overnight at 4 °C with antibodies against KIF11 (23333-1-AP, Proteintech, Rosemond, IL, USA) and TPX2 (11741-1-AP, Proteintech) in 5% skim milk. After being washed, the membranes were incubated in secondary antibodies for 2 h. Protein bands were detected using an enhanced chemiluminescence system.

2.9 Cell Viability Assay

The anti-cancer ability of NSC689534 was assessed using A431 cell line. 15,000 cells/well were seeded in 96-well plates for 24 h, treated by relevant concentration (0, 0.25, 0.5, 0.75, 1, 2.5, 5, 7.5 µM) of NSC689534 (obtained from MedChemExpress, Monmouth Junction, NJ, USA) for 8 h or 24 h. The cells were then incubated with fresh complete media containing 10% cell counting kit-8 (CCK-8) reagent (C6005, NCM, Suzhou, CHN) for 2 h. The absorbance at 450 nm was measured with the microplate reader manufactured by Bio-Tek Instruments (Winooski, VT, USA). Every group was repeated 3 times.

### Table 2. Parameters for molecular docking analysis by AutoDock Vina 1.1.2.

<table>
<thead>
<tr>
<th></th>
<th>Center</th>
<th>Center_y</th>
<th>Center_z</th>
<th>Size_x</th>
<th>Size_y</th>
<th>Size_z</th>
<th>Exhaustiveness</th>
<th>Numb_modes</th>
<th>Energy_range</th>
</tr>
</thead>
<tbody>
<tr>
<td>5lxm</td>
<td>47.29</td>
<td>−8.97</td>
<td>13.98</td>
<td>20.0</td>
<td>20.0</td>
<td>20.0</td>
<td>8</td>
<td>9</td>
<td>3</td>
</tr>
<tr>
<td>9tlc</td>
<td>−19.12</td>
<td>−10.13</td>
<td>−10</td>
<td>20.0</td>
<td>20.0</td>
<td>20.0</td>
<td>8</td>
<td>9</td>
<td>3</td>
</tr>
</tbody>
</table>
Fig. 1. Identification of 51 differentially expressed genes (DEGs) from Four Datasets. (a–d) A total of 51 DEGs identified from four datasets. Differentially expressed genes between cutaneous squamous cell carcinoma (cSCC) and healthy tissue samples in the datasets GSE42677 (a), GSE45164 (b), GSE66359 (c), and GSE98767 (d). DEGs were screened based on FC > 2 and a corrected \( p \)-value < 0.05. Red data points in the volcano plot represent upregulated genes whereas blue points represent downregulated genes. (e) Venn diagram of common DEGs among the four datasets. cSCC, cutaneous squamous cell carcinoma; DEG, differentially expressed gene; FC, fold change.

2.10 RT-qPCR

RNAs were extracted from HaCaT and A431 cells with 1 mL TRIzol (Cat. No.10296010CN, TRIzol™ LS reagent, Carlsbad, CA, USA) per sample. cDNA synthesis and qPCR were performed using HiScript® III RT SuperMix for qPCR (R323, Vazyme, Nanjing, Jiangsu, China) and AceQ Universal SYBR qPCR Master Mix (Q511, Vazyme). GAPDH was tested for sample loading control. Primer (No.2514129018, Sangon, Shanghai, China) sequences were as follows: TPX2: TPX2-F GTCACCAAATCAGTTGACTTCC, TPX2-R AAGGATGCTTTCGTAGTTCAGA; KIF11: KIF11-F CATACTCTAGTCTTAGGACATC, KIF11-R CAAC-CAAGTTCAACTTTCCGAT; GADPH: GADPH-F CAGGGAGCATGCTGTAGATG, GAPDH-R GAAG-GCTGGGCTCTAT.

2.11 Statistical Analysis

Analyses and graphs were conducted with GraphPad Prism 9.4.1 (GraphPad Software, Inc., San Diego, CA, USA). One-way ANOVA was used for data analysis in western blotting while T-test in RT-qPCR. \( p < 0.05 \) was statistically significant.

3. Results

3.1 Identification of 51 DEGs from Four Datasets

We downloaded conforming microarray datasets from the NCBI GEO database (Table 1) and examined shared genes that were differentially expressed between cSCC and normal skin tissue in all datasets. All DEGs identified are shown as volcano plots (Fig. 1a–d). Based on the matrices of the GSE42677, GSE45164, GSE66359, and GSE98767 datasets, 3082, 1000, 1332, and 12327 DEGs, respectively, meeting the threshold of |FC| > 2 and \( p < 0.05 \) were screened. Of these, 51 DEGs were shared among the four datasets (Fig. 1e).

3.2 Association of the 51 Identified DEGs with Cornified Envelope Multi-Signaling Pathways Involved in cSCC and Dermatologic Diseases

The 51 DEGs were significantly enriched in squamous cell carcinoma of the skin, actinic keratosis, and other skin-related disorders (Fig. 2a). GO and Reactome Gene Set analysis showed enrichment in cornified envelope/formation of cornified envelope (Fig. 2b,c), indicating that the screened DEGs were closely related to skin diseases. Pathway enrichment analysis also demonstrated that these 51 genes were associated with a variety of squamous cell carcinoma-related signaling pathways, including
human papillomavirus infection, transforming growth factor beta signaling pathway, tyrosine kinase receptor signaling pathway, and regulation of the TP53-related pathway (Fig. 2c).

3.3 Further Analyses of the PPI Network and its Key Modules

The PPI network comprizing these 51 genes contained 28 nodes and 53 interactions (Fig. 3a), and their GO functional enrichment analysis was mainly related to peptide cross-linking, keratinization, epidermal cell differentiation, and skin development. Using the MCODE plug-in of CYTOSCAPE, two functionally relevant key modules were extracted from the PPI network (Fig. 3c,d). Module A contained eight genes and 23 edges, whereas module B contained five genes and 10 edges. Nearly all 13 hub genes were highly expressed in the four GEO datasets (Fig. 3b). Genes in Module A were enriched in keratinization, peptide cross-linking, and keratin-forming cell differentiation, while those in Module B were mostly associated with spindle organization and polarization, mitotic spindles, and the cell cycle. In addition, we found that the scores of the genes in both modules were ranked in the top 15 when they were validated using the MCC algorithm of CYTOHUBBA, another plug-in for hub gene extraction (Fig. 3c). These results confirmed the reliability of the extracted hub genes.
Fig. 3. The protein-protein interaction (PPI) network and its key modules extracted from the DEGs. (a) PPI network of DEGs using the STRING website. (b) Expression level of 13 hub genes in the four GEO datasets. A darker color represents a higher level of expression. (c,d) Key modules extracted by the MCODE plug-in with a degree cutoff >2, a node score cutoff >0.2, a k-score of 2, and maximum depth of 100. (e) Hub genes extracted using the MCC algorithm of CYTOHUBBA. A longer bar represents a higher score. DEG, differentially expressed gene; GEO, gene expression omnibus; PPI, protein-protein interaction.

3.4 Construction of Two Potential Signaling Pathways Composed of Hub Genes from Key Modules

Utilizing the information of the SIGNOR3.0 database, an open-source signaling network that manually stores annotated causal relationships between human proteins, biologically relevant chemicals, stimuli, and phenotypes, TPX2, KIF11, PTTG1, and another non-modular gene, CDK1, were extracted from 13 hub genes, forming two possible signaling pathways (Fig. 4).

One of them comprised the CDK1, PTTG1, and mitogen-activated protein kinases/extracellular signal-regulated kinase (MAPK-ERK) signaling pathway. PTTG1 has been shown to be highly expressed in various neoplastic diseases, such as hepatocellular carcinoma, cholangiocarcinoma, and breast cancer [21–23], and is associated with tumor invasion and metastasis [24]. Both CDK1 and MAPK are kinases, whereas PTTG1 has sites for phosphorylation modification (Fig. 5a). However, activation of PTTG1 through phosphorylation by MAPK has not been confirmed in vivo, and there is a lack of studies on the PTTG1-MAPK-ERK-related pathway in cSCC.

Another pathway contained three genes, TPX2, KIF11, and CDK1, of which TPX2 and KIF11 are involved...
in the biological processes of spindle organization, mitotic spindle pole, and mitosis in the GO functional annotation. TPX2 includes three major functional domains: the N-terminal Aurora A kinase binding domain, the nuclear localization signal (NLS) structural domain, and the TPX2 structural domain (Fig. 5b). Among them, the TPX2 structural domain mediates the localization of Xklp2 to the mitotic spindle in Xenopus Leavis [25]. KIF11, a member of the Eg2 (KIF15) homolog family, is homologous to Xklp2. Therefore, it is reasonable to speculate that TPX2 interacts with KIF11 through the TPX2 domain and affects the function of the mitotic spindle, thereby leading to chromosomal instability [26], which is an important event in tumorigenesis. Regarding the role of CDK1 in the pathway, both TPX2 and KIF11 have a large number of sites for phosphorylation modification (Fig. 5b,c), especially TPX2, whose phosphorylation has a considerable effect on its function [27].

3.5 KIF11 and TPX2 are Highly Expressed in the A431 Cell Line

TPX2, KIF11, PTTG1, and CDK1 were consistently highly expressed in the four selected GEO datasets (Fig. 3b). Owing to the lack of a database involving prognosis-related clinical information for cSCC, we validated the expression levels and prognostic relevance of these four genes in a variety of squamous cell carcinomas of other tissues and cutaneous malignant melanoma that was homozygous for cSCC (Fig. 6a–h). HNSC, which refers to squamous cell carcinoma occurring mostly in the mucosal areas of the head and neck, such as the tongue, pharynx, and larynx, is broadly classified as squamous cell carcinoma of the skin. TCGA-based analyses showed that these four genes were highly expressed in most squamous cell carcinomas, as well as cutaneous melanoma (Fig. 6a–d). Moreover, elevated expression of these genes except for PTTG1 was correlated with poorer overall survival in HNSC ($p < 0.1$; Fig. 6e–h). The HPA database was used to verify histological expression levels of TPX2 and KIF11. KIF11 was significantly more expressed in cSCC tissues than in normal tissues, whereas the difference in TPX2 staining intensity between cSCC and the adjacent normal skin tissue was not significant (Fig. 7a). We verified the expression difference of mRNA in the cell lines (Fig. 8d), whereas higher protein expression level of only TPX2 was observed in A431 cells (Fig. 8a,b).

We also queried the mutation status of these genes in patients with cSCC using cBioPortal. Except for PTTG1 with a mutation rate <1%, the mutation rates of TPX2 and KIF11 were 7% and 9%, respectively (Fig. 7b), and their mutations were associated with poorer overall survival (Fig. 7c,d).

3.6 NSC689534 is a Potential Drug Candidate Acting on TPX2 and KIF11

Based on the CTD database, interactions between small molecular compounds and the gene TPX2 and KIF11 networks were visualized using the NetworkAnalyst website (Fig. 9a). In total, 21 common small molecule compounds were identified. After further analysis with the help of PubChem and published literature, we excluded compounds that were inherently toxic (e.g., troglitazone and mustard gas) and have been studied in cSCC (e.g., cyclosporine) [28,29]. We selected the pyridine 2-carbaldehyde thiosemicarbazone (NSC689534) (Fig. 9b) as the target for further studies. Molecular docking analyses identified the potential of NSC689534 to interact with KIF11 (Fig. 9c). Although TPX2 could not dock directly with NSC689534, the TPX2-Aurora A complex, which affects spindle length in human somatic cells [30], was able to interact with NSC689534 through hydrophobic interactions (LEU139, VAL147, LEU263, and ASP274) and hydrogen bonds (ASN216 and ASP274) with strong binding ability (Fig. 9c and Table 3). Likewise, KIF11 bound NSC689534 strongly through four hydrophobic interactions and one II-stacking (parallel) interaction with a binding energy of -7.3 kcal/mol (Fig. 9c and Table 3). Then, we provided chemical insights into NSC689534 using SwissADME. Accordingly, the molecular weight of the compound was determined to be 362.45 g/mol. The analysis also implied a high level of gastrointestinal absorption, and the compound could not easily cross the blood-brain barrier, indicating that NSC689534 met the criteria required for a potential drug in terms of properties such as molecular weight, lipophilicity, and pharmacokinetics (Table 4). The drug-likeness indexes (Lipinski, Ghose, Veber, Egan, Muegge)
Fig. 5. Molecular structure and post-translational modification sites of PTTG1 (a), TPX2 (b), and KIF11 (c) according to cBioPortal.

were also all in compliance, and the bioavailability score was >0.1 (Table 4), suggesting good drug-likeness. Moreover, the synthetic accessibility score of NSC689534, a method to assess the ease to synthesize a compound, was 3.22. A score approaching one indicates that a compound has good synthetic accessibility. In a recent research, the anti-tumor capability of NSC689534 was identified in vitro and in vivo [31]. The treatment of NSC689534/Cu²⁺ at 5 µM for 24 or 48 h could induce apoptosis in HL60 and PC3 cells [31]. According to the analysis above, NSC689534 may be an effective inhibitor of TPX2 and KIF11 and show anti-tumor effect in cSCC.

3.7 In Vitro Verification of the Inhibition Ability to A431 Cell Line of NSC689534

A431 cells were cultured in 96-well plates and exposed to different concentrations of NSC689534 for 24 h or 48 h. After determining the cell viability with CCK8 reagent, the inhibition ability of NSC689534 to A431 cells was confirmed (Fig. 8c). It was possible to achieve very impressive inhibition rate even at a low concentration of 0.5 µM. Subsequently, the protein expression of TPX2 and KIF11 was compared among normal keratinocytes, A431 cells and cSCC cells treated with NSC689534. It was found that NSC689534 could reduce the expression of KIF11 but not TPX2 (Fig. 8a,b). Combining results of molecular docking analysis (Fig. 8c,d), we consumed that NSC689534 interacted with KIF11 and then reduced its expression in cSCC cells. Our results suggested that NSC689534 could inhibit the proliferation of A431 cells and reduce the expression of KIF11.

4. Discussion

In this study, we aimed to suggest a potential compound for future research that may benefit patients with
Fig. 6. Association of overexpressed core differentially expressed genes in different types of carcinomas with poor prognosis. Expression levels of PTTG1 (a), KIF11 (b), TPX2 (c), and CDK1 (d) in four carcinoma types (HNSC, SKCM, ESCA, and LUSC). *p < 0.05. (e–h) Overall survival curves of patients with high and low expression of PTTG1 (e), KIF11 (f), TPX2 (g), and CDK1 (h) in HNSC samples. p < 0.1. ESCA, esophageal carcinoma; HSNC, head and neck squamous cell carcinoma; KIFF, kinesin family member 11; LUSC, lung squamous cell carcinoma; SKCM, skin cutaneous melanoma; TPX2, targeting protein for Xklp2.

cSCC. NSC689534 might be a candidate drug for cSCC targeting TPX2 and KIF11. cSCC is the second most common cutaneous malignancy among nonmelanoma skin cancers [32]. Most patients are in the early stages of the disease at the time of consultation and can be cured by surgical excision. However, cSCC has the ability to metastasize [10] and contributes to 20% of the mortality among skin tumors [33]. Once a tumor metastasizes, surgical treatment is often insufficient. For instance, radiotherapy, chemotherapy, EGFR inhibitors, and immune checkpoint inhibitors (e.g., the PD-1 inhibitor cemiplimab) can be selected as adjuvant therapies or combined for systemic therapy. Unfortunately, satisfactory long-term outcomes remain difficult to achieve [12]. Moreover, few articles using bioinformatics have been devoted to identify potential drugs for cSCC. Screening for DEGs that distinguish cSCC from normal skin tissue using public databases can help search for new biomarkers for cSCC and targets for the subsequent discovery of potential drugs using molecular docking analysis.

Here, we identified in four microarray datasets 51 shared DEGs that were significantly associated with skin diseases and enriched in multiple signaling pathways in cSCC. Based on the PPI network constituted by String and the plug-in MCODE, two key functionally relevant modules were extracted, where the genes were all associated with mitosis and cell cycle. With the aid of protein causality annotations stored in the SIGNOR3.0 database, we identified two signaling pathways.
Fig. 7. Histological expression levels and mutation likelihood of TPX2 and KIF11 according to the HPA database and cBioPortal. (a) Histological expression levels of KIF11 in the HPA. (b) Mutation rates of TPX2, KIF11, and PTTG1 in cSCC. (c,d) Mutation-prognosis curves of TPX2 and KIF11. cSCC, cutaneous squamous cell carcinoma; HPA, Human Protein Atlas; KIFF, kinesin family member 11; TPX2, targeting protein for Xklp2.

One of the pathways consisted of the CKD1, PTTG1, and MAPK-ERK signaling pathways. PTTG1 was isolated from rat pituitary tumor cells in 1997 [34], and its overexpression has been reported in a variety of endocrine-related tumors and non-endocrine-related cancers involving the central nervous, pulmonary, and gastrointestinal systems [35–39]. PTTG1 has been recognized as a key signature gene associated with tumor metastasis [40]. PTTG1 phosphorylation is important for protein activation [41], and cell cycle-dependent phosphorylation during mitosis may be associated with cell migration [42]. MAPK has the ability to phosphorylate PTTG1 in rats, which is associated with the transactivation of PTTG1 [43]. Accordingly, CDK1 and MAPK were inferred to be capable of phosphorylating PTTG1 at different sites with distinct effects. In turn, the activation of PTTG1 can also contribute to tumor metastasis via the MAPK-ERK signaling pathway [22]. It has been reported that in cSCC, PTTG1 might be a biomarker for tumor metastasis associated with mutated p53 protein, but its value for the prediction of prognosis is unknown [44]. Consistently, our overall survival analysis based on the TCGA database revealed no statistically significant impact of PTTG1 expression levels on HNSC prognosis. Consequently, this signaling pathway was not selected for further investigations in subsequent screenings of small-molecule compounds. Nevertheless, considering that HNSC represents only a section of all cSCCs and that the involvement of PTTG1 in the MAPK-ERK signaling pathway in cSCC has not been experimentally examined, a prognostic value of PTTG1 in cSCC cannot be completely rejected.

Another pathway involved two core genes, TPX2 and KIF11, as well as CDK1, which is not considered a core gene but differed in the four datasets. Both TPX2 and KIF11 are involved in mitosis [45]. They are able to interact in certain ways, but there is no unified perspective on the mechanism of their interaction and impact [45–48]. In a recent study, TPX2 was shown to regulate spindle motil-
Fig. 8. *In vitro* verification of the inhibition ability to A431 cell line of NSC689534. (a,b) Expression levels of KIF11 (a) and TPX2 (b) in HaCaT cell line, A431 cell line and A431 cell line with treatment of NSC689534 at 0.25 µM for 24 h by Western Blot. ***p < 0.001. (c) Inhibition rate of NSC689534 in A431 was assessed by CCK8 assay at 24 h and 36 h. IC50 (24 h) = 0.2400 µM, IC50 (36 h) = 0.2232 µM. (d) qPCR analysis to evaluate the expression of TPX2 and KIF11 in A431 and HaCaT cell lines.

Subsequently, NSC689534 was selected as a potential small-molecule compound that can act on both TPX2 and KIF11, based on the CTD database and available literature. The results of molecular docking analyses showed that NSC689534 was capable of strongly binding to KIF11 with a binding energy of ~7.3 kcal/mol, whereas it could not bind to TPX2 directly. In the next validation *in vitro*, the expression of KIF11 but not TPX2 was down-regulated with the treatment of NSC689534. Meanwhile, the compound had properties of suitable molecular weight, lipophilicity, pharmacokinetic effects, drug-likeness, and good synthetic accessibility. As to side effects, there were no studies...
Fig. 9. NSC689534, a potential drug candidate targeting TPX2 and KIF11. (a) Small molecular compound-gene interaction network visualized on the NetworkAnalyst website. (b) Structure of NSC689534, KIF11, and TPX2. (c,d) Three-dimensional and two-dimensional structures of ligand (NSC689534)–receptor (KIF11, TPX2) interactions. KIFF, kinesin family member 11; TPX2, targeting protein for Xklp2.

Table 3. Interaction of ligands and receptors in the binding pocket.

<table>
<thead>
<tr>
<th>Ligand</th>
<th>Receptor</th>
<th>PDB ID</th>
<th>Binding affinity (kcal/mol)</th>
<th>Bonding length</th>
<th>Amino acid residues</th>
<th>Interaction</th>
</tr>
</thead>
<tbody>
<tr>
<td>689534</td>
<td>TPX2</td>
<td>5lxm</td>
<td>-8.1</td>
<td>2.2</td>
<td>ASP274</td>
<td>Hydrogen bond</td>
</tr>
<tr>
<td>689534</td>
<td>KIF11</td>
<td>6tle</td>
<td>-7.3</td>
<td>2.3</td>
<td>ASN264</td>
<td>Hydrogen bond</td>
</tr>
</tbody>
</table>

Table 4. NSC689534 meets the required criteria for drug-likeness.

<table>
<thead>
<tr>
<th>Physicochemical properties</th>
<th>Value</th>
</tr>
</thead>
<tbody>
<tr>
<td>Formula</td>
<td>C_{19}H_{18}N_{6}S</td>
</tr>
<tr>
<td>Molecular weight</td>
<td>362.45 g/mol</td>
</tr>
<tr>
<td>Pharmacokinetics</td>
<td></td>
</tr>
<tr>
<td>Gastrointestinal absorption</td>
<td>High</td>
</tr>
<tr>
<td>Blood-brain barrier permeant</td>
<td>No</td>
</tr>
<tr>
<td>Drug-likeness</td>
<td></td>
</tr>
<tr>
<td>Lipinski</td>
<td>Yes; 0 violations</td>
</tr>
<tr>
<td>Ghose</td>
<td>Yes</td>
</tr>
<tr>
<td>Veber</td>
<td>Yes</td>
</tr>
<tr>
<td>Egan</td>
<td>Yes</td>
</tr>
<tr>
<td>Muegge</td>
<td>Yes</td>
</tr>
<tr>
<td>Bioavailability score</td>
<td>0.55</td>
</tr>
<tr>
<td>Medicinal chemistry</td>
<td></td>
</tr>
<tr>
<td>Synthetic accessibility</td>
<td>3.22</td>
</tr>
</tbody>
</table>

reporting on the toxicity. While in an *in vivo* research, NSC689534 did not lead to any loss in animal models [31]. The above analysis suggested that this compound had the potential to be an effective inhibitor of KIF11. Various thiosemicarbazones, such as Triapine, have been explored as anti-tumor agents [25,50]. NSC689534 was reported
to be capable of inducing cell death associated with reactive oxygen species generation and depletion of cellular glutathione [51,52], whereas Cu²⁺ enhanced its anti-proliferative activity [31]. If the anti-tumor effect and toxicity of NSC689534 can be clarified in vivo, it has the potential to be applied to patients with progressive cSCC. It can be used as a systemic treatment for patients whose lesions cannot be surgically resected or who have developed metastases.

Overall, our study suggests that CDK1, TPX2, and KIF11 may play a role in the development of cSCC by forming a signaling pathway that affects spindle organization and mitosis through their interactions. NSC689534 may be a potential drug candidate for the treatment of cSCC owing to its satisfactory bioavailability, synthetic accessibility, and relatively strong binding ability with KIF11, and the efficiency in vitro.

However, it should be noted that in vivo validation experiments are lacking, which is the main limitation of the present study. Moreover, our study suggested the compound’s effect on the interaction and expression of KIF11. Whether NSC689534 inhibited cell proliferation by affecting mitosis through interactions with KIF11 or induced apoptosis through oxidative stress as suggested in other essays remained to be shown. Thus, the detailed mechanism of NSC689534 needed more experiments to confirm. In the future, we will focus on validating the function of the two core genes in vivo and the mechanism of NSC689534 in vivo.

5. Conclusions

Based on the study findings, we propose a potential signaling pathway involved in the development of cSCC, where TPX2 and KIF11 may play an important role. This pathway ultimately affects spindle organization and mitosis. Both of them were proved to be highly expressed in mRNA level in the A431 cell line. Thus, NCS 689534 may be a potential drug candidate targeting KIF11 in this pathway. However, the hypothesis regarding the mechanism and specific role of NSC689534 in cSCC still requires further experimental validation. Our findings suggest a potential drug for progressive cSCC and prove the value of NSC689534 for further research, which provide new insights into systemic therapy for progressive cSCC.

Abbreviations

CTD, Comparative Toxicogenomics Database; cSCC, cutaneous squamous cell carcinoma; DEG, differentially expressed gene; EGFR, epidermal growth factor receptor; FC, fold change; GEO, Gene Expression Omnibus; GO, gene ontology; HNSC, head and neck squamous cell carcinoma; HPA, Human Protein Atlas; KIF11, kinesin family member 11; MCC, Matthews Correlation Coefficient; NLS, nuclear localization signal; PPI, protein-protein interaction; PTTG1, pituitary tumor transforming gene; SIGNOR, SIG-naling Network Open Resource; TBST, tris-buffered saline with Tween-20; TCGA, Cancer Genome Atlas; TPX2, targeting protein for Xklp2.

Availability of Data and Materials


Author Contributions

YM and XDC designed and conducted the study. CS analyzed the data and collated the figures. XZ, QQL, AYP, and WMZ contributed to analysis of data and the original draft. XYW helped prepare the figures. HYQ provided financial support for the research and interpretation of data. YM, CS, HYQ and XDC contributed to editorial changes in the manuscript. All authors have contributed to editorial changes in the manuscript. All authors read and approved the final manuscript. All authors have participated sufficiently in the work and agreed to be accountable for all aspects of the work.

Ethics Approval and Consent to Participate

Not applicable.

Acknowledgment

The authors thank all individuals who participated in this study. We would like to thank Editage (www.editage.cn) for English language editing.

Funding

This study was funded by the Foundation of Nantong Science and Technology Bureau (JC2020025), Health Committee of Nantong (MB2020021), and Clinical Medicine Special Program of Nantong University (2019JY017). The funding sources were involved in the collection, analysis, and interpretation of data; the preparation, review, or approval of the manuscript; and the decision to submit the manuscript for publication.

Conflict of Interest

The authors declare no conflict of interest.
References


