The Global research of protein post-translational modifications in the cancer field: A bibliometric and visualized study

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Objectives: Protein post-translational modifications (PTMs) are closely associated with tumorigenesis, targeting PTMs of key proteins might be the focus of antitumor drug discovery. This study aimed to analyze the research progress on protein PTMs in tumorigenesis by performing qualitative and quantitative evaluations.

Methods: The Web of Science Core Collection was selected as the database, and Science Citation Index Expanded was selected as the citation index. Visualization tools such as VOSviewer, CiteSpace, HistCite, and Online Analysis Platform of Bibliometrics were used to deeply explore the information of the retrieved research papers and analyze them in terms of research trends and main aspects of research.

Results: The search yielded 3777 relevant articles. The results showed that the total number of PTMs related papers in cancer field has been increasing annually, with the largest number of papers published in the United States of America. The co-word cluster analysis showed that the research on PTMs and tumorigenesis was primarily focused on the following four areas, mechanism, histone, P53, key Technologies. Tumor metabolism, autophagy, and protein-protein interaction, histone ubiquitination have become new research topics.

Conclusion: This study provides an important reference for the research direction and selection of topics of interest in the PTMs of cancer field.

KEYWORDS
post-translational modification, tumor, citespace, VOSviewer, histcite, knowledge graph, bibliometrics
1 Introduction

Protein post-translational modifications (PTMs) represent important regulatory modalities of protein function; they alter the charge properties, hydrophilicity/hydrophobicity, and conformation of proteins. PTMs are extremely diverse, primarily being associated with processes such as phosphorylation, ubiquitination, methylation, and acetylation. Currently, several modifications, such as succinylation, lactylation, crotonylation, malonylation, and trihydroxybutanylation have been discovered, and their critical roles in disease progression have been investigated. PTMs represent key processes within signal transduction of phosphate, acetyl, and glycosyl groups, which are conducted from one protein to another. As most PTMs are reversible, they are used as ‘switches’ in normal cells to determine the cell states (quiescent or active), thereby rapidly and tightly regulating cell proliferation (1). To date, 461 unique types of modifications have been identified, including phosphorylation, acetylation, ubiquitination, and ubiquitination (2). These modifications regulate the development of various diseases in the nervous, endocrine, and cardiovascular systems by altering the activity, intracellular distribution, and interactions of the targeted proteins (3–5).

In the early stages, bibliometric analysis was primarily used by researchers in disciplines such as intelligence, library science, and archives. However, with the advancement of research and the emergence of cross-disciplinary approaches, this analysis is now widely used in numerous fields within the medical discipline. For instance, Huang et al. used CiteSpace and VOSviewer software to analyze emerging trends and research foci in the gastrointestinal microbiome, which showed that gut microbiota, inflammatory bowel disease, probiotics, irritable bowel disease, and obesity are hotspots in gut microbiome research, whereas bile acids, obesity, and mycobacteria represent new research foci (6). Furthermore, Wu et al. conducted a knowledge graph analysis and visualization of applied Artificial Intelligence techniques in the new coronary pneumonia epidemic, presenting researchers and practitioners with perspectives on the challenges and limitations of Artificial Intelligence applications in COVID-19 and facilitating research on Artificial Intelligence applied to COVID-19 (7). A different research group mapped knowledge structures and thematic trends in rheumatoid arthritis osteoporosis, providing a field with potential research frontiers and hot directions (8).

Similarly, tumor PTMs have received considerable attention in recent years, and the characteristics as well as the regulatory mechanisms of PTMs have been shown to exhibit potential roles in tumorigenesis, prognosis, and drug development. However, the complicated nature of the literature discussing PTMs in cancer field can prove to be confusing even for experts and scholars when presented in the absence of clear future directions. Bibliometrics analysis provides a timely, visual, relatively objective way to a create a representative sample of articles, journals and publishers, track the development and explore the knowledge structure in a specific knowledge field (9).

In this study, a bibliometric analysis of international research on PTMs in cancer field was conducted using VOSviewer, CiteSpace, and HistCite and Online Analysis Platform of Bibliometrics visual analysis software tools based on the status of PTMs related papers in cancer field deposited in the Web of Science Core Collection (WOSCC) Science Citation Index Expanded (SCI-EXPANDED) database.

2 Materials and methods

2.1 Data sources

Web of Science is considered to be the most prominent database of scientific publications on many research topics. It provides several databases covering interdisciplinary research and explores the professional areas of many disciplines (10). The cluster analysis of literature co-citation can explore the common topics of similar documents, which is one of the most powerful functions of CiteSpace and the most important part of bibliometrics analysis. But the co-citation analysis can only analyze the papers searched from WOSCC (11). HistCite also supports only Web of Science databases and is powerless for databases such as Scopus and PubMed. In order to meet the requirements of data analysis, We retrieved articles in the Web of Science Core Collection Science Citation Index Expanded (SCI-Expanded) from inception to April 11th, 2022. The retrieval formula is as follows: #1 = ((((((TS=(Neoplasias)) OR TS=(Neoplastic)) OR TS=(Malignancy)) OR TS=(Malignances)) OR TS=(Tumors)) OR TS=(Tumor)) OR TS=(Cancers)) OR TS=(Cancer)) OR TS=(Cancer)).

2.2 Data analysis methods

2.2.1 Analysis of literature publication time and countries/regions

Online Analysis Platform of Bibliometrics (http://bibliometric.com/) was used to analyze trends in the number of papers issued and the annual number of papers issued by each country to determine the literature distribution.
2.2.2 Analysis of the academic connection between countries/regions, institutions, authors and journals

Analyzing the co-citation among countries or regions, institutions and authors to determine the countries, institutions and authors who have made great contributions in this field and their potential cooperative relations;

VOSviewer 1.6.17 software was used to analyze and generate the collaboration between countries/regions, organizations, and a co-citation network diagram for high-yield authors. The specific settings were as follows: type of analysis: co-citation; unit of analysis: cited authors; choice threshold: minimum number of citations of an author was 50. Of the 128,093 authors, 250 met the threshold. For the institutions, type of analysis: co-authorship; unit of analysis: organizations; choice threshold: minimum number of documents of an organization was 20. Of the 3217 organizations, 44 met the threshold. For the countries, type of analysis: co-authorship; unit of analysis: countries; choice threshold: minimum number of documents of a country was 5. Of the 76 countries, 48 met the thresholds. The network diagram consists of nodes and connections, where the nodes represent the country/region, organizations or authors. The same color represents the close cooperation among these countries/regions, organizations or authors. We cleaned the data before analyzing, for instance, in the countries/regions analysis, publications from Taiwan were reclassified to China, and those from England, Scotland, Northern Ireland, and Wales were assigned to the United Kingdom (12).

CiteSpace software V5.8.R3 SE, 64 bits (Drexel University, Philadelphia, PA, USA) was used to conduct the dual map.
overlay of journals. The dual map overlay of journals aims to reveal the topic distribution of journals. Publications and citations in this field can be described at the disciplinary level.

### 2.2.3 Knowledge-based analysis of PTMs in the cancer field

Analyzing literature co-citation, citation path analysis, keyword clustering and keyword burst to determine the knowledge base and research hotspots in this field, which is the most critical step in this bibliometric analysis.

HistCite software was used to analyze the citation paths of the first 30 highly cited pieces of literature. The citation paths is to map out the development of this field, lock in the important literature of this research direction, and find some papers with groundbreaking achievements without specified keywords. The numbers in the box represent the chronological order of the documents in all downloaded documents, and the closer to the present, the larger the number; The size of the box in the figure is proportional to the local citation score (LCS) of the literature, that is, the bigger the box, the higher the LCS. Normally, the LCS and global citation score (GCS) were used to evaluate the significance of each article. LCS indicates the number of citations of the document in the current literature set, GCS indicates the number of citations in all the resources in the WOSCC database at the time the document was downloaded. The higher the LCS, the higher the importance of the publication in its field of expertise, and the higher the GCS meant that the publication had attracted worldwide attention, regardless of the reader's specialty. Therefore, it was believed that LCS had a higher reference value than GCS (13).

CiteSpace software was used to analyze and visualize co-cited references, and citation bursts for keywords. Since co-cited references and keyword burst are mainly used to explore common topics and emerging topics in this field, the author analyzes the literature information in the past ten years from 2011 to 2021 in order to avoid too much literature interfering with the real analysis results. The CiteSpace settings were as follows: time span was from 2011 to 2021, years per slice was 1, pruning selected "Minimum Spanning Tree and Pruning Sliced Networks", and selection criteria selected “Top N=50”. Labels chosen by the log-likelihood ratio test method (LLR) are used in the subsequent discussions (14). For keywords burst detection, "Keywords" was chosen for Node Type, and others followed the default. After removing keywords with little significance (like cells, mice, etc.), the top 30 keywords with the strongest citation bursts were identified and presented using Microsoft Excel 2019.

VOSviewer 1.6.17 software was used to analyze and generate a cluster network diagram for the co-occurrence of author keywords. "Author keywords" were selected for cluster analysis, and the frequency of more than or equal to 20 times was set as the high-frequency author keywords, 61 met the threshold. The network diagram consists of nodes and connections, where the nodes represent the keywords. We merged the synonyms such as “dna-damage” and “dna damage” in keyword evolution analysis. See the Additional files "replace" for more details. The connections between the nodes represent collaborative, co-occurring, or co-cited relationships. The size of the nodes reflects the frequency of occurrence of the elements, and the frequency of occurrence is positively correlated with the size of the nodes. The colors of the nodes and lines represent different clusters or years (15, 16).

### 3 Results and discussion

#### 3.1 Analysis of literature publication time and countries/regions

As shown in Figure 2A, studies related to PTMs in the cancer field included in the WOSCC SCI-EXPANDED database have kept gradually increasing from 1997 to 2021, indicating that the relationship between PTMs and the cancer field will continue to receive international scholarly attention. To find out which countries/regions are leading in this area of research, further analysis of publications from different countries and regions was performed using the bibliometric online analysis platform (http://bibliometric.com/). We found that the US is the pioneer in this field and the number of publications is steadily increasing. Although China initially lagged behind, its annual publication output in this field has grown rapidly (Figure 2B).

#### 3.2 Analysis of the academic connection between countries/regions, institutions, authors and journals

As can be seen in Figure 3A, the distance between the United States and the China is closer, the number of common references cited by the research on behalf of the United States and the China is more, and the research topics may be similar; In terms of cooperation between institutions, those in each country still prefer to cooperate with their own institutions. There is close cooperation between Shanghai Jiao Tong University, Huazhong University of Science and Technology, and Chinese Academy of Sciences (Figure 3C). International exchange cooperation is still not very close, as shown in Figure 3C. Enhanced international collaboration may further promote PTM research in tumor. Table 1 summarizes the top 15 organizations with the highest contributions. The National Cancer Institute (NCI) had the highest number of publications with 70 papers. The Centre National de la Recherche Scientifique (CNRS) and the Chinese Academy of Sciences (CAS) ranked second and third, with 56 and 50 papers, respectively. Most of the top 15 institutions belong to the United States. A co-cited author refers to two or more authors who are cited together. A network graph of co-cited authors can provide information about influential research groups and
potential collaborators, as shown in Figure 3B, different colors represent clusters with close cooperation. For example, Chou KC has a high output of articles and has extensive contacts with other authors, especially Xu Y, Chen Z, Chen C, etc.

The top 15 highly cited journals are shown in Table 2, with the Journal of Biological Chemistry having the highest total citations of 3022. According to the Journal Citation Report (JCR) 2021, 11 of the top 15 journals listed in Table 2 are in Q1. In Figure 4, the two paths in orange are indicated that Molecular/Biology/Immunology journals frequently quoted Molecular/Biology/Genetics journals and Health/Nursing/Medicine journals. Green path is indicated that Medical/Medicine/Clinical journals frequently quoted Molecular/Biology/Genetics journals.

3.3 Knowledge-based analysis of PTMs in the cancer field

3.3.1 Analysis of citation path evolution

By analyzing the citation networks of highly cited papers, we can understand the historical evolution of the field during this period. As shown in Figure 5, we selected the 30 most cited papers in the field to build the citation network. Specific literature information is shown in Table 3. According to the topics and contents of the papers, these 30 highly cited papers can be divided into two relatively independent parts, representing two research topics.

On the left, the yellow background shows the study of histones PTMs and tumors over the past few years, focusing on the relationship between histone modifications and tumor development and clinical prognosis and their related mechanisms (17–25), linking epigenetics to tumors, with the key event nodes shown in Figure 6A.

On the right, the blue background shows the study of non-histone PTMs and tumors over the past few years. Analysis of the top 30 highly cited studies in PTMs and tumor research shows that there are about two-thirds of studies on p53, mostly taking place a decade ago (26–35), indicating that p53 has been widely followed and studied a decade ago, but the mechanism of the post-translational modification of p53 on tumor occurrence, development and prognosis still needs to be further verified. High-cited studies concerning post-translational modifications of p53 with tumors are summarized in Figure 6B.
Other studies on tumor and post-translational modifications have focused on the Phosphatase and tensin homolog deleted from chromosome 10 (PTEN). PTEN is a major negative regulator of signaling pathways defined by class I phosphatidylinositol 3 kinase, AKT, and the mechanistic target of rapamycin (mTOR), which also plays a key role in controlling a range of important cellular processes including cell proliferation, growth, survival, and metabolism (36–39). PTEN is regulated by various PTMs, for example, phosphorylation, acetylation, and ubiquitylation. Phosphorylation of PTEN at Ser229, Thr321,
Tyr336, Thr366, Ser370, Ser380, Thr382, Thr383, and Ser385 has been shown to be associated with the regulation of tumor suppressor function, cell membrane binding, and stability of PTEN (40). Furthermore, PCAF promotes PTEN acetylation at Lys125 and Lys128, whereas CBP acetylates Lys402. Thioredoxin-interacting protein and peroxiredoxin 1 have been shown to prevent acetylation-mediated PTEN inactivation. The disulfide bond formed between Cys124 and Cys71 by oxidation also reduces the catalytic activity of PTEN, however, this can be avoided by deacetylase sirtuin 1. Ubiquitination of PTEN at Lys13 and Lys289 regulates its tumor suppressor function, subcellular distribution, and stability (40).

### 3.3.2 Analysis of citations and keywords cluster

Through the analysis of citations and keywords, we can identify development trends and research hotspots in the research field. The citation clustering diagram is shown in Figure 7. As can be seen from the picture, in recent years, scholars have mainly focused on the following aspects. #0 therapeutic target, #1 epigenetic target, #2 proteogenomic characterization, #3 double-strand break, #4 chemical inhibitor, #5 non-histone lysine methylation, #6 nutrient-sensing nexoasine, #7 cancer epigenetics research, #8 post-translational modification network, #9 mitochondrial sirtuin, #10 demethylation pathway, #11 cancer cell, #12 histone variant, #13 androgen receptor, #14 PTEN ubiquitination, #15 diagnostic

### Table 1: The top 15 institutions involved in PTMs of cancer field.

| Rank | Institutions                                                                 | Country      | Count |
|------|------------------------------------------------------------------------------|--------------|-------|
| 1    | National Cancer Institute                                                    | United States| 70    |
| 2    | Centre National de la Recherche Scientifique                                 | France       | 56    |
| 3    | Chinese Academy of Sciences                                                  | China        | 50    |
| 4    | The University of Texas MD Anderson Cancer Center                            | United States| 39    |
| 5    | Johns Hopkins University                                                     | United States| 39    |
| 6    | Baylor College of Medicine                                                   | United States| 33    |
| 7    | University of Pennsylvania                                                   | United States| 33    |
| 8    | Karolinska Institute                                                         | Sweden       | 32    |
| 9    | University of Oxford                                                         | United Kingdom| 32   |
| 10   | University of Michigan                                                       | United States| 31    |
| 11   | Memorial Sloan Kettering Cancer Center                                       | United States| 30    |
| 12   | Harvard University                                                           | United States| 30    |
| 13   | New York University                                                          | United States| 27    |
| 14   | Northwestern University                                                      | United States| 26    |
| 15   | University of Toronto                                                        | Canada       | 26    |

Source: authors with CiteSpace.

### Table 2: The top 20 Journals involved in PTMs of cancer field.

| Rank | Journals                                                                 | Country      | IF (2021) | JCR | Cited Counts |
|------|--------------------------------------------------------------------------|--------------|-----------|-----|--------------|
| 1    | Journal of Biological Chemistry                                          | United States| 5.157     | Q2  | 3022         |
| 2    | Proceedings of the National Academy of Sciences of The United States Of America | United States| 11.205    | Q1  | 2975         |
| 3    | Nature                                                                   | United Kingdom| 49.962   | Q1  | 2748         |
| 4    | Cell                                                                     | United States| 41.582    | Q1  | 2659         |
| 5    | Science                                                                  | United States| 47.728    | Q1  | 2411         |
| 6    | Cancer Research                                                          | United States| 12.701    | Q1  | 2225         |
| 7    | Oncogene                                                                 | United Kingdom| 9.867    | Q1  | 2039         |
| 8    | Journal of Molecular Cell Biology                                        | China        | 6.216     | Q4  | 1915         |
| 9    | Molecular Cell                                                           | United States| 17.970    | Q1  | 1866         |
| 10   | EMBO Journal                                                             | United States| 11.598    | Q1  | 1788         |
| 11   | PloS One                                                                  | United States| 3.240     | Q2  | 1690         |
| 12   | Nucleic Acids Research                                                    | United Kingdom| 16.971   | Q1  | 1557         |
| 13   | Genes and Development                                                    | United States| 11.361    | Q1  | 1516         |
| 14   | Biochemical and Biophysical Research Communications                       | United States| 3.575     | Q2  | 1483         |
| 15   | Nature Reviews Cancer                                                    | United Kingdom| 60.716   | Q1  | 1395         |

Source: authors with CiteSpace.
tumor target, #16 autophagy regulation, #17 DNA damage site, #18 epithelial-mesenchymal transition, and #19 therapeutic target hsp90.

A total of 61 keywords were high-frequency keywords. The clustering diagram is shown in Figure 8A. Searching for keywords with long distances and large points may provide new ideas for research in this field. Keywords in each cluster were listed in Table 4, and themes were summarized, which were divided into four categories: #1 mechanism, #2 histone, #3 P53, and #4 Key Technologies.

The keywords in blue in Figure 8A are the first category of keywords, which mainly describe the mechanism by which PTMs are involved in tumorigenesis and development. PTMs play important roles in regulating protein activity, stability, and folding by inducing covalent attachment of new functional groups such as phosphate, methyl, and acetyl groups to proteins (41). Traditional PTMs, such as phosphorylation and polyurethane, and non-traditional PTMs, such as methylation and acetylation, have been shown to influence the inflammatory response in the cancer field by targeting natural sensors and downstream signaling molecules, including receptors, ligands, enzymes, and transcription factors (42–44). In addition, PTMs can improve the stability of complex signaling pathways through a variety of regulatory mechanisms (38). Although PTMs are closely associated with tumorigenesis, proliferation, and metastasis (1, 45), the molecular mechanisms remain poorly understood. The following examples describe the mechanisms of two kinds of PTMs involved in tumorigenesis and development.

Lysine acetylation is a conserved PTM that links acetyl coenzyme A metabolism to cellular signaling and regulates numerous biological processes by modulating protein interactions, activity, and localization (46). It preferentially targets macromolecular complexes involved in a variety of cellular processes, such as chromatin remodeling, cell cycle,
| Number | Title                                                                 | First author | Publication year | Journal               | LCS | GCS |
|--------|----------------------------------------------------------------------|--------------|------------------|-----------------------|-----|-----|
| 41     | DNA damage induces phosphorylation of the amino terminus of p53       | Siliciano JD | 1997             | GENE DEV              | 13  | 668 |
| 121    | Post-translational modifications and activation of p53 by genotoxic stresses | Appella E | 2001             | EUR J BIOCHEM         | 59  | 865 |
| 151    | Regulation of p53 activity by its interaction with homeodomain interacting protein kinase-2 | Hofmann TG | 2002             | NAT CELL BIOL         | 24  | 478 |
| 178    | MDM2 ± HDAC1-mediated deacetylation of p53 is required for its degradation | Ito A       | 2002             | EMBO J                | 22  | 419 |
| 182    | Acetylation of p53 Inhibits Its Ubiquitination by Mdm2                 | Li MY       | 2002             | J BIOL CHEM           | 28  | 362 |
| 196    | Pth2, a p53-Induced Ubiquitin-Protein Ligase, Promotes p53 Degradation | Leng RP     | 2003             | CELL                  | 28  | 549 |
| 197    | Ubiquitination, phosphorylation and acetylation: the molecular basis for p53 regulation | Brooks CL | 2003             | CURR OPIN CELL BIOL   | 25  | 591 |
| 212    | Phosphorylation Site Interdependence of Human p53 Post-translational Modifications in Response to Stress | Saito S    | 2003             | J BIOL CHEM           | 21  | 187 |
| 275    | Post-translational modification of p53 in tumorigenesis                | Bode AM     | 2004             | NAT REV CANCER        | 67  | 948 |
| 313    | Loss of acetylation at Lys16 and trimethylation at Lys20 of histone H4 is a common hallmark of human cancer | Fraga MF | 2005             | NAT GENET             | 88  | 1277|
| 329    | Global histone modification patterns predict risk of prostate cancer recurrence | Seligson DR | 2005             | NATURE                | 67  | 763 |
| 396    | The complexity of p53 stabilization and activation                     | Lavin MF    | 2006             | CELL DEATH DIFFER     | 18  | 504 |
| 423    | Modification of p53 with O-linked N-acetylglucosamine regulates p53 activity and stability | Yang WH    | 2006             | NAT CELL BIOL         | 22  | 306 |
| 438    | Regulating the p53 pathway: in vitro hypotheses, in vivo veritas       | Toledo F    | 2006             | NAT REV CANCER        | 29  | 1007|
| 531    | How chromatin-binding modules interpret histone modifications: lessons from professional pocket pickers | Taverna SD | 2007             | NAT STRUCT MOL BIOL   | 44  | 1079|
| 540    | Structure, dynamics and functions of promyelocytic leukaemia nuclear bodies | Bernardi R | 2007             | NAT REV MOL CELL BIO  | 14  | 663 |
| 592    | The FoxO code                                                          | Calnan DR   | 2008             | ONCOGENE              | 22  | 853 |
| 717    | Global Histone Modifications in Breast Cancer Correlate with Tumor Phenotypes, Prognostic Factors, and Patient Outcome | Elsheikh SE | 2009             | CANCER RES            | 34  | 280 |
| 827    | G9a and Glp Methylate Lysine 373 in the Tumor Suppressor p53           | Huang J     | 2010             | J BIOL CHEM           | 28  | 272 |
| 858    | Covalent histone modifications — miswritten, misinterpreted and mis-erased in human cancers | Chi P       | 2010             | NAT REV CANCER        | 34  | 774 |
| 910    | p53 post-translational modification: deregulated in tumorigenesis      | Dai C       | 2010             | TRENDS MOL MED        | 35  | 355 |
| 916    | Covalent histone modifications — miswritten, misinterpreted and miserased in human cancers | Saddic LA | 2010             | J BIOL CHEM           | 14  | 146 |
| 1025   | The impact of acetylation and deacetylation on the p53 pathway         | Brooks CL   | 2011             | PROTEIN CELL          | 15  | 199 |
| 1048   | Histone onco-modifications                                             | Fullgrabe J | 2011             | ONCOGENE              | 22  | 190 |
| 1082   | Targeting protein prenylation for cancer therapy                       | Berndt N    | 2011             | NAT REV CANCER        | 15  | 390 |
| 1107   | Global Histone Modifications in Breast Cancer Correlate with Tumor Phenotypes, Prognostic Factors, and Patient Outcome | Gu B       | 2012             | INT J BIOL SCI        | 15  | 142 |
| 1143   | Driver mutations in histone H3.3 and chromatin remodelling genes in paediatric glioblastoma | Schwartzentruber J | 2012 | NATURE               | 34  | 1501|
| 1179   | The functions and regulation of the PTEN tumour suppressor             | Song MS     | 2012             | NAT REV MOL CELL BIO  | 23  | 1319|
| 1774   | PhosphoSitePlus, 2014: mutations, PTMs and recalibrations              | Hornbeck PV | 2015             | NUCLEAR ACIDS RES     | 68  | 1380|
| 2144   | The world of protein acetylation                                       | Drazic A    | 2016             | BRA PROTEINS PROTEOM  | 17  | 331 |

Source: authors with HistCite.
The number correspond to the number in Figure 5.
splicing, nuclear translocation, and actin nucleation (47). Glycan drives multiple biological processes in cancer, such as cell signaling and communication, tumor cell dissociation and invasion, cell-matrix interactions, tumor angiogenesis, immune regulation, and metastasis formation, which provide a specific set of targets for therapeutic intervention in the cancer field (48).

Lysine β-hydroxybutyrylation represents a novel acylation modification of proteins mediated by trihydroxybutyric acid, which was first reported by Professor Zhao’s group at the University of Chicago in 2016. They showed that it is closely related to the regulation of fatty acid oxidative metabolism and energy metabolism, and is involved in numerous biological processes such as tumorigenesis and DNA damage repair processes (49). Additionally, lysine 2-hydroxyisobutyrylation (Khib), a PTM of lysine residues, was discovered in 2014 and represents a highly abundant type of PTM that is widely observed in prokaryotes and eukaryotes (50). Khib occurs on histones and plays an important regulatory role in germ cell differentiation. In addition, Khib is closely related to glucose metabolism, amino acid synthesis, glycolysis, and other biological processes. Khib modifications and their regulation are therefore becoming a hot research topic in the field of epigenetics and metabolic regulation (51, 52).

The second type of keyword, marked in purple in Figure 8A, mainly describes the relationship between histone modification and tumors. The keywords marked in brown in Figure 8A mainly describe the relationship between p53 modification and tumors. The results of keyword cluster analysis and citation path analysis show that the past studies on PTM and tumors are mainly focused on histones and p53, see sub-section on ”Analysis of citation path evolution” for details.

The keywords in yellow in Figure 8A mainly describe the key technologies and databases in the research of PTMs and cancer. Methodologically, the advent of high-resolution mass spectrometry has greatly facilitated the development of proteomics. In 2011, Baylin proposed a comprehensive proteomic PTM analysis using sequence enrichment and reported a mass spectrometry-based method for the comprehensive analysis of protein expression, phosphorylation, ubiquitination, and acetylation through a series of enrichments for different PTMs in the same biological sample. This technique can be used to quantify nearly 8,000 proteins and over 20,000 phosphorylation, 5,000 ubiquitination, and 3,000
acetylation sites per experiment; thus, generating a holistic view of cellular signaling pathways and can be universally applied to any biological model system and PTM (53). Sharma et al. developed a rigorous experimental and computational workflow capable of mapping over 50,000 different phosphorylated peptides in a single human cancer cell line. Their research showed that phospho-Tyr (P-Tyr) is a functionally independent PTM in the eukaryotic proteome, and the low occupancy of P-Tyr loci observed in unstimulated cells is related to a specific cellular control mechanism (54). Next-generation sequencing links epigenetic abnormalities to mutations that control DNA methylation, DNA packaging, and function in chromatin and metabolism (55). This work has contributed to the understanding of the temporal and spatial regulatory roles of post-translational modifications involved in signaling pathways and networks. The investigators’ work on experimental identification will propel PTM research to a new stage.

At present, the development of PTM-related databases is also gradually becoming systematic. This is because, in addition to the previously identified PTMs, new types of PTMs are constantly being discovered, and the relationship and mechanism between various types of PTMs and various tumors are also being explored. The complex relationship between various PTMs and tumors poses a severe test for researchers to search and explore. In the past few years, experts from various countries have developed databases with their own strengths, which provide a great reference value for future researchers. Cuckoo (http://www.biocuckoo.org/index.php) is a working group developed by Yuxue et al. that...
includes predictions, tools, and databases. They also provide a detailed categorization summarizing the 233 databases and computational tools that have been developed to date (http://www.biocuckoo.org/link.php), http://dbPTM.mbc.nctu.edu.tw/ and http://ptmcode.embl.de which can predict potential PTM targets can be used to analyze PTM crosstalk and assess PTM-related diseases. MaxQB database (http://maxqb.) can be used to analyze phosphorylation or other PTMs (48). The UniProt database (http://www.uniprot.org) provides a comprehensive, high-quality, and freely accessible resource of protein sequence and functional information (56). The scientific community can also access information on each acetylation site, such as evolutionarily conserved sequences and local secondary structure predictions for proteins surrounding the acetylation site by Phosida (www.phosida.com). The TP53 database (www.iarc.fr/p53/homepage.htm) compiles various types of data and information from the literature and databases on human TP53 gene variants associated with cancer, which is managed by the National Cancer Institute. Phospho Site Plus (http://www.phosphosite.org) is an open, comprehensive, manually managed, and interactive resource for the study of experimentally observed PTMs, primarily in human and mouse proteins. It contains 130,000 non-redundant modification sites, including phosphorylation, ubiquitination, and acetylation sites. The interface is designed for easy navigation and directly from the homepage, users can initiate simple or complex searches and browse high-throughput datasets using disease, tissue, or cell lines (53).

3.3.3 Analysis of new topics of PTMs in the cancer field

Keyword co-occurrence analysis is one of the effective methods to classify research topics. The burst detection of keywords is usually used to select new topics in specific research areas (13). The keywords that have exploded in recent years are obtained through the CiteSpace software, as shown in Table 5, where the length of the entire row (red and blue bands) in the last column represents the research period (1997–2022), and the red belt represents the outbreak period. Combining the burst section of the keywords shown in Table 5 and the keyword sequence diagram shown in Figure 8B, we can analyze that the new research keywords in recent years are mainly as follows, protein-protein interaction, epithelial-mesenchymal transition, metabolism, self-renewal, mechanism, receptor, recognition, histone ubiquitination, autophagy, and mitochondria. Scholars also began to pay attention to the application of PTMs in the therapy of tumors where hepatocellular carcinoma and pancreatic cancer have been concerned in recent years. These emerging topics not only help us to understand the frontiers of PTMs in cancer research, but also provide a new source of inspiration for future research to put forward new research questions, scientific hypotheses, and viewpoints.

3.4 Advantages and limitations

This research has several unique advantages. First of all, for the first time, we systematically analyzed the publications related to tumor and post-translational modification by using the method of bibliometrics, which can comprehensively guide scholars who focus on this field. Secondly, we give full play to the advantages of these three softwares (CiteSpace, VOSviewer, and HistCite), and make quantitative and qualitative analysis of the literature in this field, so that the data analysis process is objective and credible. Last but not least, compared with traditional reviews, bibliometrics analysis has unearthed the internal relations among literatures and potential emerging themes in this field, and presented them to readers in a visual way, so that readers can better understand the developing research focus and trends, which undoubtedly laid a foundation for scholars to quickly understand the historical context, knowledge base and development trend of this field. Although it has stability and objectivity, it also has its limitations. In order to meet the requirements of data analysis, we only use English literature published in the WOSCC database. Therefore, the inclusion of papers published in other languages from other databases may increase the rigor of the research.

4 Conclusion

There is no doubt that through high-quality research in the past 25 years, we have made great progress in our understanding of post-translational modifications. With the help of information
visualization, we can determine the research focus and overall trend in this field, and provide reference information to future researchers. The rapid development of mass spectrometry and the establishment of numerous databases have greatly facilitated the development of proteomics and research on PTMs in the cancer field. Previous studies have mainly focused on histone and p53 modifications. In recent years, researchers have shifted from the study of a single PTM type to the interaction between multiple protein modifications, and paid attention to tumor self-renewal, looking for new receptors and targets. New therapeutic targets in PTMs may be the focus of future research.

Data availability statement

The original contributions presented in the study are included in the article/Supplementary Material. Further inquiries can be directed to the corresponding author.

Author contributions

RM and ZB conceived and designed the structure of this manuscript. MZ and RM wrote the original draft. YM collected the data. JL and JX performed the analysis. JT and ZM proofread all data and figures. BH, TC, and ZB revised the paper. All authors contributed to the article and approved the submitted version.

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TABLE 5 The top 30 Keywords with the Strongest Citation Bursts.

| Keywords                                      | Strength | Begin-End     | 1997 - 2022 |
|----------------------------------------------|----------|---------------|-------------|
| messenger rna                                | 5.5      | 1997-2005     |             |
| tumor suppressor protein                     | 7.37     | 2000-2012     |             |
| mass spectrometry                            | 8.39     | 2001-2011     |             |
| signal transduction                          | 6.15     | 2001-2006     |             |
| farnesyltransferase inhibitor                | 5.05     | 2001-2008     |             |
| c terminal domain                            | 5.00     | 2002-2010     |             |
| endothelial growth factor                    | 6.23     | 2003-2011     |             |
| endoplasmic reticulum                        | 5.83     | 2004-2011     |             |
| dna binding                                  | 5.17     | 2004-2009     |             |
| wild type p53                                | 5.01     | 2004-2009     |             |
| ionizing radiation                           | 7.97     | 2005-2011     |             |
| histone deacetylase inhibitor                | 6.51     | 2006-2012     |             |
| prostate cancer cell                         | 5.51     | 2007-2012     |             |
| cell cycle arrest                            | 8.25     | 2008-2015     |             |
| transcriptional activity                     | 6.95     | 2009-2015     |             |
| quantitative proteomics                      | 7.76     | 2010-2012     |             |
| RNA polymerase II                            | 5.31     | 2011-2015     |             |
| ubiquitin                                    | 5.08     | 2012-2019     |             |
| chromatin                                    | 5.54     | 2013-2017     |             |
| gastric cancer                               | 5.07     | 2015-2018     |             |
| protein phosphorylation                      | 7.14     | 2016-2020     |             |
| stress                                       | 5.35     | 2016-2020     |             |
| protein-protein interaction                  | 5.15     | 2017-2019     |             |
| therapy                                      | 5.04     | 2017-2018     |             |
| epithelial mesenchymal transition            | 7.88     | 2018-2020     |             |
| self renewal                                 | 5.57     | 2018-2020     |             |
| metabolism                                   | 5.3      | 2018-2022     |             |
| mechanism                                    | 6.52     | 2019-2022     |             |
| recognition                                  | 5.73     | 2019-2022     |             |
| receptor                                     | 5.02     | 2019-2020     |             |

Source: authors with CiteSpace.
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Conflict of interest

The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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Supplementary material

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fonc.2022.978464/full#supplementary-material
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