

Monitoring the developmental trend and competitive landscape of natural gas hydrate using patent analysis

Zhenfeng LIU (✉ zfliu@shmtu.edu.cn)

Shanghai Maritime University School of Economics and Management <https://orcid.org/0000-0002-1808-9352>

Pianran Lü

Shanghai Maritime University School of Economics and Management

Jian FENG

Shanghai Maritime University, China Institute of FTZ Supply Chain

Lorna UDEN

Staffordshire University, School of Computing

Research Article

Keywords: patent analysis, developmental trend, competitive landscape, natural gas hydrate, ITGInsight

Posted Date: July 10th, 2023

DOI: <https://doi.org/10.21203/rs.3.rs-3087553/v1>

License:   This work is licensed under a Creative Commons Attribution 4.0 International License.

[Read Full License](#)

1 **Monitoring the developmental trend and competitive landscape of natural gas**

2 **hydrate using patent analysis**

3 Zhenfeng Liu^a, Pianran Lü^a, Jian Feng^b, Lorna Uden^c

4 ^a School of Economics and Management, Shanghai Maritime University, Shanghai 201306, China

5 ^b China Institute of FTZ Supply Chain, Shanghai Maritime University, Shanghai 201306, China

6 ^c School of Computing, Staffordshire University, Stoke-on-Trent ST4 2DE, United Kingdom

7 * Correspondence: zfliu@shmtu.edu.cn

8

9 **Abstract:** Natural gas hydrate (NGH) is an important alternative energy resource to achieve carbon neutral. The
10 developmental trend and competitive landscape of NGH exploitation and production play a crucial role for policymakers
11 in government, managers of enterprises, and science researchers. This paper proposes a new framework to carry out in-
12 depth analysis of NGH by combining patentometrics, technologies evolution and correlation relationships to monitor
13 developmental trends and competitive landscape using patent analysis. The results show that China, the US, and Japan
14 hold a clear advantage using patents analysis. The current technological development in NGH field is more oriented
15 towards extraction technologies, equipment, and processing systems. The co-opetition analysis among countries reveals
16 that the largest international cooperation network is mainly in Europe and the United States, while national partnerships
17 in Asia are mainly in China and Japan. The cooperation among institutions is still low and occurs mainly within
18 universities in China, whereas both the US and Japan have cooperation between enterprises. The competitive landscapes
19 of NGH-related key technologies among countries and institutions are also discussed. This study not only contributes
20 to monitoring the developmental trend and competitive landscape in NGH but also provides policy recommendations
21 for the government and enterprises on strategic management and collaborative innovation.

22 **Keywords:** patent analysis, developmental trend, competitive landscape, natural gas hydrate, ITGInsight

23

1 Introduction

25

26

27

28

29

30

31

32

33

34

35

36

As the energy crisis worsens, and the development and utilization of new energy sources is gaining widespread attention (Vedachalam *et al.*, 2015). Natural gas hydrate (NGH) is a crystalline solid formed by a mixture of methane and water under high pressure or low temperature. It is known as combustible ice, which is widely distributed on the marine sediments and terrestrial permafrost (Kvenvolden, 1988; Zhao *et al.*, 2022). NGH has become an important transitional energy source in the process of achieving carbon peaking and carbon neutrality in Europe, the United States of America (US), and China. (Wei *et al.*, 2021) because of its cleanliness, accessibility, wide distribution, ease of storage and security of supply. Currently, there are over 230 areas worldwide where NGH are to be explored and developed, and the global resource of NGH is approximately 2.1×10^{16} cubic metre, which is twice the total resources of existing fossil energy on land (coal, oil, and the standard NGH) (Kvenvolden, 1999; Musakaev, Khasanov and Borodin, 2018). NGH has become one of the most promising new energy resources and is considered to be an ideal alternative energy source for the 21st century (Collett and Dallimore, 1999; He *et al.*, 2021; Makogon, Holditch and Makogon, 2007). It has attracted a growing number of companies and academics worldwide to conduct relevant research.

37

38

39

40

41

42

43

44

45

46

47

48

49

50

51

52

53

54

55

56

57

58

Many countries around the world are actively developing NGH industry including the US, Russia, Canada, Japan, Korea, China, and India. The US is at the forefront of NGH research in the world and is the most active in research into exploration and extraction techniques. In 1968, the US conducted its NGH investigation at the Black Sea Plateau (Chazallon *et al.*, 2021). Until the 21st century, research efforts on marine NGH in the US have focused on the Gulf of Mexico. In Japan, the exploration program for NGH in the Nankai Trough was made a priority in 1995, and large-scale exploration tests for NGH samples were conducted in the eastern part of the Nankai Trough from 1999 to 2000, but the expected high grade NGH deposits were not found (Oyama and Masutani, 2017; Tsuji *et al.*, 2004). China's NGH resources in the South China Sea are huge, about 80 billion tonnes of oil equivalent, which is equivalent to more than half of China's total onshore oil and gas resources (Gao, 2020; Kong *et al.*, 2018). On May 18, 2017, China announced the successful test mining of NGH, which was the world's first that achieve the continuous and steady flow of gas from NGH in marine area (Li *et al.*, 2018). However, NGH exploitation and production has fallen far short of public expectations, even though NGH has attracted a lot of attention from academics and countries. However, the current NGH technologies are not yet ready for large-scale industrial mining. At present, NGH is still at the early stage of commercialization, and the economics of extraction under existing technology and resources are low (Ye *et al.*, 2022). Hence there exists a considerable gap from research and development (R&D) to the mass production for NGH. Moreover, because of the importance of NGH as an alternative to existing energy sources, various countries are pressing ahead with R&D and strategic deployment of NGH-related technologies (Kong *et al.*, 2018). Therefore, it is crucial for researchers and engineers to understand the developmental trends for forecasting technology opportunities in NGH. Meanwhile, evaluating the competitive landscape of NGH technology is crucial for policymakers and managers to create an effective R&D strategy. Understanding the developmental trends of NGH is helpful for us to grasp the history of technological development, identify current research hotspots and indicate R&D directions (Wang, X. *et al.*, 2022). Technological competitive landscape analysis refers to the process of analyzing and determining external scientific and

59 technical information that can have a significant impact on the organization's competitive position (Li *et al.*, 2022;
60 Wang, X. *et al.*, 2022).

61 The existing literature on the developmental trends and the competitive landscape in NGH is still in its infancy,
62 such as identifying research hotspots and frontiers by using bibliometrics analysis (Seo, Han and Sohn, 2015), statistical
63 analysis (Wang, H. *et al.*, 2022), and systematic literature review on the NGH-related technologies (Komatsu *et al.*,
64 2013; Veluswamy *et al.*, 2018; Wei *et al.*, 2022; White *et al.*, 2020; Wu *et al.*, 2021). Despite this, there is a lack of
65 patent-based reviews and bibliometrics on the various technical themes of marine NGH. Because of the high complexity
66 and uncertainty nature of NGH exploitation and production, it is difficult to evaluate the developmental trends and the
67 competitive landscape with bibliometrics or literature review. To address this, it is our belief that patents, which
68 comprises about 80% of the world's technology knowledge, can be used as an important pillar for forecasting technology
69 opportunities and making strategic decisions by government and firms. Because patents data contains key research
70 findings, it is ideal as a strong indicator of technological innovation and progress. The study of patents allows us to
71 understand competitors and competing technology, and to identify developments and trends in related technological
72 topics in different countries (Mogee, 1991). According to the statistics of the World Intellectual Property Organization
73 (WIPO), patent documents cover 95% of human scientific research achievements. Effective use of patent information
74 can reduce the costs of R&D, shorten its time (Cantwell and Janne, 1999), and speed up R&D and inventions process
75 (B. Jin *et al.*, 2011). Due to the importance of NGH as potential alternative energy source, major countries around the
76 world have to started commercial exploitation of NGH. Although patent analysis is used in energy research (Assunção
77 *et al.*, 2021; Block and Song, 2022; Luan, Sun and Wang, 2021; Yin, Gu and Zhang, 2020), but it is rarely studied in
78 NGH. This study presents patent analysis in the NGH by focusing on the following issues:

79 1) What are the overall patent layout in the NGH field, including time span, countries, patentees and technology
80 classification?

81 2) What are the technological development trends in the NGH field from the perspective of technology topics and
82 their evolution?

83 3) What is the competitive landscape in the NGH field, including national or institutional competition?

84 To address these issues, this study proposes a framework to monitor the developmental trend and competitive
85 landscape of technologies related to marine NGH. First, from the perspective of patentometrics, we conducted an overall
86 layout of patents, including the application trends, country, patentee, and hot technology area distribution. Then, based
87 on the subject terms, the evolutionary paths of NGH related technologies are analysed, which are used to determine
88 technological development trends. Finally, by means of correlation calculations and clustering, we analysed the
89 competition and cooperation landscapes among countries and institutions in the key technical fields.

90 The general structure of this study is as follows. Section 2 describes the rules for retrieving and preprocessing of
91 the data, as well as the methods and principles used in the subsequent analysis. In Section 3, we first provide a general
92 overview of the patent data, then we examine developmental trends through technological evolutionary approaches, and
93 finally we analyse the competitive landscape among countries and institutions, respectively. Finally, in Section 4, we
94 conclude the results of this study's analysis and make recommendations.

95 **2 Data and method**

96 **2.1 Data source and preprocessing**

97 This study focuses on marine gas for the following reasons. Firstly, , more than 90% of NGHs occur in submarine
98 sediments at shelf margins, and less than 10% are distributed in fractures and pores of rocks in continental permafrost
99 (Qin *et al.*, 2022). Secondly, following a preliminary search of patents we found that the patents are mainly distributed
100 in marine NGH related technologies. All the data in this research came from Derwent Inovations Index (DII), and since
101 this study focuses on patent4s related to marine NGH, we added some criteria to correct the results when retrieving the
102 data. We created the following retrieval strategy: TS = (“natural gas hydrate*” OR “gas hydrate*” OR “methane
103 hydrate*” OR “clathrate hydrate*” OR “ch4 hydrate*” OR NGH OR “combustible ice” OR “flammable ice”) AND
104 (“deep water” OR sea OR ocean OR offshore OR off-shore OR “off shore” OR subsea OR marine), A total of 806 patent
105 data were obtained to 2021, using Excel and ITGInsight for analysis and visualisation of the acquired data.

106 **2.1.1 Institutions merging**

107 In order to eliminate data confusion and facilitate analysis, we combined institutions with different forms of
108 expression, but belonging to the same company. For example, CHINA NAT OFFSHORE OIL CORP. In the data, there
109 are 6 institutions whose full names are not exactly the same but have the same abbreviation, we define these data as
110 from CNOOC and merge them. However, for universities and research institutes, we believe that there is no strong
111 connection between sub-institutions from the same institution in different regions and they can be regarded as
112 independent institutions, such as the research institute of the Chinese Academy of Sciences in various places, UNIV
113 CHINA PETROLEUM HUADONG and UNIV CHINA PETROLEUM BEIJING.

114 **2.1.2 DMCs filtering**

115 The Derwent Manual Code (DMC), given by the Derwent indexing experts for each patented technology, is used
116 to reveal and express the technical innovation of an invention and its applications. Past research showed that a DMC-
117 based analysis of a patent can reveal all technology areas it relates to in detail (Aaldering and Song, 2019; Wei *et al.*,
118 2017). The DMCs shown in **Table 1** below were removed from the top 40 DMCs ranked by number of patents. The
119 descriptions of many DMCs are very common (Q49-V35, D04-B07F, etc.) or too broad (Q49-E05, E10-J02D1, etc.).
120 For these reasons, they may overwrite those DMCs with less numbers but more important or more detailed classification,
121 resulting in unsatisfactory or inaccurate analysis. In this study, we used a filtering rule to count the top 10 DMCs sorted
122 by number of patents, analyse the evolution of DMCs in the past 20 years, and define the technical fields of institutions
123 and the competition between them.

124 **Table 1** Removed DMCs

DMC	Description	Count
Q49-V35	Fluids, slurry	270
D04-B07F	Desalination of brine or sea water	28

H01-D	Producing crude oil and natural gas	25
Q49-E05	Underwater	25
H06-A02	(Liquefied) Natural gas	24
E10-J02D1	Methane	23
D04-A01	Purification of water [general]	18
H01-F	Natural gas [unclassified]	12

125 **2.1.3 Subject terms filtering**

126 In order to obtain the wanted subject terms, we need to perform some deletion and processing on meaningless or
 127 repeated words in records. First, after obtaining all the records of subject words, by calculating the similarity between
 128 words, we integrated the entries with a similarity value above 95.0, which means that these words represent the same
 129 meaning. Some of them used different words but mean the same, such as “riser tube” and “riser pipe”, and some of
 130 them are just words in different tenses, or the same words but in a reversed order, such as “oil production” and
 131 “product oil”. Then we calculate the PC-value of all words, which is a method of counting the frequency of
 132 occurrence of words in all patent records and with high precision. The formula for calculating the PC-value is :

$$133 \quad PC - value(a) = \begin{cases} \log_2^{|a|} f(a) + 2^{|a|-2} g(a) & a \text{ is not nested} \\ \log_2^{|a|} (f(w) - \frac{1}{|T_a|} \sum_{b \in T_a} f(b)) + 2^{|a|-2} g(a) & otherwise \end{cases}$$

134 a represents the subject word to be calculated, $|a|$ means the length of this word, and $f(a)$ indicates its frequency of
 135 occurrence in thesaurus, $g(a)$ indicates its frequency of occurrence in patent. b is an extracted candidate word that
 136 contains a , $f(b)$ means the total frequency of occurrence of b in the thesaurus. T_a is the set of extracted candidate
 137 terms that contain a , and $|T_a|$ is the count of terms in the set (Wang, Zhang and Liu, 2021a). After the calculation, we
 138 rank the subject words according to their PC-value and only select the words whose PC-value is above 1. Thirdly, by
 139 manually checking and filtering, we remove those words that were not meaningful for the analysis of this study
 140 among the words left in the previous step of screening. Such terms tend to appear numerous, frequent, and recurring
 141 in many patent data, not only confounding our analysis results, but also masking more important terms, for example,
 142 sea water, gas hydrate, natural gas hydrate, diagram, degree c and so on.

143 Finally, the most important step is that we used these terms that have completed the above process to generate a
 144 subject terms dictionary, which can help us limit the analysis content, refine the objects and reduce the interference with
 145 the research results in subsequent analysis. All the analyses involving subject words in this study were carried out based
 146 on the processed dictionary, rather than the fully original data.

147 **2.2 Method**

148 In this section, we present the main analysis methods used in this study, namely: the construction of patent
 149 relationship matrixes from the retrieved data; the determination of technology evolution paths based on the different
 150 ways in which technologies diverge; principles for determining the competitive landscape among countries and

151 institutions; and the generation, and optimisation of visualisation graphs.

152 2.2.1 Patent matrixes construction

153 In order to construct the coorelation and cooperation networks used in the later analysis, we first need to determine
 154 the affiliation of each patent and construct an affiliation matrix for the patents. Record the order in which each research
 155 entity appears in each patent, and the order of the first occurrence shall prevail when the same entity appears multiple
 156 times in a patent. Assuming that there are n research entities and m patents, construct a matrix about the affiliation
 157 between research subjects and patents.

$$158 \mathbf{A} = \begin{pmatrix} (b_1 \ b_2 \ b_3)_{11} & (b_1 \ b_2 \ b_3)_{12} & \cdots & (b_1 \ b_2 \ b_3)_{1j} & \cdots & (b_1 \ b_2 \ b_3)_{1m} \\ (b_1 \ b_2 \ b_3)_{21} & (b_1 \ b_2 \ b_3)_{22} & \cdots & (b_1 \ b_2 \ b_3)_{2j} & \cdots & (b_1 \ b_2 \ b_3)_{2m} \\ \vdots & \vdots & \vdots & \vdots & \vdots & \vdots \\ (b_1 \ b_2 \ b_3)_{i1} & (b_1 \ b_2 \ b_3)_{i2} & \cdots & (b_1 \ b_2 \ b_3)_{ij} & \cdots & (b_1 \ b_2 \ b_3)_{im} \\ \vdots & \vdots & \vdots & \vdots & \vdots & \vdots \\ (b_1 \ b_2 \ b_3)_{n1} & (b_1 \ b_2 \ b_3)_{n2} & \cdots & (b_1 \ b_2 \ b_3)_{nj} & \cdots & (b_1 \ b_2 \ b_3)_{nm} \end{pmatrix}$$

159 In this matrix: $b_i = 1$ or $b_i = 0$, $\sum_{i=0}^3 b_i = 1$ or $\sum_{i=0}^3 b_i = 0$; $(b_1 \ b_2 \ b_3)_{ij} = (1, 0, 0)_{ij}$ means subject i is the
 160 first author of patent j ; $(b_1 \ b_2 \ b_3)_{ij} = (0, 1, 0)_{ij}$ means subject i is the second author of patent j ; $(b_1 \ b_2 \ b_3)_{ij} =$
 161 $(0, 0, 1)_{ij}$ means subject i is the third author or the author after third of patent j ; $(b_1 \ b_2 \ b_3)_{ij} = (0, 0, 0)_{ij}$ means
 162 subject i is not the author of patent j .

163 Based on matrix \mathbf{A} , we can then construct the cooperation matrix \mathbf{B} for the cooperation network. Caculate the sum
 164 of the number of patents for each subject as the first, second and third author respectively, constuct a quantity matrix \mathbf{B}
 165 as follows:

$$166 \mathbf{B} = \begin{pmatrix} \sum_{j=1}^m (b_1)_{1j} & \sum_{j=1}^m (b_2)_{1j} & \sum_{j=1}^m (b_3)_{1j} \\ \sum_{j=1}^m (b_1)_{2j} & \sum_{j=1}^m (b_2)_{2j} & \sum_{j=1}^m (b_3)_{2j} \\ \vdots & \vdots & \vdots \\ \sum_{j=1}^m (b_1)_{ij} & \sum_{j=1}^m (b_2)_{ij} & \sum_{j=1}^m (b_3)_{ij} \\ \vdots & \vdots & \vdots \\ \sum_{j=1}^m (b_1)_{nj} & \sum_{j=1}^m (b_2)_{nj} & \sum_{j=1}^m (b_3)_{nj} \end{pmatrix}$$

167 In this matrix, $\sum_{j=1}^m (b_1)_{ij}$, $\sum_{j=1}^m (b_2)_{ij}$, $\sum_{j=1}^m (b_3)_{ij}$ represent the sum of the number of patents for subject i as the
 168 first, sencond and third author respectively.

169 Construct cooperation matrix \mathbf{AA}' with matrix \mathbf{A} . Among them, matrix \mathbf{A} is a matrix of order $n \times 3m$, \mathbf{A}' is a
 170 matrix of order $3m \times n$, so \mathbf{AA}' is a matrix of order $n \times n$. Assume that $\mathbf{AA}' = (a_{ij})_{nm}$, for every element a_{ij} :

$$a_{ij} = \mathbf{A}_i \mathbf{A}_j' = ((b_1 \ b_2 \ b_3)_{i1} \ (b_1 \ b_2 \ b_3)_{i2} \ \cdots \ (b_1 \ b_2 \ b_3)_{im}) \times \begin{pmatrix} (b_1 \ b_2 \ b_3)'_{j1} \\ (b_1 \ b_2 \ b_3)'_{j2} \\ \vdots \\ (b_1 \ b_2 \ b_3)'_{jm} \end{pmatrix}$$

Since the correlation network of this study is based on DMC, we construct the co-occurrence matrix of DMC. The co-occurrence matrix \mathbf{C} is constructed based on research entities and DMC as follows:

$$\mathbf{C} = \begin{pmatrix} d_{11} & d_{12} & \cdots & d_{1k} & \cdots & d_{1l} \\ d_{21} & d_{22} & \cdots & d_{2k} & \cdots & d_{2l} \\ \vdots & \vdots & \vdots & \vdots & \vdots & \vdots \\ d_{i1} & d_{i2} & \cdots & d_{ik} & \cdots & d_{il} \\ \vdots & \vdots & \vdots & \vdots & \vdots & \vdots \\ d_{n1} & d_{n2} & \cdots & d_{nk} & \cdots & d_{nl} \end{pmatrix}$$

In this matrix, d_{ik} represents the number of times DMC_k appears in the patents filed by subject A_i ; n means the total number of research subjects, l means the total number of DMCs in all patents.

As the calculation of the correlations in the analysis software we used: ITGInsight, is based on co-occurrence. Therefore, finally, by matrixes \mathbf{A} and \mathbf{C} , we can be able to obtain the correlations between the research entities and draw the relative diagrams.

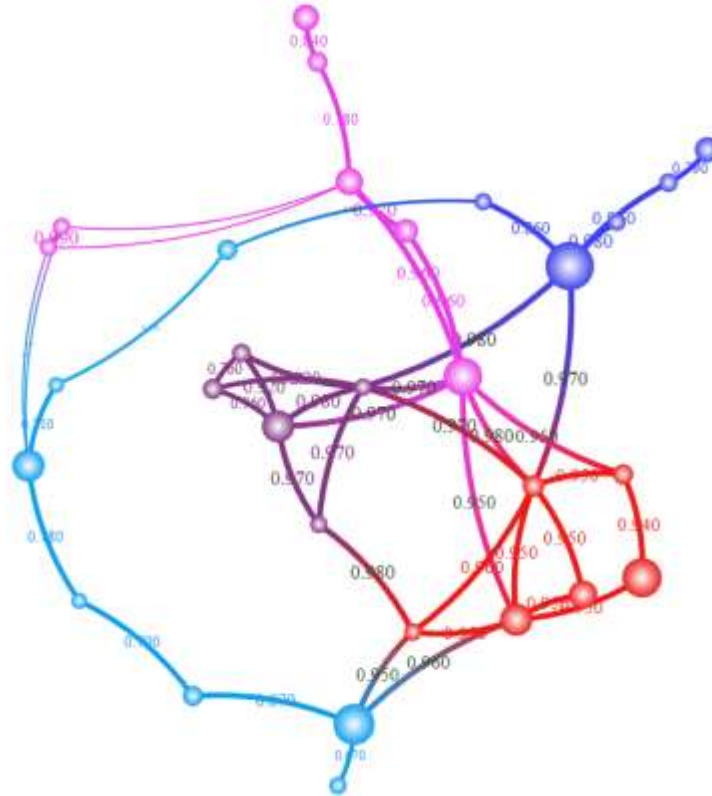
2.2.2 Technology evolution analysis

By comparing the year-by-year changes in the number of patent applications in a certain technical field and studying its evolutionary process, we can see the development history of its technologies and analyse the future development trend, or to identify emerging technologies or those that are gradually being eliminated, find the weak points or hot spots in the field, and predict future research. As shown in the evolutionary map in Section 3.2, each color represents a subject term, the length of every rectangle is proportional to the number of occurrences of the corresponding subject term, and the thickness of the connection lines is related to the relationship strength between the two rectangles.

The path and direction of technology evolution can be shown by the different ways in which the rectangles are connected to each other. There are four different types of connections, representing five different evolutionary processes. First, two rectangles of the same color with only one normal line between them, means the evolution of the same technology in these two years, and the trend of increasing or decreasing can be seen, which may indicate gains or losses in importance. Second, if there is no line between a rectangle in one year and any rectangle in the next year, it means that this technology has not been used in the patent filed in the second year; If there is a rectangle that has no line with any rectangle in the previous year, it may be an emerging technology. Third, one rectangle has several lines to connect it with two or more rectangles in the following year, this means that one technology has differentiated into more technologies, and it is a refinement of it, showing the trend of further research and application, or a few technologies that are closely related to it. Fourth, several rectangles in one year are connected to only one rectangle in the next year, indicating the merger of technologies (Wang *et al.*, 2021b).

198 **2.2.3 Competition analysis**

199 Using the method described in Section 2.2.1, we generate a correlation network between the entities, as shown in
200 **Fig. 1**. Each node represents an entity, the size of a node is proportional to its number of patents. The edges between the
201 nodes represent the relationship between two entities, the thickness of which is proportional to the strength of the
202 association, and the strength values are marked on the edges. We use the strength value in the network to represent the
203 competitive relationship and cooperative relationship between entities. Larger strength values represent stronger
204 connections, and vice versa.



205
206 **Fig. 1** Sample network of correlation relationship

207 Because there is less cooperation between countries on key technologies, we will only develop our analysis through
208 the correlation network. Due to the relationship shown in the image is between countries of origin or priority, we can
209 derive the competitive relationship between countries only through the correlation network. A node contains the patent
210 applicants or institutions belonging to that country, and there are no cases where the same patent is filed in more than
211 one region, resulting in a link between two regions. Therefore, we can analyse the areas of competition and the intensity
212 of competition directly.

213 In contrast to countries, cooperation between institutions on patented technologies is more common, especially
214 between institutions in the same country. Thus, we need to exclude the interference from their cooperation when
215 analyzing the competitive relationship based on correlation networks, and we will do so by comparing the cooperation
216 and correlation networks. If there is no line or a very thin line between two nodes shown in the former, and a thick line

217 between the same two nodes in the latter, we can then define that there is a clear competition between the institutions
218 represented by these two nodes. Due to our simplification of the image, isolated nodes are removed, which will result
219 in the nodes shown in the two images generated by using the same data not exactly being the same. While we are using
220 the rule that was mentioned above to search for competitive relationships, we may find that a node that shows a strong
221 connection with another node in the correlation network does not appear in the cooperation network, and in this case,
222 we can judge the existence of a competitive relationship only through the correlation network.

223 **2.2.4 Visualisation graphs generation**

224 We chose algorithm LinLog to complete the layout of nodes during the visualisation process. LinLog algorithm is
225 proposed by Andreas Noack, and the energy expression of this algorithm was defined as (Esposito, 1988) :

$$226 \quad U_{LinLog}(p) = \sum_{\{u,v\} \in E} \|p_u - p_v\| - \sum_{\{u,v\} \in V^2} \ln \|p_u - p_v\|$$

227 In this formula, p_u , p_v represents the location of node u and node v respectively, and $\|p_u - p_v\|$ means the
228 distance between nodes u and v . On the right side of the equation, the first part means the attractive force between
229 adjacent nodes, and the second part means the repulsive force between them. To avoid the situation of infinite energy,
230 we need different nodes in different positions, and the least amount of energy represents the best layout.

231 After producing the desired diagrams, we need to refine and compress them further so that relationships with high
232 correlation strength can be highlighted. There are two methods used in such a process:

233 (1) Using the Pathfinder algorithm. The algorithm was designed to analyse data similarity in 1990 by American
234 psychologist Schvaneveldt, Durso and Dearholt (1989), by keeping the strongest connection among all possible paths
235 between two nodes after checking the association between all data, by establishing the most efficient connection path.

236 (2) Setting a threshold. By choosing a suitable value as the threshold, we can make the visualisation only show the
237 lines that exceed the set threshold. This approach offers us a way to improve the image that is not only simple but also
238 easy to understand and interpret. The image can also be adjusted flexibly according to different datasets to meet the
239 needs of different analysis. By filtering out a part of the connection in this way and re-laying it, the image can be
240 further optimized.

241 **2.3 Research Framework**

242 We integrate the methods mentioned above into the following research framework in **Fig. 2**.

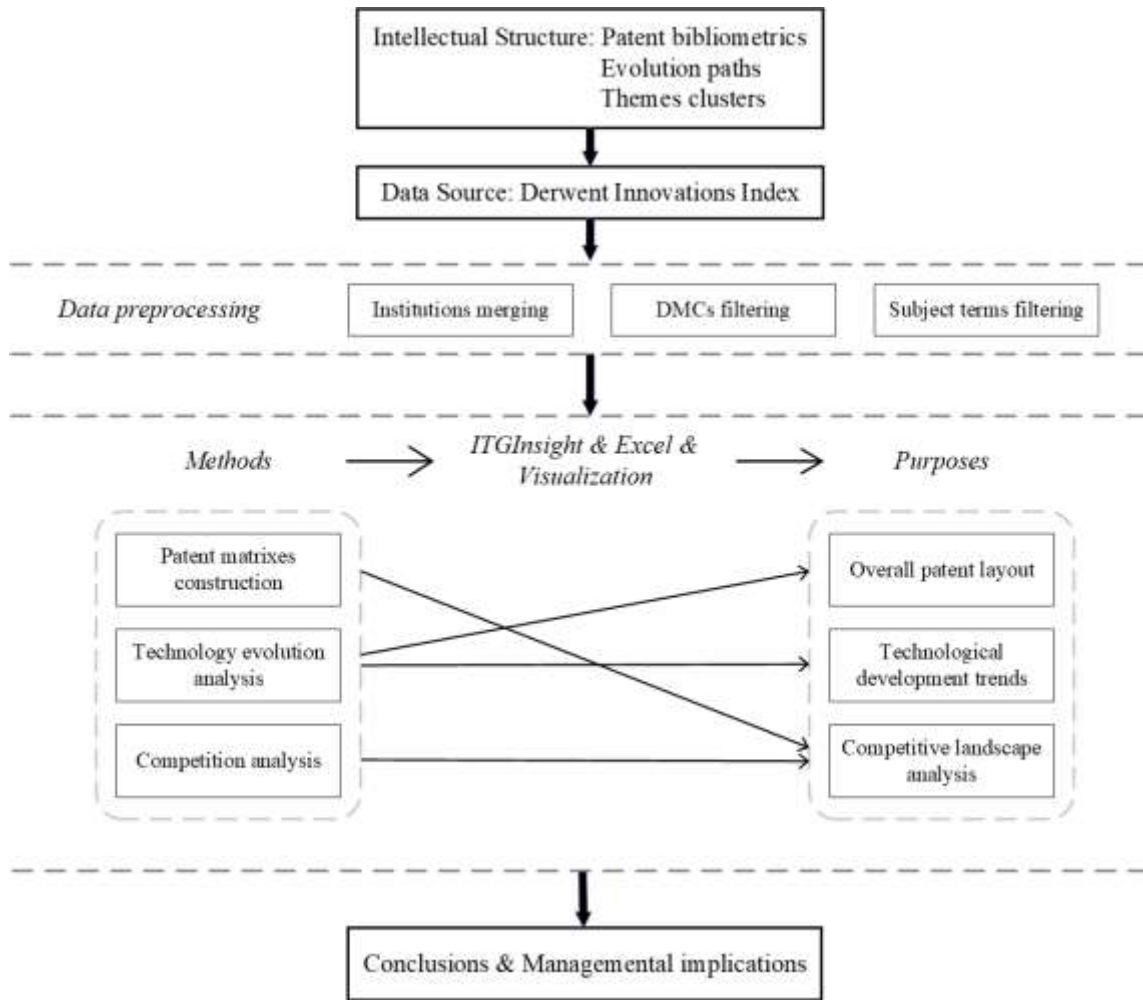


Fig. 2 Research framework

3 Results and discussion

In this section, we will analyse and discuss the results from the following three perspectives: a general overview of patent data, trends in technological evolution, and an analysis of the competitive landscape.

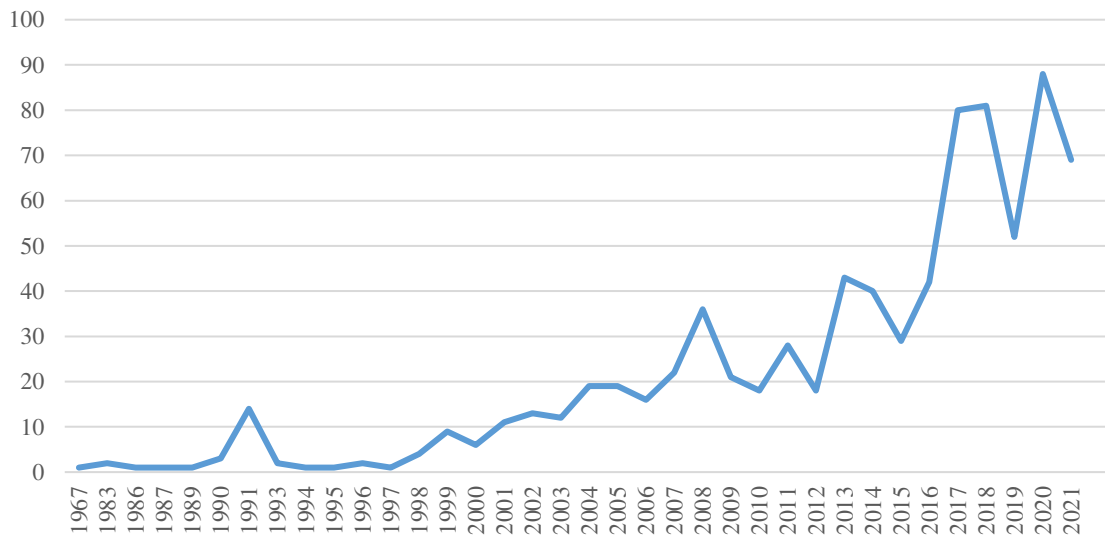
3.1 Overall patent layout

In order to obtain a comprehensive overview of patent layout and filing trends, we analyse the patent data and discuss the results from four perspectives: temporal, geographical, patentee and technology classification, respectively.

3.1.1 Time span analysis

The trend of the number of patent applications over time can only reflect the development trend of scientific and technology innovation in a research field, but also the active degree of its innovation. We counted the number of applications by year for the patents retrieved, as shown in Fig. 3. Fig. 3 shows that the technologies related to the patent of marine NGH have been developed since 1967. In 1967, the first patent application was made by SHELL OIL CORP

256 of the US. **Fig. 3** also shows the annual change in the number of global patent applications in the field of marine NGH.
 257 As can be seen, the technologies for these have been developed since 1997. The intuitive reason may be that Kyoto
 258 Protocol, which was developed by international climate organisations in 1997, a decade-long development of emerging
 259 alternative energy sources was spawned. After a brief surge in 2006, there has been sustained and significant rapid
 260 growth since 2015, and reached the peak for patent applications in 2020. Possible explanations for this apparent increase
 261 is that in 2016, the Paris Agreement called for a "global average temperature increase of less than 1.5°C by the end of
 262 the 21st century" (UNFCCC, 2015). This attributes to the increase in research over the last five years, as a bridge energy
 263 for the transition from fossil fuel to energy, NGH is a focus of attention for all parties.



264 **Fig. 3** Global patent application trend of marine NGH patent technology

265 **3.1.2 Geographical analysis**

267 Over the past 20 years, the number of patent applications for marine NGH has continued to rise. Since 2021, more
 268 than 30 countries or regions have applied for related patents. In order to reveal the trend of the major patent application
 269 countries and forecast changes of related technologies in the global market, we chose the top 10 countries to draw the
 270 evolution map. Considering that many countries may apply for patents in WIPO, we removed it from the data records,
 271 and merged data belonging to Russia and the Soviet Union. Each color represents a country; the country's name is
 272 marked on the rectangle using an abbreviation; and the length of the rectangle is proportional to the number of patents
 273 applied for by the corresponding country.

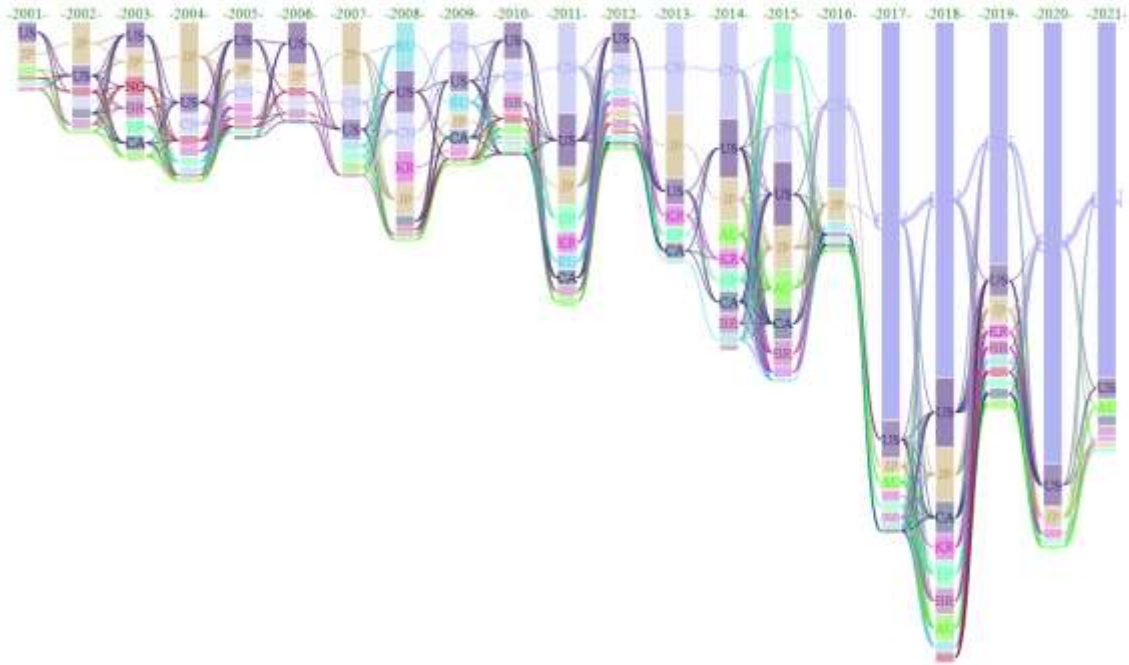


Fig. 4 Evolution map of the top 10 countries in the past 20 years

As shown in **Fig. 4**, the number of patent applications in the US has maintained a steady growth rate with a slight decline in recent years, and reached a maximum of 13 in 2018. With an abundance of fossil energy, the need for NGH in the US is not in demand. USA has performed three mining tests of NGH with Canada. In recent years, the US has invested less in NGH research but continues to support basic science research and participate in major international hydrate programs. In contrast, due to the lack of energy resource, Japan attaches great importance to the investigation and exploitation of NGH. Japan's NGH R&D plan for the 21st Century, which began in 2000, covers all aspects of NGH exploration, development, environmental impact, as well as engineering options for offshore mining and commercialization studies. The search for safe and reliable energy has always been a top priority in Japan's national energy policy and innovation policy, and NGH have once again become a hot topic following the nuclear power plant incident in Fukushima in 2011. It has conducted two NGH exploitation tests in the Nankai Trough in 2013 and 2017 (Zhu *et al.*, 2020). However, neither of the two field test in 2017 resulted in significant production increases, and the number of patent applications in Japan has also show a downward trend in the past 3 years.

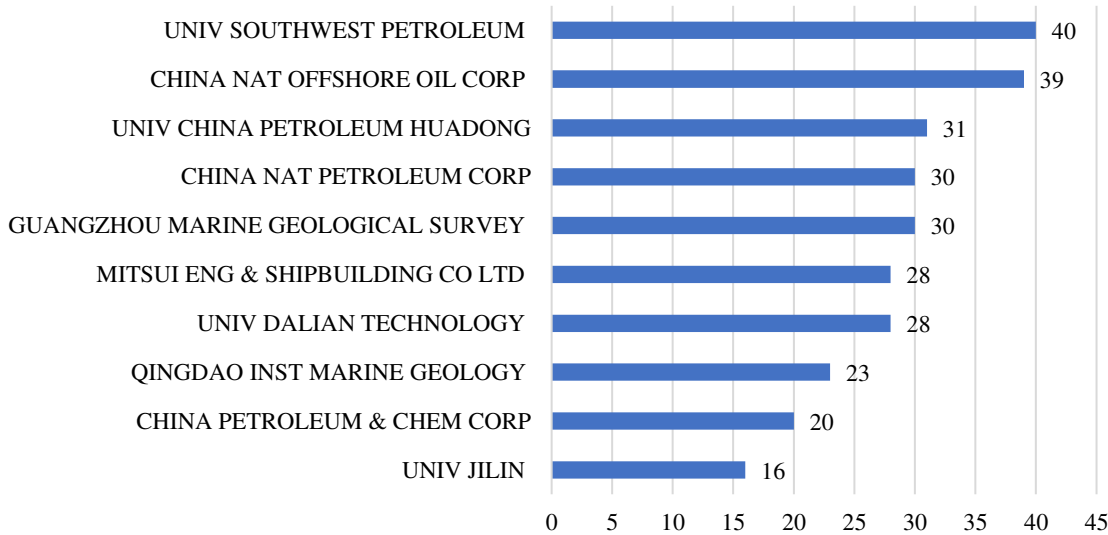
The number of patent applications in China was a relatively small part of the global total until 2010. It start to grow steadily from 2011 to 2014, and has risen significantly from 2015. Since 2015, the annual applications have accounted for more than half of the global total. It reached a peak of 82 applications, accounting for 92% of the annual global application volume in 2020. The number of Chinese patents in the last six years is surging. There are two reasons for this. Firstly, it is due to the confirmation of a super 100 billion cubic metre gas hydrate deposit in the Shenhu sea area in 2015 and the identification of hydrate drilling targets in 2016 (Tan, Pan and Liu, 2016). Secondly, according to the *The Report of China Mineral Resource Reserves, 2018*¹, the preliminary forecast for gas hydrate resources in China's

¹ <http://en.cgsjournals.com/article/doi/10.31035/cg2018100>

295 waters is about 8×10^{10} t of oil equivalent, which is equivalent to more than half of China's total onshore oil and gas
296 resource.

297 3.1.3 Patentee analysis

298 As shown in Fig. 5 nine of the top ten institutions come from China. It shows that although China started late in
299 the field of marine NGH, it has caught up with other countries in terms of the number of applications. These institutions
300 mainly come from universities and research institutes, which means that the marine NGH are still in the basic theoretical
301 research stage. However, the number of patents held by the enterprises cannot be ignored, representing that some
302 technologies have already begun to be commercialized in recent years. Because of this study limits the technical
303 direction to marine NGH and mainly focus on its exploitation. Although there are many patents related to the
304 transportation and manufacture of NGH, or the study of NGH in permafrost areas, these have not been retrieved.



305
306 **Fig. 5** Top 10 institutions for patent application

307 3.1.4 Technology classification analysis

308 We selected the top 15 DMCs and as shown in Fig. 6. H01-D08, H01-C03, and E31-N05C are three different
309 mining methods: thermal injection, depressurisation, and CO₂ replacement. Q49-A, H01-B01, H01-D05, Q49-A01,
310 H01-B03C3, H01-D04, H01-B03C3, A12-W10A, H01-D03, and H01-C01 are all related to the equipment and
311 components exploited in the NGH field. From a broader category of DMC, the results show that the patents of marine
312 NGH are mainly concentrated in the fields of H01 (Obtaining crude oil and natural gas – including exploration, drilling,
313 well completion, production, and treatment) and Q49 (Mining). Therefore the research topics are generally related to
314 technology and equipment of drilling and mining for NGH. The top 15 DMCs with the number of patents and their
315 meanings are shown in Table A1 in Appendix.

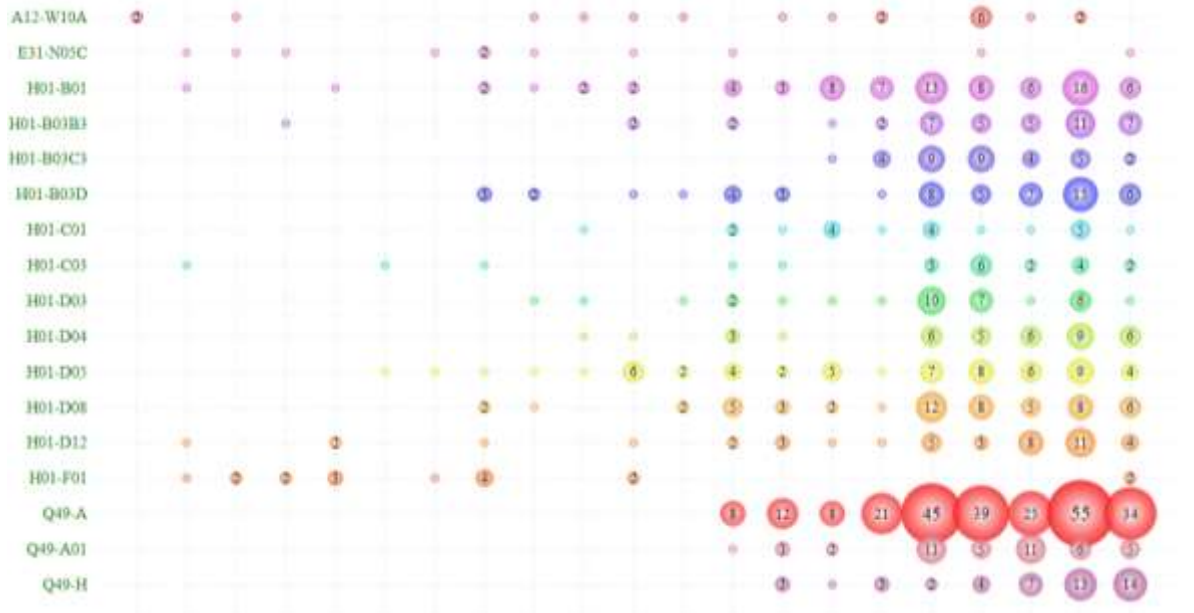


Fig. 6 Evolution map of the number of major technology patents in the last 20 years

Fig. 6 shows the changing trend of the number of patents for different DMCs in the past 20 years. Some technologies were applied for related patents over a long period of time. The annual number of patent applications remains basically stable, and has a high frequency of occurrence, such as A12-W10A, H01-D05, and H01-B01. This shows that they have received attention over a long time as basic mining equipment or method. On the contrary, we can see that only the patent number of H01-F01 are declining. From 2012 to 2020, there has been no patent application. This means that this DMC mainly involves the traditional on-site processing technology of NGH rather than mining processes. There are some technologies that have not been patented before, or have been in small number, but gradually developed in recent years, such as H01-B03B3, Q49-A, Q49-A01, Q49-H, H01-B03C3, H01-D08, H01-D03, and so on. All of these indicate that the multiple mining methods of NGH have begun to receive widespread attention and utilisation.

3.2 Technological development trends

Because of the importance of patents in the last twenty years, we chose the evolution of subject terms to reveal the evolution process of patent topics and reflect technological development trends over time in the marine NGH field. After deleting some terms that appear many times but have no actual research significance, we selected the top 40 subject terms with the highest frequency of occurrence to make the evolution map in the past twenty years as shown in (**Fig. 7**), and grouped them according to different technical topics and conducted an analysis for each topic.

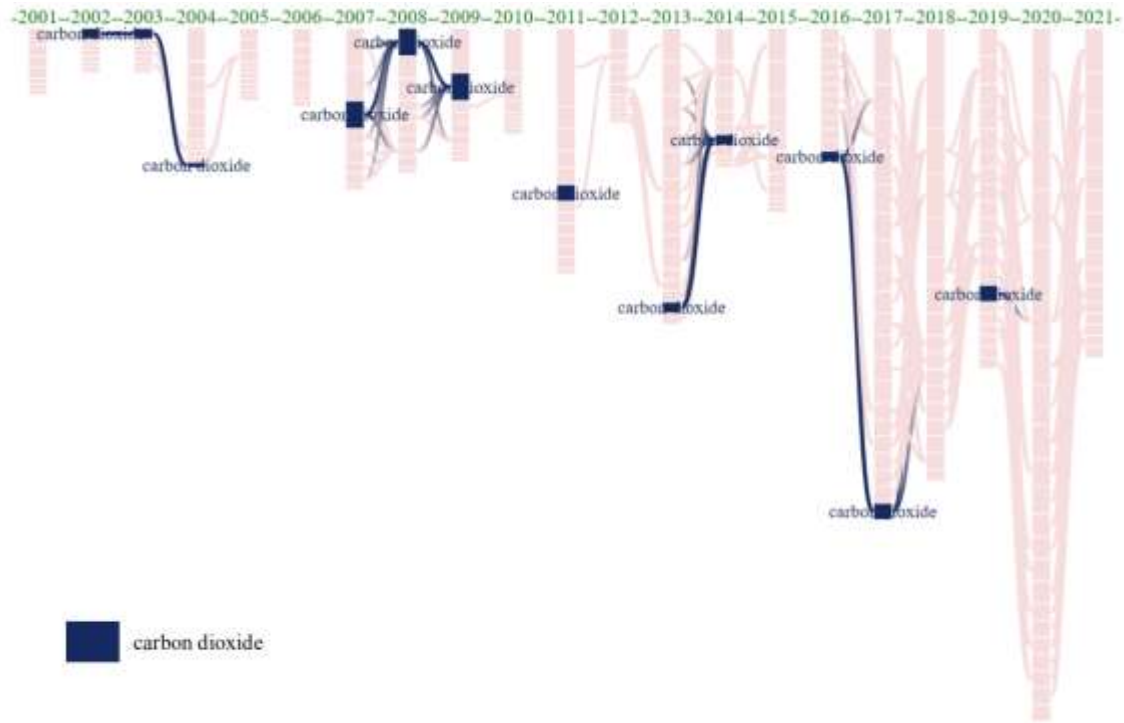


Fig. 8 Evolution of CO₂ replacement

In **Fig. 8**, we can find that the technology of CO₂ replacement mining has been patented early, and has consistently appeared over the last 20 years. The number of patents stayed at a steady level and did not fluctuate much, and was at its highest share from 2007 to 2009. It suggests that this technology has not made some significant progress. Compared to before 2015, the number in recent years has shown a slight decline which means that this method is not yet commercially available for NGH extraction. Therefore, the use of this method is gradually decreasing with the development of other mining techniques.

(2) Thermal injection

The principle of this method is that the heated mediums (e.g., hot water, microwave, electromagnetic wave) are injected in NGH reservoir to break the equilibrium of the hydrate phases and induce hydrate decomposition (Shi *et al.*, 2021). As a mining technology in an early appearance, the thermal injection method has been used in the field of NGH mining for a long time, as shown in **Fig. 9**. The thermal injection method can avoid secondary NGH plugging which can serve effectively as an auxiliary method (Li *et al.*, 2016; Liu *et al.*, 2019). However, it is understood that the efficiency of using the thermal injection alone is not considerable, thus it is rarely used individually (Kumar *et al.*, 2019). Generally, it is used in conjunction with other mining methods as a means to induce rapid decomposition of hydrate reservoirs.

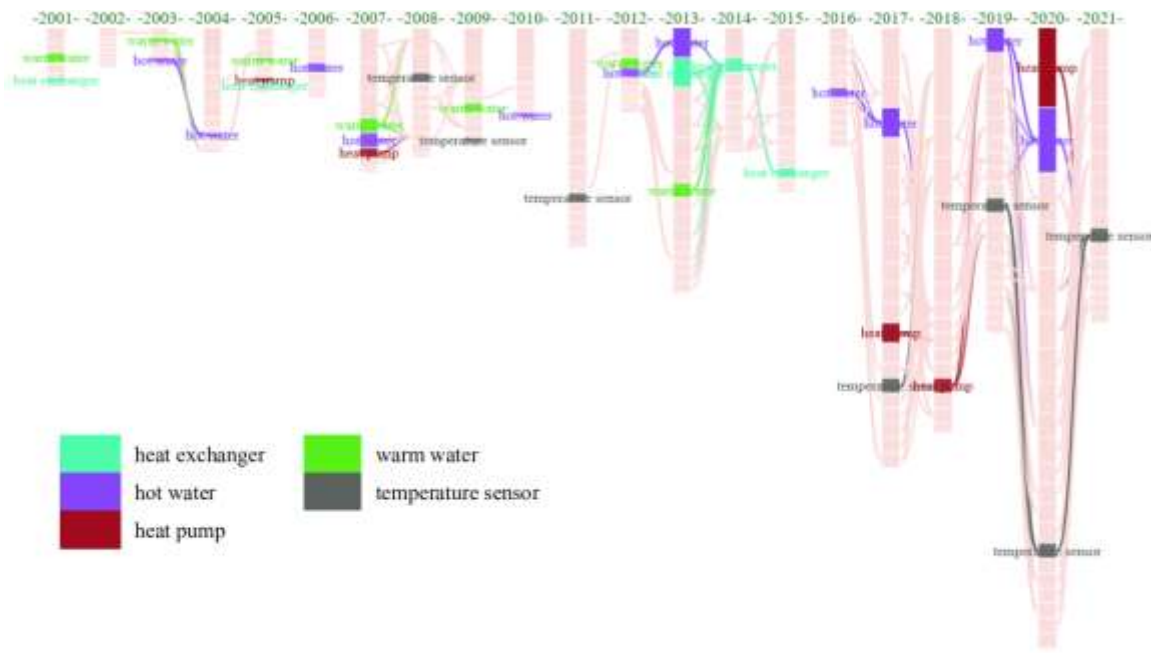


Fig. 9 Evolution of terms related to thermal injection

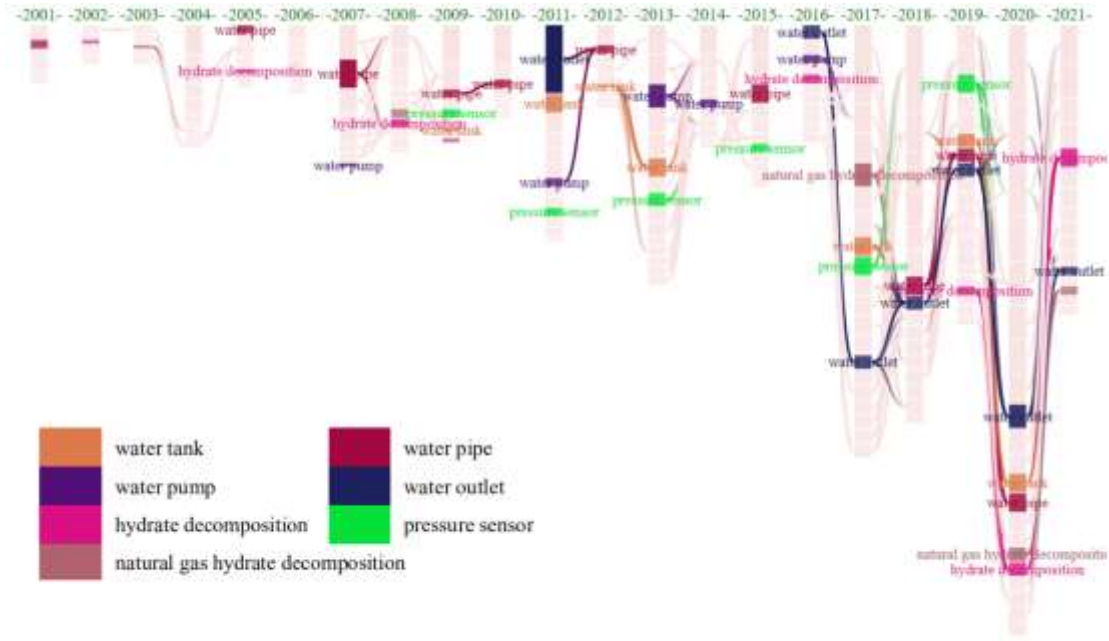
In **Fig. 9** we can see the two terms “hot water” and “warm water”, which means the same, occurred many times during the past 20 years. Moreover, there are many evolutionary links between these terms and other terms in recent years. The meanings of which are not shown in the map, such as “gas-liquid separator”, “global warming”, indicating that they cannot be judged from their literal meaning as part of the thermal injection method. Although we know the use of thermal injection has low efficiency, but the evolution map shows that its use has not diminished as the number of patents has increased in recent years. However, there has been an increase in the number of occurrences of “hot water” and “heat pump” in 2020. From those terms, we find that there are many edges between the terms related to thermal injection and terms related to other techniques. For example, “carbon dioxide” and “sound wave”. The result illustrates the crossover of the thermal injection method with a variety of other methods.

(3) Depressurisation method

The principle of this method is that when the hydrate pressure drops below the equilibrium pressure by means of groundwater extraction or gas lift, it automatically decomposes NGH from the hydrate reservoir (Wang *et al.*, 2018; Zhao *et al.*, 2015). Due to the simplicity of the operation, high energy efficiency, and the relatively rapid induced decomposition (Moridis *et al.*, 2011), the depressurisation method is considered to be the most economical and effective NGH mining technique (Aghajari, Moghaddam and Zallaghi, 2019). However, this method may lead to low temperature and freezing of the hydrate reservoir, and the secondary formation of hydrate will block gas channels and affect the production efficiency (Li *et al.*, 2021). In recent years, in order to increase the yield of NGH, there has been research on mixed mining methods that combine depressurisation with other auxiliary means such as, the hydraulic fracturing (Feng *et al.*, 2019), the thermal injection (Cranganu, 2009; Su *et al.*, 2013).

Next, we select these terms in **Fig. 10** into the same group to study and analyse the evolution of this method. There are two exceptions to the choice of these terms. Firstly, in the chemical reagent injection mining method, although it

389 decomposes the hydrate reservoir, the lack of relevant patents results in few terms associated with this method. Secondly,
 390 in the solid fluidised mining method, its decomposition occurs in pipes or on sea surface because of the “in-situ
 391 fragmentation” technique (Zhou *et al.*, 2018), but the “decomposition” in **Fig. 10** are mainly linked with terms “hydrate
 392 layer” or “hydrate reservoir” that do not belong to the solid fluidised mining method. Therefore, the terms in **Fig. 10** we
 393 choose do not fall into the above two mining methods.



394
 395 **Fig. 10** Evolution of depressurisation

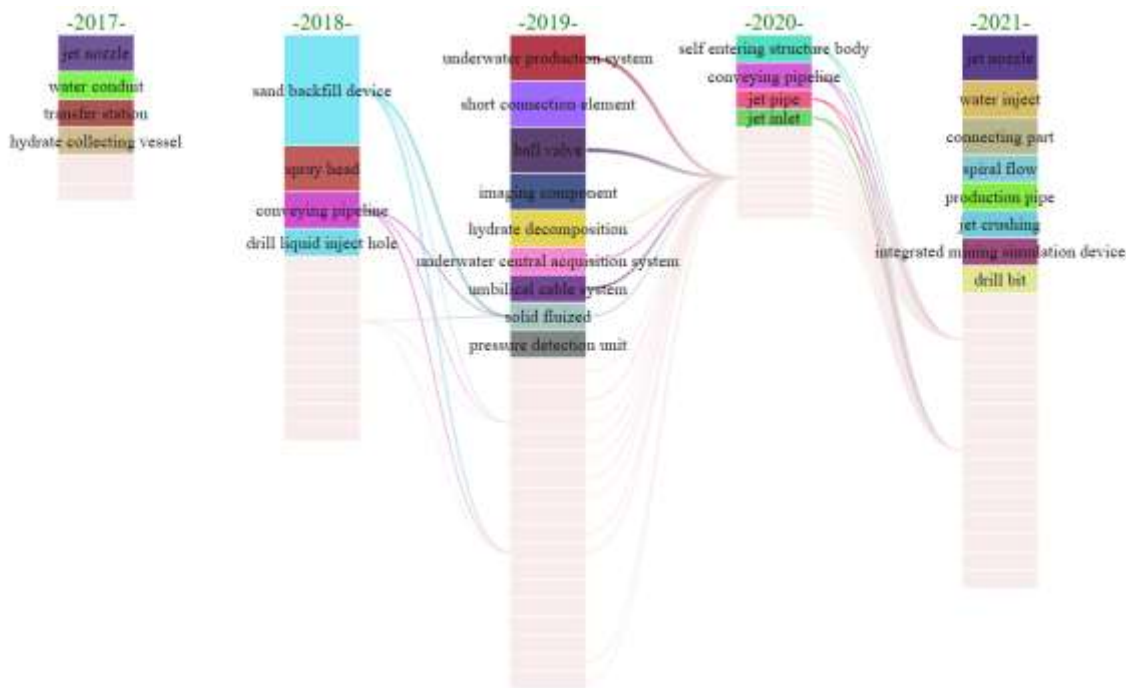
396 As shown in **Fig. 10**, although depressurisation method is a relatively simple and mature mining technique, it has
 397 not been used much in the field of marine NGH extraction before 2017. This suggests that at an early stage, marine
 398 NGH extraction received less attention. From 2007, the number and type of occurrences of related terms began to
 399 increase, and terms like pipe, pump, tank, etc. that involved basic installations and methods have appeared almost every
 400 year since 2009, maintaining a steady and gradual growth. In 2017, 2018, 2019 and 2020, the total number of
 401 occurrences of all terms relating to depressurisation method is 16, 7, 15, and 19 respectively. This shows that although
 402 the number and variety of subject terms has increased, the number of occurrences of terms related to this method has
 403 maintained a relatively stable trend. This suggests that as a mature mining technique, the achievements have remained
 404 satisfactory after being put to use in the extraction of marine NGH.

405 The two terms “hydrate decomposition” and “natural gas hydrate decomposition” are always connected with more
 406 terms in recent years. However, we can see a very low number of occurrences of these two terms prior to 2016, there
 407 were even 10 years in which these words had not appeared. The rarity of connecting lines suggesting that previously
 408 there was less exploitation of marine NGH. On the contrary, the increase in the number of occurrences in recent years
 409 after 2016, which indicates that the ways and means of promoting the decomposition of marine NGH have gradually
 410 begun to develop and progress, and there are more related technologies and equipment.

411 (4) Solid fluidised

412 The principle of this method is to break down the NGH reservoir directly into granular form, then transport the
 413 flow that contains the solid particles to the offshore platform for further hydrate decomposition (Zhou *et al.*, 2014). This
 414 method does not change the equilibrium of the marine NGH layer and avoids the massive and disorderly decomposition
 415 of NGH on the seabed, which can ensure the stability of geological and ecological environment. Thus, it has the
 416 characteristics of safety, high efficiency, and environmental friendliness (Wang *et al.*, 2022; Zhao Jinzhou and Na, 2017).
 417 Besides, the marine NGH reservoirs located in the Shenhu sea in China are non-diagenetic ore bodies. Due to its special
 418 characteristics, this method is more effective compared to others. China conducted the first successful test mining using
 419 the solid fluidised method in 2017. (Shouwei *et al.*, 2018).

420 As an emerging technology in recent years, the solid fluidised method has a relatively small number of patents
 421 associated with it, and the relevant subject terms do not appear in Fig. 7. However, its excellent characteristics and the
 422 developmental potential of marine NGH test mining cannot be ignored. Therefore, in order to study its development
 423 process and trend, we conduct an evolutionary analysis of the subject terms related to this method separately. We added
 424 to the original retrieval strategy: ("solid*" AND "fluid*"), and gained 14 patent records related to the solid fluidised
 425 method and. Through the processing method of subject terms in Section 2.1.3, we generated Fig. 11.



426
 427 **Fig. 11** Evolution of solid fluidised

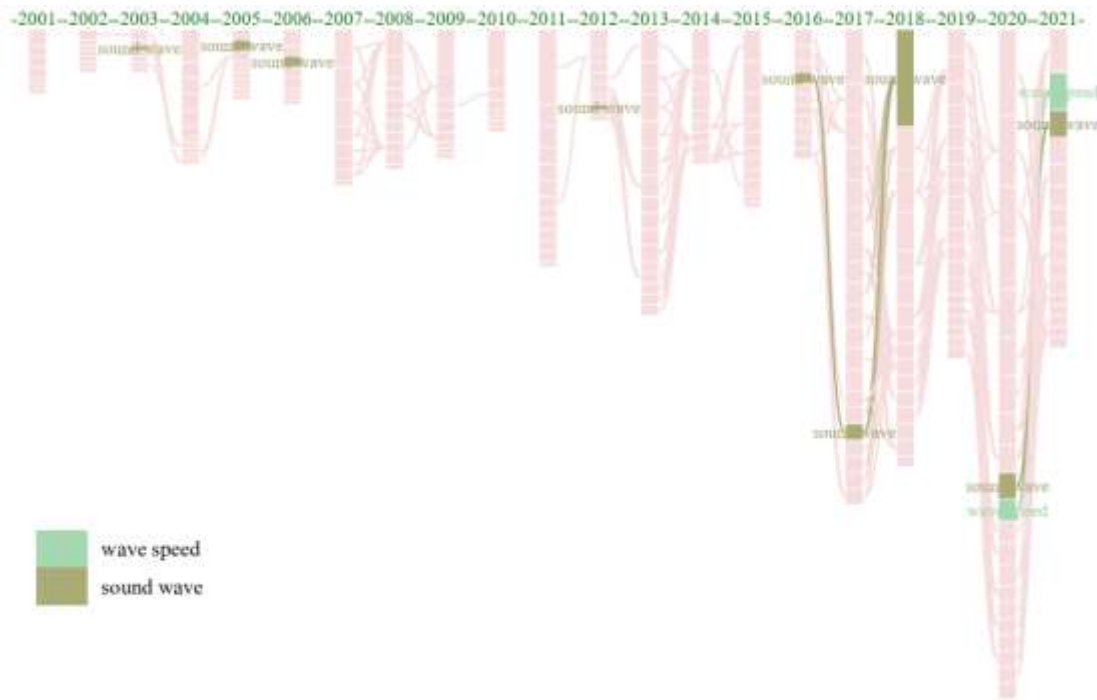
428 **Fig. 11** shows the more frequently occurring subject terms in each year, which are used to analyse the changing
 429 focus and developmental trends of technologies related to the solid fluidised method. In 2017, when this method first
 430 emerged and was first put into test mining, the patents related to it mainly focused on the various types of equipment
 431 used in mining by this method. Then, in 2018, subject terms that appeared more frequently were about “sand backfilling”
 432 and conveying. This indicates that researchers are beginning to focus on the transport of the acquisition and the
 433 backfilling of the NGH reservoir after implementing the extraction. In 2019, the categories of subject terms began to

434 increase, covering a wider range, including underwater mining and production control systems, monitoring units, image
 435 content, cables, etc. This shows that research on the use of this method in marine NGH mining is progressing, and the
 436 relevant facilities in NGH reservoirs suitable for production by this method are gradually improved. Although there are
 437 fewer patents in 2020, for the first time, the terms “drilling cost”, “drilling efficiency”, and “geological disaster” appear
 438 in relevant patents, indicating that experts are beginning to pay attention to the costs, efficiency, and the impact on the
 439 ecological environment during the mining process. Finally, in 2021, patents began to focus on various modules and
 440 equipment of integrated extraction systems, reflecting the fact that the method is being put into test mining.

441 **3.2.2 Evolution of other technologies**

442 (1) Exploration technology

443 The exploration technologies used in marine NGH mainly include seismic reflection, electromagnetism, logging,
 444 borehole sampling, and so on (Sadeq *et al.*, 2018). In **Fig. 12**, two terms “sound wave” and “wave speed” represent
 445 “acoustic technique”, which is one of the seismic reflection techniques and widely used in subsea energy exploration
 446 (Winters *et al.*, 2007). This exploration technology is widely used for discovering NGH reservoirs since 2016.



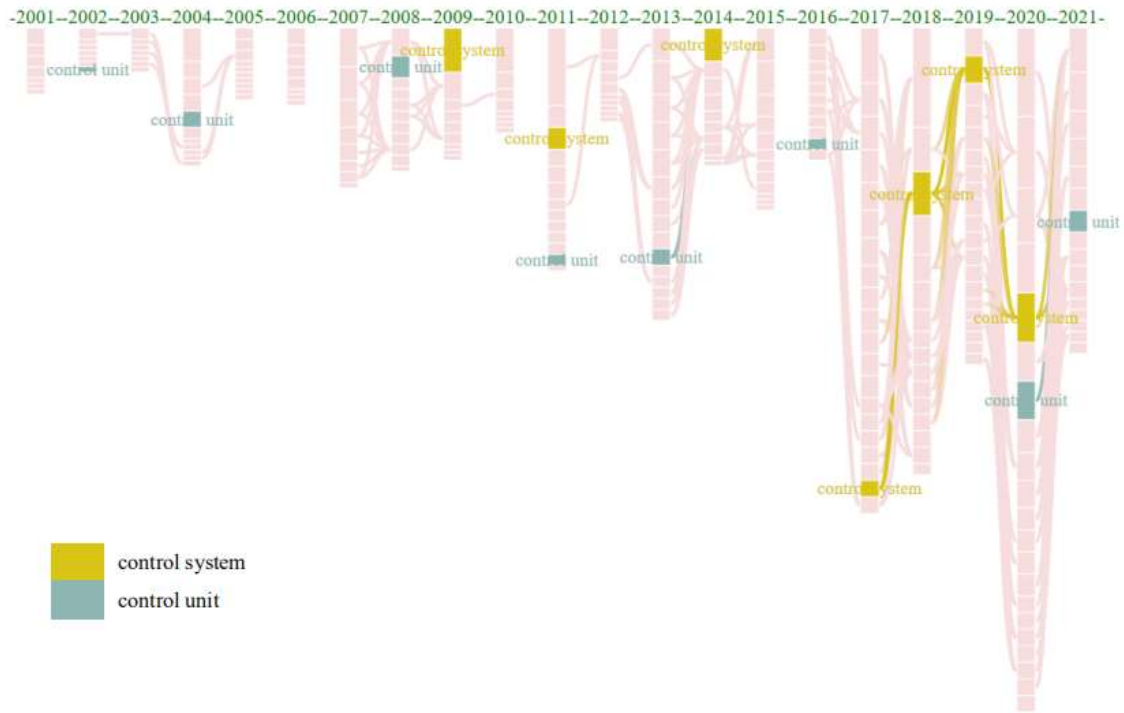
447
 448 **Fig. 12** Evolution of exploration technology

449 (2) Control system

450 In **Fig. 13**, two terms “control system” and “control unit” span a long period of time, and the number of occurrences
 451 of them varies slightly from year to year. We define them as control system during the process of mining NGH. The
 452 exploration and mining of marine NGH are carried out by remotely controlling machines or equipment on the seafloor.
 453 In NGH research, , the control system receives and transmits signals through the control unit used to feedback the sound,
 454

455

vibration, temperature, etc. of the seabed, so as to allow the manual or automatic control of the equipment by the operator.



456

Fig. 13 Evolution of control system

457

458

(3) Infrastructure and equipment

459

460

We classed all the terms that related to digging, drilling, and mining into infrastructure and equipment, as shown in Fig. 14.

461

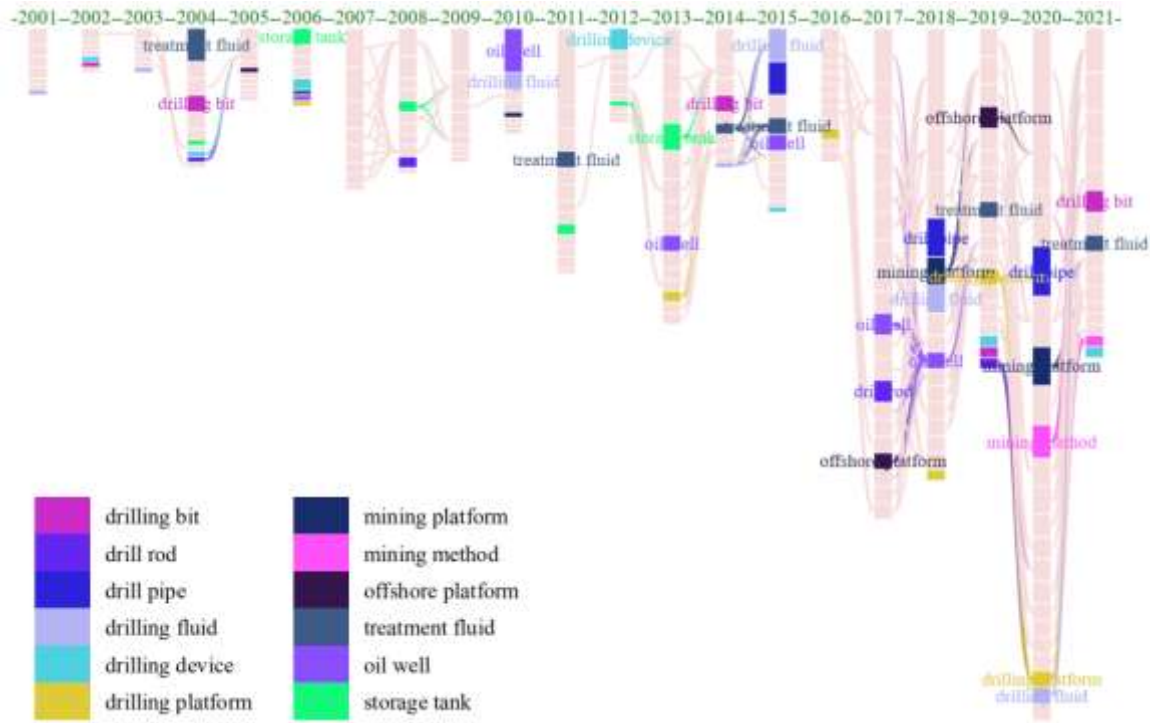
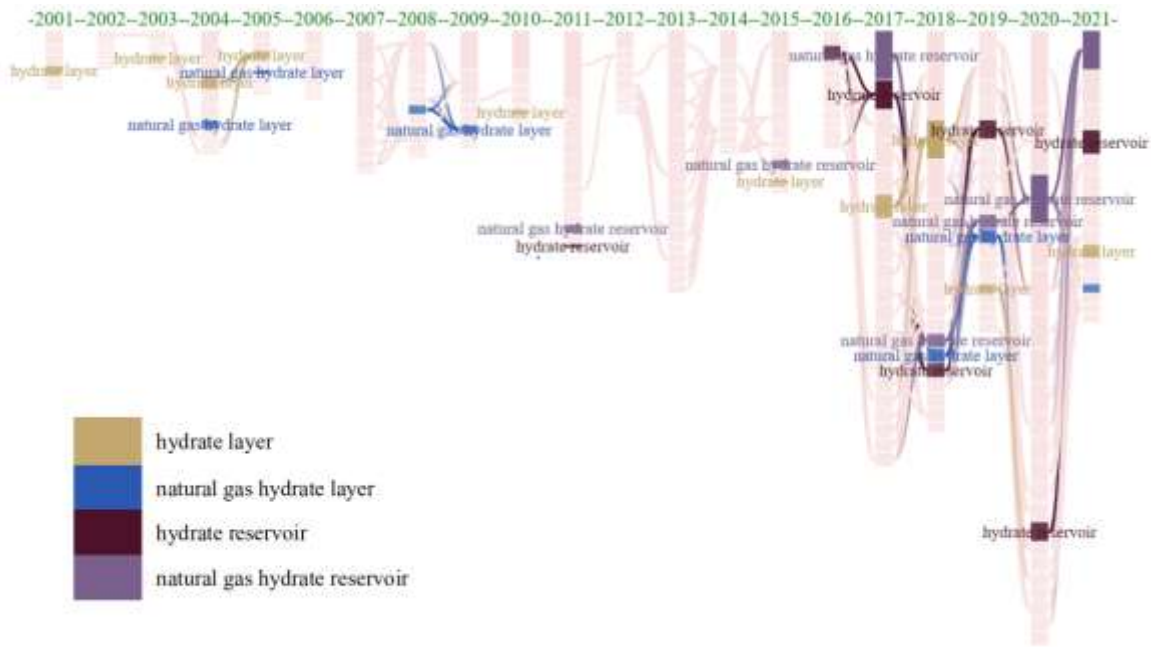


Fig. 14 Evolution of mining devices

Similar to the evolution of control system, these terms also have a long time span, and the technology evolution of these basic devices has been modest, and the general trend has remained stable before 2014. However, with the rapid increase in the number of Chinese patent applications and the fact that China’s main research and exploration areas are located in the South China Sea, the number and type of these infrastructures and tools in the field of marine NGH has begun to grow after 2014.

(4) NGH reservoir

We set terms “hydrate reservoir”, “natural gas hydrate reservoir”, “hydrate layer” and “natural gas hydrate layer” into one category and carry out evolution analysis in **Fig. 15**.



472
473 **Fig. 15** Evolution of NGH reservoir

474 In **Fig. 15**, there are two sets of terms indicating NGH reservoir, one is composed of layers: hydrate layer and
475 natural gas hydrate layer. The other is composed of reservoirs: hydrate reservoir and natural gas hydrate reservoir.
476 Although these two sets have the same meaning, the evolution trends they show are opposite. For “layer”, which
477 appeared early and frequently before 2010, has almost disappeared with only two prominent occurrences in recent years,
478 2017 and 2018. On the contrary, “reservoir” did not appear from 2001 to 2014, except for a brief appearance in 2011,
479 and only in 2015 did they begin to emerge consecutively, with a more significant number of occurrences in recent years.
480 The evolution trend of two terms with the same meaning is reversed. This situation occurs for the following reasons:

481 First of all, among all the retrieved patents, we found that majority of those using the word “reservoir” are Chinese
482 institutions, while the description “layer” is used mainly by institutions in other countries. It can be seen that NGH has
483 been a research hotspot for decades, whereas China has only started to pay attention to this in the last five or six years,
484 and the technology is lagging behind. But in recent years, with investment in R&D and patent applications, its
485 development momentum is very strong and the speed is very fast. In the period from 2006 to 2014, both pairs of words appear
486 infrequently. We speculate that it may be that in an environment where the energy crisis was not severe or where there
487 was insufficient awareness of the crisis, there was insufficient investment and motivation in R&D due to the difficulty
488 of extraction, resulting in less research on the exploration and extraction of hydrate layers and reservoirs.

489 **3.3 Competitive landscape analysis**

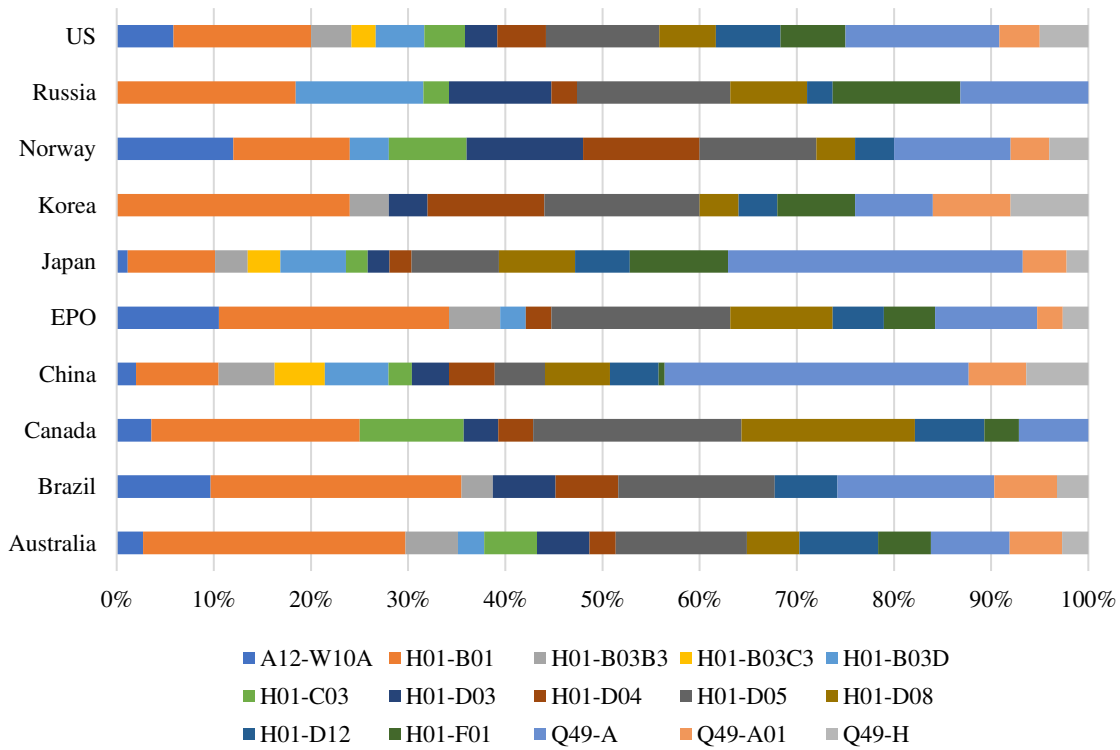
490 **3.3.1 National competitive landscape analysis**

491 This section analyses the competitive landscape of key technologies from two angles. We first analyse the main
492 technology and competitive areas among countries based on the DMC, and then we analyse the competitive landscape

493 in the different technology areas based on the subject terms.

494 (1) Main Technical Fields

495 In order to demonstrate the strengths and weaknesses of each country in popular technology areas, we use the top
496 10 countries to show the distribution of their respective patents applications in the top 15 DMCs and generate **Fig. 16**.
497 Each color represents a DMC marked below the diagram, the width of the rectangle is proportional to the number of
498 patents under the DMC corresponding to that color.



499

500

Fig. 16 Distribution of patent technology themes in major countries

501 It is clear that each country has its own areas of technological strength in NGH. From a proportional point of view,
502 US patents have the most balanced distribution of technology themes and are more advanced in many of the technologies.
503 Both China and Japan have a high percentage of patents on Q49-A. Canada does not hold a large number of patents in
504 total, but has the highest percentage of patents in H01-D08 of any country, as do Korea, Norway and Australia in H01-
505 B01.

506 Meanwhile, some countries' areas of technological strength do not fully encompass all popular technology areas,
507 or have more obvious disadvantages. For example, neither Russia nor Korea has a patent related to A12-W10A, the
508 EPO does not have a patent related to H01-D12 while all other countries do. Canada has obvious areas of strength but
509 also obvious weaknesses in that it does not cover a wide range of technology areas, as does Russia, which covers only
510 10 of the 15 DMCs. Some technologies are only mastered by a few countries, such as the US, Japan, and China, which
511 have patents related to H01-B03C3, and in addition, only these three countries have patents on each of the popular
512 technologies, which shows a possible competitive relationship between them.

513

(2) Country competition analysis

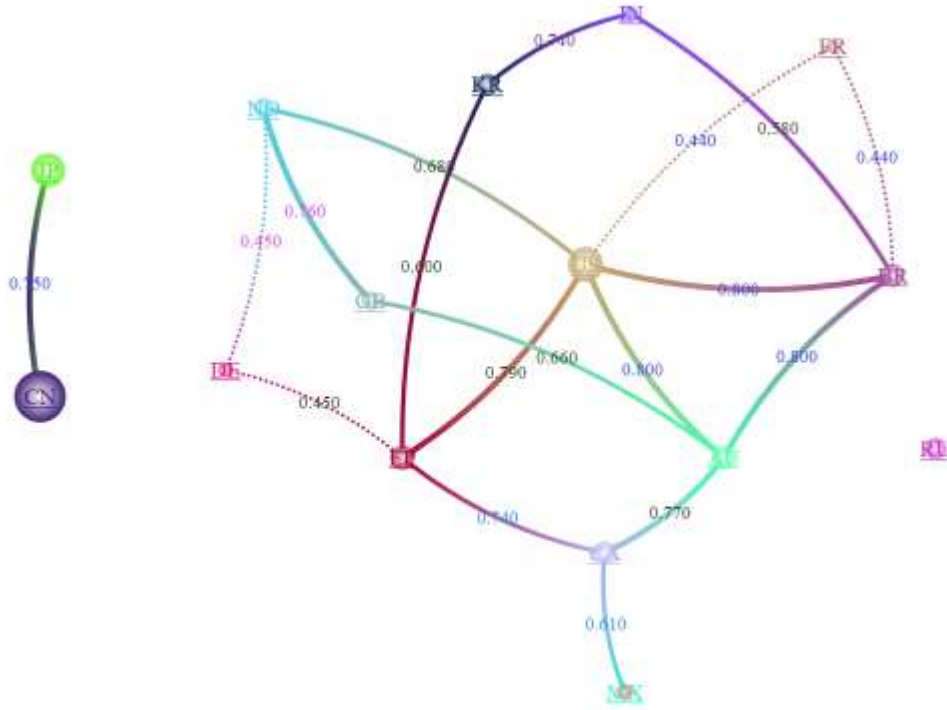
514

515

516

517

Each DMC represents a corresponding technology, so it can provide a clear and accurate technology classification for patents in the field of marine NGH. Therefore, based on the DMC, we can not only identify popular technology areas, i.e., those with a high number of patent applications, but also analyse which technology areas are in competition among countries.



518

519

Fig. 17 DMC-based country correlation network

520

521

522

523

524

Based on patent matrixes construction in Section 2.2.1 and visualisation graphs generation in Section 2.2.4, we obtain Fig. 17. We can see that the correlation network is divided into three parts: the middle part is the more densely connected, with the United States as the centre; the left part with only two countries, China and Japan; and the right part with Russia, which is not connected to any country. There are 8 pairs of countries in Fig. 17 with a correlation strength of 0.75 or more, reflecting countries' that are interested in technology R&D and patent applications in NGH

525

526

527

528

529

530

531

532

533

On the left side of this network, both the Nankai Trough in Japan and the Shenhu Sea in the South China Sea are among the five hydrate test areas in the world, and Japan has been investing in the exploration and extraction of marine NGHs in its South China Sea Trough area since 1995. In 2015, china discovered that there are over 100 billion cubic meters of NGH deposits in the Shenhu waters, and mining technologies have developed rapidly, resulting in the surge of patent applications. Because the test mining areas of the Japan and china are similar, their respective mining techniques and methods must also intersect, thus creating competition in these areas. The strength value of the correlation between China and Japan is 0.75, which also confirms the existence of a more intense competition between the two in marine NGH. After comparing the DMCs with a large number of patents in these two countries, we found that they overlap in DMCs Q49-A, H01-B01, H01-D05 and H01-D08, i.e. the main competitive technology areas. These

534 technologies are mainly related to various types of production equipment and mining methods in NGH .

535 As a country at the forefront of NGH research in the world, the US is actively participates in major international
536 NGH programs as shown in the middle correlation network. Therefore, it has a correlation with many countries. By
537 examining the main DMCs, we found countries, such as Australia, British, and Norway, have a high number of patents
538 related to A12-W10 (Mining, oil wells), A12-W10A and A12-W10B (Well stimulation, flooding, recovery, fracturing).
539 Within this network, it can be seen that these countries have a high number of correlations, with most of them being
540 connected to two or more countries, such as EPO, Brazil, and Canada. This illustrates the diversity of competitive
541 relationships within this network. There are also multi-perspective correlations in this network. The triangular network
542 formed by the US, Australia, and Brazil, has the highest association than the quadrangular network formed by the US,
543 Australia, Canada, and EPO.

544 It can also be seen that, the competition between China and Japan, and the competition centered on the US, are
545 different in the technically. In the middle competition network, in addition to the US, Australia is also highly competitive.

546 (3) Country cluster analysis

547 When it comes to identifying technology areas, the classification method of DMC, while having considerable
548 accuracy, but suffers from coarse granularity and a lack of detail and specificity. Though individual subject terms have
549 limited expression content and are better in distinguishing technical fields, the combination of multiple highly relevant
550 subject terms can show the corresponding technical field more precisely. Therefore, to compensate for the incomplete
551 presentation of specific competition areas and the lack of detail in the above correlation analysis, we will further show
552 the competitive landscape of countries in various technologies through clustering based on subject terms.

553 We classed all patents based on the thesaurus of subject terms generated after previous filtering in **Fig. 18**, and the
554 remained of the 790 nodes after deleting the irrelevant patents. In this map, countries were distinguished by the color of
555 the nodes, and clusters were distinguished by the colour of the density map, and each cluster was numbered in the
556 middle, as shown in **Fig. 18**. The subject terms with a high number of occurrences in each cluster were exported, as
557 shown in **Table A2** in Appendix.

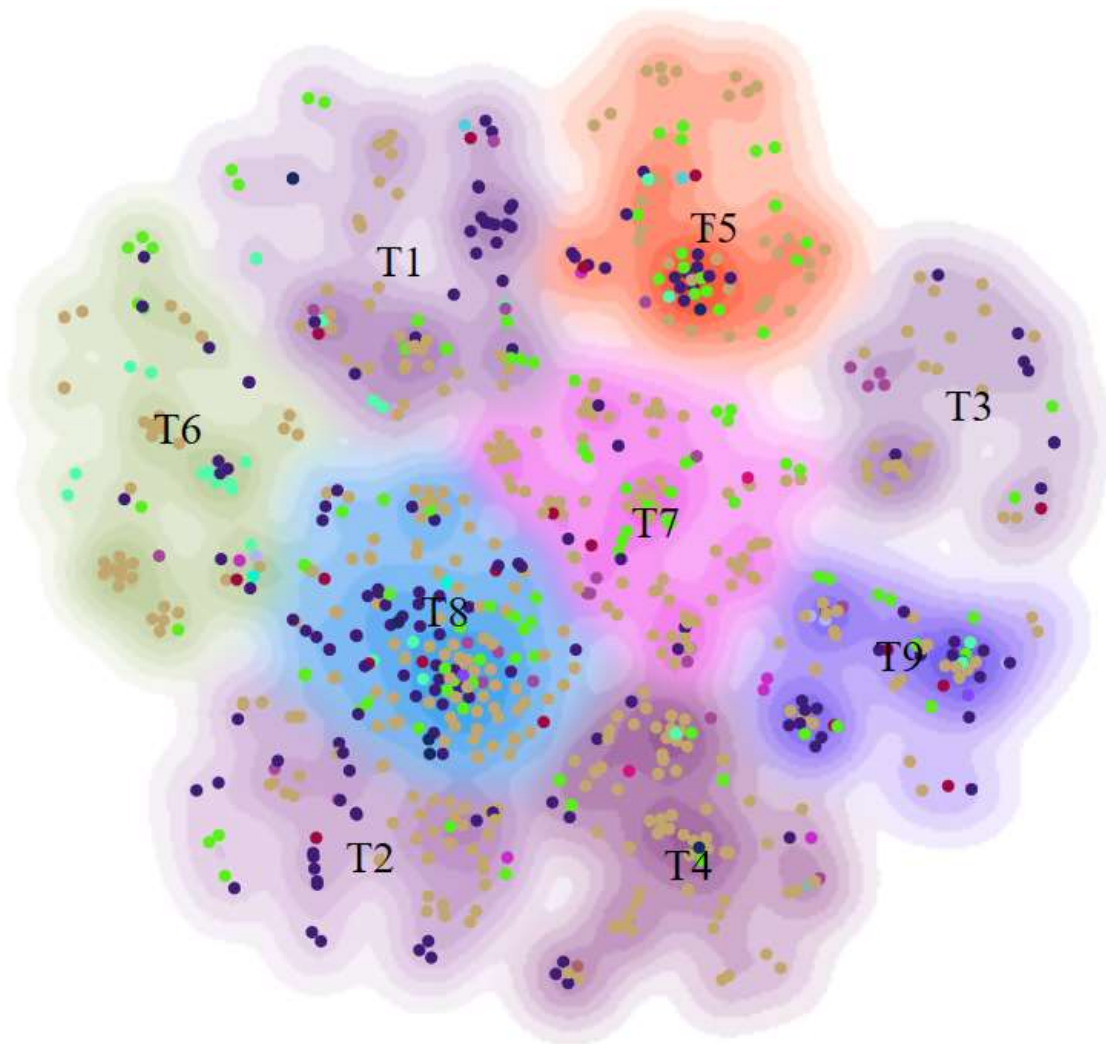


Fig. 18 Subject terms-based cluster scatter plots map

As it can be seen in **Fig. 18**, the key technologies in marine NGH field are concentrated on nine areas. **Table 2** presents the results of the summary of the main subject terms in each cluster to determine the technology area they each indicate,

Table 2 Technology areas

Cluster	Technology area
T1	Depressurisation mining method
T2	Chemical injection mining method
T3	Replacement mining method

T4	Drilling structures and related equipment
T5	CO2 replacement mining method
T6	Drilling platforms
T7	Hydrate layer extraction and gas transmission
T8	Drill fluid and injection
T9	Thermal injection method

565

566

567

568

569

570

571

572

573

574

575

576

577

578

579

580

581

582

583

In terms of the density of nodes, a higher density indicates a higher number of patent applications in that technology area, which is a popular and critical area where many countries are conducting relevant R&D and competing with each other. For example, as can be seen from the colors of the density map in **Fig. 18**, the nodes are dense and there is a wide variety of node colors in T8 and T9, indicating that the transport of marine NGH and the thermal injection method are widely researched and applied, the related technologies are mature. These are the centers of competition between countries, and the main competitors in both clusters are China, the US, and Japan.

The clusters with low node density, indicate that the competitiveness of each country in this area is relatively low and that the relevant technologies they possess are not yet comprehensive. For example, in T2 and T3, of **Fig. 18**, the practical difficulties of applying the replacement method and the potential environmental pollution caused by the chemical injection method are the reasons that prevented the rapid development and marketability of these two mining methods, resulting in a low number of patents and slower progress.

In terms of the distribution of nodes, only China, the US, Japan, and Korea have distributed their respective patents in each of the technology themes represented by the clusters. In T4 and T7, the highest number of distributed patents indicating that China is at a competitive advantage in these two technology themes. In T5, the patents are mainly from China, the US, and Japan, which have similar competitive capabilities in this technology theme, and this is also the technology area in which Japan is most competitive. Russia's most competitive technology area is T6, even surpassing the US in second place.

3.3.2 Institution competitive landscape analysis

584

585

586

587

588

589

Unlike the predominantly competitive relationships between countries, it is common for institutions to have a mixture of cooperative and competitive relationships. The analysis of relationships between institutions is based on the method described in Section 2.2.3.

(1) Institution cooperation analysis

By using the calculation and visualisation methods of **Fig. 17** and deleting the isolated nodes to simplify the network, we obtain **Fig. 19**. This reveals the cooperative relationship among institutions.

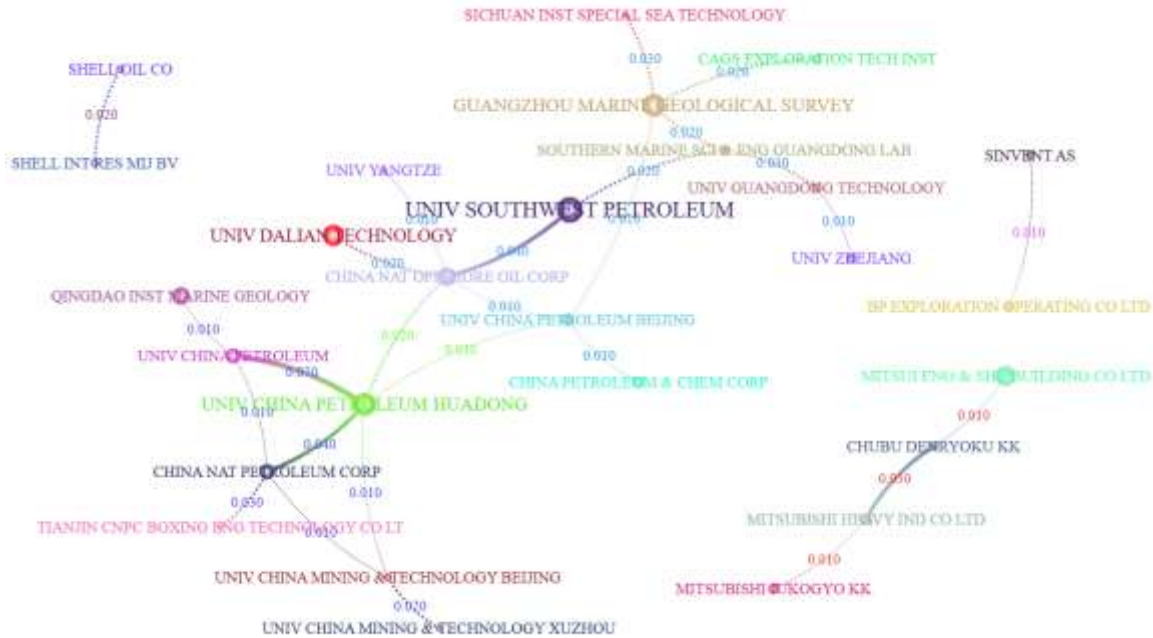


Fig. 19 Institution cooperation

In the top 50 institutions, we can see that only 24 institutions have cooperative relationships in Fig. 19. We can see that most of the values between institutions are below 0.04, which represents the intensity of cooperation that is generally low. Among them, there are four significant relationships: CHINA NAT OFFSHORE OIL CORP and UNIV SOUTHWEST PETROLEUM, UNIV CHINA PETROLEUM HUADONG and UNIV CHINA PETROLEUM, UNIV CHINA PETROLEUM HUADONG and CHINA NAT PETROLEUM CORP, MITSUBISHI HEAVY IND CO LTD and CHUBU DENRYOKU KK; and the values are 0.04, 0.07, 0.04 and 0.05, respectively.

Fig. 19 also shows that the cooperation between institutions is usually domestic and rarely transnational. Domestically, the cooperation network is mainly developed with three institutions as the center: UNIV CHINA PETROLEUM HUADONG, CHINA NAT OFFSHORE OIL CORP, and GUANGZHOU MARINE GEOLOGICAL SURVEY. Furthermore, enterprises are more likely to collaborate with others than universities and research institutes. For example, CHINA NAT OFFSHORE OIL CORP has cooperative relationships with UNIV SOUTHWEST PETROLEUM, UNIV CHINA PETROLEUM HUADONG, UNIV DALIAN TECHNOLOGY and so on as shown in Fig. 19. On the contrary, there is less cooperation between universities or research institutes.

(2) Institution competition Analysis

We set the threshold for the strength value of the correlation at 0.50 and rearranged the layout after removing the isolated nodes to obtain Fig. 20. This network shows the competitive relationship between institutions based on the co-occurrence of DMC.

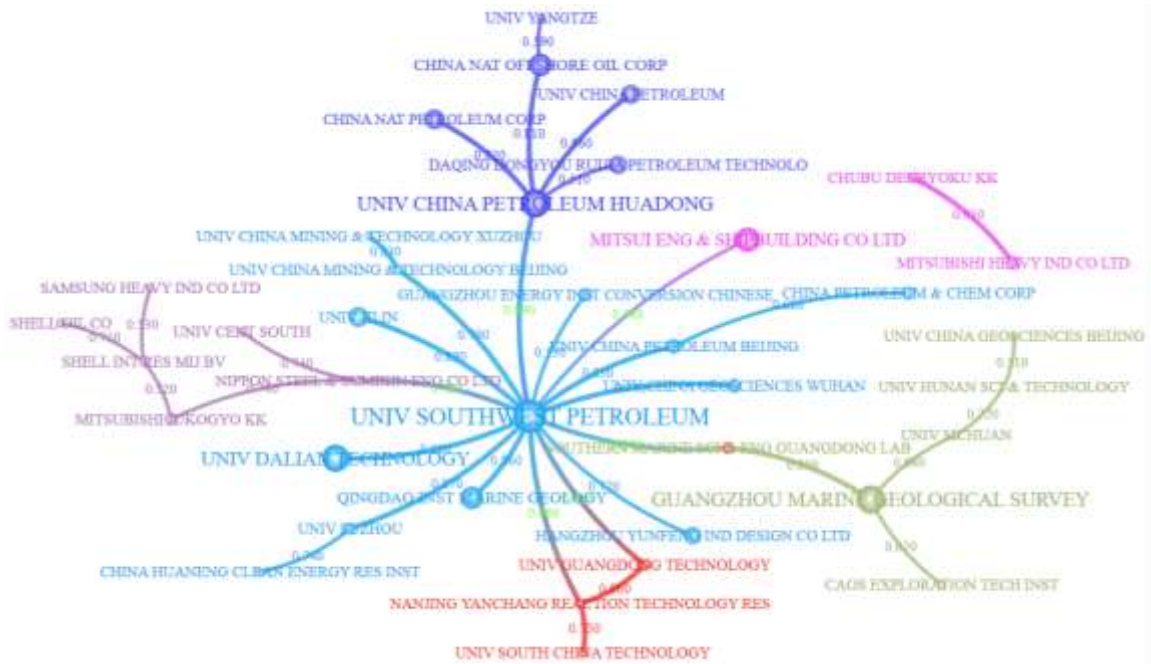


Fig. 20 Institution correlation

The detail DMCs of the top 10 institutions is shown in **Table 3**. We removed Q49-A, which was present in the main DMCs in each institution, and only retained the heterogeneous DMCs among institutions.

Table 3 Main DMCs for each institution

Institution Name	Main DMC
UNIV SOUTHWEST PETROLEUM	Q49-A01, 7 H01-B03C3, 7 H01-B01, 6 H01-B03B3, 6 H01-D03, 5 H01-D08, 5
CHINA NAT OFFSHORE OIL CORP	H01-B01, 7 H01-D04, 7 H01-D08, 7 T01-J13, 6 T01-J09F, 4 H01-B05A, 4
UNIV CHINA PETROLEUM HUADONG	H01-B01, 6 H01-C03, 6 H01-D04, 5 H01-D12, 5 Q49-A01, 4 H01-C07, 4
GUANGZHOU MARINE GEOLOGICAL SURVEY	Q49-H, 7 Q49-A01, 5 H01-B03B3, 4 H01-D12, 3 S02-K01, 3 T01-J15X, 3
CHINA NAT PETROLEUM CORP	H01-B03B, 9 H01-B06, 8 H01-B01, 7 A12-W10A, 6 H01-B03B3, 6 S03-E13D, 5
UNIV DALIAN TECHNOLOGY	H01-D08, 4 H01-D12, 4 H01-B01, 3 H01-D04, 3 H01-D06C, 3 H01-D06, 3
MITSUI ENG & SHIPBUILDING CO LTD	E31-N05C, 4 H06-A, 3 J04-X, 3 E11-Q02, 3 D04-A01F1, 2 D04-A01C, 2
QINGDAO INST MARINE GEOLOGY	H01-B03D, 5 H01-C08, 5 H01-D12, 5 H01-D08, 4 H01-B03B3, 5 H01-B03C3, 4
CHINA PETROLEUM & CHEM CORP	H01-B03D, 6 H01-D06, 6 E12-B02, 4 E11-W, 4 S03-C01X, 4 A12-W10A, 4

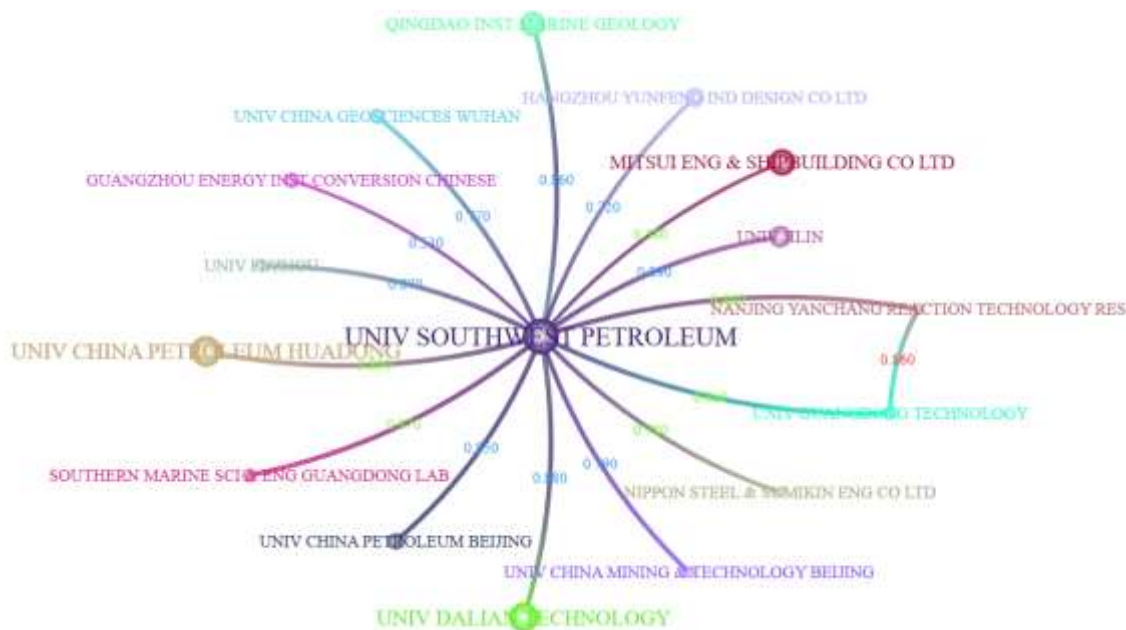
UNIV JILIN	H01-B03C3, 4	H01-B03C1, 3	H01-B03D, 3	H01-C01, 3	H01-D08, 3	H01-B01, 3
UNIV CHINA PETROLEUM	A12-W10A, 3	H01-B03B, 2	H01-C03, 2	H01-D06C, 2	H01-D12, 2	S03-C01C1, 2
DAQING DONGYOU RUIJIA PETROLEUM TECHNOLO	A03-A00A, 6	A12-W10A, 6	E10-E04H1, 5	E10-E04L1, 5	E33-B, 5	A04-D05A, 4
HANGZHOU YUNFENG IND DESIGN CO LTD	P41-A05, 8	Q49-A01, 6	P41-A03, 5	Q49-B01A, 3		
BAKER HUGHES INC	H01-C03, 2	H01-C10, 2	H01-E, 2			
UNIV CHINA PETROLEUM BEIJING	H01-A, 2	H01-B03D, 2	Q49-A01, 2	S03-C01X, 2		

615

616 Using **Fig. 20** and **Table 3**, we selected three representative institutions as analysis subjects. One is UNIV
617 SOUTHWEST PETROLUEM, which ranks first in the number of patent filings. The second is MITSUI ENG &
618 SHIPBUILDING CO LTD, the only Japanese institution in the top ten, apart from those from China. The third is
619 DAQING DONGYOU RUIJIA PETROLEUM TECHNOLO, which has more special main DMCs.

620 (1) UNIV SOUTHWEST PETROLUEM

621 Since UNIV SOUTHWEST PETROLUEM is the institution that has applied for the largest number of patents and
622 has a significant relationship with many other institutions (**Fig. 20**), we show the part of the institutions that are
623 associated with UNIV SOUTHWEST PETROLUEM separately in (**Fig. 21**).



624

625 **Fig. 21** USWP local correlation network

626

627 Comparing with **Fig. 19**, among the institutions in **Fig. 21**, only SOUTHERN MARINE SCI & ENG

628 GUANGDONG LAB and CHINA NAT OFFSHORE OIL CORP have a cooperative relationship with UNIV
 629 SOUTHWEST PETROLUEM, and the strength values reaches 0.02 and 0.04, respectively.

630 From **Fig. 21**, we can see that there are 12 institutions with correlation strength value of 0.70 or more with UNIV
 631 SOUTHWEST PETROLUEM. In order to further study which technology fields overlap between these institutions
 632 and UNIV SOUTHWEST PETROLUEM that caused the strong degree of correlation, we selected them and the top
 633 20 DMCs to produce **Fig. 22**.



634 **Fig. 22** Main technical distribution of relevant institutions

635
 636
 637 Vertically, we can see that H01-B01 (Marine Drilling structures and equipment), H01-D08 (Producing crude oil
 638 and natural gas - Thermal methods) and H01-B03D (Transmission/Generation of power, data, etc.) are all the relatively
 639 basic or widely used technologies, almost every institution in **Fig. 22** has patents related to them. UNIV SOUTHWEST
 640 PETROLUEM has a clear advantage in H01-B01, H01-B03B3, H01-B03C3, H01-D03 (Producing crude oil and natural
 641 gas - Pumps), H01-D08, and Q49-A01 (Extraction equipment), which are mainly the DMCs that closely related to the
 642 solid fluidised mining method (Tang *et al.*; Wang, G. *et al.*; Zhang, Y. *et al.*; Zhang, Z. *et al.*). Besides, it also has some
 643 patents related to thermal injection. For example, “A mining method and equipment of natural gas hydrate in shallow
 644 seabed”, change the solid-state existence conditions of NGH mainly by subsea heating method, and further decomposes
 645 the NGH in the mixture (Wang *et al.*).

646 Horizontally, though UNIV SOUTHWEST PETROLUEM has the largest number of patents among them, UNIV
 647 CHINA PETROLEUM HUADONG holds the most extensive technical coverage. UNIV CHINA PETROLEUM
 648 HUADONG, UNIV JILIN, and QINGDAO INST MARINE GEOLOGY have more technology overlap with UNIV
 649 SOUTHWEST PETROLUEM and no cooperation, which causes their correlation strength to reach 0.89, 0.89 and 0.86.
 650 In particular, QINGDAO INST MARINE GEOLOGY, which has many patents in the same technology area where
 651 UNIV SOUTHWEST PETROLUEM has applied for, indicates a significant competitive relationship between them.
 652 There are many technology areas in which they compete. Among these areas, it has obvious advantages in H01-B03B3,
 653 H01-B03C3, H01-D03, Q49-A01, while its patent layout is weaker in the technology areas of H01-C03, H01-C07, H01-

654 D12, etc. This indicates that strengths of UNIV SOUTHWEST PETROLUEM are mainly concentrated in the
655 technologies related to solid fluidised mining method.

656 (2) MITSUI ENG & SHIPBUILDING CO LTD

657 MITSUI ENG & SHIPBUILDING CO LTD ranks seventh in the number of patent applications, however, the
658 networks reveal that it has no cooperation with other institutions, and a slight correlation only with UNIV SOUTHWEST
659 PETROLEUM. In **Table 3**, we can see that the main DMCs belonging to MITSUI ENG & SHIPBUILDING CO LTD
660 are significantly different from those of other institutions, which is why they have no correlation with other institutions.
661 Many of them are related to CO₂ replacement method (E31-N05C: CO₂), a mining method in which institutions in
662 other countries have few relevant patents. Currently, the other two institutions that have applied for a larger number of
663 patents related to this method are from Japan: MITSUBISHI HEAVY IND CO LTD and CHUBU DENRYOKU KK.
664 As it can be seen from **Fig. 20**, there is a strong relationship between these two institutions. By lowering the threshold
665 in this network, a correlation between MITSUI ENG & SHIPBUILDING CO LTD and MITSUBISHI HEAVY IND
666 CO LTD with a strength value of 33 can be found.

667 Except for E31-N05C, we know that MITSUI ENG & SHIPBUILDING CO LTD are the leaders in the areas of
668 manufacture, storage, and transportation of NGH. Such as J04-X (Other chemical methods), D04-A01C (Purification
669 of water by freezing, crystallization), D04-A01F1 (Other filtration process), and E11-Q02 (Removal, effluent treatment-
670 process, apparatus), which may relate to these areas. For example, there is a method and apparatus for further reducing
671 storage and transportation costs by continuously dehydrating, cooling, and solidifying with high efficiency to produce
672 gas hydrates containing a low proportion of water (Kimura *et al.*). However, there are very few institutions that have
673 filed patents related to this technology.

674 (3) DAQING DONGYOU RUIJIA PETROLEUM TECHNOLO

675 Among Chinese institutions, DAQING DONGYOU RUIJIA PETROLEUM TECHNOLO has most special and
676 rare DMCs: A03-A00A (Polysaccharides uses), A12-W10A (Drilling mud or fluid), E10-E04H1 (Diol), E10-E04L1
677 (Methanal, use). These are the technologies for drilling fluids with gas hydrate inhibitors, by injecting chemicals to
678 facilitate the decomposition of NGH and conduct the exploitation. Except for A12-W10A, it has several main DMCs
679 that are rare in other institutions in China, but appear frequently in institutions from the US. This illustrates that this
680 company competes primarily with institutions in some other countries, rather than domestic institutions.

681 4 Conclusions, managerial implications and limitations

682 4.1 Conclusions

683 This study proposes a framework to monitor the developmental trend and competitive landscape of technologies
684 in marine NGH via patent analysis. From the perspective of patentometrics, we conducted an overall layout of the
685 temporal and quantitative trends, geographical distribution, patentee distribution and technology distribution of NGH
686 related patent applications. Then, based on the subject terms, the evolutionary paths of NGH related technologies were
687 analysed, which were used to determine technological development trends. Finally, we analysed the competition and

688 cooperation landscape among countries and institutions in key technical fields.

689 Firstly, in terms of patents overview, the development of marine NGH has a long history and has shown significant
690 growth in the last 20 years. With many countries placing increasing emphasis on the development and application of
691 NGH-related technologies, with China, The US, and Japan having clear advantage in the number of related patents, and
692 Australia, Brazil, Canada, Russia, and South Korea are also important patenting countries. China has a wide distribution
693 of technology areas and comprehensive patent reserves. We have seen a surge in patent applications over the last decade
694 and has quickly become the country with the largest number of patents in the world. Today, the developmental trends
695 in marine NGH technologies are relatively concentrated, and the patent data owned by the main patentees showed the
696 advantages of agglomeration. Nine of the top ten patentees are from China with one from Japan.

697 Secondly, in terms of the technical themes the patents, the current development of marine NGH technology is more
698 oriented towards the fields of extraction technology and equipment, and the field of processing systems and technologies.
699 The former mainly focuses on various mining methods and techniques, as well as tools and equipment used in the
700 extraction process, while the latter focuses on data acquisition, transmission and control, etc. Of the five main mining
701 methods for marine NGH, the CO₂ replacement method has been a popular area of research due to its high
702 environmental friendliness. However, due to the operational difficulties and inefficiencies in actual mining, this method
703 has never been successfully applied to large-scale test mining. In contrast, in recent years, thermal injection and
704 depressurisation methods have been commonly used in the test mining of marine NGH. R&D and patent applications
705 on basic and mature mining methods are increasing. The chemical extraction method, due to the potential pollution of
706 the marine ecosystem, the number of related patent applications is relatively small. The number of related patent
707 applications in chemical extraction method is small due to the potential pollution of the marine ecosystem. The solid
708 fluidised mining method has developed in recent years, with research being carried out mainly by Chinese institutions.

709 Thirdly, Today, in marine NGH-related technologies, the world's largest international cooperation network is
710 mainly distributed in Europe and the United States, with the US as the center, Australia, EPO, etc. as the lead. Whereas
711 national partnerships in Asia are mainly between China and Japan. Through the analysis and comparison based on DMC
712 and subject terms respectively, we can see that extraction tools and equipment, drilling fluids, and thermal injection
713 technology are the research hotspots in each country, and competition in these areas is relatively intense. In contrast,
714 the competition in the field of chemical mining methods and CO₂ replacement method are weaker and the number of
715 related patents is smaller. But, these technologies are potential areas of competition in the future. There is a need to
716 increase investment in these areas to improve R&D capabilities and opportunity for further research. In addition, the
717 results of the clustering networks not only point to areas of technology that require greater investment in R&D, but also
718 provide direction to countries in their search for possible partners. For areas where technology development is not yet
719 mature, technological breakthroughs can be sought together by collaborating with countries with more advanced
720 research facilities, where they have more mature technology development. By extensive collaboration between
721 countries, it is possible for us to find technological innovations to further promote and improve the commercialisation
722 of marine NGH extraction technologies.

723 Finally, as the institution with the highest number of patent applications, UNIV SOUTHWEST PETROLUUM is

724 associated with numerous institutions. However, all institutions with strong ties to it are from China, and transnational
725 relationships are rare. Similarly, most cooperative and correlation relationships held by institutions from other countries
726 are with institutions in their own countries. Our analysis shows that the technical cooperation in marine NGH is limited
727 and the technical barriers are high. Currently, in China, the majority of patentees are universities and research institutes,
728 and the number of patent applications from enterprises is generally low, indicating that marine NGH-related
729 technologies are still at the basic theoretical research stage and are still some distance away from maturity and
730 commercialization. Technologies have undergone long term evolution due to the long period of research of Marine NGH
731 in US and Japan. Because of this, the patentees in these countries are enterprises, demonstrating more advanced
732 commercialization progress.

733 **4.2 Management implications**

734 Today, the R&D of marine NGH is changing from "experimental exploitation" to "productive exploitation",
735 combining theory with market demand and applying it in actual mining processes will be the focus in the future. To
736 utilities, the use of NGH as potential alternative energy development, government should pay great importance to its
737 research and development at the industrial and market levels. Universities and research institutes should follow
738 industrial dynamics, promote basic research for practical applications, and accelerate the transfer of scientific research
739 results. Enterprises should strengthen cooperation among industry, universities, and research institutes, consolidate core
740 technology reserves, strive to build their own intellectual property rights system, and stimulate independent innovation
741 to improve competitive ability.

742 For the government and industry, it should pay attention to the following two aspects in guiding the
743 commercialization process of NGH. Vertically, there should be a sustained focus on industry-academia-research
744 cooperation among various types of institutions. Some Chinese institutions have already demonstrated mature
745 partnerships, such as CHINA NAT PETROLEUM CORP and CHINA NAT OFFSHORE OIL CORP, and have
746 cooperative relationships with a number of universities and research institutes, working with a wide range of partners
747 and showing good cooperation. Secondly, horizontal cooperation between institutions of the same type should be
748 strengthened. During the analysis, it can be seen that the current level of horizontal cooperation among Chinese
749 institutions is still low, whereas in both the US and Japan cooperation is mainly between enterprises. For China,
750 cooperation among universities and research institutes needs to be further enhanced by extending the network of
751 cooperation and increasing the number of partners. In terms of enterprises in NGH for technology areas with a high
752 concentration of patent applications, competition should be reduced and R&D in other technologies should be
753 accelerated. In contrast, for technology areas with fewer patent applications and weaker competition, consideration
754 should be given to multi-party cooperation and collaborative innovation for developing advantageous areas.

755 **4.3 Limitations**

756 This study has several limitations. Firstly, although patents of marine NGH account for more than 90% of total
757 NGH patents, one future work should investigate NGH patents in permafrost to enrich the diversity of findings.

758 Secondly, despite technology being the core feature of patents, papers and standard reports are still research sources of
 759 multi-source data. Our future work will expand data sources to strengthen both the analysis on theory and application
 760 except for technological research in the NGH field.

761 Appendix

762 **Table A1** Distribution of the top 15 DMCs of key technologies

Record	Description	Count
Q49-A	Mining and quarrying equipment	247
H01-B01	Marine Drilling structures and equipment	82
H01-D05	Marine production equipment for crude oil and natural gas	61
H01-D08	Producing crude oil and natural gas – Thermal methods	57
H01-B03D	Transmission/Generation of power, data etc.	56
Q49-H	Maintenance equipment; Equipment and methods for removing tools from mines, boreholes or wells	47
Q49-A01	Extraction equipment	44
H01-B03B3	Rotary drilling – Valves and control equipment	43
H01-D12	Testing, control operations and equipment, general	43
H01-D04	Producing crude oil and natural gas – Separators	38
H01-B03C3	Rotary drilling – Drill pipe	34
H01-D03	Producing crude oil and natural gas – Pumps	33
H01-C03	Fracturing; Fracking	22
H01-F01	Natural gas – Field treatment and processing	22
A12-W10A	Drilling mud or fluid	21
E31-N05C	CO2	21
H01-C01	Well completion, stimulating, and servicing – Casing and tubing	21

763
 764 **Table A2** Main subject terms in each cluster

Cluster	Main Subject Terms						
T1	gas hydrate deposit, 15	reaction kettle, 12	subterranean formation, 11	water storage tank, 10	water pump, 7	heat exchanger, 7	gas compression separator, 5
T2	liquid hydrocarbon, 4	hydrate slurry, 4	bottom portion, 4	gas hydrate agglomeration, 4	oil pipe, 3	hydrate decomposition, 3	liquid storage tank, 3
T3	hydrate layer, 17	carbon dioxide, 4	product storage, 4	methane gas suction line, 4	methane substitution storage tank, 3		
T4	lower end, 27	upper end, 21	lower part, 18	output shaft, 9	insulation oil, 8	drill rod, 6	hydrate layer, 5

T5	carbon dioxide, 33	global warming, 12	carbon dioxide hydrate, 7	energy consumption, 6	hydrate layer, 5	electric power generation, 5	sodium chloride, 4
T6	mining platform, 9	carbon dioxide, 6	internal pressure, 4	cement slurry, 4	sound wave, 4	pressure reduction method, 3	
T7	hydrate layer, 31	gas liquid separator, 12	gas pipeline, 11	natural gas hydrate exploit, 10	drill bit, 8	control valve, 7	gas hydrate decomposition, 5
T8	water pump, 14	gas hydrate inhibitor, 10	solid gas hydrate, 7	control system, 7	riser tube, 5	gas hydrate decomposition, 4	drill fluid, 4
T9	hydrate reservoir, 23	heat exchanger, 19	hot water, 11	temperature sensor, 4	sea water heat, 3	heat pump, 3	heat source, 3

765

766 Reference

767

Reference

768

769

770

771

772

773

774

775

776

777

778

779

780

781

782

783

784

785

786

787

788

789

790

791

792

793

794

795

796

797

798

799

800

801

802

803

Aaldering, L.J., Song, C.H., 2019. Tracing the technological development trajectory in post-lithium-ion battery technologies: A patent-based approach. *Journal of Cleaner Production* 241, 118343.

Aghajari, H., Moghaddam, M.H., Zallaghi, M., 2019. Study of effective parameters for enhancement of methane gas production from natural gas hydrate reservoirs. *Green Energy & Environment* 4(4), 453-469.

Assunção, L.R.C., Mendes, P.A.S., Matos, S., Borschiver, S., 2021. Technology roadmap of renewable natural gas: Identifying trends for research and development to improve biogas upgrading technology management. *Applied Energy* 292, 116849.

B. Jin, L. Feng, Piao, H.J., Z.Q. Diao, 2011. Research on information fusion model for patent retrieval. *Information Technology* 10, 164-167.

Block, A., Song, C.H., 2022. Exploring the characteristics of technological knowledge interaction dynamics in the field of solid-state batteries: A patent-based approach. *Journal of Cleaner Production* 353, 131689.

Cantwell, J., Janne, O., 1999. Technological globalisation and innovative centres: the role of corporate technological leadership and locational hierarchy | This paper represents one contribution to the TSER project on Technology, Economic Integration and Social Cohesion (contract no. SOE1-CT95-1005).1. *Research Policy* 28(2), 119-144.

Chazallon, B., Rodriguez, C.T., Ruffine, L., Carpentier, Y., Donval, J.P., Ker, S., Riboulot, V., 2021. Characterizing the variability of natural gas hydrate composition from a selected site of the Western Black Sea, off Romania. *Marine and Petroleum Geology* 124, 104785.

Collett, T.S., Dallimore, S.R., 1999. Hydrocarbon gases associated with permafrost in the Mackenzie Delta, Northwest Territories, Canada. *APPLIED GEOCHEMISTRY* 14(5), 607-620.

Cranganu, C., 2009. In-situ thermal stimulation of gas hydrates. *Journal of Petroleum Science and Engineering* 65(1), 76-80.

Esposito, C., 1988. Graph graphics: Theory and practice. *Computers & Mathematics with Applications* 15(4), 247-253.

Feng, Y., Chen, L., Suzuki, A., Kogawa, T., Okajima, J., Komiya, A., Maruyama, S., 2019. Enhancement of gas production from methane hydrate reservoirs by the combination of hydraulic fracturing and depressurization method. *Energy Conversion and Management* 184, 194-204.

Gao, D., 2020. Discussing on development modes and engineering techniques for deepwater natural gas and its hydrates. *Natural Gas Industry* 40(8), 169-176.

He, J., Li, X., Chen, Z., Li, Q., Zhang, Y., Wang, Y., Xia, Z., You, C., 2021. Combined styles of depressurization and electrical heating for methane hydrate production. *APPLIED ENERGY* 282.

Kimura, T., Iwasaki, S., Ito, K., Kondo, Y., Nagayasu, H., Watabe, M., Ema, H., Yoshikawa, K., Production of natural gas hydrate such as liquefied natural gas hydrate, involves reacting natural gas and water at specific pressure and temperature followed by dehydration, cooling natural gas hydrate and reducing pressure.

Komatsu, H., Ota, M., Smith, R.L., Inomata, H., 2013. Review of CO₂-CH₄ clathrate hydrate replacement reaction laboratory studies – Properties and kinetics. *Journal of the Taiwan Institute of Chemical Engineers* 44(4), 517-537.

Kong, Z., Jiang, Q., Dong, X., Wang, J., Wan, X., 2018. Estimation of China's production efficiency of natural gas hydrates in the South China Sea. *Journal of Cleaner Production* 203, 1-12.

Kumar, P., Collett, T.S., Shukla, K.M., Yadav, U.S., Lall, M.V., Vishwanath, K., 2019. India National Gas Hydrate Program

804 Expedition-02: Operational and technical summary. *Marine and Petroleum Geology* 108, 3-38.
805 Kvenvolden, K.A., 1988. Methane hydrate — A major reservoir of carbon in the shallow geosphere? *Chemical Geology* 71(1),
806 41-51.
807 Kvenvolden, K.A., 1999. Potential effects of gas hydrate on human welfare. *PROCEEDINGS OF THE NATIONAL*
808 *ACADEMY OF SCIENCES OF THE UNITED STATES OF AMERICA* 96(7), 3420-3426.
809 Lee, Y., Seo, Y.-j., Ahn, T., Lee, J., Lee, J.Y., Kim, S.-J., Seo, Y., 2017. CH₄ – Flue gas replacement occurring in sH hydrates
810 and its significance for CH₄ recovery and CO₂ sequestration. *Chemical Engineering Journal* 308, 50-58.
811 Li, J.-f., Ye, J.-l., Qin, X.-w., Qiu, H.-j., Wu, N.-y., Lu, H.-l., Xie, W.-w., Lu, J.-a., Peng, F., Xu, Z.-q., Lu, C., Kuang, Z.-g.,
812 Wei, J.-g., Liang, Q.-y., Lu, H.-f., Kou, B.-b., 2018. The first offshore natural gas hydrate production test in South China Sea.
813 *China Geology* 1(1), 5-16.
814 Li, N., Zhang, J., Xia, M.-J., Sun, C.-Y., Liu, Y.-S., Chen, G.-J., 2021. Gas production from heterogeneous hydrate-bearing
815 sediments by depressurization in a large-scale simulator. *ENERGY* 234.
816 Li, S., Zheng, R., Xu, X., Hou, J., 2016. Energy efficiency analysis of hydrate dissociation by thermal stimulation. *Journal of*
817 *Natural Gas Science and Engineering* 30, 148-155.
818 Li, X., Shen, Y., Cheng, H., Yuan, F., Huang, L., 2022. Identifying the Development Trends and Technological Competition
819 Situations for Digital Twin: A Bibliometric Overview and Patent Landscape Analysis. *IEEE Transactions on Engineering*
820 *Management*, 1-24.
821 Liu, Y.G., Hou, J., Zhao, H.F., Liu, X.Y., Xia, Z.Z., 2019. Numerical simulation of simultaneous exploitation of geothermal
822 energy and natural gas hydrates by water injection into a geothermal heat exchange well. *RENEWABLE & SUSTAINABLE*
823 *ENERGY REVIEWS* 109, 467-481.
824 Luan, C., Sun, X., Wang, Y., 2021. Driving forces of solar energy technology innovation and evolution. *Journal of Cleaner*
825 *Production* 287, 125019.
826 Makogon, Y.F., Holditch, S.A., Makogon, T.Y., 2007. Natural gas-hydrates - A potential energy source for the 21st Century.
827 *JOURNAL OF PETROLEUM SCIENCE AND ENGINEERING* 56(1-3), 14-31.
828 Moge, M.E., 1991. Using patent data for technology analysis and planning. *Research Technology Management* 34(4), 43-
829 49.
830 Moridis, G.J., Silpngarm, S., Reagan, M.T., Collett, T., Zhang, K., 2011. Gas production from a cold, stratigraphically-
831 bounded gas hydrate deposit at the Mount Elbert Gas Hydrate Stratigraphic Test Well, Alaska North Slope: Implications of
832 uncertainties. *Marine and Petroleum Geology* 28(2), 517-534.
833 Musakaev, N.G., Khasanov, M.K., Borodin, S.L., 2018. The mathematical model of the gas hydrate deposit development in
834 permafrost. *International Journal of Heat and Mass Transfer* 118, 455-461.
835 Oyama, A., Masutani, S.M., 2017. A Review of the Methane Hydrate Program in Japan. *Energies* 10(10), 1447.
836 Qin, X.-w., Lu, C., Wang, P.-k., Liang, Q.-y., 2022. Hydrate phase transition and seepage mechanism during natural gas
837 hydrates production tests in the South China Sea: A review and prospect. *China Geology* 5(2), 201-217.
838 Sadeq, D., Alef, K., Iglauer, S., Lebedev, M., Barifcani, A., 2018. Compressional wave velocity of hydrate-bearing bentheimer
839 sediments with varying pore fillings. *International Journal of Hydrogen Energy* 43(52), 23193-23200.
840 Schvaneveldt, R.W., Durso, F.T., Dearholt, D.W., 1989. Network Structures in Proximity Data, in: Bower, G.H. (Ed.)
841 *Psychology of Learning and Motivation*. Academic Press, pp. 249-284.
842 Seo, S., Han, E., Sohn, S., 2015. Trend analysis of academic research and technical development pertaining to gas hydrates.
843 *Scientometrics* 105.
844 Shi, K., Wei, R., Guo, X., Li, Q., Lv, X., Fan, Q., Dong, H., Yang, L., Zhao, J., Song, Y., 2021. Enhancing Gas Production
845 from Hydrate-Bearing Reservoirs through Depressurization-Based Approaches: Knowledge from Laboratory Experiments.
846 *ENERGY & FUELS* 35(8), 6344-6358.
847 Shouwei, Z., Qingping, L., Wei, C., Jianliang, Z., Weixin, P., Yufa, H., Xin, L., Liangbin, X., Qiang, F., Jiang, L., 2018. The
848 World's First Successful Implementation of Solid Fluidization Well Testing and Production for Non-Diagenetic Natural Gas
849 Hydrate Buried in Shallow Layer in Deep Water, *Offshore Technology Conference*.
850 Su, Z., Huang, L., Wu, N., Yang, S., 2013. Effect of thermal stimulation on gas production from hydrate deposits in Shenhu
851 area of the South China Sea. *Science China Earth Sciences* 56(4), 601-610.
852 Tan, Z., Pan, G., Liu, P., 2016. Focus on the Development of Natural Gas Hydrate in China. *Sustainability* 8(6), 520.
853 Tang, Y., Wang, G., Zhou, S., Liu, Q., Zhong, L., Li, W., Li, Q., Fu, Q., He, Y., Wang, C., Wang, L., Submarine shallow green
854 solid fluidized natural gas hydrate exploitation device, has spray head formed with spraying hole, and sand backfill sleeve
855 provided with three-layer pipe, where pipe is connected with material returning port. *Univ Southwest Petroleum (Uswp-C)*
856 *Univ Southwest Petroleum (Uswp-C) Univ Southwest Petroleum (Uswp-C)*.
857 Tsuji, Y., Ishida, H., Nakamizu, M., Matsumoto, R., Shimizu, S., 2004. Overview of the MITI Nankai Trough wells: A
858 milestone in the evaluation of methane hydrate resources. *RESOURCE GEOLOGY* 54(1), 3-10.
859 UNFCCC, 2015. FCCC/CP/2015/L.9/Rev.1: Adoption of the Paris Agreement.

860 <https://unfccc.int/resource/docs/2015/cop21/eng/l09r01.pdf>.

861 Vedachalam, N., Srinivasalu, S., Rajendran, G., Ramadass, G.A., Atmanand, M.A., 2015. Review of unconventional
862 hydrocarbon resources in major energy consuming countries and efforts in realizing natural gas hydrates as a future source of
863 energy. *Journal of Natural Gas Science and Engineering* 26, 163-175.

864 Veluswamy, H.P., Kumar, A., Seo, Y., Lee, J.D., Linga, P., 2018. A review of solidified natural gas (SNG) technology for gas
865 storage via clathrate hydrates. *Applied Energy* 216, 262-285.

866 Wang, Li, Y., Zhao, J., Shi, B., Gong, J., Li, Q., 2022. Simulation of the effect of hydrate adhesion properties on flow safety
867 in solid fluidization exploitation. *Petroleum*.

868 Wang, B., Fan, Z., Wang, P., Liu, Y., Zhao, J., Song, Y., 2018. Analysis of depressurization mode on gas recovery from methane
869 hydrate deposits and the concomitant ice generation. *Applied Energy* 227, 624-633.

870 Wang, G., Deng, J., Xie, C., Fu, Q., Zhong, L., Zhou, S., He, Y., Multi-phase flow detection device for realizing solid-state
871 fluidized exploitation of shallow natural gas hydrates on ocean floor, has connection element whose ends are provided with
872 buckles, and imaging device mounted on imaging component. *Univ Southwest Petroleum (Uswp-C)*.

873 Wang, H., Zhang, L., He, J., Zhou, T., 2022. The Development of Natural Gas Hydrate Exploitation Technology From
874 Perspective of Patents. *Frontiers in Energy Research* 10.

875 Wang, X.-H., Li, F.-G., Xu, Y.-X., Sun, C.-Y., Pan, H., Liu, B., Yang, L.-Y., Chen, G.-J., Li, Q.-P., 2015. Elastic properties of
876 hydrate-bearing sandy sediment during CH₄-CO₂ replacement. *Energy Conversion and Management* 99, 274-281.

877 Wang, X., Daim, T., Huang, L., Li, Z., Shaikh, R., Kassi, D.F., 2022. Monitoring the development trend and competition status
878 of high technologies using patent analysis and bibliographic coupling: The case of electronic design automation technology.
879 *Technology in Society* 71, 102076.

880 Wang, X., Zhang, S., Liu, Y., ITGInsight-discovering and visualizing research fronts in the scientific literature.
881 *SCIENTOMETRICS*.

882 Wang, X., Zhang, S., liu, Y., 2021a. ITGInsight—discovering and visualizing research fronts in the scientific literature.
883 *Scientometrics*.

884 Wang, X., Zhang, S., Liu, Y., Du, J., Huang, H., 2021b. How pharmaceutical innovation evolves: The path from science to
885 technological development to marketable drugs. *TECHNOLOGICAL FORECASTING AND SOCIAL CHANGE* 167.

886 Wei, N., Bai, R., Zhao, J., Zhang, Y., Xue, J., 2021. The prospect of natural gas hydrate (NGH) under the vision of Peak
887 Carbon Dioxide Emissions in China. *Petroleum* 7(4), 357-363.

888 Wei, W.-N., Li, B., Gan, Q., Li, Y.-L., 2022. Research progress of natural gas hydrate exploitation with CO₂ replacement: A
889 review. *Fuel* 312, 122873.

890 Wei, Y.-M., Kang, J.-N., Yu, B.-Y., Liao, H., Du, Y.-F., 2017. A dynamic forward-citation full path model for technology
891 monitoring: An empirical study from shale gas industry. *Applied Energy* 205, 769-780.

892 White, M.D., Kneafsey, T.J., Seol, Y., Waite, W.F., Uchida, S., Lin, J.S., Myshakin, E.M., Gai, X., Gupta, S., Reagan, M.T.,
893 Queiruga, A.F., Kimoto, S., Baker, R.C., Boswell, R., Ciferno, J., Collett, T., Choi, J., Dai, S., De La Fuente, M., Fu, P., Fujii,
894 T., Intihar, C.G., Jang, J., Ju, X., Kang, J., Kim, J.H., Kim, J.T., Kim, S.J., Koh, C., Konno, Y., Kumagai, K., Lee, J.Y., Lee,
895 W.S., Lei, L., Liu, F., Luo, H., Moridis, G.J., Morris, J., Nole, M., Otsuki, S., Sanchez, M., Shang, S., Shin, C., Shin, H.S.,
896 Soga, K., Sun, X., Suzuki, S., Tenma, N., Xu, T., Yamamoto, K., Yoneda, J., Yonkofski, C.M., Yoon, H.C., You, K., Yuan, Y.,
897 Zerpa, L., Zyrianova, M., 2020. An international code comparison study on coupled thermal, hydrologic and geomechanical
898 processes of natural gas hydrate-bearing sediments. *Marine and Petroleum Geology* 120, 104566.

899 Winters, W.J., Waite, W.F., Mason, D.H., Gilbert, L.Y., Pecher, I.A., 2007. Methane gas hydrate effect on sediment acoustic
900 and strength properties. *Journal of Petroleum Science and Engineering* 56(1), 127-135.

901 Wu, N., Li, Y., Wan, Y., Sun, J., Huang, L., Mao, P., 2021. Prospect of marine natural gas hydrate stimulation theory and
902 technology system. *Natural Gas Industry B* 8(2), 173-187.

903 Ye, H., Wu, X., Li, D., Jiang, Y., Gong, B., 2022. A novel thermal stimulation approach for natural gas hydrate exploitation
904 — the application of the self-entry energy compensation device in the Shenhu sea. *Journal of Natural Gas Science and
905 Engineering* 105, 104723.

906 Yin, C., Gu, H., Zhang, S., 2020. Measuring technological collaborations on carbon capture and storage based on patents: A
907 social network analysis approach. *Journal of Cleaner Production* 274, 122867.

908 Zhang, Y., Pei, J., Chen, G., Gao, Y., Han, Q., Yin, C., Modularized solid fluidized natural gas hydrate layer mining device,
909 has drill bit module, jet module, front moving module, telescopic module, rear moving module, lifting module and sea water
910 injection module connected by taper thread. *Univ Northeast Petroleum (Uypt-C)*.

911 Zhang, Z., Hu, G., Li, Y., Fang, X., Li, X., He, Y., Li, Q., Zhou, S., Liu, Q., Zhong, L., Zhang, L., Wang, G., Hydrate solid
912 fluidization-depressurization combined mining method for natural gas hydrate exploitation in e.g. ocean, involves activating
913 low-pressure mode to perform step-down mining operation at natural gas hydrate storage layer until reservoir is completely
914 mined. *Univ Southwest Petroleum (Uswp-C)*.

915 Zhao, J., Zheng, J.-n., Wang, X., Dong, S., Yang, M., Song, Y., 2022. Effects of underlying gas on formation and gas

916 production of methane hydrate in muddy low-permeability cores. *Fuel* 309, 122128.
917 Zhao, J., Zhu, Z., Song, Y., Liu, W., Zhang, Y., Wang, D., 2015. Analyzing the process of gas production for natural gas hydrate
918 using depressurization. *Applied Energy* 142, 125-134.
919 Zhao Jinzhou, Z.S., Zhang Liehui, Wu Kaisong, Guo Ping, Li Qingping, Fu Qiang, Gao Hang, Na, W., 2017. The first global
920 physical simulation experimental systems for the exploitation of marine natural gas hydrates through solid fluidization.
921 *NATURAL GAS INDUSTRY* 37(9), 15-22.
922 Zhou, S., Wei, C., Li, Q., CNOOC, 2014. The green solid fluidization development principle of natural gas hydrate stored in
923 shallow layers of deep water. *China Offshore Oil and Gas*.
924 Zhou, S., Zhao, J., Li, Q., Chen, W., Zhou, J., Wei, N., Guo, P., Sun, W., 2018. Optimal design of the engineering parameters
925 for the first global trial production of marine natural gas hydrates through solid fluidization. *Natural Gas Industry B* 5(2), 118-
926 131.
927 Zhu, H., Xu, T., Yuan, Y., Xia, Y., Xin, X., 2020. Numerical investigation of the natural gas hydrate production tests in the
928 Nankai Trough by incorporating sand migration. *Applied Energy* 275, 115384.
929

930 **Ethics declarations**

931 **Ethical approval**

932 The authors declare that no human participants and/or animals were involved in this work.

933

934 **Consent to participate and publish**

935 All authors confirmed that they provided a substantial contribution to the conception or design of the work; to the
936 acquisition, analysis, or interpretation of data; to draft the work or revise it.

937

938 **Competing interests**

939 The authors declare no competing interests.

940 **Author Contributions**

941 Conceptualization, Zhenfeng Liu; Formal analysis & Methodology, Jian Feng; Project administration, Zhenfeng Liu;
942 Resources, Pianran Lü; Writing – original draft, Pianran Lü; Writing – review & editing, Zhenfeng Liu & Lorna Uden.

943 **Funding**

944 This study was financially supported by Shanghai Science and Technology Program (Project No. 22692113300).

945 **Acknowledgments**

946 We are thankful to all those who have helped in carrying out the research.