



# JRC TECHNICAL REPORTS

## Weak signals in Science and Technologies in 2021

*Technologies at a very early stage of development that could impact the future*

Olivier Eulaerts, Geraldine Joanny, Sotiris Fragkiskos, Marcelina Grabowska, Stefano Brembilla, Davide Rossi, Gabriel Nicula, Sergio Perani

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## Abstract

Early identification of today's emerging technologies is key for the design of new policies by policymakers, who need to be made aware of potentially disrupting technologies or scientific development as early as possible to develop well-fitted policies that secure both a stable business environment for industrial actors and a safe and secure society for citizens to live in.

This report is the third annual report on weak signals in technology and science published by the Joint Research Centre and presents a list of 93 weak signals in 2021. These early signs of emerging technologies or products were detected using text mining, clustering techniques and scientometric indicators applied on a corpus of peer-reviewed scientific publications (Scopus).

These 93 weak signals have been grouped in seven topics and online thematic dashboards are available to the user to further explore the weak signals.

Some observations can be made on the weak signals detected this year. First, Europe has been found to contribute significantly, in terms of scientific publications, to weak signals related to ICT, Societal issues, Medicine and Biotechnology, Agriculture & Environment.

For weak signals related to Engineering & Physics, the leadership of European organisations is not as strong but the EU is still well positioned when it comes to scientific publications in roughly half of the weak signals (e.g. for atomic scale manufacturing, spectrometry, twistrionics or autonomous surface ships).

When it comes to weak signals related to Energy and Materials, Chinese organisations are clearly leading in terms of numbers of scientific publications. Nonetheless, Europe contributes significantly to 8 of the 29 signals (e.g. Calcium batteries, Multi energy grid, Nickelate superconductors or Twisted layer graphene).

Finally, looking at the patenting activity for the weak signals shows that the number of patents applications by European organisations is systematically behind those of China and the US. This is observed even for topics in which Europe has a clear leading role in scientific publications. Although some additional quality indicators could be considered to nuance this observation (differences in the quality of applications in different jurisdictions, extensions to additional territories, number of patents retrieved actually too low to draw a significant conclusion, software not patentable in Europe, etc.), this nevertheless confirms the trend that has been observed in the two previous JRC weak signal reports<sup>1</sup> i.e. that European R&D organisations active in the development of the reported weak signals are less prone to patent early-stage research and technologies than Chinese or US-based organisations.

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<sup>1</sup> See references 9,10 and 11.

## **Acknowledgements**

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# 1 Introduction

## Technology emergence

Considering the societal and market disruption potential related to the emergence of new technologies, their early identification is of strategic importance for the design of new policies at European and national levels<sup>2</sup>. In a time of accelerating technological change and hyperconnectivity, early awareness of potentially disrupting technologies or scientific development gives indeed policy makers more time to design well-fitted policies that secure both a stable business environment for industrial actors and a safe and secure society for citizens to live in<sup>3,4</sup>. In addition, the early design of policies that encourage and frame the development of emerging technologies can lead to new knowledge and new markets<sup>5</sup>. It is therefore not surprising that forward-looking activities have taken a growing role in policy-making processes since the 1990's<sup>6</sup>. Among other methods, technology foresight has gained a lot of momentum, mirroring the increasing pace of technological innovation and its deepening penetration into our daily life. In particular, technology foresight is central to support policy-making mechanisms in areas impacted by the development of these new technologies and innovations, which today is de facto most policy areas

Technology foresight aims at the early identification of emerging scientific and technological issues as its aim is to capture the development trends and frontier areas of future science and technology. Traditionally, technology foresight is performed through qualitative processes involving scientists, technologists, futurologists, and other experts. In the last decade, there has been a staggering interest among academics in the identification of emerging technologies through the use of data<sup>7</sup>. In that context, scientometric techniques are often considered to perform technology foresight<sup>8</sup>. Indeed, while historically scientometric methods have been mainly used in order to trace back academic journal citation, they can also be used nowadays to not only understand the past but also to forecast the future<sup>9</sup>. Scientometrics analyses are often performed using bibliometrics techniques as it allows the measurement of texts and information and enable researchers to explore, organize and analyse large amounts of data to identify 'hidden patterns'<sup>10</sup>. Bibliometrics techniques are based on applying mathematical and statistical methods to scientific publications, books and other media of communication<sup>11</sup> are used extensively in the quest for detecting emerging technologies<sup>12,13</sup>.

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2 Bakhtin, P., Saritas, O., Chulok, A. et al. Trend monitoring for linking science and strategy  
*Scientometrics* 111, 2059–2075 (2017).

3 Martin, B.R., *Technology Analysis & Strategic Management*, Volume 7, Issue 2, 1 January 1995, Pages 139-168, *Foresight in Science and Technology*.

4 Henry Small, Kevin W. Boyack, Richard Klavans, Identifying emerging topics in science and technology,  
*Research Policy*, Volume 43, Issue 8, 2014, Pages 1450-1467.

5 Martin, B. R. (1995). Foresight in science and technology. *Technology Analysis and Strategic Management*, 7(2), 139–168.

6 I. Miles, The development of technology foresight: a review, *Technol. Forecast. Soc. Change*, 77 (9) (2010), pp. 1448-1456.

7 Rotolo, D., Hicks, D., & Martin, B. R. (2015). What is an emerging technology?. *Research policy*, 44(10), 1827-1843.

8 Daim, T. U., Rueda, G., Martin, H., & Gerdtsri, P. (2006). Forecasting emerging technologies: Use of bibliometrics and patent analysis. *Technological forecasting and social change*, 73(8), 981-1012.

9 Morris, S., DeYong, C., Wu, Z., Salman, S., & Yemenu, D. (2002). DIVA: a visualization system for exploring document databases for technology forecasting, *Computers & industrial engineering*, 43(4), 841-862.

10 M.J. Norton, *Introductory concepts in information science* ; Information Today Inc., for the American Society for Information Science, Medford, NJ: 2000, v, 127, [3] pp.

11 Pritchard A., *Statistical bibliography or bibliometrics?*, *Journal of Documentation*, 25 (4) (1969), pp. 348-349

12 John Mingers, Loet Leydesdorff; A review of theory and practice in scientometrics, *European Journal of Operational Research*, Volume 246, Issue 1, 2015, Pages 1-19.

Other scientometric approaches use for example patent databases to detect the emergence and maturation of technologies<sup>14,15</sup>, text mining of online news articles from the Web<sup>16</sup>, network analysis<sup>17,18</sup>, the use of information extracted from internet<sup>19</sup>, other alternative data sources like social media<sup>20</sup>, or mixed approaches e.g. combining citations indicators and count of online clicks on scientific publications platforms to determine the prominence of scientific topics<sup>21</sup>. The recent contest organised by the Georgia Institute of Technology, where contestants applied more than 19 different scientometric techniques to predict highly active research topics using 10 years of scientific publications, shows how dynamic the field of data-driven technology foresight is today<sup>22</sup>.

### **Technological foresight at JRC**

Within the European Commission, the Joint Research Centre, acting at the interface between science and policy making, is the main provider of technological foresight studies to policy makers. At JRC, technological foresight is a multidisciplinary activity and combines a “qualitative” approach, involving expert’s opinions, and a data-driven “quantitative” approach involving hard data analysis.

Through its “qualitative” foresight activities, the JRC brings together relevant experts and stakeholders to develop anticipatory knowledge and collect insights on possible alternative futures. As many policy fields have a technological component, these scenarios for the future are used to support policy-makers with long-term implications and opportunities on technological development<sup>23</sup>.

Broad and granular scanning of technology development are usually performed through qualitative foresight. In the spirit of Foresight 2.0 which foster complementary approaches to foresight studies<sup>24</sup>, JRC started to develop in 2018 an in-house quantitative process for technology foresight. This data-oriented approach aims at detecting early signs of emerging technologies or of scientific developments (weak signals<sup>25</sup>) using a mix of text mining

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13 Abercrombie, R.K., Udoeyop, A.W. & Schlicher, B.G. A study of scientometric methods to identify emerging technologies via modeling of milestones. *Scientometrics* 91, 327–342 (2012).

14 Changyong Lee, Ohjin Kwon, Myeongjung Kim, Daeil Kwon, Early identification of emerging technologies: A machine learning approach using multiple patent indicators, *Technological Forecasting and Social Change*, Volume 127, 2018, Pages 291-303.

15 Liu, S. J., & Shyu, J. (1997). Strategic planning for technology development with patent analysis. *International journal of technology management*, 13(5-6), 661-680.

16 Janghyeok Yoon, Detecting weak signals for long-term business opportunities using text mining of Web news, *Expert Systems with Applications*, Volume 39, Issue 16, 2012, p. 12543-12550.

17 Huang, L., Chen, X., Ni, X., Liu, J., Cao, X., & Wang, C. (2021). Tracking the dynamics of co-word networks for emerging topic identification. *Technological Forecasting and Social Change*, 170, 120944.

18 Fefie Dotsika, Andrew Watkins, Identifying potentially disruptive trends by means of keyword network analysis, *Technological Forecasting and Social Change*, Volume 119, 2017, p.114-127, ISSN 0040-1625,

19 Dirk Thorleuchter, Dirk Van den Poel, Weak signal identification with semantic web mining, *Expert Systems with Applications*, Volume 40, Issue 12, 2013, Pages 4978-4985, SSN 0957-4174.

20 X. Zhou et al., "Identifying and Assessing Innovation Pathways for Emerging Technologies: A Hybrid Approach Based on Text Mining and Altmetrics," in *IEEE Transactions on Engineering Management*, vol. 68, no. 5, pp. 1360-1371, Oct. 2021.

21 <https://joint-research-centre.ec.europa.eu/system/files/2018-06/fta2018-paper-b3-rota.pdf>

22 Alan L. Porter, Denise Chiavetta, Nils C. Newman, Measuring tech emergence: A contest, *Technological Forecasting and Social Change*, Volume 159, 2020.

23 See for example the 2022 Strategic Foresight Report “Twinning the green and digital transitions in the new geopolitical context” at [https://ec.europa.eu/info/strategy/strategic-planning/strategic-foresight/2022-strategic-foresight-report\\_en#documents](https://ec.europa.eu/info/strategy/strategic-planning/strategic-foresight/2022-strategic-foresight-report_en#documents)

24 Schatzmann, J., Schäfer, R. & Eichelbaum, F. Foresight 2.0 - Definition, overview & evaluation. *Eur J Futures Res* 1, 15 (2013).

25 Mari Holopainen, Marja Toivonen, Weak signals: Ansoff today, *Futures*, Volume 44, Issue 3, 2012, Pages 198-205,

techniques and scientometric indicators applied on a corpus of peer-reviewed scientific publications or patents<sup>26,27,28</sup>. More information about the process can be found in Chapter 3 of the present report.

In addition to the weak signals reports published in 2019 and 2020<sup>29,30,31</sup>, weak signals of technology emergence detected through this data driven process have also been used to feed various foresight processes in the Commission and related institutions (see for example the two public reports on border control technologies<sup>32</sup> and horizon scanning for nuclear safety and security<sup>33</sup>).

## Tool and data

The 93 weak signals presented in this report are the result of a detection process ran by the JRC during the first quarter of 2022 on a corpus of peer-reviewed scientific publications using TIM Trends<sup>34</sup>. This software combines text mining techniques with computational and data visualisation means and has been specifically designed by JRC to detect weak signals of emerging technologies or new scientific topics.

The weak signals were detected by analysing data from the Scopus collection of scientific publications (from 1996 to 2020), following a methodology combining text mining, scientometrics and domain knowledge (read more about the methodology in section 3). Domain knowledge for the weak signals related to biotechnologies, medicine and health was provided by the European Medicine Agency. It is important to note that the list of weak signals is not exhaustive and may also contain signals that will never lead to new technologies or innovations.

## Dashboards

Thematic dashboards are available online for deeper exploration of the weak signals, through visualisations based on the collection of documents (peer-reviewed scientific publications, patents and EU funded research projects) associated to each of them. The dashboards offer many features to quickly grasp the main characteristics of each signal: what the signal is about, which organisations are active in the field, what countries are involved, what is the dynamics and the trajectory of the research, etc. The dashboards have been set up in the TIM Technology system<sup>35</sup> and can be accessed here:

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26 G. Joanny, S. Perani, O. Eulaerts, Detection of disruptive technologies by automated identification of weak signals in technology development. Proceedings of the ISSI, International Society for Scientometrics and Informetrics (2019), pp. 2644-2645.

27 A. Moro, E. Boelman, G. Joanny, J.L. Garcia, A bibliometric-based technique to identify emerging photovoltaic technologies in a comparative assessment with expert review, *Renewable Energy*, 123 (2018), pp. 407-416

28 A. Moro, G. Joanny, C. Moretti, Emerging technologies in the renewable energy sector: a comparison of expert review with a text mining software, *Futures*, 117 (2020), Article 102511

29 Eulaerts O., Joanny G., Giraldi J., Fragkiskos S., Perani S., Weak signals in Science and Technologies - 2019 Report, EUR 29900 EN, Publications Office of the European Union, Luxembourg, ISBN 978-92-76-12386-6.

30 Eulaerts O., Joanny G., Perani S., Weak signals in Science and Technologies 2019 - Analysis and recommendations, EUR 30061 EN, Publications Office of the European Union, Luxembourg.

31 Eulaerts et al, Weak signals in Science and Technologies –Weak signals in 2020, EUR 30714 EN, Publications Office of the European Union, Luxembourg.

32 Eulaerts, O. and Joanny, G., Weak Signals in Border Management and Surveillance Technologies, EUR 31126 EN, Publications Office of the European Union, Luxembourg, 2022.

33 Tanarro Colodron, J., Simola, K., Simic, Z., Cihlar, M., Gerbelova, H., Liessens, A. and Joanny, G., Horizon Scanning for Nuclear Safety, Security and Safeguards Yearly Report - 2020, EUR 30607 EN, Publications Office of the European Union, Luxembourg, 2021.

34 TIM Trends is a tool of the TIM analytics suite developed by JRC. Link to TIM analytics website: [https://knowledge4policy.ec.europa.eu/text-mining/topic/tim\\_analytics\\_en](https://knowledge4policy.ec.europa.eu/text-mining/topic/tim_analytics_en)

35 [https://www.timanalytics.eu/TimTechPublic/main.jsp?dataset=s\\_1507](https://www.timanalytics.eu/TimTechPublic/main.jsp?dataset=s_1507)

Engineering & Physics:

[https://www.timanalytics.eu/TimTechPublic/dashboard/index.jsp#/space/s\\_1857](https://www.timanalytics.eu/TimTechPublic/dashboard/index.jsp#/space/s_1857)

Information and Communication technologies:

[https://www.timanalytics.eu/TimTechPublic/dashboard/index.jsp#/space/s\\_1853](https://www.timanalytics.eu/TimTechPublic/dashboard/index.jsp#/space/s_1853)

Materials: [https://www.timanalytics.eu/TimTechPublic/dashboard/index.jsp#/space/s\\_1856](https://www.timanalytics.eu/TimTechPublic/dashboard/index.jsp#/space/s_1856)

Agriculture & Environment:

[https://www.timanalytics.eu/TimTechPublic/dashboard/index.jsp#/space/s\\_1852](https://www.timanalytics.eu/TimTechPublic/dashboard/index.jsp#/space/s_1852)

Medicine & Biotechnology:

[https://www.timanalytics.eu/TimTechPublic/dashboard/index.jsp#/space/s\\_1858](https://www.timanalytics.eu/TimTechPublic/dashboard/index.jsp#/space/s_1858)

Societal issues:

[https://www.timanalytics.eu/TimTechPublic/dashboard/index.jsp#/space/s\\_1854](https://www.timanalytics.eu/TimTechPublic/dashboard/index.jsp#/space/s_1854)

Energy:

[https://www.timanalytics.eu/TimTechPublic/dashboard/index.jsp#/space/s\\_1855](https://www.timanalytics.eu/TimTechPublic/dashboard/index.jsp#/space/s_1855)

## **Analysis & Visualisations**

Scientific publications, patents and EU projects are retrieved for each weak signal and key data and indicators are calculated. Visualisations are provided for each individual signal and for all the signals belonging to the same topic.

### **- At weak signal level**

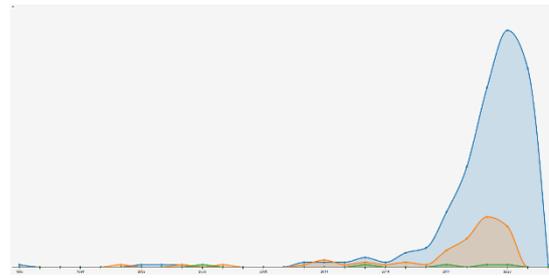
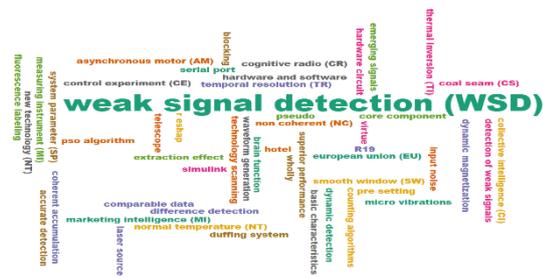
Three visualisations are presented for each weak signals (see figure 1):

*The Word cloud of relevant keywords* allows to quickly grasp the important concepts related to the weak signal. Fifty keywords are generated by TIM's language processing algorithms to represent the set of documents as a whole. The size of the keywords in the cloud measures the "relevance" of the term in the set (see annex for the calculation of the relevance).

*The Distribution of documents* shows the distribution of documents retrieved for the weak signal with  $(X,Y)=(\text{years},\#\text{documents})$ . The sharper and higher the peak in the last 3 years, the most intense the weak signal is. The same colour code is used for all the weak signals: Blue = Scientific publications; Orange = Patents; Green = EU projects.

*The List of main organisation* provides the most active organisations for each weak signal. The number next to the organisation name is the number of documents in which the organisation was the entity of the author of a scientific publication, applicant of a patent or beneficiary of an EU project. The country in which the entity is located is also shown.

**Figure 1:** Visualisations at Weak Signal level



ERIDE INC	Y	1.0	[United States of America]
U-BLOX AG	Y	1.0	[Switzerland]
GMV	Y	1.0	[Spain]
Universidad Autónoma	Y	1.0	[Spain]
Korea Energy Economics Institute	Y	1.0	[South Korea]
Korea Institute of Science and Technology Information	Y	1.0	[South Korea]
European Space Agency	Y	1.0	[Netherlands]
Joint Research Centre	Y	1.0	[Italy]
Amirkabir University of Technology	Y	1.0	[Iran]
Fraunhofer Institute for Production Technology IPT	Y	1.0	[Germany]
RWTH Aachen University	Y	1.0	[Germany]
EFS Pyrénées Méditerranée	Y	1.0	[France]

## - At topic level

Three visualisations are shown at topic level: two radar charts that allow to compare the signals together, and a double histogram comparing publishing and patenting between territories.

**The first visualisation** (figure 2 left) is a radar chart that shows four dimensions related to the characteristics of each signal: activeness; number of articles; number of patents and persistence.

*Activeness* is considered as a proxy for signal novelty. This indicator is defined as the ratio between the number of documents retrieved for a certain period and the total number of documents retrieved for the total period 1996-2021. The indicator displayed here is  $activeness[2019-2021]$  and corresponds to the ratio  $[\#documents\ published\ during\ the\ period\ 2019-2021] / [\#documents\ published\ during\ the\ period\ 1996-2021]$ . A high activeness score means that a high percentage of documents have been published during the recent selected period, and are therefore new and active.

*Number of articles* and *number of patents* indicate the intensity of research and market closeness respectively. They simply correspond to the number of documents for each type retrieved in the period 1996-2022.

*Persistence* indicates for how long the signal has being studied or researched. This indicator is calculated by counting the number of years for which documents relating to the signal were retrieved.

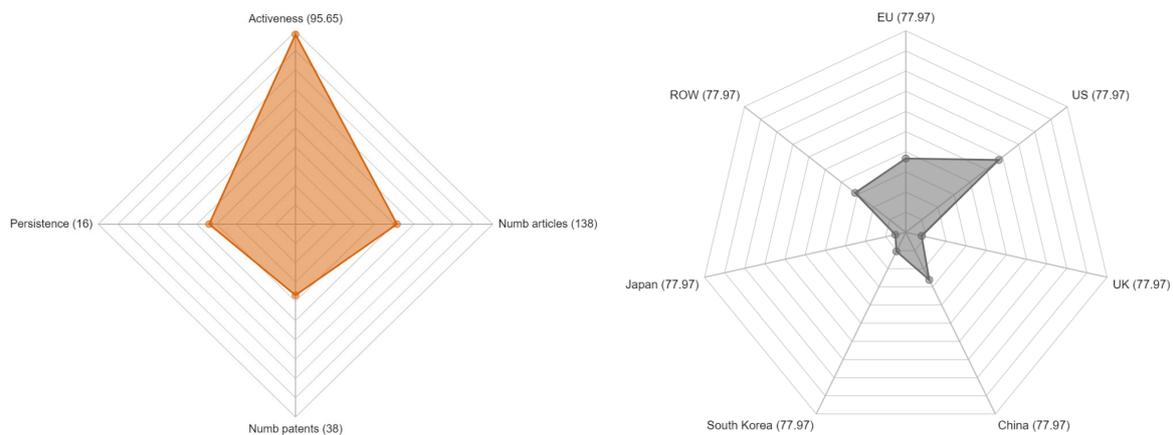
The maximum value for each of the axis of the first visualisation is the absolute maximum for said axis among all the signals for the topic considered. Figure 2 (left) shows a typical shape for a weak signal.

**The second visualisation** (figure 2 right) shows the contribution of various territories (contribution of organisations located in these territories). 7 axis are used to show the contributions from: EU, US, China, South Korea, UK, Japan, and the rest of the world (ROW).

For example, a contribution of 45% from Japan means that there is at least one organisation from Japan in 45% of the documents related to the signal.

A different choice has been made for the maximum value of each axis in the territories radar: the maximum value for each axis is the absolute maximum value for any of the countries considered. In the example used here, the maximum value for each of the axis is 77.97%, which is the value for US for one of the weak signal in this topic. It is also important to note that because of documents with international collaboration, the sum of the contributions from each country might exceed 100% (as there might be several organisations from various territories involved in one publication or patent).

**Figure 2:** Visualisations at topic level



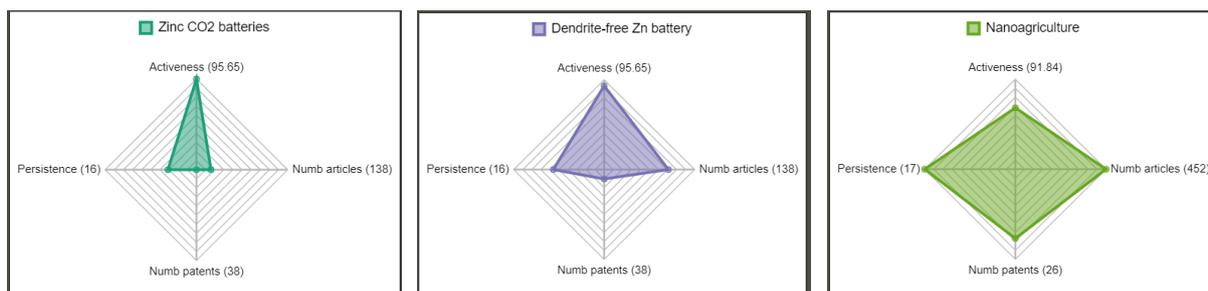
Radar visualisation of weak signal characteristics

Radar visualisation of WS territorial contributions

The use of radar visualisations introduces a geometrical element in the analysis of weak signals, which might be the first step towards automated graph analysis where variations of shapes with time would be monitored and trigger alarms when significant changes is observed. In particular, the visualisation using four indicators characteristic of a weak signal (figure 2 left) might be used in that perspective. Although all shapes and forms are observed, three main types of shapes can be distinguished (see figure 3):

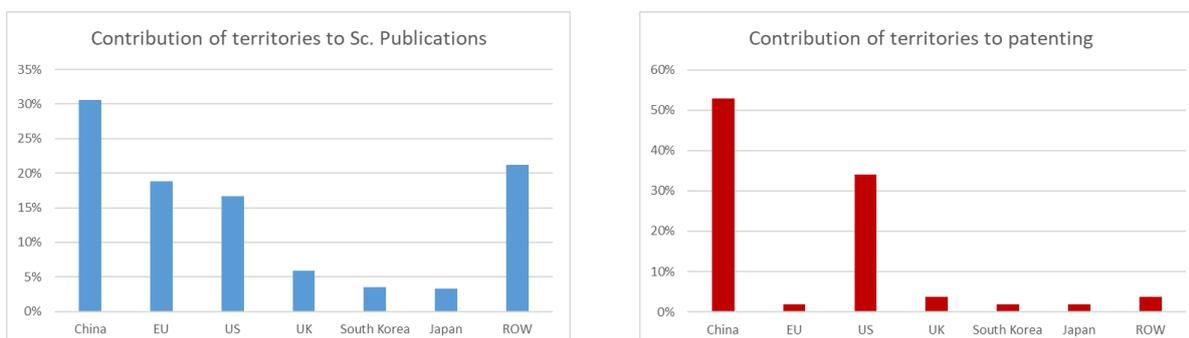
- *narrow flat triangles* (high activeness, relatively low persistence, relatively low number of scientific publications and patents), that could be associated to very early weak signals;
- *broad flat triangles* (high activeness, average persistence and number of articles, low number of patents), which describes weak signals in development for some time:
- *diamonds* (a high or relatively lower activeness, high persistence, number of articles and number of patents), mainly associated with “older” weak signals with intense R&D over the last years, typical of very promising technologies where patenting goes in parallel with publishing, or even precedes publishing.

**Figure 3:** Typical shapes for radar visualisation Weak Signal



A **third visualisation** (figure 4) at topic level completes the picture by showing the contributions of the same territories separately to publishing scientific articles and to patenting. Because patents from both individuals and organisations have been taken into account, and because the overall number of patents is usually small for weak signals, any conclusion made on patenting numbers should be made with caution and should at most be considered as indicating a mere emerging trend.

**Figure 4:** Visualisations at topic level “From publishing to Patenting”



## 2 Weak Signals

93 weak signals have been detected and grouped in 7 topics: Engineering & Physics, Information and Communication Technologies (ICT), Materials, Agriculture & Environment, Medicine and Biotechnology, Societal issues, and Energy. This grouping has been made by looking at most populated journal categories for each weak signal.

Numerous weak signals related to neural networks and SARS-coV-2 have also been detected but have not been considered for the purpose of this report. The following pages briefly present the weak signals for each topic.

**Figure 5:** List of the weak signals by topic



## 2.1 Engineering & Physics

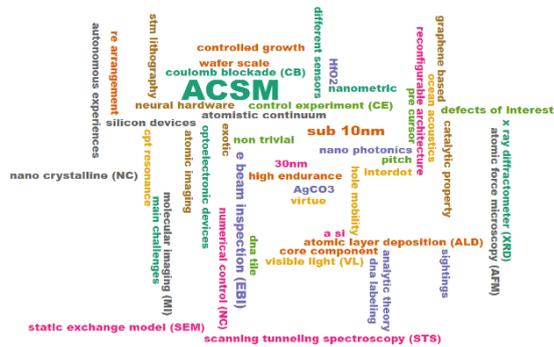
Dashboard:

[https://www.timanalytics.eu/TimTechPublic/dashboard/index.jsp#/space/s\\_1857](https://www.timanalytics.eu/TimTechPublic/dashboard/index.jsp#/space/s_1857)

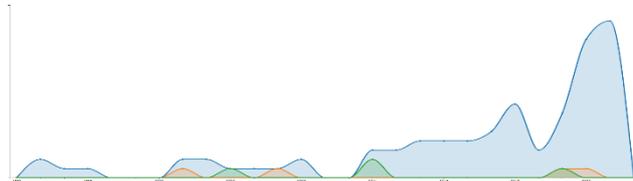
### Atomic scale manufacturing

This concept has a large potential to disrupt technical field where the performance of materials are important. In atomic scale manufacturing, single atoms and molecules are precisely positioned to form flawless products

Figure 6: Visualisations for Atomic scale manufacturing



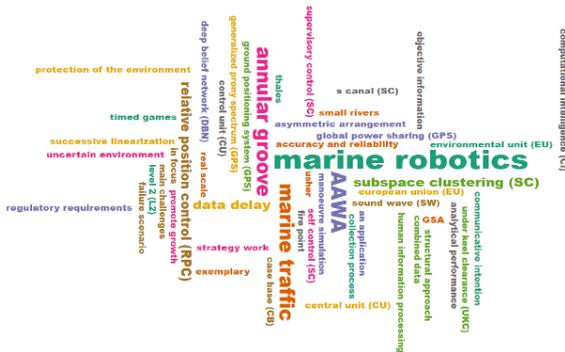
Osaka University	12	[Japan]
Tianjin University	11	[China]
University of New South Wales	9	[Australia]
University College Dublin	9	[Ireland]
Hunan University	5	[China]
EUVL Infrastructure Development ...	5	[Japan]
Chinese Academy Of Sciences	5	[China]
University of Science and Technology	4	[China]
TOKYO OHKA KOGYO CO LTD	3	[Japan]
St. Petersburg State Electrical Engi...	3	[Russian Federation]



### Autonomous surface ships

Autonomous ships are the future of the maritime transport industry, promising to overcome conventional vessels in terms of performance, safety and environmental impact. Many challenges remain for researchers before they become a reality, e.g. collision avoidance, GPS tracking reliability, or safe docking mechanism.

Figure 7: Visualisations for Autonomous surface ships



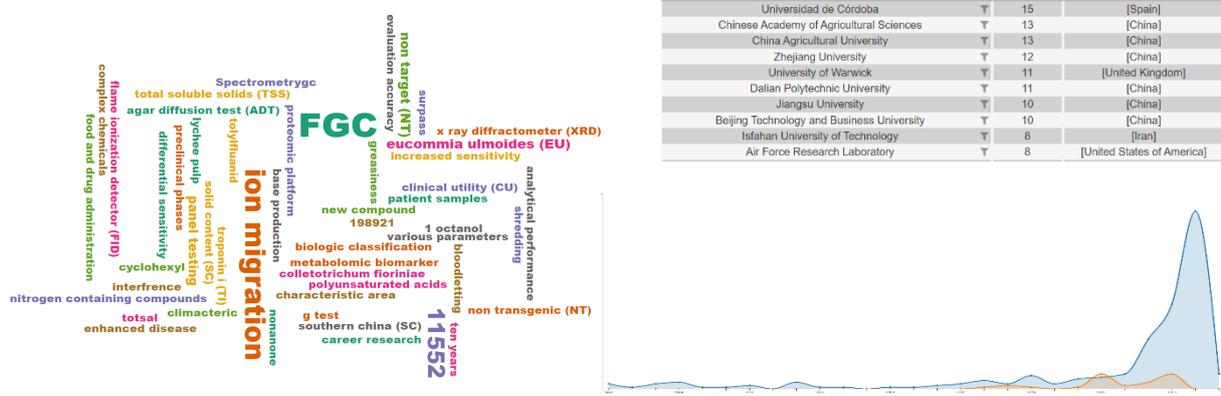
Norwegian University of Science and Technology	29	[Norway]
Delft University of Technology	25	[Netherlands]
Wuhan University of Technology	24	[China]
Gdynia Maritime University	19	[Poland]
Dalian Maritime University	19	[China]
Aalto University	15	[Finland]
STIFTELSEN SINTEF	8	[Norway]
Massachusetts Institute of Technology	8	[United States of America]
Korea Maritime and Ocean University	8	[South Korea]
Kongsberg Group	7	[Norway]



## Gas chromatography-ion mobility spectrometry

GC-IMS is an emerging technique which seems particularly adapted to detect volatile organic components down to parts per billion (ppb) or even parts per trillion (ppt).

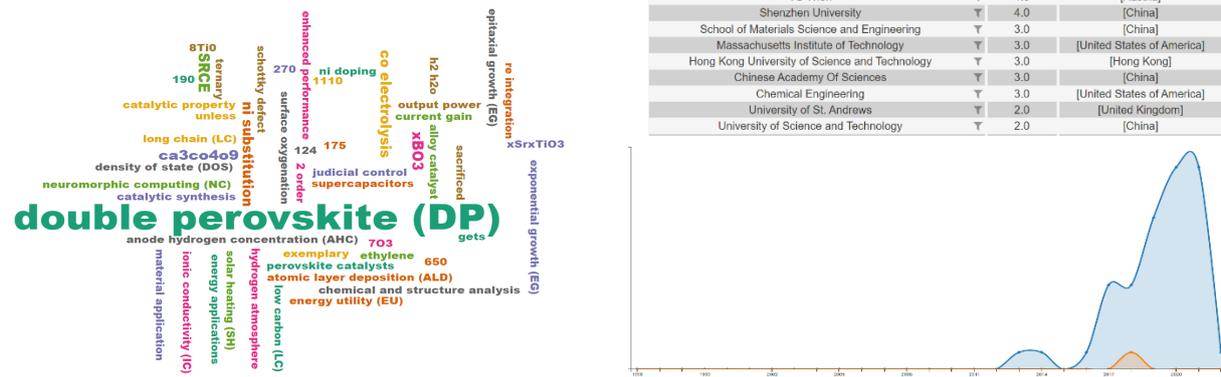
Figure 8: Visualisations for Gas chromatography-ion mobility spectrometry



## Nanoparticles exsolution

is a promising novel and time efficient method to build catalyst surface with a high degree of precision. It is emerging in recent years in the field of surface catalysis, in particular for applications in fuel cells.

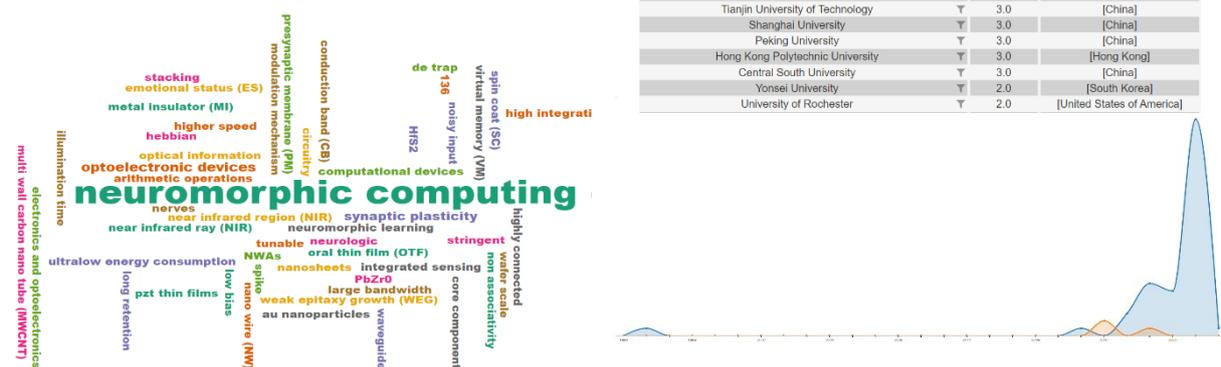
Figure 9: Visualisations for Nanoparticles exsolution



## Optoelectronic synapses

These devices aim at mimicking biological synapses for applications in neuromorphic engineering, a new interdisciplinary subject that takes inspiration from biology, physics, mathematics, computer science, and electronic engineering to design artificial neural systems. Research in optoelectronic synapses is paving the way to disrupting technologies (e.g. vision systems, head-eye systems, auditory processors, autonomous robots).

Figure 10: Visualisations for Optoelectronic synapses



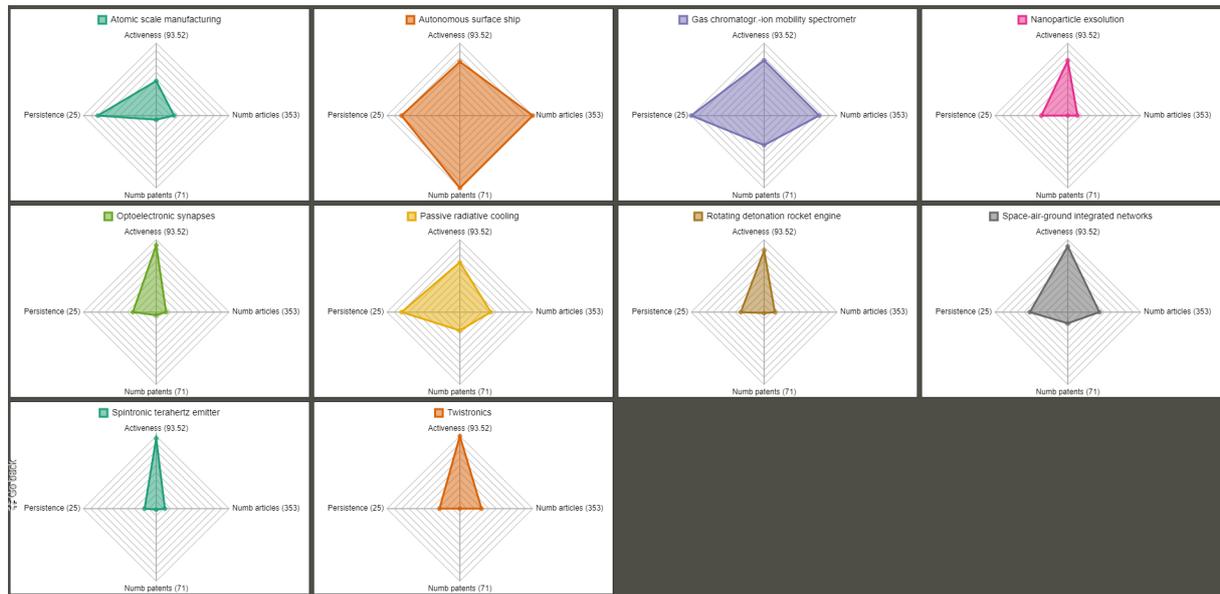




## Radar Weak Signal

9 out of the ten weak signal in Engineering & Physics have a very high activeness. This is the case even for the three diamond-shaped signals: Autonomous Surface Ships, Gas Chromatography Ion Mobility Spectrometry, and Passive Radiative Cooling. We also observe a high persistence for these three signals, meaning that there is being research on these topics for many years but there is also a clear peak of R&D activity in the last years, reflecting a renewed interest for the technique or the technology leading to an acceleration of R&D. One of the weak signals, Atomic scale manufacturing, has an relatively low activeness (44), but still exhibits some characteristics of a weak signal, and was considered for this report due to the possible future impact of this manufacturing technique.

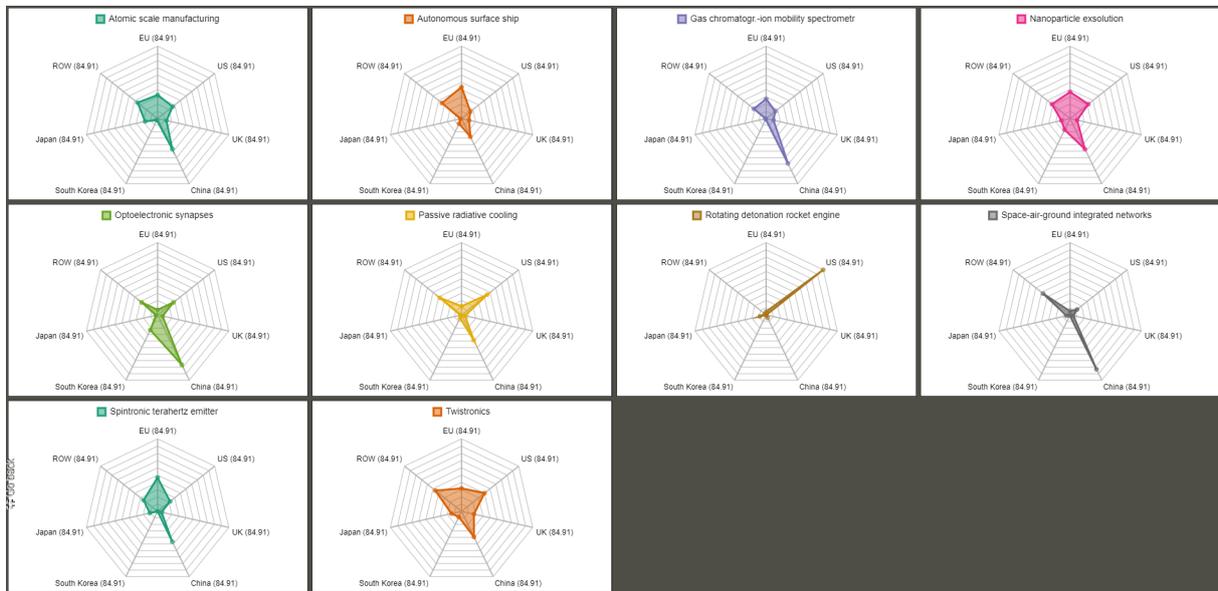
**Figure 16:** Radar Weak Signal for Engineering and Physics



## Radar Territories

The EU is relatively well positioned in five of the weak signals (atomic scale manufacturing, gas chromatography ion mobility spectrometry, nanoparticles exsolution, spintronic terahertz emitters, twistronics) and leading in autonomous surface ships, with China or US leading in the development of all the other weak signals.

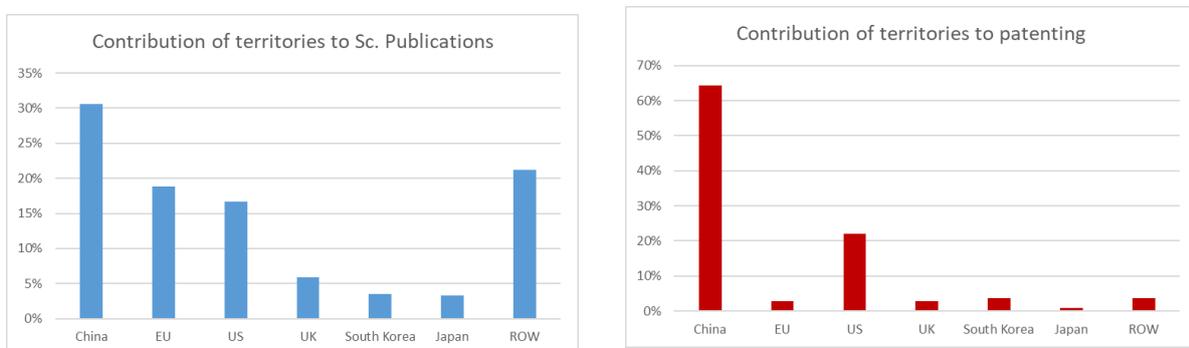
**Figure 17:** Radar territories for Engineering and Physics



## From publishing to patenting

It appears clearly that the while Europe contributes strongly to scientific publications, of which 20% involve at least one R&D organisation from EU, the situation for patenting is very different, with China and the US strong leading in filing patents.

**Figure 18:** From publishing to Patenting for Engineering and Physics



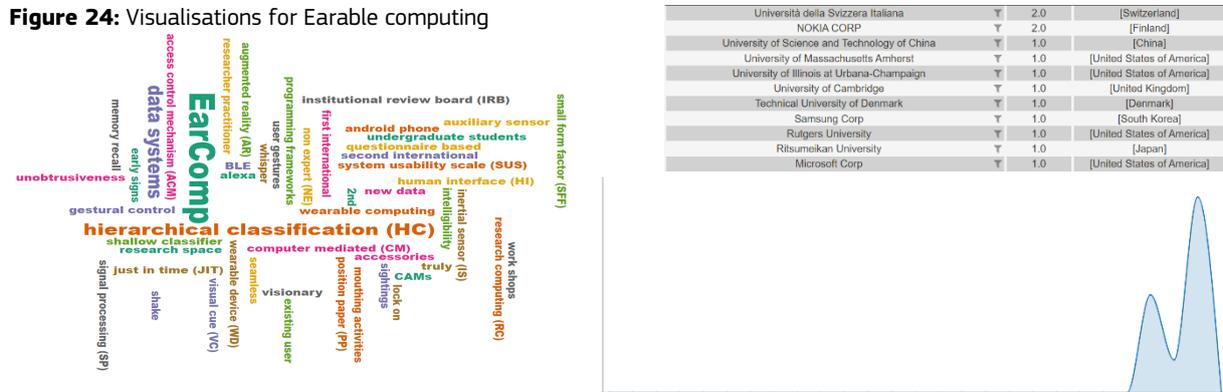




## Earable computing

This new research field looks into the future of wearable devices, and is developing new hardware, software, and apps that will run on earable platform (earphones). The capabilities of such devices would include sensing human behaviour, acoustic augmented reality, digital assistants whispering of just-in-time information, tracking user motion and health.

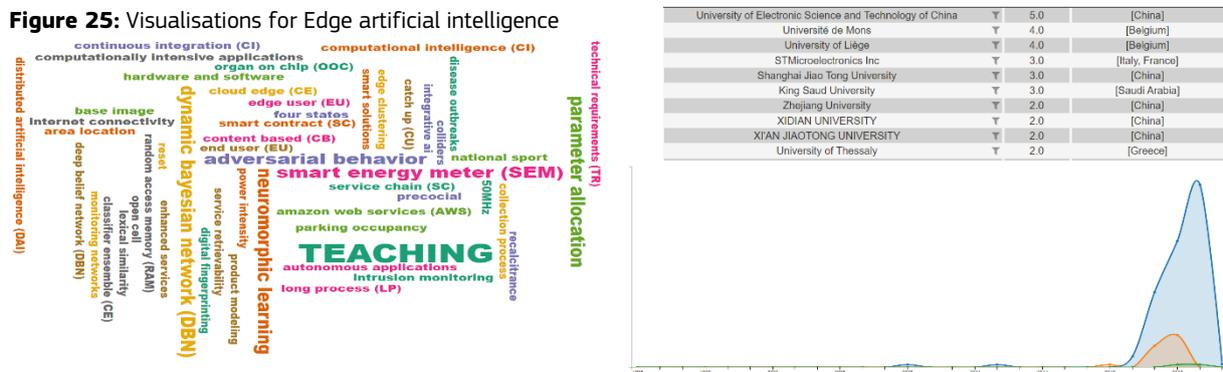
Figure 24: Visualisations for Earable computing



## Edge artificial intelligence

Edge AI brings the decentralization of data and computing to a new level, providing for the functioning of AI on edge devices. Intelligence at the edge alleviates privacy concerns related to the streaming and storing of data to the cloud, it enables real-time fast operations on devices at the edge, and it brings AI services to remote areas, using edge devices to compensate poor networking infrastructures.

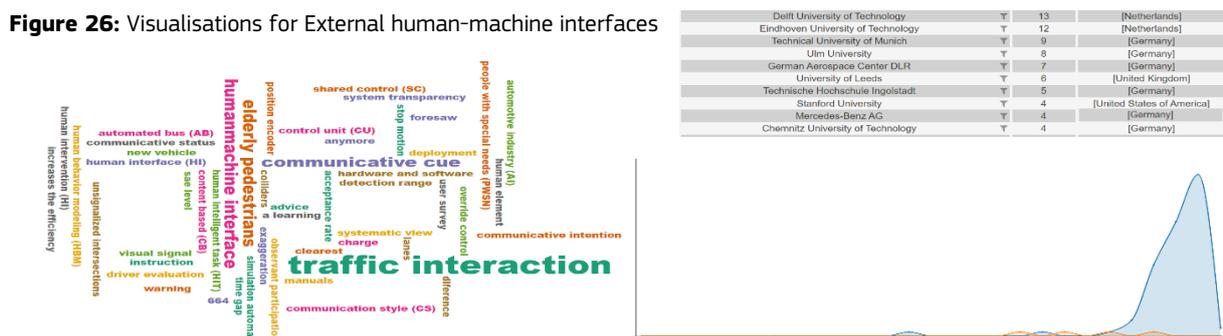
Figure 25: Visualisations for Edge artificial intelligence



## External Human-Machine Interfaces

One challenge to make autonomous driving a reality is the interaction between autonomous vehicles and other users of road infrastructures (pedestrians, bikers, skateboarders, etc.). External Human-Machine interfaces (eHMI) are currently investigated to compensate for the communication problems that may arise between autonomous vehicles and other users.

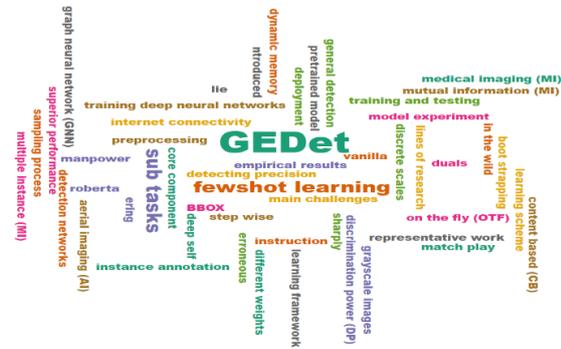
Figure 26: Visualisations for External human-machine interfaces



## Few-shots object detection

Localizing objects is a key step in object detection tasks in autonomous systems (vehicles, robots, etc.). High accuracy in localisation requires object-level annotations and are unable to detect objects of unknown categories. Few-shot object detection is a new method that aims at developing detectors that can detect and adapt to previously unseen objects with scarce or indirect annotated examples.

Figure 27: Visualisations for Few-shots object detection



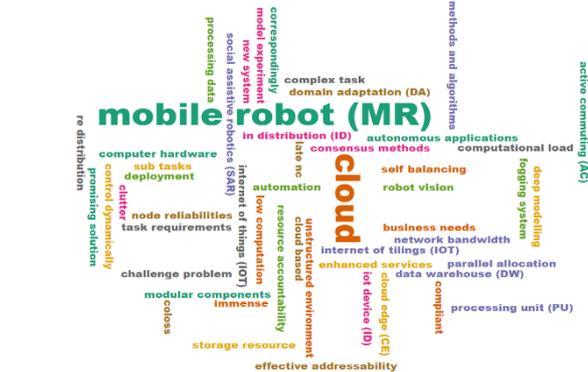
National University of Defense Technology	5.0	[China]
University of Illinois at Chicago	4.0	[United States of America]
Chinese Academy Of Sciences	4.0	[China]
Beijing University of Posts and Telecommunications	3.0	[China]
Beihang University	3.0	[China]
Zhejiang University	2.0	[China]
Xiamen University	2.0	[China]
Tencent	2.0	[China]
Korea University	2.0	[South Korea]
BM Corp	2.0	[United States of America, Chi...]
Huawei Noah's Ark Lab	2.0	[Hong Kong]



## Fog robotics

is an emerging research area in the field of robotics that applies the concept of fog computing to robots. In addition to using computation capacities through cloud services, which can be costly in terms of network communication usage, robots are connected to each other and to devices at the edge, pushing part of the computation and memory needs on them.

Figure 28: Visualisations for Fog robotics



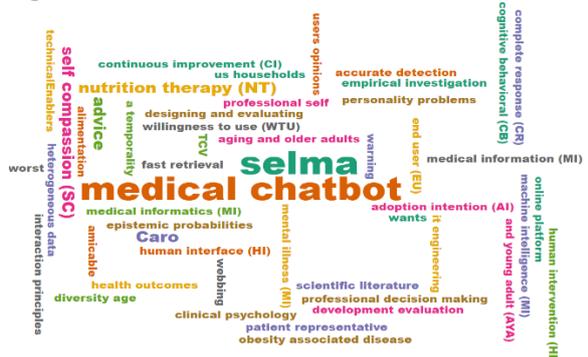
Southern Federal University	5.0	[Russian Federation]
University of California	4.0	[United States of America]
Vienna University of Technology	1.0	[Austria]
University of Turku	1.0	[Finland]
University of Technology	1.0	[Australia]
University of North Carolina at Chapel Hill	1.0	[United States of America]
University of Dhaka	1.0	[Bangladesh]
Tongmyong University	1.0	[South Korea]
Tata Consultancy Services	1.0	[India]
Shanghai Jiao Tong University	1.0	[China]



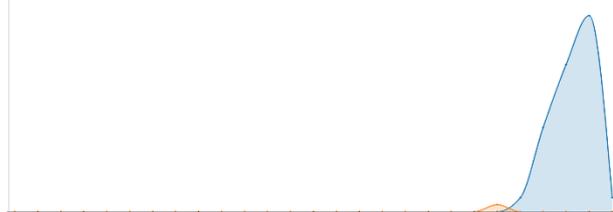
## Health chatbots

are increasingly used in the field of Health and trigger research on various aspects: health data security and health data privacy, patients perception and acceptance, metrics for chatbot evaluation, health ethics, automation of diagnosis, etc.

Figure 29: Visualisations for Health chatbot



Hamad Bin Khalifa University	5.0	[Qatar]
Bern University of Applied Sciences	5.0	[Switzerland]
University of Auckland	4.0	[New Zealand]
Jazan University	4.0	[Saudi Arabia]
University of Warwick	3.0	[United Kingdom]
University of Leeds	2.0	[United Kingdom]
University of Bergen	2.0	[Norway]
University of Applied Sciences	2.0	[Germany]
School of Engineering	2.0	[United States of America]
National Tsinghua University	2.0	[Taiwan]

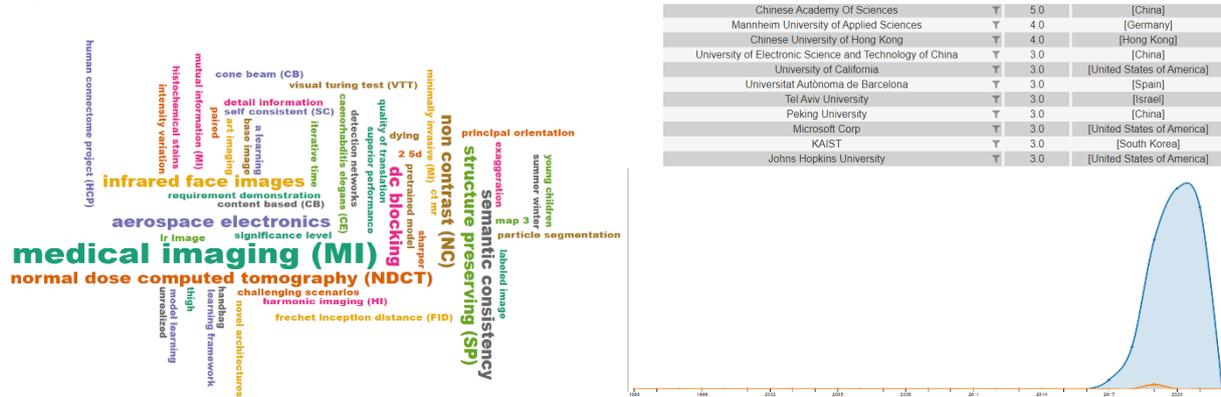




## Unpaired image-to-image translation

is a class of vision and graphics problems where the goal is to translate an image from a source domain to a target domain in the absence of paired examples. It is a promising technique to e.g. accelerate and reduce the cost of medical imaging interpretation.

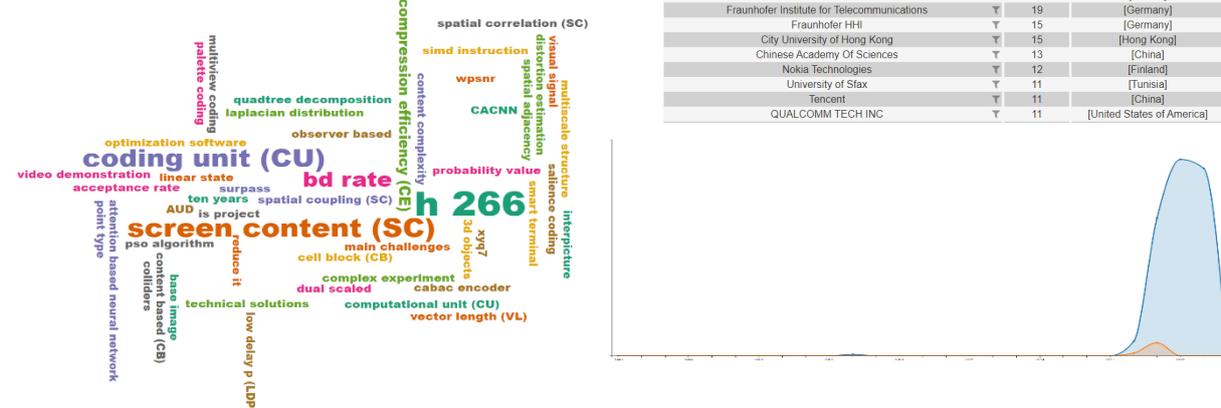
Figure 33: Visualisations for Unpaired image-to-image translation



## Versatile video coding

is the most recent international video coding standard that brings significant bit-rate reductions (around 50%) for the same subjective video quality, compared to its predecessor HEVC. Finalised in July 2020, VVC is now being implemented in devices and chipsets, explaining the peak of research papers on this technology.

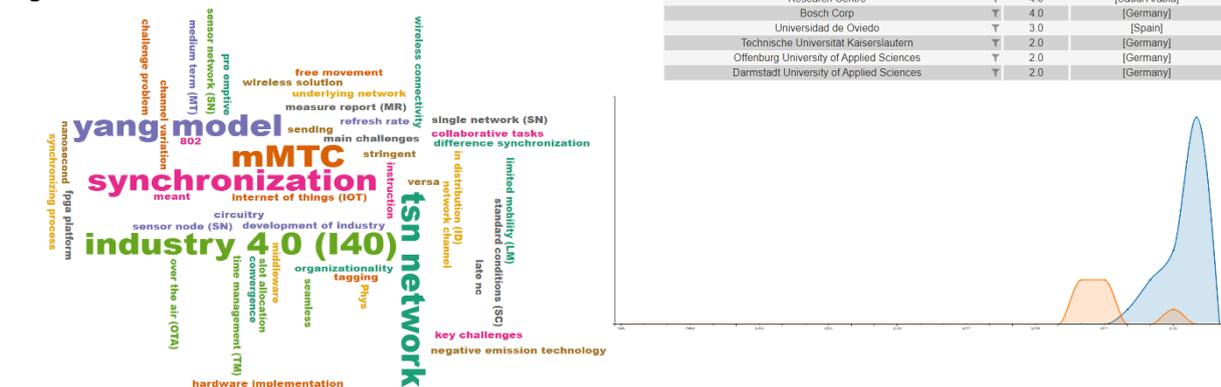
Figure 34: Visualisations for Versatile video coding



## Wireless time sensitive network

In industrial environments, multiple devices need to exchange data with latency down to 1ms. Time-sensitive networking over wireless networks are being developed to allow such low latency communication.

Figure 35: Visualisations for Wireless time sensitive network



## Radar Weak Signal

All of the weak signals have a very high activeness. 9 of the weak signals in ICT have very similar shapes: small number of articles and patents, low or average persistence, and very high activeness. Those are typical characteristics of technologies in a very early stage of development. 5 weak signals stand out: Directed acyclic graphs (with a relatively high number of patents (37)); Edge artificial intelligence (some patents ad high persistence); External human-machine interface (high persistence); Programmable wireless environment (High number of patents, high persistence); Versatile video coding (very high number of articles).

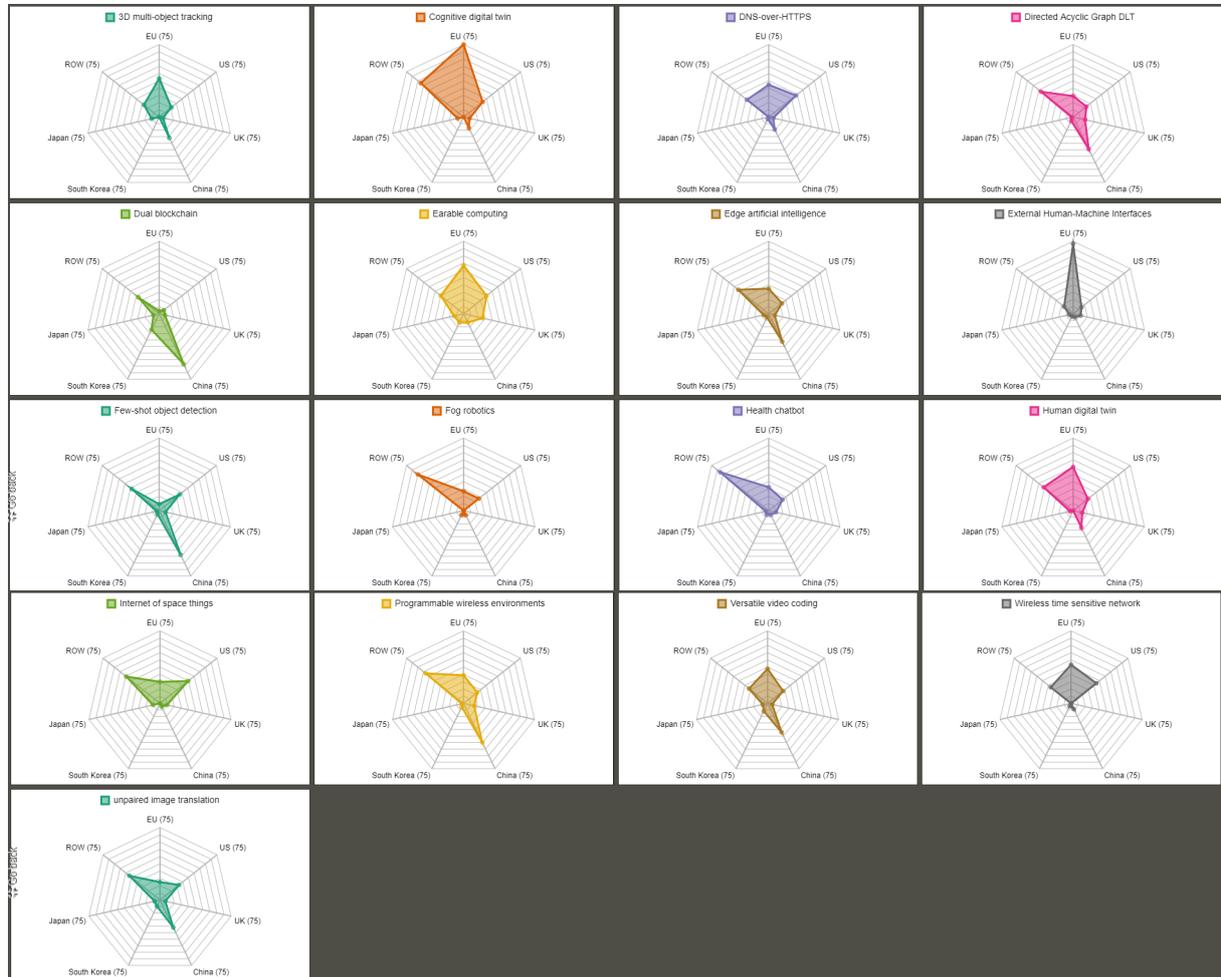
**Figure 36:** Radar Weak Signal for ICT



## Radar Territories

Europe is well-positioned or even leading in many of the weak signals relate to ICT. The US and China are often prominent players in the ICT weak signals.

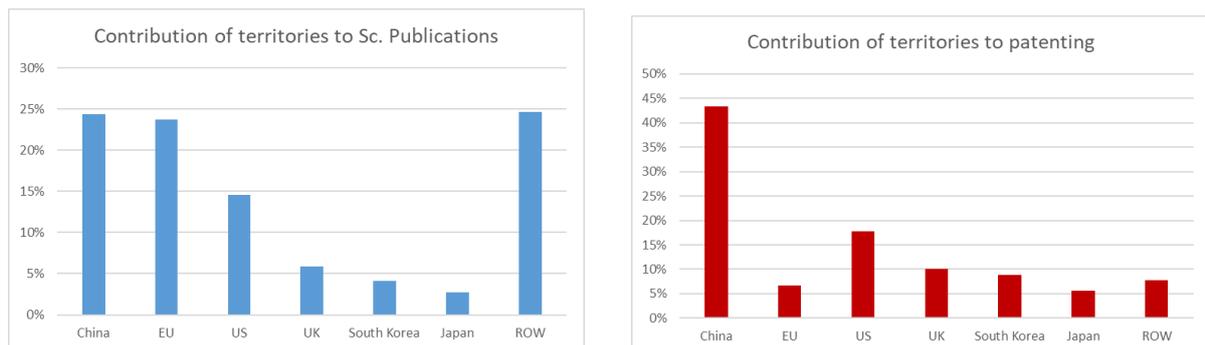
**Figure 37:** Radar Territories for ICT



## From publishing to patenting

Looking into the contributions of the main territories to scientific publication on the one hand, and patenting on the other hand, shows that Europe is indeed strong when it comes to publishing but is lagging behind in patenting. The fact that software inventions cannot be protected by patents at the European patent office might explain partially the low patenting of Europe in the ICT domain.

**Figure 38:** From publishing to Patenting for ICT









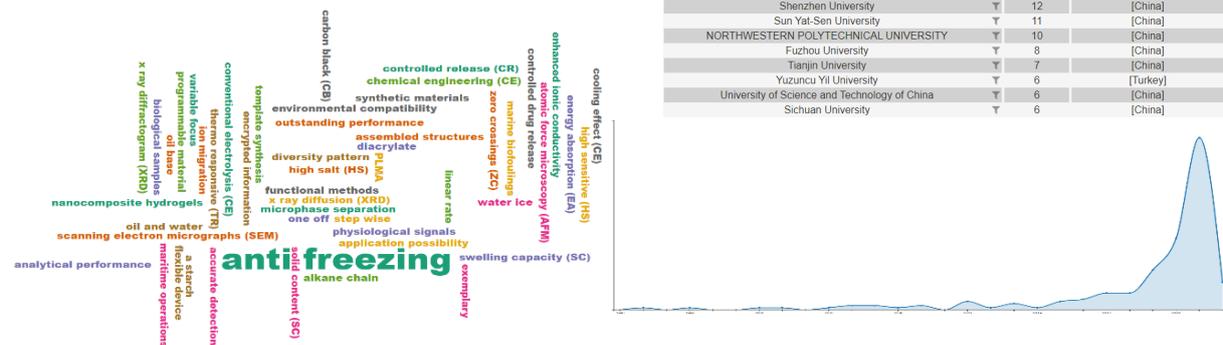




## Organohydrogels

Hydrogels have many applications but lose moisture or solvent in open environment, which induces a decrease in volume and an increase in hardness. They also lose flexibility at lower temperature due to water freezing. Organic materials are introduced into hydrogels to form organohydrogels that could maintain their properties at high and low temperatures with the view to use them in stretchable electronics, biosensors, as intelligent coating materials, etc.

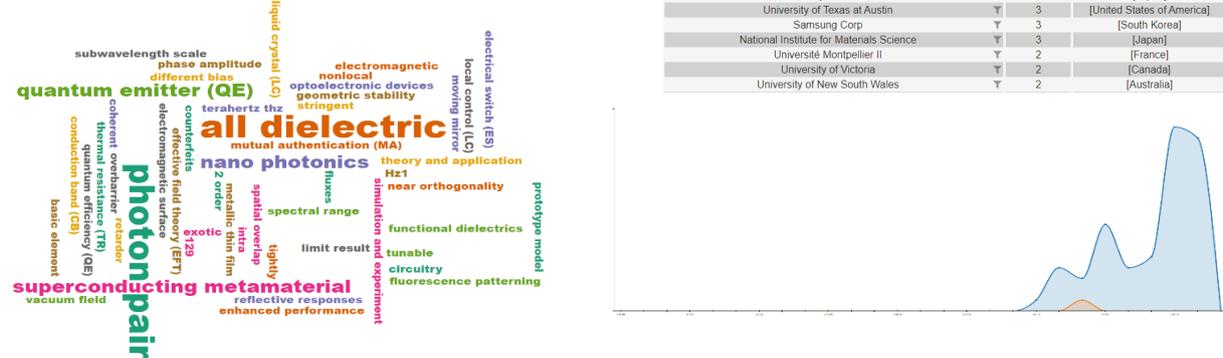
Figure 51: Visualisations for Organohydrogels



## Quantum metasurfaces

Metasurfaces have been widely investigated in the past decade for creating the next-generation multifunctional flat-optics devices, and they have now reached a mature stage where applications are now flourishing (e.g. light bending, EM wave modifications, metalenses, etc.). Some of the research efforts looks into how metasurfaces can be used for quantum applications i.e. the manipulation of matter at a quantum level.

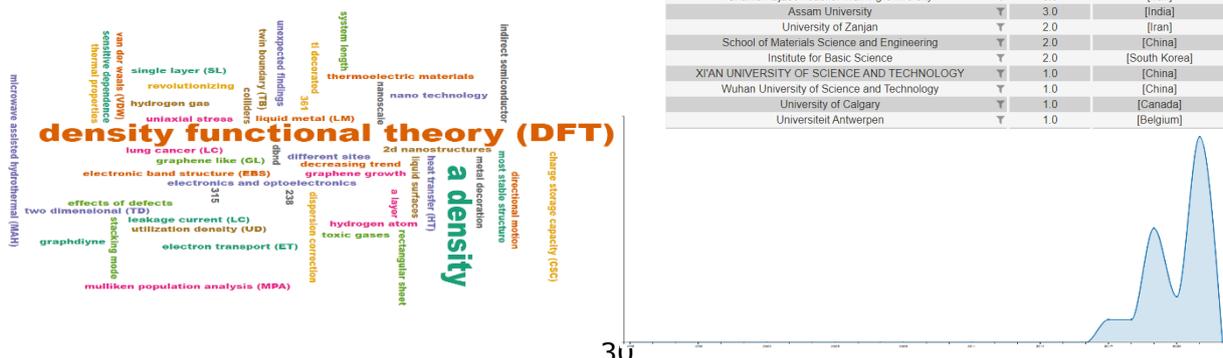
Figure 52: Visualisations Quantum metasurfaces



## Twin graphene

is a novel two-dimensional semiconducting allotrope carbon material that has a modified energy band, giving to the material unique electron transport properties, which will lead to potential applications in the fields of energy storage, spin transport or photoluminescence.

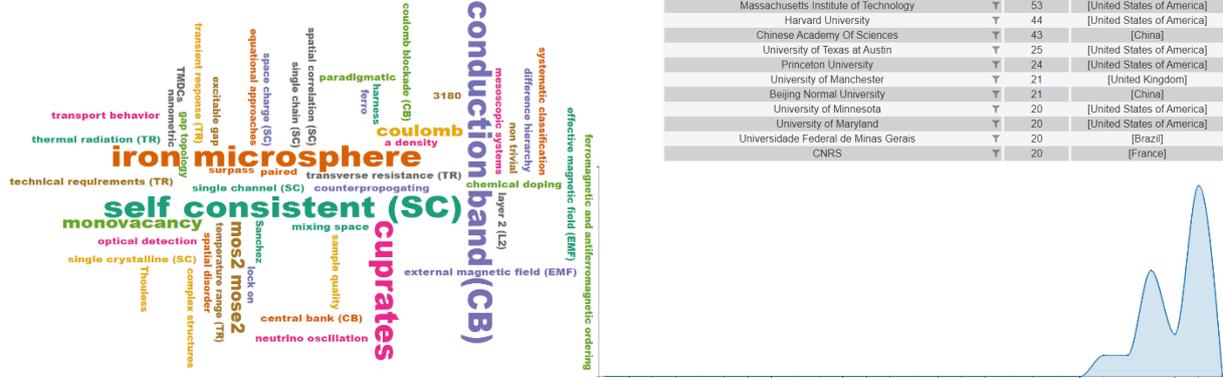
Figure 53: Visualisations for Twin graphene



## Twisted bilayer graphene

is a new material that differs from plain bilayer graphene by having an angle between the two layers. Surprisingly, the angle between the two layers modifies the electronic behaviour of the material e.g. making the material superconducting.

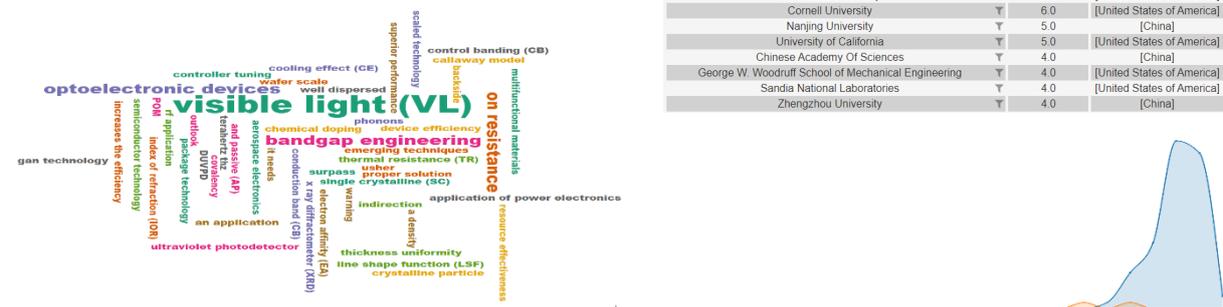
Figure 54: Visualisations for Twisted bilayer graphene



## Ultrawide bandgap semiconductors

have wider bandgap than traditional semiconductors and have promising potential applications in radio frequency and high-power electronics, optoelectronics, quantum electronics, and for electronics submitted to harsh environmental conditions.

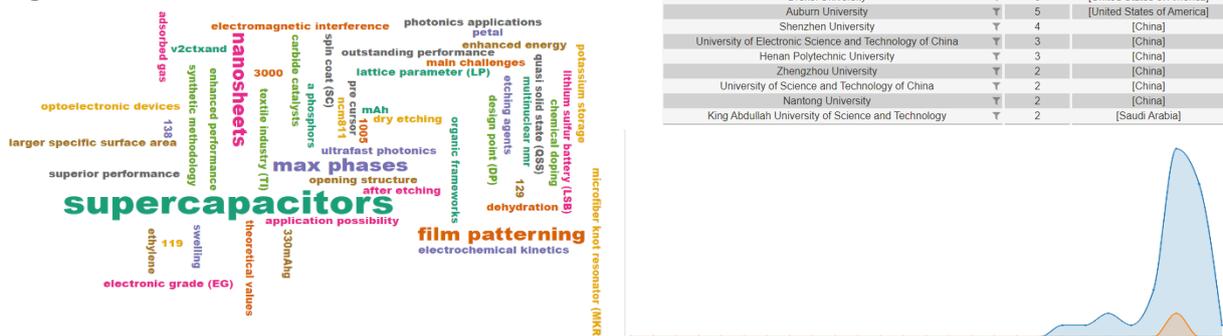
Figure 55: Visualisations for Ultrawide bandgap semiconductors



## V2CTx MXene

are new types of MXenes based on Vanadium carbides. MXenes are two-dimensional nanostructured inorganic compounds with unique properties and potential applications in the design of batteries, supercapacitors, new composites, antennas, optoelectronics, chemical sensing, catalysis etc.

Figure 56: Visualisations for V2CTx MXene



## Radar WS

12 of the weak signals share the similar shape of a very sharp triangle pointing to the left, characteristic of high activeness, low number of patents and articles, and low persistence. The weak signal about “Hybrid nanofluid” and, to a lesser extent, the one on “Twisted layer graphene”, have a high number of articles, high activeness, and high persistence, leading to a broad flat triangle. Two other signals have a slightly different shape (left triangle) with a relatively low number of articles and high persistence: nickelate superconductors and organohydrogel. Finally, two weak signals have a relatively high number of patents: mycelium-based materials and High entropy carbides.

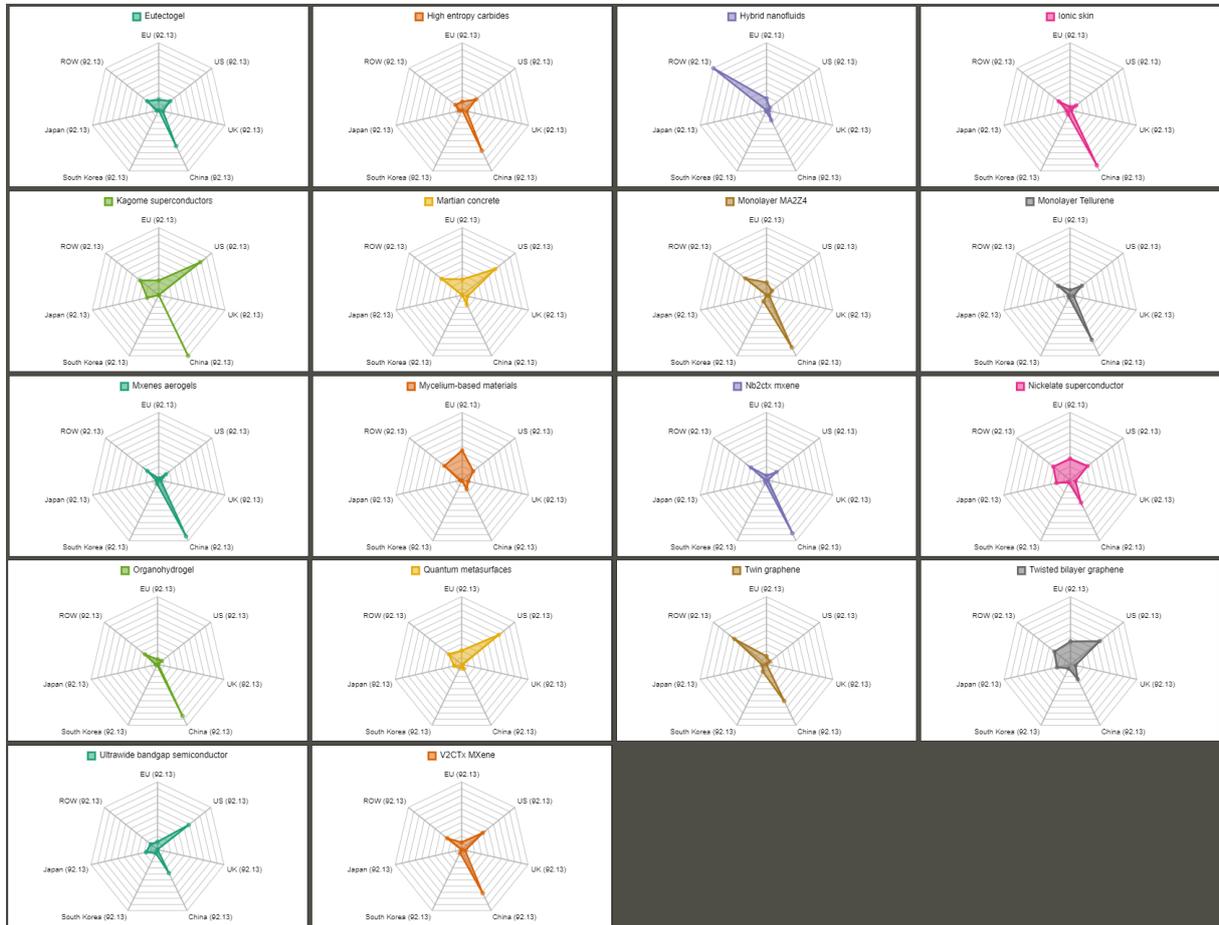
**Figure 57:** Radar Weak Signal for Materials



## Radar Territories

The leadership of China in emerging materials cannot be contested, with a massive contribution in 10 of 17 weak signals and co-leadership with the US in two weak. Europe is well-positioned in 4 of the WS: Martian concrete, Mycelium-based materials, Nickelate superconductors and Twisted layer graphene.

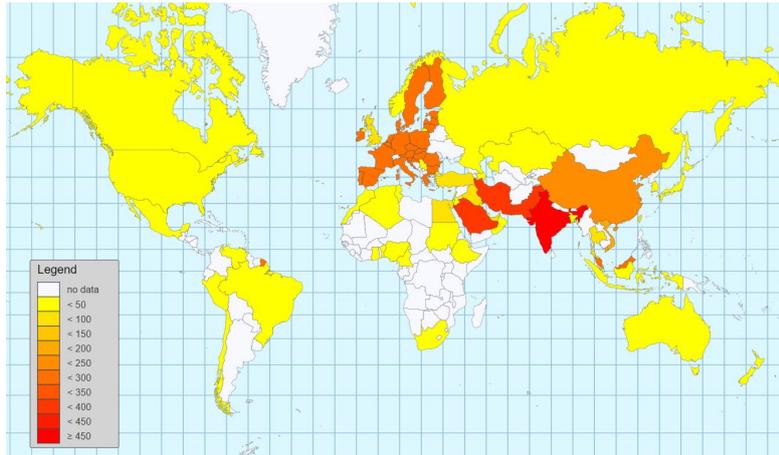
**Figure 58:** Radar Territories for Materials



## From publishing to patenting

Looking at all the weak signals together, one can see that China, EU, and the US contribute to 10-15% of the scientific publications and patents, with the rest of the territories contributing up to 50%. This is not what is usually observed for weak signals and is actually caused by one particular weak signal: “hybrid nanofluid” which has a high activeness but also a very high number of articles (~1850 articles). As the views are relative to the topic (so to the 16 weak signals), and as many of the weak signals have a low number of articles, “hybrid nanofluids” is skewing the visualisations. Countries like Saudi Arabia, India, Malaysia are very active on this topic and are pushing up the proportion for “ROW”.

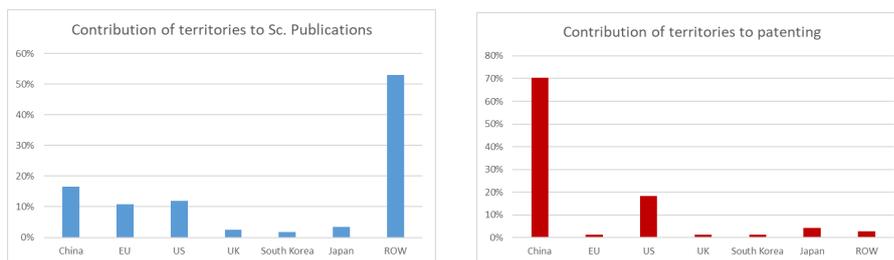
**Figure 60:** EU/world map for “hybrid nanofluids”



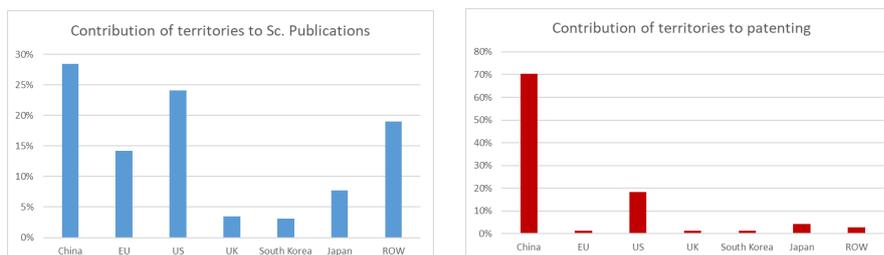
Looking at the contribution of territories for all the weak signals except for “hybrid nanofluids”, one can observe that China and the US are indeed leading in terms of number of scientific publications for weak signals in materials, with respective contributions up to 30% and 25%. Europe contributes in 15% of the scientific publications, but when it comes to patents, is far behind China and the US.

**Figure 61:** From publishing to Patenting for Materials

For all weak signals



For all weak signals except “hybrid nanofluids”

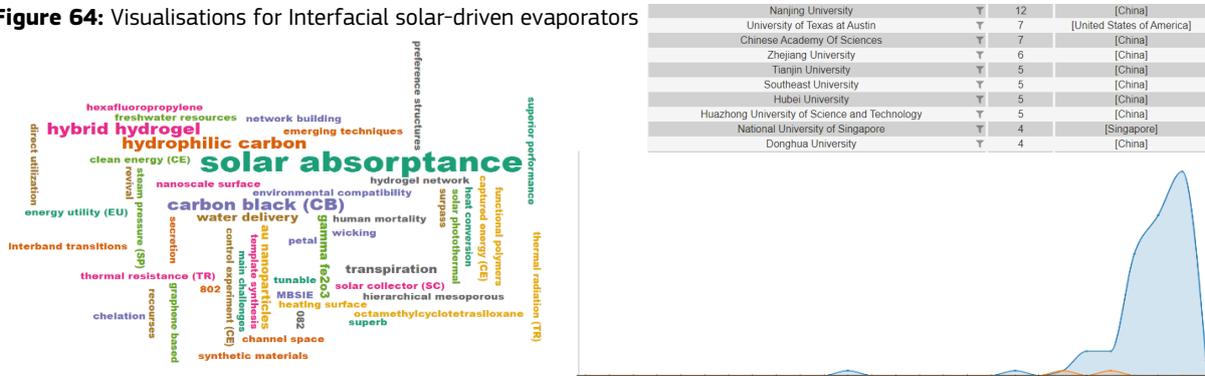




## Interfacial solar-driven evaporators

are efficient, sustainable, and low-cost devices for producing clean water. Research is ongoing to enhance overall performance by using new materials or new system architecture, but also to solve some issues related to scaling up such as the stability of evaporation performances or the reliability for long-term operations.

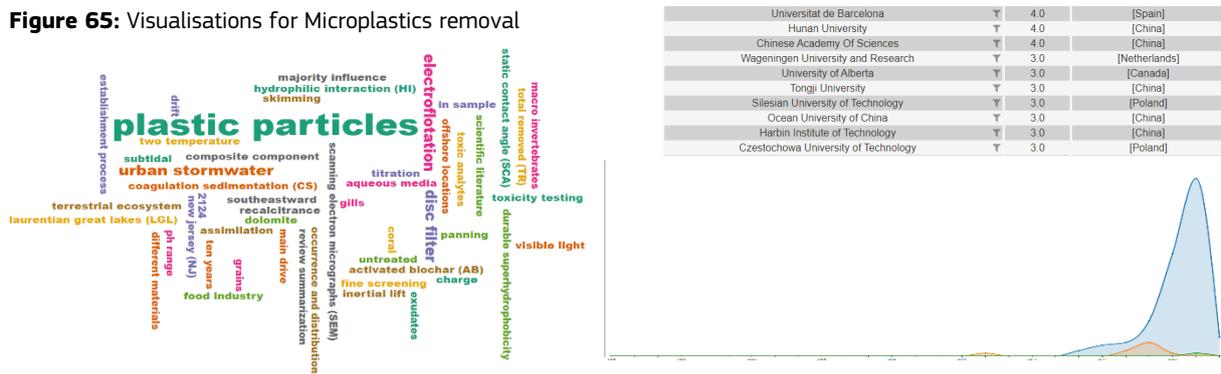
Figure 64: Visualisations for Interfacial solar-driven evaporators



## Microplastics removal

Microplastics are a threat for the environment and a big challenge for the future. Researchers are investigating possible physical, chemical or biological removal options. Good results have been achieved in laboratory but many of these options still lack efficiency in real environmental conditions.

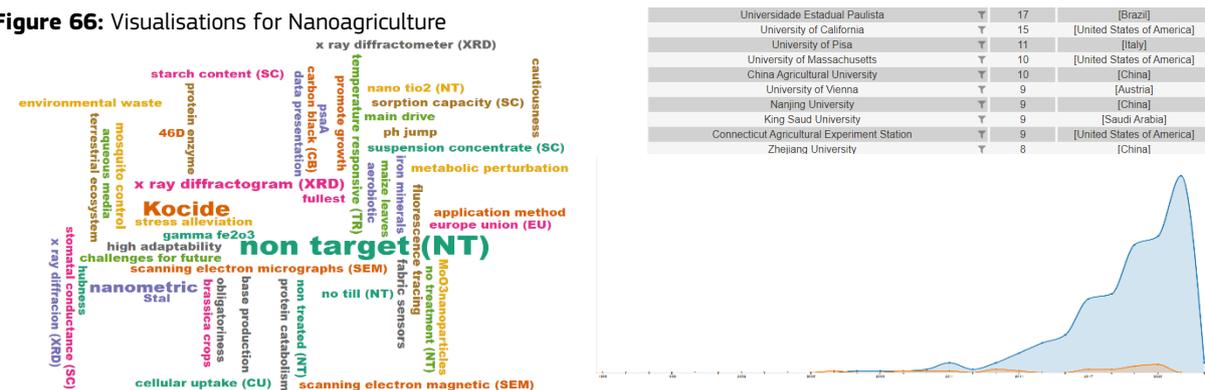
Figure 65: Visualisations for Microplastics removal



## Nanoagriculture

is a relatively new approach that aims at addressing current issues in agriculture and to meet future challenges. It includes the use of nano-biotechnology and nanomaterials in agriculture, nanofertilisers, nanopesticides, nanosensors, etc. Researchers are developing new products and processes, and are also studying the effect of using nanomaterials on human and animal health and the environment.

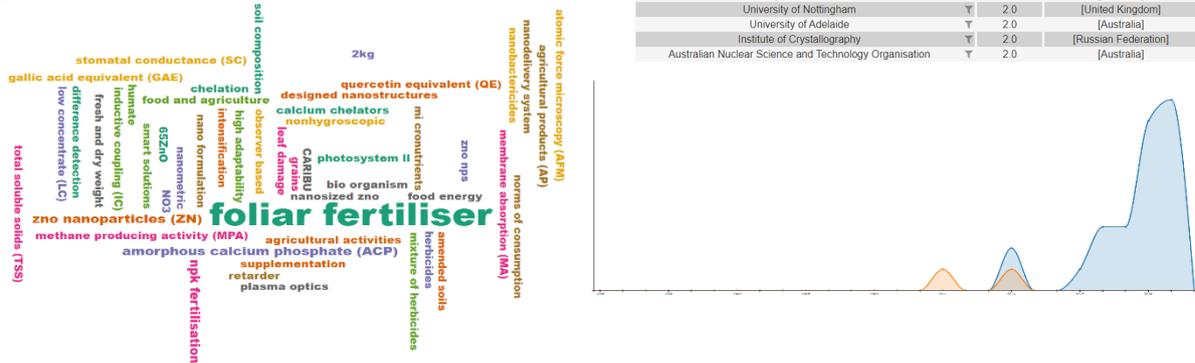
Figure 66: Visualisations for Nanoagriculture



## Nanofertilisers

is a weak signal associated to nanoagriculture. Scientists are converting fertilizers into their nano-size version, which improves their efficacy. Research is needed to achieve reliable industrial processes and to evaluate the impact of nanofertilisers on the food chain and the environment.

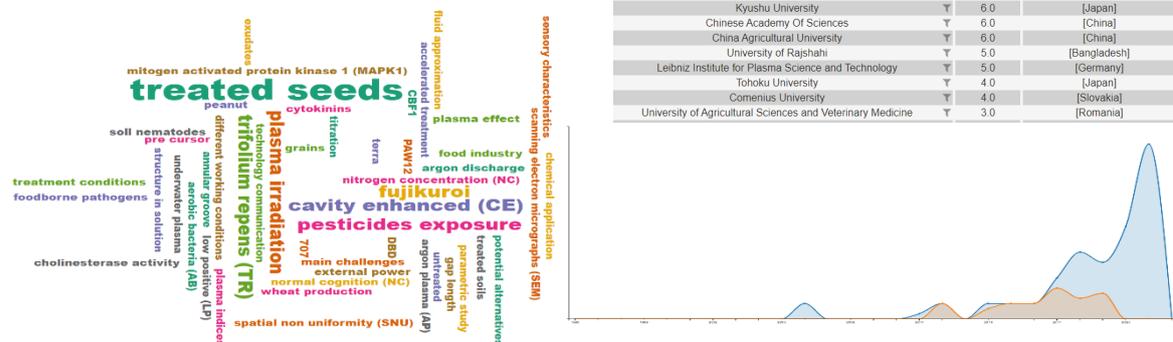
Figure 67: Visualisations for Nanofertilisers



## Plasma agriculture

describes the use of plasma treatments in seed processing for agricultural purposes. In this type of treatments, seeds are subjected to pre-sowing treatments to improve the timeliness and uniformity of the germination. Various plasma treatments have proven to be efficient at laboratory scale, reporting enhanced plant growth, improved stress tolerance, and improved antimicrobial resistance, but scaling-up in real conditions as yet to be achieved.

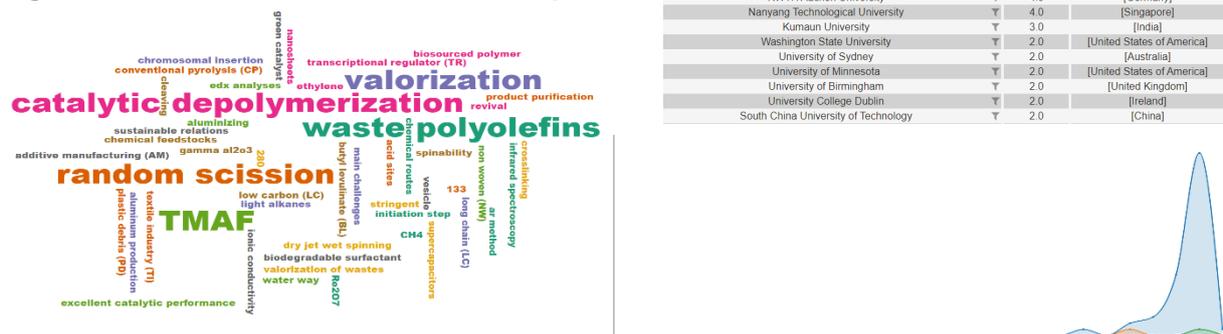
Figure 68: Visualisations for Plasma agriculture



## Plastic chemical upcycling

Upcycling of plastics is meant to complement plastics recycling by offering a way to transform plastic waste into higher-value products and contribute to reduce the environmental burden of plastic on the environment. Various conversion methods (e.g. pyrolysis, gasification, photoreforming) are currently under development and scaling up.

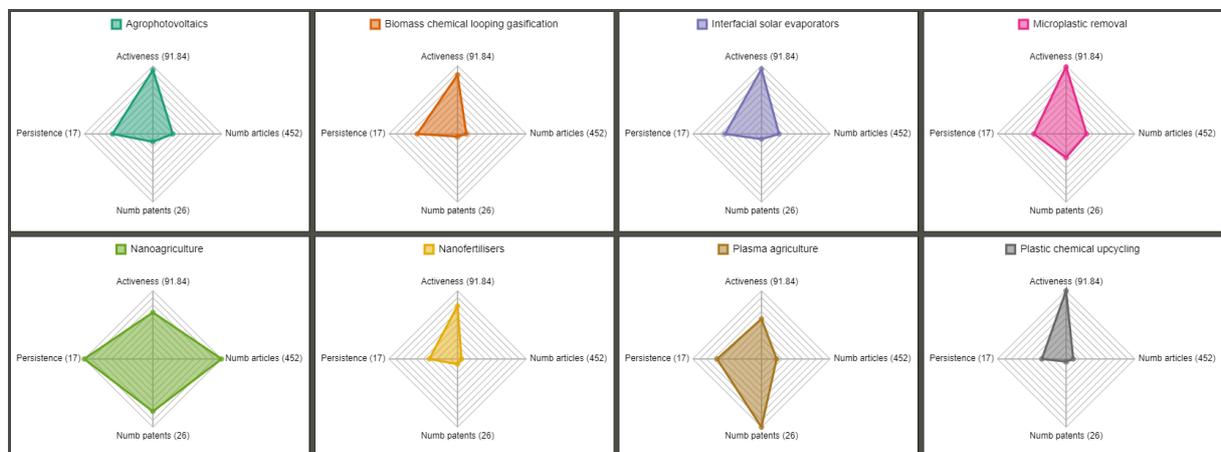
Figure 69: Visualisations for Plastic chemical upcycling



## Radar WS

Six of the 8 weak signals have a similar shape, with a high activeness, a relatively low number of articles and patents, and average persistence (Agriphotovoltaics, Biomass chemical looping gasification, interfacial solar evaporation, microplastics removal, nanofertilisers, plastic chemical upcycling). For the weak signal on plasma agriculture, we can observe that there are already some patents registered. Although the distribution of documents corresponds to a weak signal, activeness is clearly lower than for the other six (activeness 19-22 of 53) because of higher persistence (so more documents published before 2019). The same analysis is valid for the weak signal on nanoagriculture (activeness 19-22 of 62) which has a diamond shape due to its longer persistence, relatively high number of patents and scientific publications, and a high activeness, making it the strongest of the weak signals for this topic.

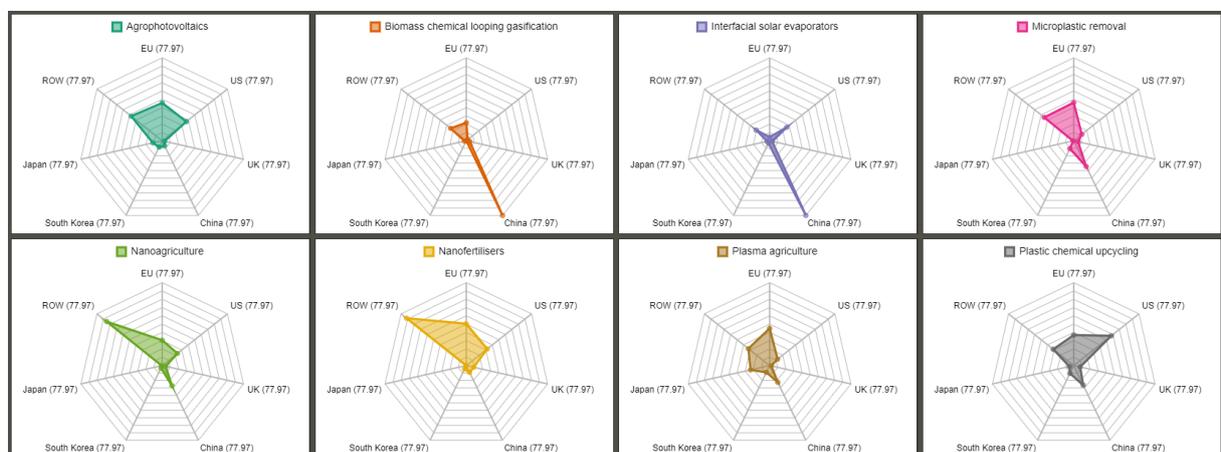
**Figure 70:** Radar Weak Signal for Agriculture & Environment



## Radar Territories

One can observe that Europe is strong in the weak signals on agriphotovoltaics, microplastics removal, nanofertilisers, plasma agriculture. The only WS for which Europe is clearly lagging behind is the one related to interfacial solar evaporators. The US seems to have, on average, a lower interest in this category of topics.

**Figure 71:** Radar Territories for Agriculture & Environment

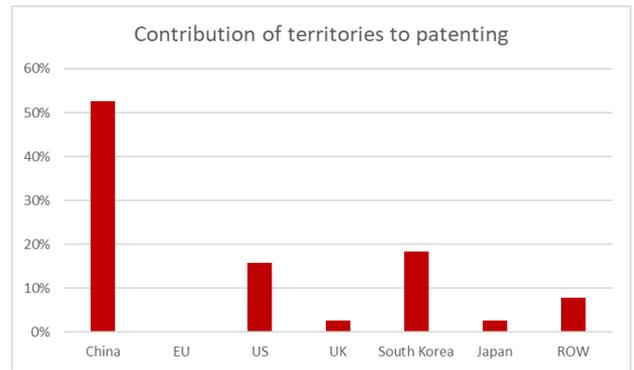
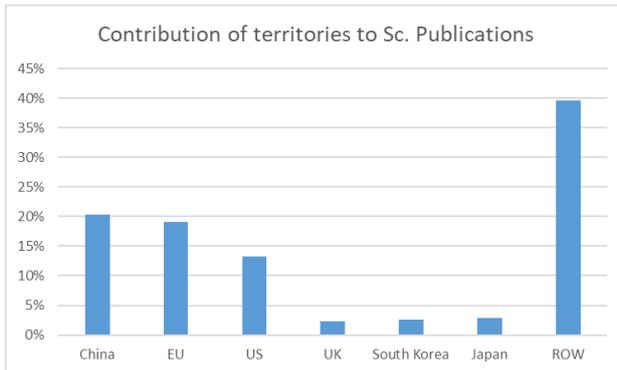


### From publishing to patenting

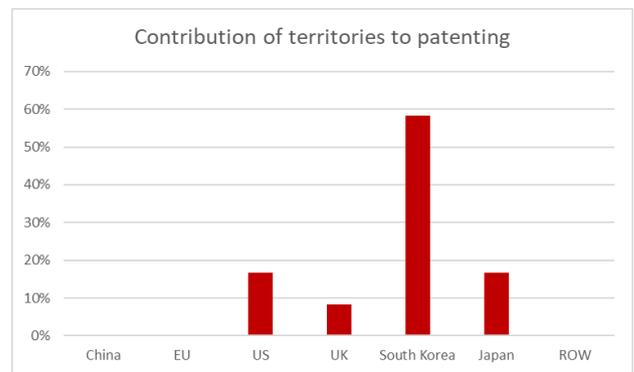
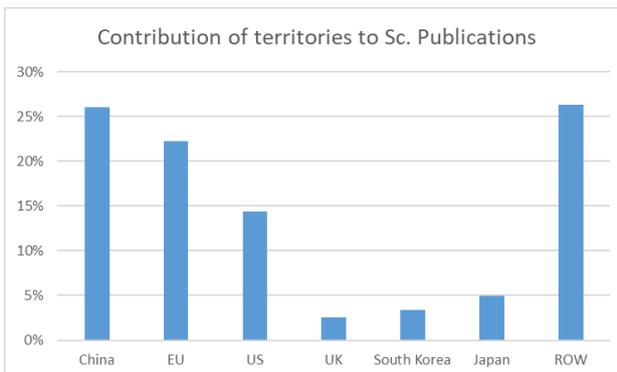
While European organisations lead with Chinese organisations in scientific publications for weak signals in agriculture and environment, they are clearly not translating this research into patents. Similarly to what is observed for WS in materials, one weak signal (nanoagriculture) pushes up the contribution of the ROW, mainly because of the massive contribution from India to this WS.

**Figure 72:** From publishing to Patenting for Agriculture & Biotechnology

For all weak signals



For all weak signals except “nanoagriculture”



## 2.5 Medicine and Biotechnology

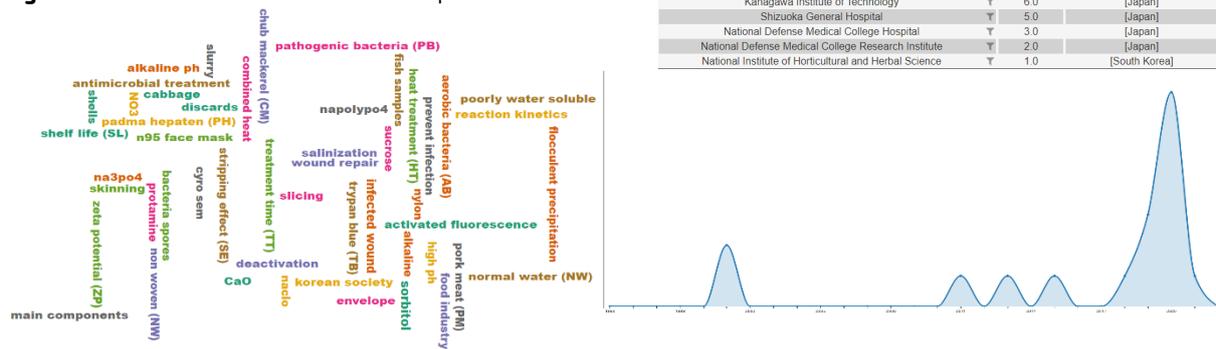
Dashboard:

[https://www.timanalytics.eu/TimTechPublic/dashboard/index.jsp#/space/s\\_1858](https://www.timanalytics.eu/TimTechPublic/dashboard/index.jsp#/space/s_1858)

### BiSCaO antiseptics

are new antiseptics obtained by heating scallop shells. They exhibit a wide microbicide activity and their production is potentially cheap and environmentally-friendly.

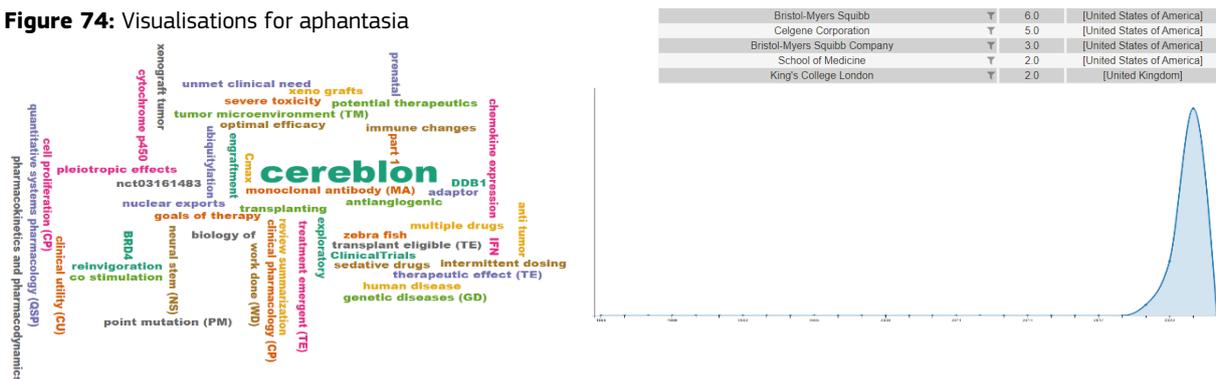
**Figure 73:** Visualisations for BiSCaO antiseptics



### CELMoDs for cancer

Cereblon E3 ligase modulation (CELMoD) drugs are a new generation of compounds with antitumor activity that are being tested in the treatment of cancers, in particular in multiple myeloma therapy.

**Figure 74:** Visualisations for aphantasia







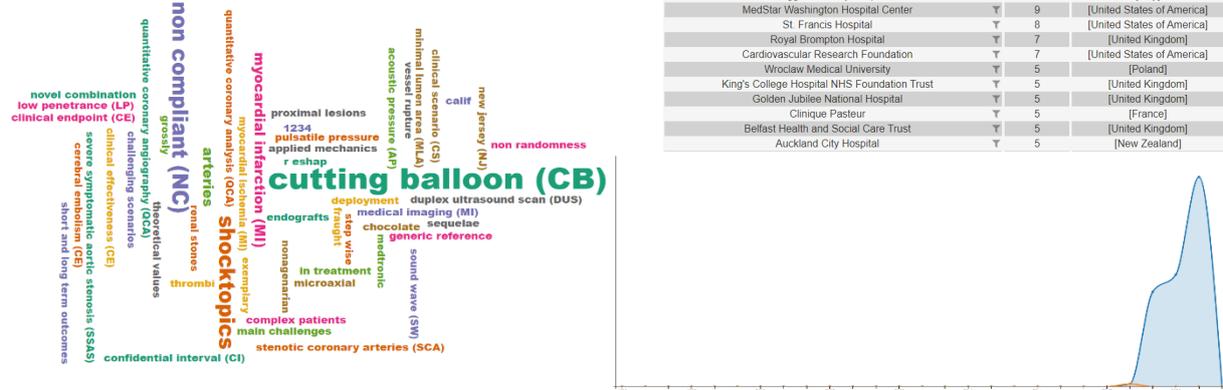




## Intravascular Lithotripsy

is a new technique for treating severely calcified lesions that uses acoustic shockwaves to fracture the calcific plaques, improving luminal dimension gain and vessel expansion.

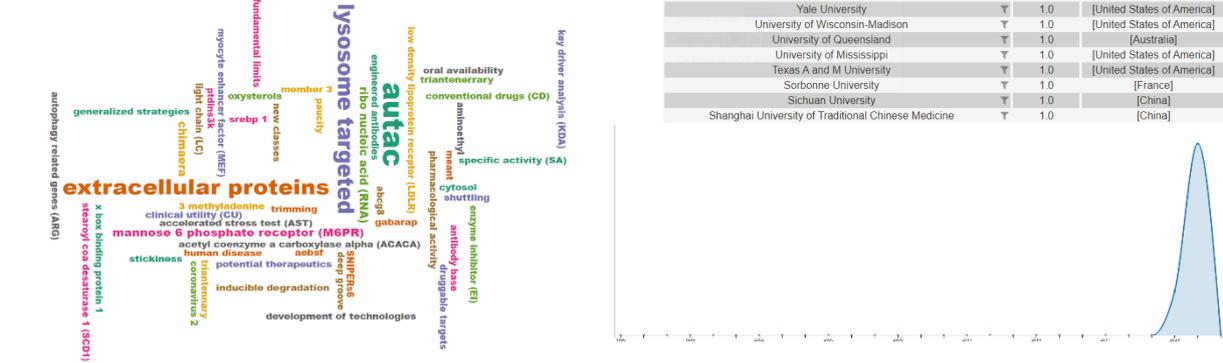
Figure 87: Visualisations for Intravascular Lithotripsy



## Lysosome Targeting Chimaeras (LYTACs)

Targeted protein degradation is a relatively new technique to eliminate disease-causing undruggable proteins. LYTACs is the latest tool for targeted protein degradation that makes use of the lysosome degradation pathway. In particular, it targets extracellular proteins and proteins attached to the membrane.

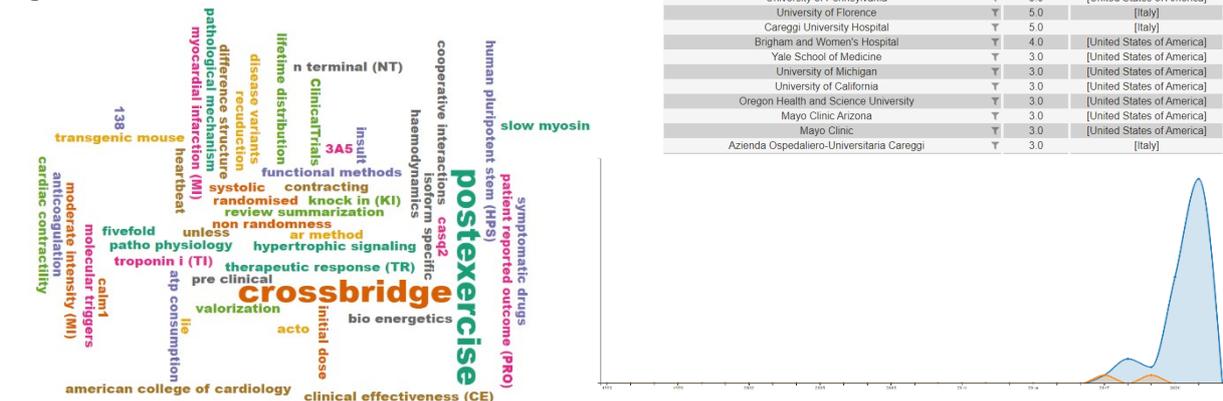
Figure 88: Visualisations for LYTACs



## Mavacamten

is an inhibitor of cardiac myosin ATPase that is currently under development and testing as an oral medicine under development to treat symptomatic obstructive hypertrophic cardiomyopathy, for which there are no efficient treatment options.

Figure 89: Visualisations for Mavacamten









## Radar WS

Most of the radar visualisations for weak signals in Medicine and Biotechnology look alike: a sharp and flat triangle characteristic of high activeness, relatively low number of publications, and low persistence. 3 signals have different characteristics: Direct RNA sequencing, which is a technique that is explored for many years (the signal nevertheless has a relatively high activeness); CRISPR based diagnostic, which has a relatively more patents than the other signals; and Chemodynamic therapy which has a relatively high number of scientific publications and patents, compared to the other weak signals.

**Figure 96:** Radar Weak Signal for Medicine & Biotechnology



## Radar Territories

European organisations contribute significantly to most of the weak signals in Medicine and Biotechnology. Moreover, in most of those, the contribution is very balanced with the relative contribution of the US. In general, those are also topics in which China doesn't seem to have much interest. Some extreme country distributions are observed for BisCaO antiseptic, Chemodynamic Therapy, Nanocatalyst Cancer Therapy and eCIRP, for which one of the territories produced almost all of the documents retrieved (Japan, China, China and US respectively), with the other territories (including EU) contributing anecdotally.

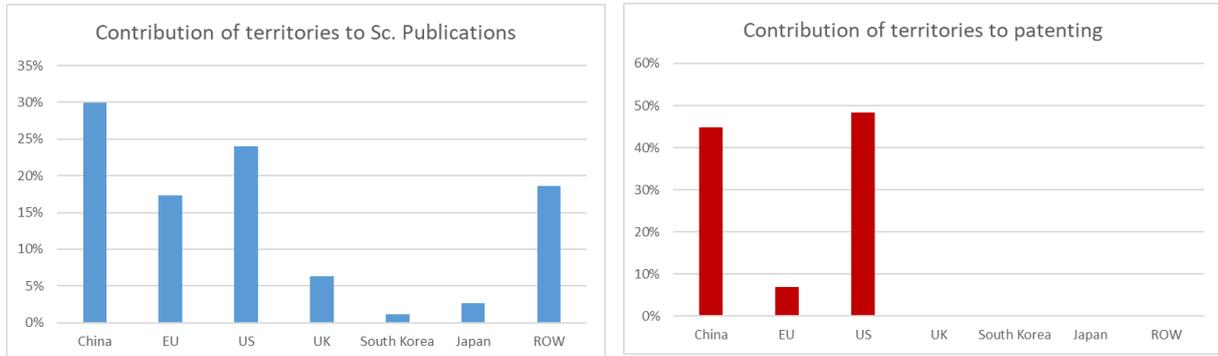
**Figure 97:** Radar Territories for Medicine & Biotechnology



### From publishing to patenting

Again, while contributing to 17% of the scientific publications for the weak signals in Medicine and Biotechnology (China and US respectively at 30% and 24%), European organisations contribute to only 7% of the patents, leaving most of the patents to Chinese and US based organisations.

**Figure 98:** From publishing to Patenting for Medicine & Biotechnology





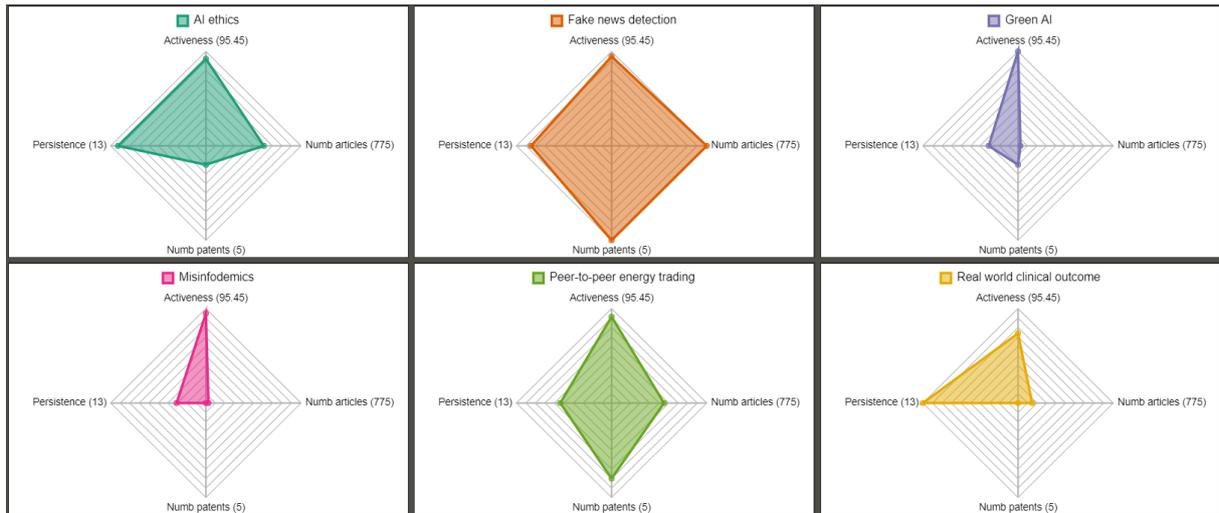




## Radar WS

All six of the weak signals have high activeness and very few patents. AI ethics, Fake news detection, Real world clinical outcome have a high persistence. Combined with high activeness, this means that these topics are being discussed for a long time in scientific publications but that there is a recent surge in the number of publications. Green AI and Misinfodemics have similar shapes: very new topics with a small number of publications. The weak signal on Real world clinical outcome has a particular shape, with very high persistence, high activeness, and a relatively low number of articles (115).

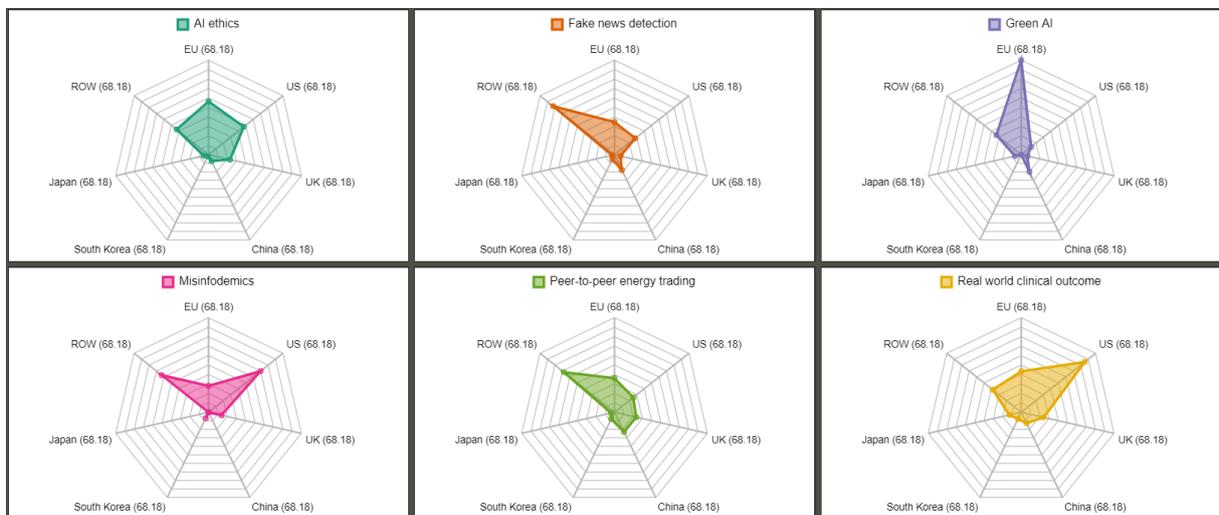
**Figure 105:** Radar Weak Signal for Societal issues



## Radar Territories

Europe is well-positioned in weak signals related to societal issues, leading in a few of them. China, as observed in previous reports, is not very active in weak signal related to social sciences.

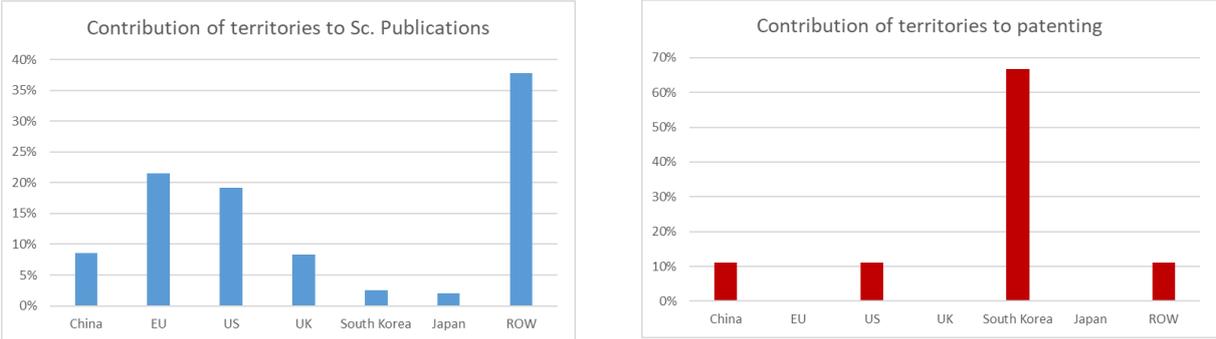
**Figure 106:** Radar Territories for Societal issues



### From publishing to patenting

The dominance of European, Chinese, and US based organisations is less marked for weak signals on societal issues, with organisations from the rest of the world (mainly from India and Australia) contributing significantly to scientific publications. While Europe is not involved in patenting for the 6 weak signals, it must be noted that only 8 patents have been retrieved for all of the signals and the contribution to patenting should not be taken here has a concrete indication. Also, the particular nature of the topics makes it natural that very few patents were found.

**Figure 107:** From publishing to patenting for Societal issues



## 2.7 Energy

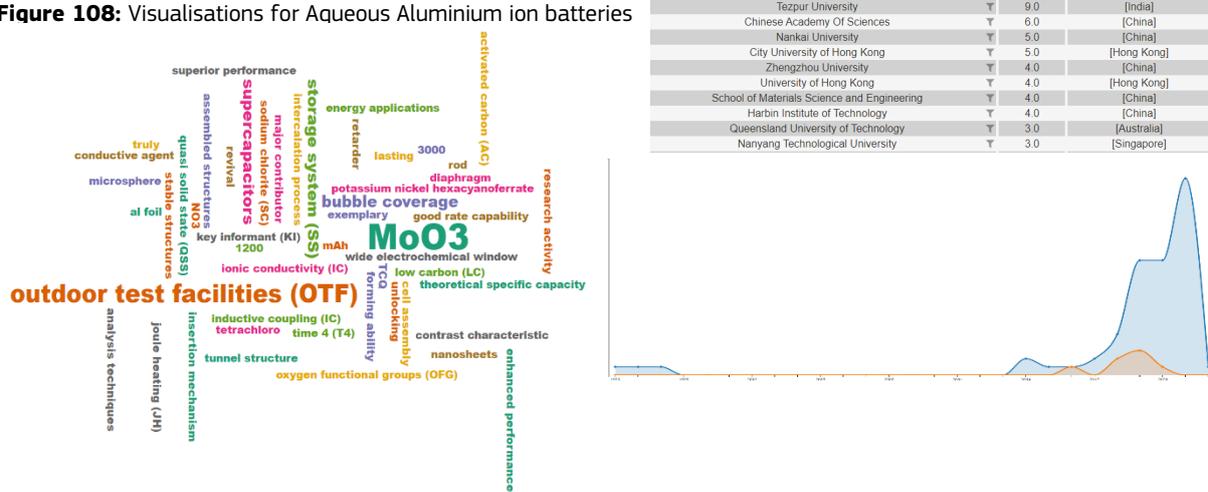
Dashboard:

[https://www.timanalytics.eu/TimTechPublic/dashboard/index.jsp#/space/s\\_1855](https://www.timanalytics.eu/TimTechPublic/dashboard/index.jsp#/space/s_1855)

### Aqueous Aluminium ion batteries

Because of their low manufacturing costs, superior safety, and flexibility, aqueous energy storage systems have attracted a lot of attention in the recent years and are the key to the widespread usage of wearable electronics. Among these aqueous energy storage systems, the aqueous Al ion battery is a promising candidate.

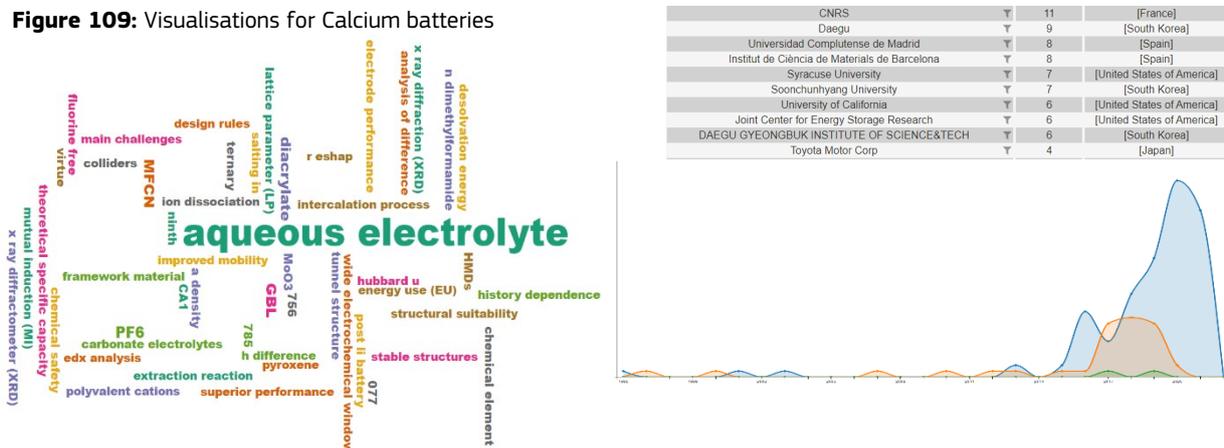
Figure 108: Visualisations for Aqueous Aluminium ion batteries



### Calcium batteries

is considered as one of the most promising post-lithium era ion battery, mainly because of abundance of Calcium on Earth, the high volumetric capacity of multivalent ion batteries compared to monovalent metal batteries, and the low reduction potential of the couple  $\text{Ca}^{2+}/\text{Ca}$ . Some recent advances related to the Calcium anode have triggered an increase in research on Calcium rechargeable batteries.

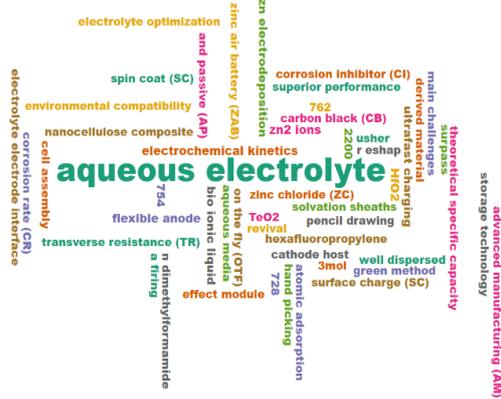
Figure 109: Visualisations for Calcium batteries



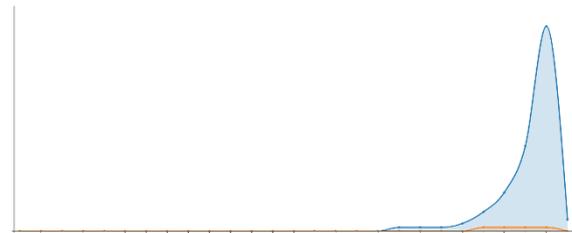
## Dendrite-free Zinc battery

Rechargeable aqueous Zinc batteries are promising for portable electronic equipment and large-scale energy storage due to their high energy density and low manufacturing costs. However, their practical application has been put to a halt by the poor reversibility of Zinc anodes, mainly due to the growth of dendrites and other interfacial interfering reactions. Researchers are exploring how to produce dendrite-free Zinc batteries.

Figure 110: Visualisations for Dendrite-free Zinc battery



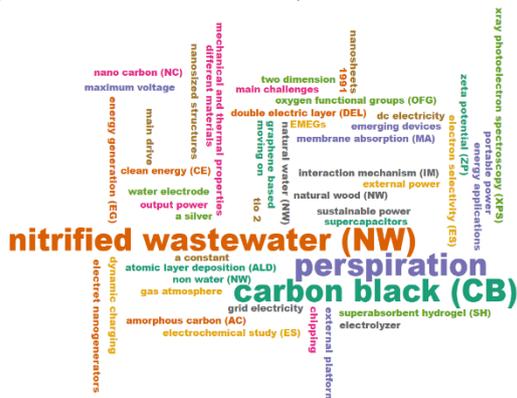
Chinese Academy Of Sciences	15	[China]
Central South University	7	[China]
Shandong University	6	[China]
Nankai University	6	[China]
University of Science and Technology of China	5	[China]
University of Maryland	5	[United States of America]
Yanshan University	4	[China]
Huazhong University of Science and Technology	4	[China]
Chulalongkorn University	4	[Thailand]
National University of Singapore	3	[Singapore]



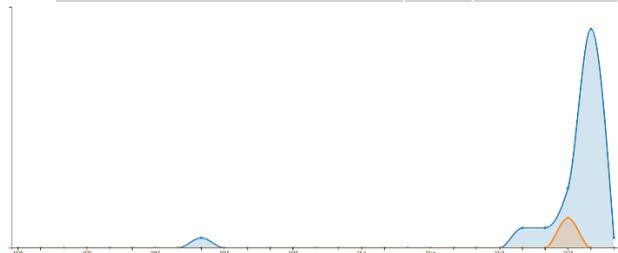
## Hydrovoltaics

is the word coining a recently discovered phenomenon i.e. the generation of electricity induced by the evaporation of water that was interacting with nanostructured materials like graphene. Research to transform this effect observed in laboratory into a renewable source of electricity is still in its infancy, but could potentially lead to some disrupting innovations.

Figure 111: Visualisations for Hydrovoltaics



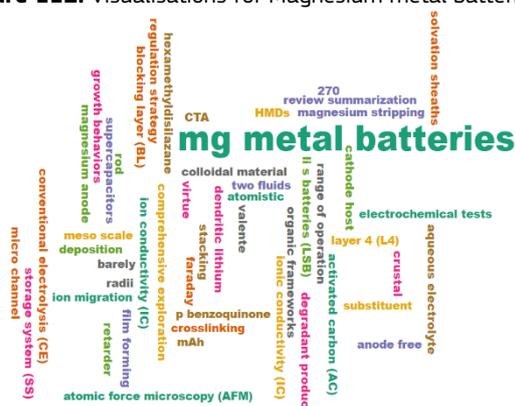
Nanjing University of Aeronautics and Astronautics	7.0	[China]
Chinese Academy Of Sciences	6.0	[China]
Soochow University	4.0	[China]
University of Electronic Science and Technology of China	3.0	[China]
Macao University of Science and Technology	3.0	[Macao]
Hunan University	2.0	[China]



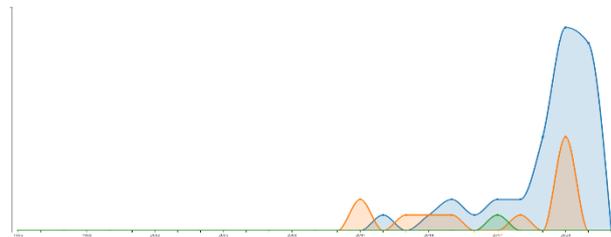
## Magnesium metal batteries

are regarded as another promising alternative to lithium-ion batteries due to their high theoretical capacity, relatively high potential, and also due to the natural abundance of magnesium. Research is ongoing to bring Mg battery closer to commercial applications, notably on the corrosive nature of magnesium electrolytes, the irreversibility of the passivation of surfaces, and the lack of suitable cathode materials.

Figure 112: Visualisations for Magnesium metal batteries



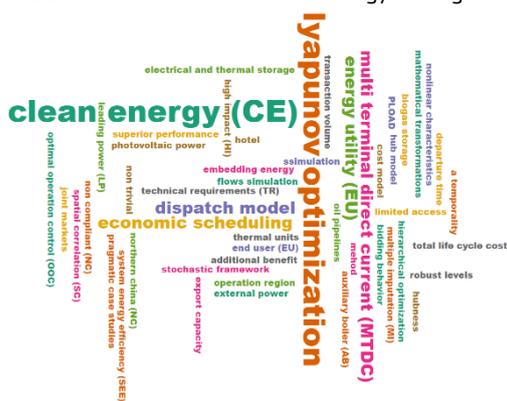
Chinese Academy Of Sciences	11	[China]
Qingdao University of Science and Technology	5	[China]
MAT CO LTD	5	[South Korea]
Bosch Corp	5	[China]
National Institute of Chemistry	4	[Slovenia]
University of Ljubljana	3	[Slovenia]
Wuhan University of Technology	2	[China]
Université Paris-Saclay	2	[France]
University of Maryland	2	[United States of America]
Shangqiu Normal University	2	[China]



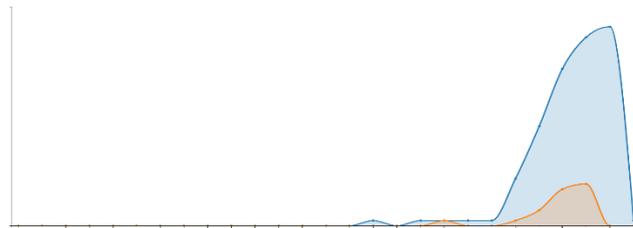
## Multi-energy microgrids

In the recent years, multi-energy microgrids have emerged as platform for connecting multiple terminal resources and multiple distributed components for energy production, conversion, and storage. Using this type of grids allows to form a network of connected and optimized multiple energy sources, with the goal to minimize energy waste.

Figure 113: Visualisations for Multi-energy microgrids



Nanyang Technological University	15	[Singapore]
STATE GRID	11	[China]
Tsinghua University	10	[China]
Zhejiang University	9	[China]
Tianjin University	9	[China]
XI'AN JIAOTONG UNIVERSITY	7	[China]
STATE GRID CORPORATION OF CHINA	7	[China]
Aalborg University	7	[Denmark]
Shenyang University of Technology	6	[China]
Guangdong Power Grid Corporation	6	[China]



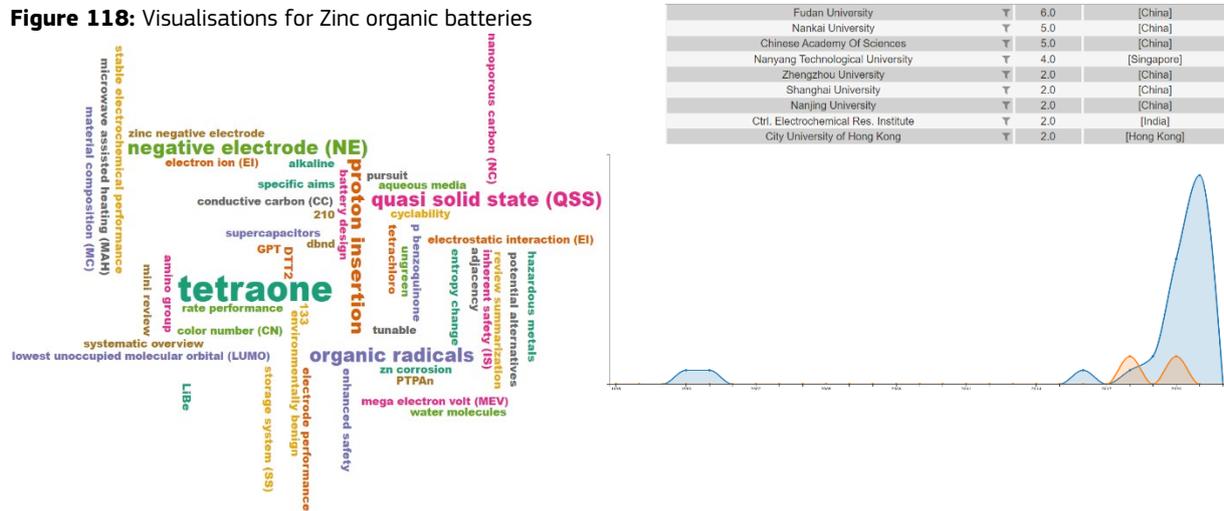




## Zinc organic batteries

Zn-organic batteries are recently attracting attention of researchers, which are trying to alleviate their low energy density and corrosion and dendrites formation problems. Here too, the abundance of Zinc on the planet and their safety makes them good candidates for the next generation of batteries.

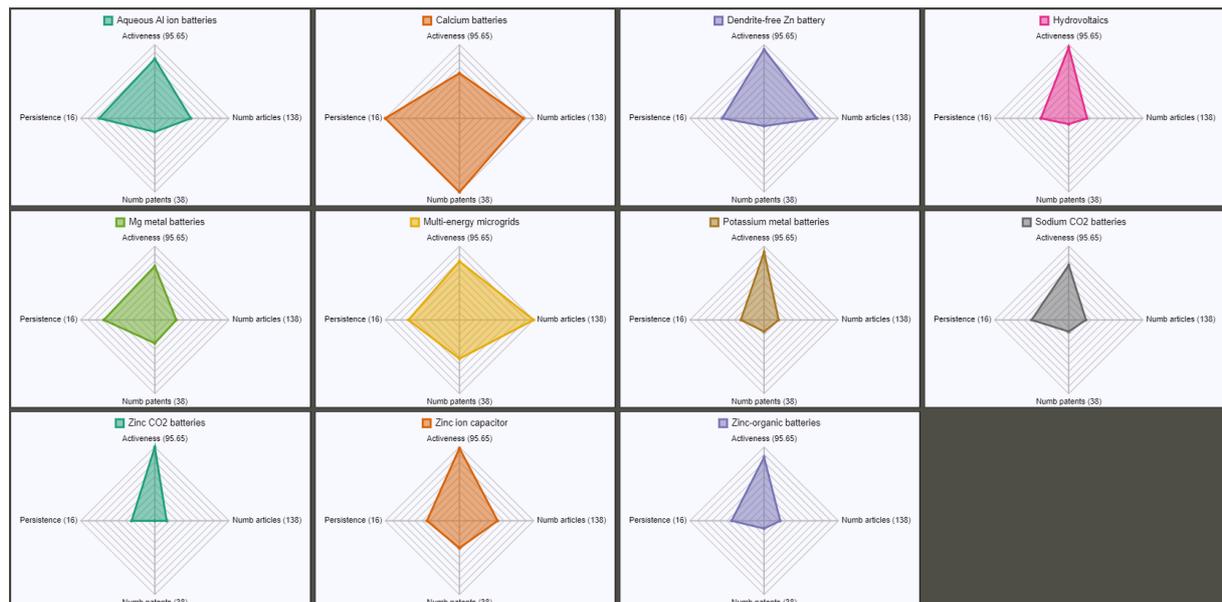
**Figure 118:** Visualisations for Zinc organic batteries



## Radar WS

Three types of weak signals in Energy can be distinguished: narrow triangles (high activeness, relatively low persistence, relatively low number of scientific publications and patents), broad triangles (high activeness, average persistence and number of articles, low number of patents), and diamonds (which have a lower activeness and many more patents).

**Figure 119:** Radar Weak Signal for Energy

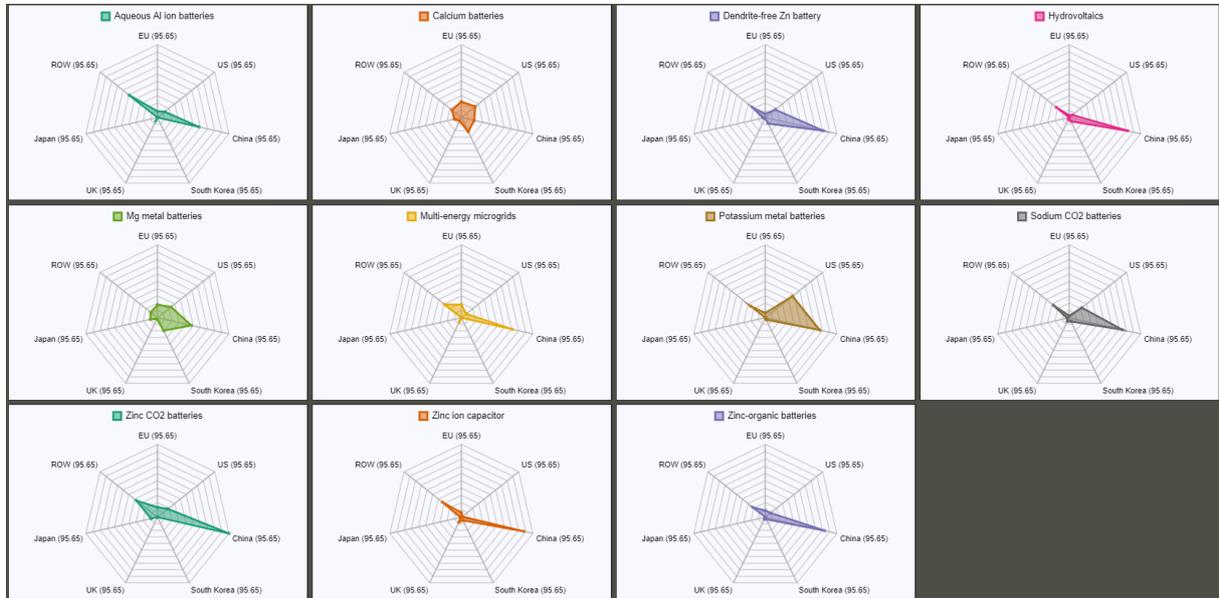




## Radars Territories

Europe is well-positioned for Calcium batteries, Magnesium metal batteries, multi energy grid, and to a lesser extend in Zinc CO2 batteries. However, China is leading in most of the weak signals.

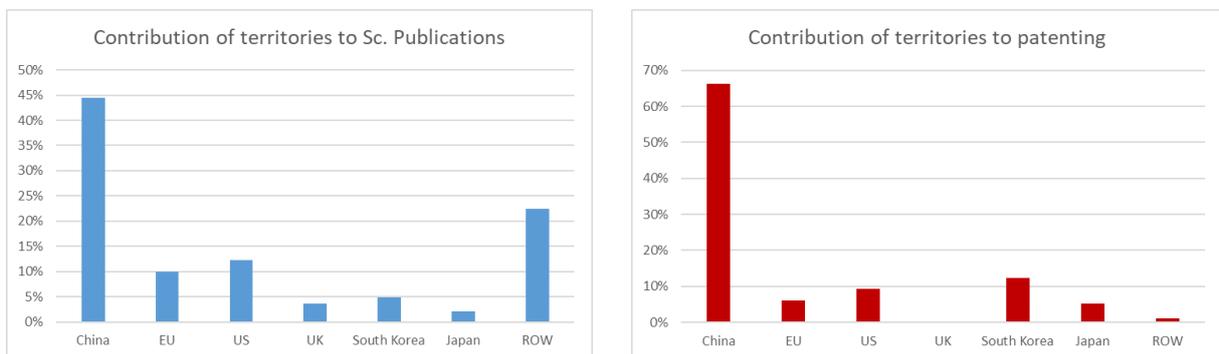
**Figure 120:** Radar Territories for Energy



## From publishing to patenting

Chinese organisations contribute massively to scientific publications for the weak signals in Energy, which reflects in patenting where also most of the patents originate from China.

**Figure 121:** From publishing to Patenting for Energy



## 3 Methodology

### 3.1 Data

For the purpose of this report, scientific publications are considered as a proxy of early technological development. The assumption is that a weak signal of technological development in a certain domain will see a sudden increase in the number of publications (see figure 122).

The Scopus database of scientific publications from Elsevier (covering 01/1996 to 12/2021) was used for the detection of weak signals. Scopus is Elsevier's abstract and citation database and covers nearly 36,377 scientific journals from approximately 11,678 publishers, of which 34,346 are peer-reviewed journals in top-level subject fields such as life sciences, social sciences, physical sciences and health sciences. The methodology applied for this exercise combines text mining, scientometrics and domain/topic knowledge.

### 3.2 Detection of raw weak signals

The approach is to automatically build sets of documents that represent as many concepts included in the data as possible. Indicators are then calculated on those sets to filter for the most emerging ones.

#### *Building the sets of documents*

The sets are built by automatically querying the Scopus database for concepts from a text-mining generated dictionary. The creation of the dictionary is a crucial step in this process. The dictionary of multi-words concepts is generated from a corpus of documents using text mining techniques. Single and compound words as well as acronyms are extracted from titles, abstracts and keyword fields in the reference corpus. To capture the recent vocabulary used in scientific publications, documents from the last seven years (2015-2021) of the Scopus database are used as corpus (~11 million scientific publications). The extracted words are then processed to group instances of the same concept, remove inconsistencies in e.g. spelling or word choice, rank the concepts by relevance and store them in a dictionary. For the 2021 round of weak signal detection, the resulting dictionary was composed of 7.884.935 concepts, each of them subsequently used in an automated query process that builds an equivalent number of sets containing scientific publications ranging from 1996 to 2021<sup>36</sup>.

#### *Detection of raw weak signals*

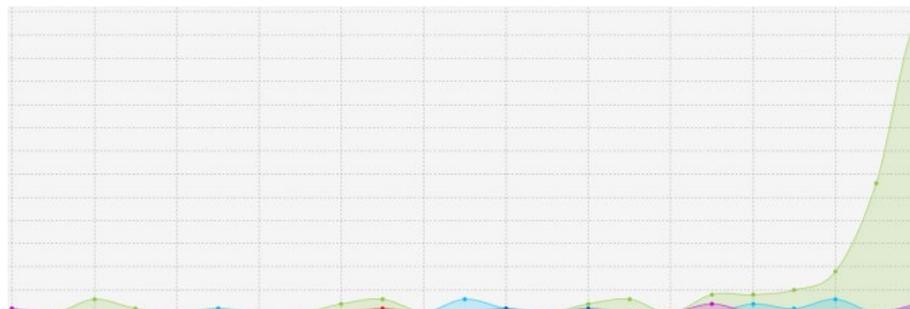
After the creation of the sets of documents – each of them representing a “concept” – a custom-built indicator called “activeness” is used to sort these sets. This indicator is defined as the ratio between the number of documents retrieved for a certain period and the total number of documents retrieved for the period 1996-2021. For example,  $\text{activeness}[2019-2021]$  corresponds to the ratio  $[\#\text{documents published during the period } 2019-2021] / [\#\text{documents published during the period } 1996-2021]$ . A high activeness score means that a high percentage of documents has been published during the selected period. The following activeness indicators have been used to detect the weak signals from the list of sets:  $\text{activeness}[2017-2021]$ ,  $\text{activeness}[2019-2021]$  and  $\text{activeness}[2020-2021]$ . The sets are ordered by decreasing activeness for further evaluation.

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<sup>36</sup> Detecting weak signals implies looking into the past to verify novelty.

The sets containing scientific articles with a high activeness are considered as raw weak signals i.e. they might be related to emerging topics in science or emerging technologies.

**Figure 122:** Typical shape of a weak signal on a graph #documents (Y-axis) Vs years (X-axis).



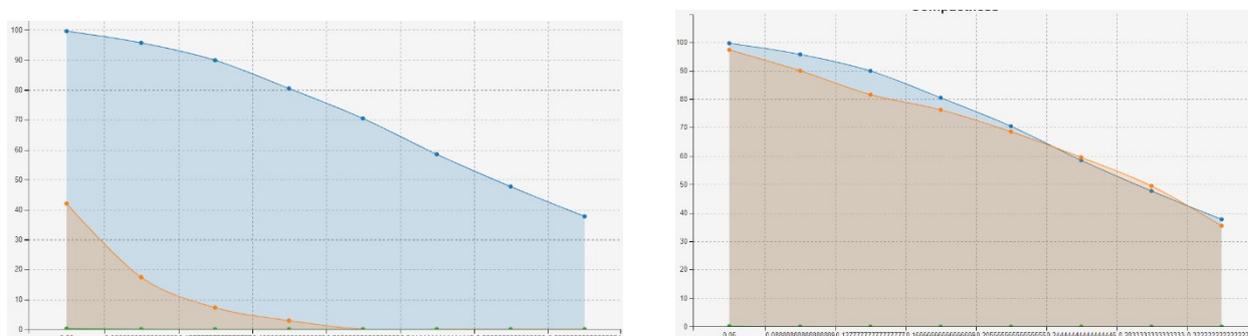
### 3.3 Selection of relevant weak signals

#### *Filtering before reconstruction*

Various filters are used to refine the list of raw weak signals, which inevitably also contains false positives. These filters are based on size of the sets of documents, manual detection or semantic proximity.

First, a simple filter is applied to reject sets that do not reach a certain minimum number of documents (the trigger was put on 5 documents for the present exercise). Manual filtering is also used to reject sets resulting from errors in the original corpus (e.g. spelling mistakes). A more elaborated filtering relying on "semantic compactness" is used to reject weak signals containing documents that are not similar from a semantic perspective. Weak signals pertaining to different conceptual areas but with one or two semantic concepts in common are not considered (e.g. documents related to a conference where the only common term between the documents is the name of said conference). As shown in figure 123, "compactness" in TIM shows the percentage of documents (y axis, from 0 to 100%) that have at least 10 documents within the similarity threshold on the x-axis. In the figure below, one can see the compactness graph for two sets of documents (orange curves): "Metallic nanoparticles in food" on the left, "Tenebrio Molitor" (an insect) on the right. The orange curve is always compared to two other curves, for reference: a blue curve based on a very compact set, and a green curve based on randomly collected scientific publications.

**Figure 123:** Typical shapes for a non-compact (left) and a compact set of documents (right)



Compactness helps to understand how similar the documents within the sets are. For some of the sets, a higher variability of topics is expected in the documents (resulting in articles less similar and therefore a lower compactness, as exemplified on the left for "Metallic

nanoparticles in food”) and for some others the similarity among documents is expected to be higher (when the topic is narrower, like for “Tenebrio Molitor” on the right, resulting in a higher compactness). One can observe that the compactness (orange curve) is very different for the two sets. The graphs are to be interpreted as follows. For “Metallic nanoparticles in food” (left), 40% of the documents in the set have at least ten documents with whom semantic distance is smaller than 0,05 (which is a very low semantic similarity). For Tenebrio Molitor (right), 95% of the documents are within that similarity range. The second points on the left graph is located at (0.15,16): only 16% of the documents have at least 10 documents similar when the threshold is increased to 0.15 of semantic similarity. For the graph on the right, the second point is at (0.15, 90): 90% of the documents have at least 10 documents that are similar with a threshold at 0.15. the same for the other points on the graphs.

In other words, the higher and more horizontal the orange curve is, the more compact the set of documents is i.e. the more it is composed by semantically similar documents. The faster the orange curve goes to zero, the less compact the set of documents is i.e. the more diverse the documents are. To compute these compactness curves, each document in the set is first compared to the other documents using cosine similarity. A minimum value of cosine distance under which two documents are not considered similar is then fixed:

- If cosine similarity > threshold, the two documents are similar
- If cosine similarity < threshold, the two documents are not similar

This threshold was fixed at 0.35 for the present exercise.

A document that is not similar to at least 10 other documents is considered as an outlier relatively to the other documents in the set. See annex below for more information on semantic similarity in TIM.

### *Reconstruction in TIM Technology*

To finalise the selection, new sets of articles are created for the promising raw weak signals in the TIM Technology system, which, in addition to scientific publications, also contains patents and EU R&D grants.

This “reconstruction” consists in optimising the search queries to increase the recall of documents and to further validate the list of signals. Because of the semantic nature of the process, it may be that what was considered as a weak signal appears to be a strong signal i.e. a trend or an issue known for long. A typical example is a technology for which a new word, or new semantic concept appears after a few years: although the technology is not new, the concept is new and it might be detected in the weak signal process. Other examples of such false positive include typos or specific conference names. This reconstruction in TIM Technology may appear as a tedious process, but it is the unfortunate price to pay for a highly sensitive process. Various features support the optimisation of the search queries: relevant keywords, clustering of articles, documents graph, compactness, document list and online access.

The full list of search queries can be found in figure 129 at the end of this report.

### *Relevant keywords*

The relevant keywords function in TIM is used to rapidly spot keywords that although relevant to the set of documents considered are not related to the weak signals. In other words, scanning through the list of relevant keywords allows to spot the keywords related to outliers i.e. articles recalled by the search query but not related to the topic of the weak signal.

The relevance of the keywords are calculated as follow. First a bag of concepts is built, containing concepts with a rank associated to each of them. The bag of concepts can be calculated at the level of individual documents or for a group of documents. In the case of relevant keywords, it is the bag of concepts for the set of documents. For each of these concepts, the Inverse Document Frequency (IDF) is calculated, where

$$\text{IDF} = \log \frac{\text{number of docs with concept}}{\text{total number of docs}}$$

The idea behind the IDF calculation is that more weight is given to the terms that are rarer. To calculate the rank:

$$\text{Rank} = \text{frequency} \times \text{IDF} \times \text{mod\_field}$$

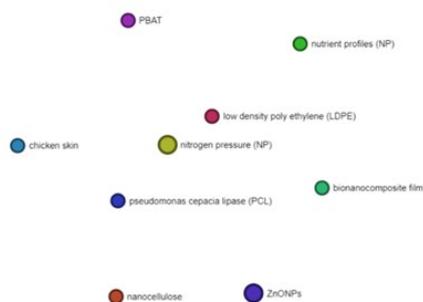
where frequency is the number of times the concept appears in set of documents and mod\_field is a modifier that gives more or less weight to the terms depending on where they are found (title, abstract or keyword). In the specific case of relevant keywords, the modifier is calculated as follows: Title: 1 Abstract: 0.5 Keyword: 2. This is made so that the “important” words are attributed a higher rank.

### Clustering

This functionality is useful to rapidly spot the composition of a collection of documents. Outliers can be quickly identified; the search query is then modified accordingly. The clustering is the grouping of a set of documents in such a way that documents in the same group (called a cluster) are more similar (in some sense) to each other than to those in other groups (clusters).

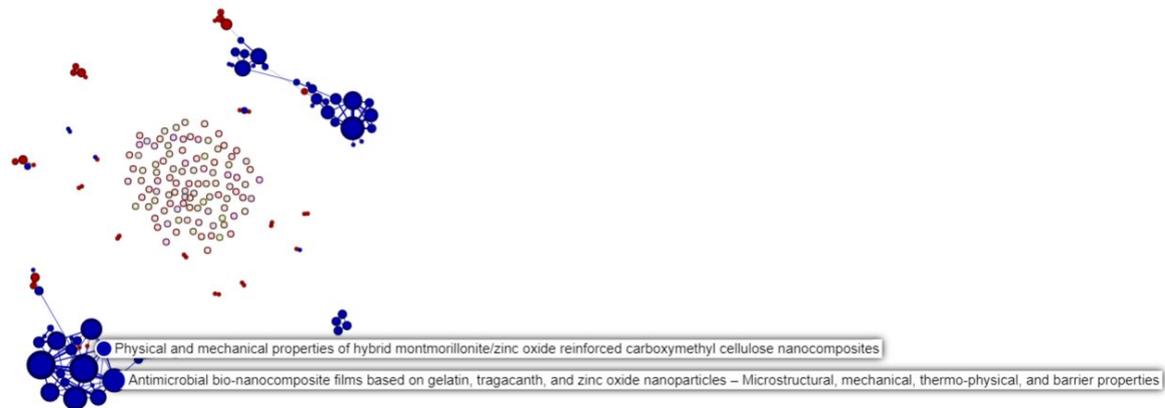
In figure 124, each node represents a cluster of documents. The documents that are inside a cluster are considered to be similar to each other, i.e. they have a cosine similarity higher than the threshold (set here at 0.35). The name of the cluster – or label of the node - is the keyword that is the most relevant in the cluster of documents.

**Figure 124:** Clusters for the set “Zinc oxide nanoparticles”.



*Document gram:* is a graphic representation of the semantic distance (or similarity) between documents in a set of documents. It is another way of taking a quick glance at the composition of a document collection. It allows to spot easily outlier articles and detect the keywords that should be used to exclude them.

**Figure 125:** example of document gram for the set of documents on the weak signal “Zinc oxide nanoparticles”.

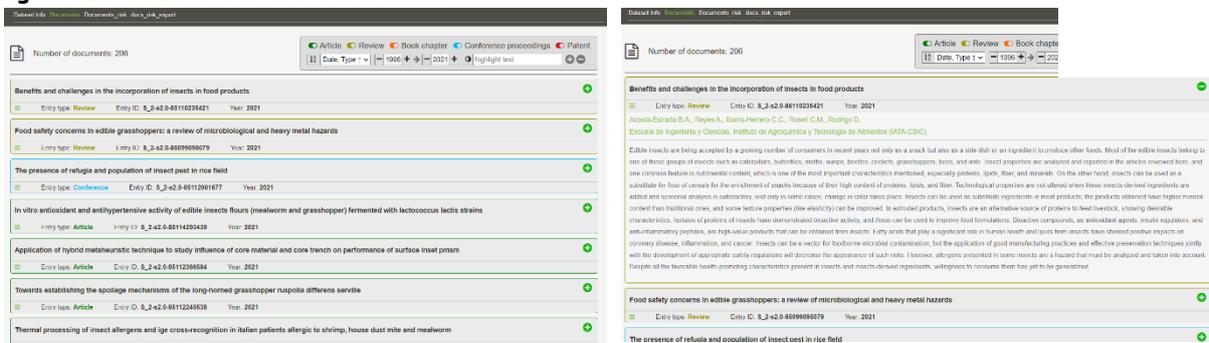


Each node represents a document in the set. An edge between two nodes is present if the cosine similarity between the two document vectors is higher than the threshold (the threshold is set by default at 0.35). The size of the edge is proportional to the cosine similarity between the pair of documents. The size of the node represents the number of documents that are similar (over a specific threshold).

### Document list and online access

In some cases, access to the articles composing the set of documents for a weak signal is needed to fine tune the search queries used to reconstruct the signals in TIM Technology. TIM’s document list presents the main information about each document in a set and offers, whenever possible, to access directly to the articles online. Final access to the full version of the articles will of course depend on the access right of the user.

**Figure 126:** Document list and online access.



### Domain knowledge

Domain knowledge can be used to further select the weak signals of relevance for a particular scientific area or policy field. For the present round of detection, domain knowledge related to biotechnologies, medicine and health was provided by the European Medicine Agency, whose experts highlighted which weak signals were the most relevant relative to their technical knowledge and policy remit.

### Grouping in 7 topics

Using the main grouping categories to which the documents of each weak signals belong, a grouping of the 93 weak signals has been made to facilitate the readability of the report. Many of the weak signals are of course cross topics.



## List of search queries used to reconstruct the weak signals in TIM

**Figure 129:** List of search queries.

Weak signals	Query
PROteolysis TArgeting Chimeras (PROTACs)	topic:(("PROteolysis TArgeting Chimeras" OR PROTAC)
mxenes aerogels	topic:(("mxene aerogel"~2)
hydrovoltaics	topic:(hydrovoltaics)
Dendrite-free zn battery	topic:(("dendrite free"~2 AND "zinc battery"~2)
organohydrogel	topic:(("organohydrogel" OR "organo hydrogel"~2)
microplastic removal	topic:(("microplastic removal"~2)
nanocatalyst cancer therapy	topic:(nanocatalytic AND (cancer OR tumor) AND therapy)
Zinc CO2 batteries	topic:(("ZN CO2 batteries"~2 OR "zinc CO2 batteries"~2)
hybrid nanofluid	topic:(("hybrid nanofluid"
Zinc ion capacitor	topic:(("zinc ion capacitor"~2)
Zinc-organic batteries	topic:(("zinc organic batteries"~2 OR "zn organic batteries"~2)
agrivoltaics	topic:(agrivoltaic OR agrivoltaic)
Flualprazolam	topic:Flualprazolam
plastic chemical upcycling	topic:(("chemical upcycling" AND (plastics OR polymer OR waste)) OR "plastic upcycling"~1 OR "polymer upcycling"~1)
Gas chromatogr.-ion mobility spectrometr	topic:(("gas chromatography-ion mobility spectrometry"~2)
rotating detonation rocket engine	topic:(("rotating detonation rocket engine"~2)
eutectogel	topic:(eutectogel OR "deep eutectic solvent gel"~2)
interfacial solar evaporators	topic:(("interfacial solar evaporation"~2 OR "solar vapor generation"~2 OR "interfacial solar vapor generation"~2) AND (desalination OR "water purification"~2))
aqueous Al ion batteries	topic:(("aqueous al batteries"~2 OR "aqueous aluminum batteries"~2) NOT ti:"non aqueous"
plasma agriculture	topic:(("plasma agriculture"~2 OR "plasma seed treatment"~2)
V2CTX MXene	topic:(("V2CTX MXene"~2)
Mg metal batteries	topic:(("MG metal batteries"~2 OR "magnesium metal batteries"~2)
nb2ctx mxene	topic:(("nb2ctx mxene"~3)
calcium batteries	topic:(("calcium battery" OR "calcium ion battery" OR "calcium rechargeable batteries"~2 OR "CA rechargeable batteries"~2)
wireless time sensitive network	topic:(("wireless TSN" OR "wireless time sensitive network"~2)
human digital twin	topic:(("human digital twin"~2)
health chatbots	topic:(("health chatbot"~2)
Earable computing	topic:(("earable computing"~2)
Biomass chemical looping gasification	topic:(("Biomass chemical looping gasification"~2)
cognitive digital twin	topic:(("cognitive digital twin"~2)
programmable wireless environments	topic:(("programmable wireless environments" OR ("intelligent surface" OR "programmable surface" OR "reconfigurable surface") AND wireless))
Internet of space things	topic:(("Direct-to-Satellite IoT"~2 OR "DtS IoT" OR "Internet of Space Things" OR "internet of space IOS"~2)
DNS-over-HTTPS	topic:(("DNS-over-HTTPS"~2)
unpaired image-to-image translation	topic:(("unpaired image image translation"~2 OR "unpaired image translation"~2)
Directed Acyclic Graph DLT	topic:(("Directed Acyclic Graph" AND (blockchain OR "distributed ledger")) OR "DAG blockchain"~2 OR "DAG DLT"~2)
green ai	topic:(("green ai" OR "green artificial intelligence"~1 OR "green machine learning" OR "artificial intelligence resource efficiency"~2) NOT ti:quantum
Few-shot object detection	topic:(("Few-shot detection"~1 OR (FSOD AND object AND detection))
dual blockchain	topic:(("dual blockchain" OR "double blockchain") NOT topic:(("double spending"))
edge artificial intelligence	topic:(("edge artificial intelligence"~2) NOT topic:cutting
Sodium CO2 batteries	topic:(("NA CO2 batteries"~2 OR "sodium CO2 batteries"~2 OR "sodium carbon dioxide batteries"~2 OR "NA carbon dioxide batteries"~2)
AI ethics	topic:(("AI ethics"~2)
Peer-to-peer energy trading	topic:(("peer to peer energy trading"~2 OR "peer to peer energy market"~2)
misinfodemics	topic:(misinfodemics OR "misinformation epidemics"~2 OR "disinformation epidemics"~2)
space-air-ground integrated networks	topic:(("space-air-ground integrated networks"~2)
fog robotics	topic:(("fog robotics")
potassium metal batteries	topic:(("potassium metal batteries"~2)
twisted bilayer graphene	topic:(("twisted bilayer graphene")
ionic skin	topic:(("ionic skin")
nanoparticle exsolution	topic:(("nanoparticle exsolution"~2)
optoelectronic synapses	topic:(("optoelectronic synapses"~2)
3D multi-object tracking	topic:(("3D multi-object tracking"~2 OR "3D multi-object detection"~2)
autonomous surface ship	topic:(("autonomous surface ship"~2 OR "unmanned surface ship"~2 OR "autonomous vessels"))
Atomic scale manufacturing	topic:(("atomic scale manufacturing"~2 OR "close to atomic scale manufacturing"~2 OR "sub 10nm manufacturing"~2 "atomic scale fabrication"~2 OR "close to atomic scale fabrication"~2 OR "sub 10nm fabrication"~2)
mycelium-based materials	topic:(("mycelium materials"~1 AND based) OR "mycelium material" OR ("mycelium composite"~1 AND based) OR "mycelium composite") NOT topic:(biochemistry OR camemberti OR pasteurized OR accumulation OR flammulina OR Larch OR Paracoccidioidomycosis OR "white rot")
versatile video coding	topic:(("versatile video coding")

Weak signals	Query
Fake news detection	topic:(("fake news detection"~2)
Inebilizumab	topic:(("inebilizumab")
kagome superconductors	topic:(("superconductors kagome"~3)
nanofertilisers	topic:(nanofertiliser OR "nano fertiliser" OR "fertiliser nanoparticle"~2)
Passive radiative cooling	topic:(("passive radiative cooling")
martian concrete	topic:(("martian concrete"~2 OR marscrete)
multi-energy microgrids	topic:(("multi energy microgrid" OR "multi energy micro grid" OR "combined energy microgrid" OR "combined energy micro grid" "mixed energy microgrid" OR "mixed energy micro grid")
spintronic terahertz emitter	topic:(("spintronic terahertz emitter"~2)
quantum metasurfaces	topic:(("quantum metasurfaces"~2)
nickelate superconductor	topic:(("superconductor AND (NdNiO2 OR LaNiO2 OR SrNiO2 OR xSRxNiO2)) OR "nickelate superconductor"~2)
external Human-Machine Interfaces	topic:(("external Human-Machine Interfaces"~2 OR (eHMI AND human AND machine))
high entropy carbides	topic:(("high-entropy carbide"~2 AND ceramics) OR ("high entropy ceramics"~2 AND carbides))
nanoagriculture	topic:(("nano* agriculture"~2 OR nanoagriculture OR nanofertiliser OR nanopesticides OR "nanobiosensor agriculture"~2)
Soluble immune checkpoints	topic:(("soluble immune checkpoint")
CRISPR based diagnostics	topic:(("CRISPR diagnostic"~2)
Facial genotyping	topic:(DeepGestalt OR "face2gene" OR "facial genotyping" OR "Computer aided facial analysis" OR ("dysmorphic recognition"~2 OR "dysmorphology analysis"~2 OR "facial analysis" OR "facial dysmorphology") AND ("computer aided" OR "machine learning" OR "algorithm") AND (phenotype OR genotype OR disease OR syndrome OR diagnosis))
Flash radiotherapy	topic:(("Flash radiotherapy")
Do-it-yourself artificial pancreas	topic:(("DIY APS" OR "do-it-yourself artificial pancreas" OR "DIY artificial pancreas" OR "OpenAPS" OR "do-it-yourself APS")
Firibastat	topic:(("firibastat")
eCIRP	topic:(("extracellular cold inducible RNA binding protein" OR eCIRP)
FAPI PET/CT	topic:(("fapi pet ct" OR ("isotope labelled fibroblast activation protein inhibitor" AND pet AND ct))
Urobiome	topic:(("urinary tract microbiome" OR urobiome)
CELMoDs for cancer	topic:(("CELMoDs OR "Cereblon E3 ligase modulator")
Direct RNA sequencing	topic:(("direct RNA sequencing")
Chemodynamic Therapy	topic:(("chemodynamic therapy" OR "CDT therapy") AND (cancer OR tumor))
LYsosome-TArgeting Chimaeras (LYTACs)	topic:(("lysosome targeting chimaera" OR lytac OR "lysosome targeting chimera")
BISCaO antiseptic	topic:(("bioshell calcium oxide" OR biscao OR "bio shell calcium oxide" OR "heated Scallop Shell Powder") AND (antiseptic OR disinfectant OR sanitizer OR pathogen OR disinfection OR microbicidal OR bactericidal))
Mavacamten	topic:(("mavacamten")
Molnupiravir	topic:(("Molnupiravir OR "EIDD 2801" OR "MK 4482")
Intravascular Lithotripsy	topic:(("intravascular lithotripsy")
Real world clinical outcome	topic:(("real world progression free survival" OR "real world clinical outcome")
Spatial and temporal omics	topic:(("spatial omics" OR "temporal omics" OR "pseudo time single cell"~3 OR "pseudotime cell"~2)
Heritable human genome editing	topic:(("heritable human genome editing" OR (HHGE AND genome AND editing))
Twistronics	topic:(("twistronics")
Ultrawide bandgap semiconductor	topic:(("ultrawide bandgap semiconductor"~2)
Monolayer Tellurene	topic:(("monolayer tellurene"~2 OR "two dimensional tellurene"~2 OR "nanosheet tellurene"~2 OR "nanoplate tellurene"~2 OR "mono layer tellurene"~2 OR "layered tellurene"~2)
Monolayer MA224	topic:(("monolayer OR nanosheet OR "layered MoSi2N4"~2 OR "layered WSi2N4" OR "two dimensional" OR nanoplate OR "mono layer") AND (MoSi2N4 OR WSi2N4)) OR topic:(("MA224")
Twin graphene	topic:(("twin graphene")

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