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Weak signals in Science and Technologies

Weak signals in 2020

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

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Abstract

This report presents a list of 75 individual weak signals in science and technology development in 2020. In addition, 4 clusters of weak signals have also been detected and are reported. These early signs of emerging technologies or products were detected using text mining, clustering techniques and scientometrics indicators applied on a corpus of peer-reviewed scientific publications.

A dashboard is at the disposal of the reader to further explore the weak signals:

https://www.timanalytics.eu/TimTechPublic/dashboard/index.jsp#/space/s_1597?ds=126842

Acknowledgements

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1 Introduction

Foresight at JRC

Acting at the interface between science and policy, one of the role of JRC is to inform policy makers working in policy fields with a technological component about new scientific developments. The early identification of emerging technologies is indeed key for the design of new policies, which need to take into account their potential to create new market opportunities or technological disruptions. In a time of accelerating technological change and hyperconnectivity, early awareness of potentially disrupting technologies or scientific development allows for more time to design well-fitted policies that secure both a stable business environment for industrial actors and a safe society for citizens to live in.

Through its 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. This report, which is the outcome of the second exercise ran by JRC to detect weak signal in science and technology development using text mining and clustering algorithms on a large collection of scientific publications¹², contributes to this foresight process by 1) flagging new emerging topics or challenges that should be explored by means of qualitative processes or by 2) validating/reinforcing the results of a qualitative exercise.

Weak signals

The list of weak signals presented in this report is the result of a detection process ran by the JRC during the first trimester 2021 on a corpus of peer-reviewed scientific publications using TIM Trends³. 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.

75 weak signals and 4 clusters of weak signals were detected using 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 and Health was provided by the European Medicine Agency. The list of weak signals is by no means exhaustive and may contain technologies that will never lead to new innovations.

Dashboard

A dedicated dashboard is available for the readers that would like to go a step further in understanding the weak signals. It displays peer-reviewed scientific publications, patents and research projects (funded by the EU framework programmes) and offers many

1 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, doi:10.2760/858426, JRC118147.

2 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 ISBN 978-92-76-15133-3, doi:10.2760/319103, JRC. 119395

3 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

features to quickly grasp the main characteristics of each signal (what it is about, which organisations are active in the field, what countries are involved, what is the dynamics and the trajectory of the research, etc.). It is accessible here:

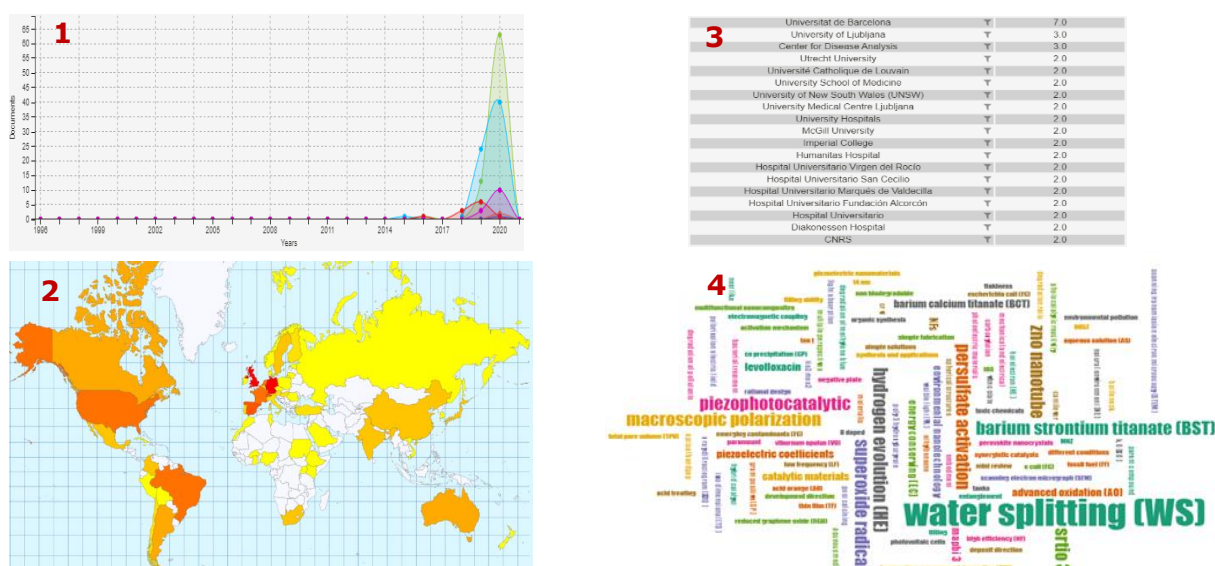
https://www.timanalytics.eu/TimTechPublic/dashboard/index.jsp#/space/s_1597?ds=126842

This dashboard is a projection of a dedicated space that has been set up in the TIM Technology system⁴.

Visualisations

The four visualisations below are systematically used in the report to give the reader a quick overview of the characteristics for each weak signal.

Figure 1: Visualisations for weak signal



Each visualisations corresponds respectively to:

1

Distribution of documents

It shows the distribution of documents retrieved for the weak signal. The sharper and higher the peak, the most intense the weak signal is.

2

Origin of the documents

The origin of the documents related to each weak signal are aggregated at country level and projected on a world heatmap. This graphic allows the reader to understand in the blink of an eye where research is concentrated.

3

List of main organisations

This list provides an indication of the most active organisations for each weak signal. Organisations with at least 1 document are considered, with a maximum of 20 organisations per list.

4

Wordcloud of relevant keywords

These keywords are generated by TIM's language processing algorithms to represent the dataset as a whole. The size of the keywords in the cloud measures the "relevance" of the term in the dataset.

⁴ https://www.timanalytics.eu/TimTechPublic/main.jsp?dataset=s_1507

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2 Weak signals

The weak signals in 2020 are grouped by sector in the table below. There are 75 individual signals categorised in Chemistry & Materials, ICT, Engineering & Physics, Environment, Biotechnologies, Health, and Social Sciences. In addition, numerous weak signals have been detected in these 4 technology areas: blockchain, RNA, neural networks, and SARS-coV-2. They have been aggregated into four “mega weak signals” to clarify the reporting.

Figure 2: List of the weak signals by sector

Chemistry & Materials 2d ruddlesden popper perovskites Aqueous zinc batteries Chiral perovskite Flexible zn batteries Fluoride shuttle battery Lithium argyrodites Hepta/perfluoroisobutyronitrile Lanthanum decahydride Li niobite Magnetic chromium trihalides Magnetic Covalent organic framework Mbenes Neuromorphic photonics Oriented external electric field Perovskite Xray Phosphorus anodes Piezocatalysis	ICT 6G Network Cryptocurrency price prediction Deepfake Disaggregated optical networks Federated learning IAB for 5G IBM Quantum processor Internet of musical things IoT malware Large scale group decision making Multi access edge computing Over the air computation Pointer-generator networks Serveless functions Siamese network for object tracking Text to image synthesis	Engineering & Physics Cellular V2X Enernet Indoor PV Integrated gas electricity systems Optical wireless power transmission Optomagnonic Supercapattery Urea oxidation reaction in fuel cell UAV assisted communication Wearable biosensors
Social sciences Behavioral public administration Digital vigilantism Geospatial AI Tourism phobia	Health Apabetalone Aphantasia Cenobamate antiepileptic Connectome-based Predictive Modeling Flortaucipir Hierarchical taxonomy of psychopathology Immunotherapy for cold tumors Infodemic Micro elimination of hepatitis C virus Moleculight Murepavadin Onasemnogene abeparvec Patisiran	Environment Biocrust restoration Hexafluoropropylene oxide dimer acid Nature Contributions to People Polystyrene nanoplastic
Blockchain weak signals		Biotechnologies Cas12a orthologs Cfap43 cfap44 in male infertility Cibersort Gene expr profiling inter analys (GEPIA) M6A RNA methylation modulators and cance Metagenome-assembled genome MOTS-c Phylosymbiosis Shp02 inhibitors for cancer Tumor derived extracellular vesicle TurboID proximity labeling
RNA weak signals		
Neural network weak signals		
SARS-coV-2 weak signals		

The following section contains a small description and the four summary visualisations for each weak signal retrieved in each of the categories.

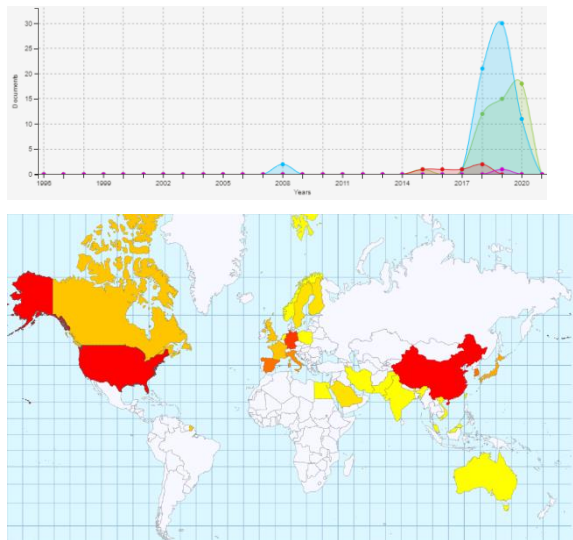
For the clusters of weak signals, we also looked into the pervasion of the technology in other domains, represented by journal categories. An increase in the diversity of journal categories in which publications for a certain technology are published suggests that the number of applications of that technology in different domains is increasing. It can be interpreted as an indication of a technology becoming more mature.

2.1 Engineering & Physics

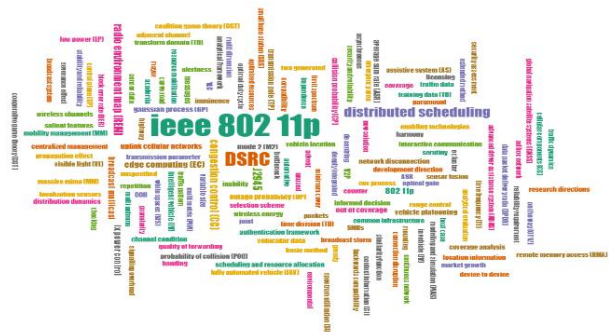
Cellular V2X

There is intense R&D ongoing on connected and autonomous vehicles, promising an improved safety, a decrease in traffic congestion, and lower environmental impacts. Vehicle-to-everything communication (V2X) is a key enabler technology that will allow vehicles to communicate with other vehicles, pedestrians, road-side equipment and the vast amount of information available on Internet. Cellular V2X is a standard launched in 2018 under the umbrella of the 3GPP consortium.

Figure 3: Visualisations for Cellular V2X



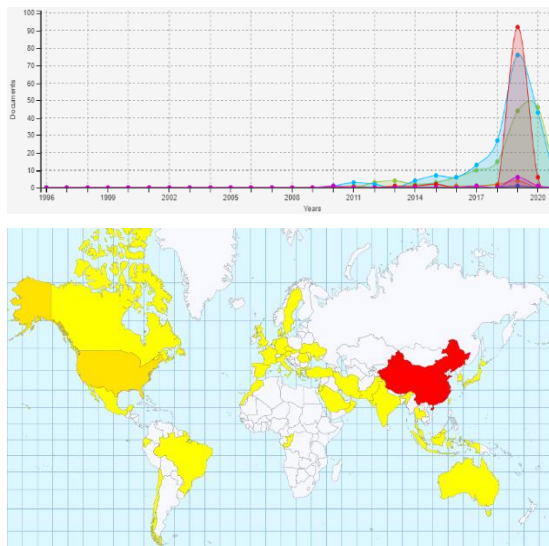
Universidad Miguel Hernández de Elche	Y	7.0
Southwest Jiaotong University	Y	6.0
QUALCOMM INC	Y	5.0
Peking University	Y	5.0
Virginia Tech	Y	4.0
Korea University	Y	4.0
Ericsson Research	Y	4.0
Beijing University of Posts and Telecommunications	Y	4.0
University of Science and Technology of China	Y	3.5
Università Mediterranea	Y	3.0
University of Central Florida	Y	3.0
Universitat Politècnica de Catalunya UPC	Y	3.0
Paderborn University	Y	3.0
NTT DataCo Inc	Y	3.0
Nagoya University	Y	3.0



Enernet

is a term combining Internet and Energy that describes what many consider an unavoidable convergence of electricity smart grids with the internet of things. This emerging network of distributed and interactive energy generation, storage and delivery is expected to become the largest Internet of things with billions of “things” to be monitored and managed (smart nodes on the grid, smart thermostats and appliances, electric vehicles, home energy storage, etc.).

Figure 4: Visualisations for Enernet



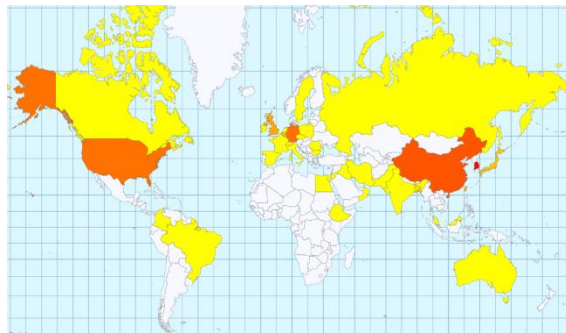
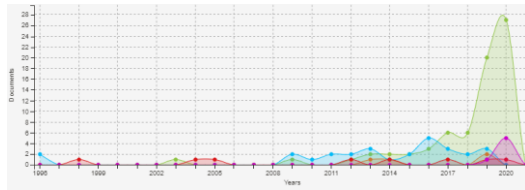
STATE GRID	Y	63
STATE GRID CORPORATION OF CHINA	Y	25
North China Electric Power University	Y	16
Jiangsu Electric Power Company	Y	14
South China University of Technology	Y	10
NARI Group Corporation	Y	10
CHINA ELECTRIC POWER RESEARCH INSTITUTE	Y	10
Wuhan University	Y	9
Shanghai Jiao Tong University	Y	8
State Grid Shandong Electric Power Research Institute	Y	7
NARI Technology Co. Ltd.	Y	7
Electric Power Research Institute	Y	7
XIAN JIAOTONG UNIVERSITY	Y	6
Chinese Academy of Sciences	Y	6
STATE GRID SHANDONG ELECTRIC POWER COMPANY	Y	5
Shanghai Municipal Electric Power Company	Y	5
Semiconductor Manufacturing International Corporation	Y	5
Hohai University	Y	5
XJ Group Corporation	Y	4
Tsinghua University	Y	4
Tianjin University	Y	4
STATE GRID HEBEI ELECTRIC POWER COMPANY	Y	4
Shanghai University of Electric Power	Y	4
Shandong University	Y	4
National Engineering Laboratory for Textile Fiber Materials a	Y	4



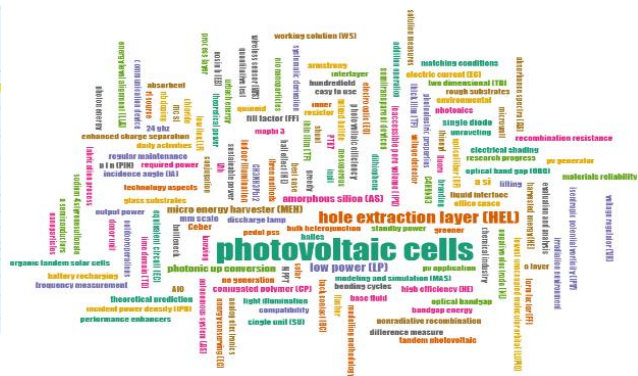
Indoor photovoltaics

is one of the most promising technologies to power connected devices (IoT) in indoor environments. Indoor spectral and working conditions differ significantly from outdoor applications (e.g. artificial light sources) and specific research and engineering is needed before indoor photovoltaics start to equip indoor devices.

Figure 5: Visualisations for Indoor PV



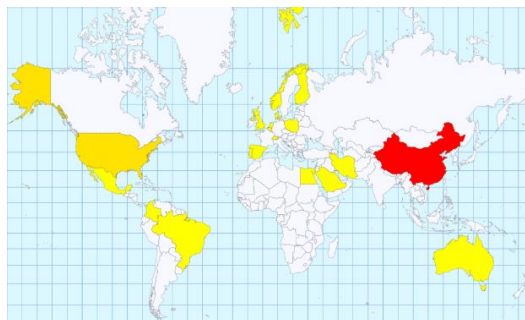
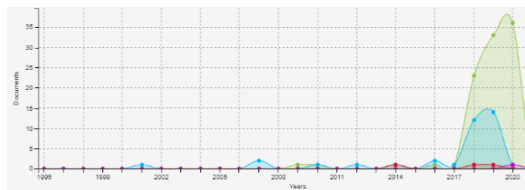
IND ACADEMIC COOP FOUNDED YONSEI UNIV	Y	10
Korea University	Y	9
University of Michigan	Y	5
Kyungpook National University	Y	5
University of Seoul	Y	4
University of Freiburg	Y	4
TU Dortmund University	Y	4
National Taiwan University	Y	4
Kyung Hee University	Y	4
Hong Kong Baptist University	Y	4
Fraunhofer Institute for Solar Energy Systems ISE	Y	4
Chinese Academy of Sciences	Y	4
Academia Sinica	Y	4
Soochow University	Y	3
Nanyang Technological University	Y	3
Mingchi University of Technology	Y	3
Imperial College London	Y	3
ELECT&TELECOMMUNICATIONS RES INST	Y	3
Bangladesh University of Engineering and Technology	Y	3



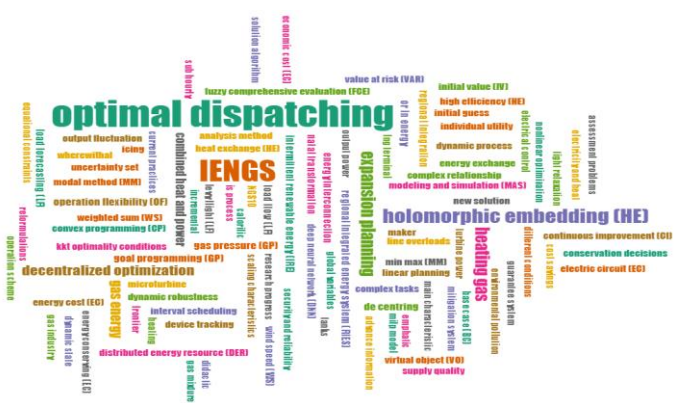
Integrated gas electricity systems

The future power system will be an interconnection of different energy vectors e.g. gas network, wind power, solar power. Integrated electricity gas network poses various challenges of coordination, reliability, and optimisation.

Figure 6: Visualisations for Integrated gas electricity systems



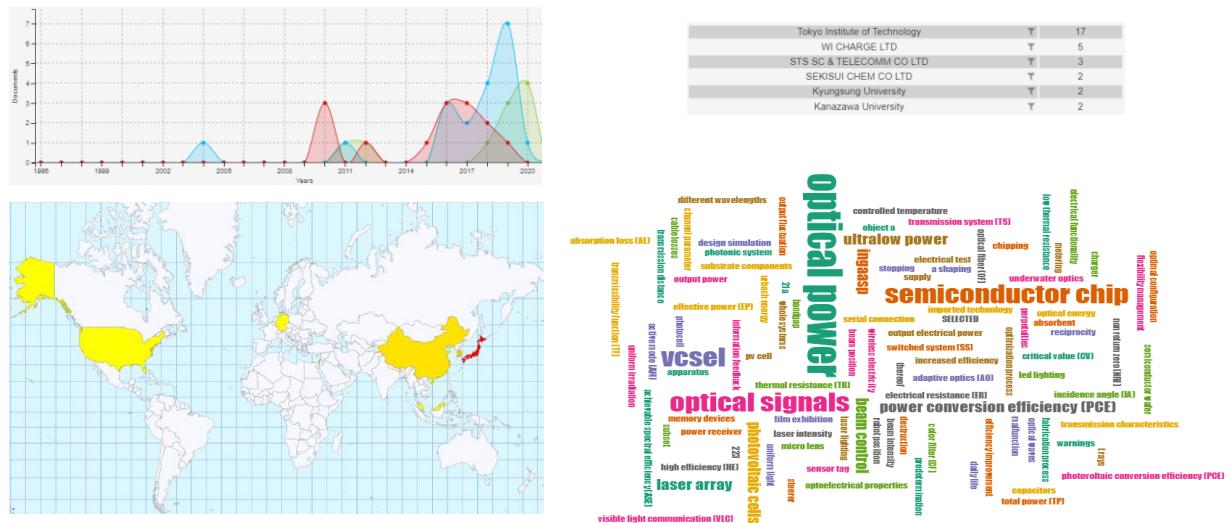
Chinese Academy of Sciences	Y	27
Zhejiang University	Y	18
Sichuan University	Y	10
South China University of Technology	Y	9
Tianjin University	Y	8
STATE GRID	Y	6
Shandong University	Y	6
Tsinghua University	Y	5
NORTHEAST ELECT POWER UNIVERSITY	Y	5
North China Electric Power University	Y	5
Illinois Institute of Technology	Y	5
Electric Power Research Institute	Y	5
University of Bath	Y	4
Stevens Institute of Technology	Y	4
STATE GRID CORPORATION OF CHINA	Y	4
Shiraz University of Technology	Y	4
Economic Research	Y	4
Aalborg University	Y	4
Wuhan University	Y	3
Nanyang Technological University	Y	3



Optical wireless power transmission

is a technology that has a high potential to change our daily lives and has many applications such as the charging of implanted medical devices, the powering of underwater vehicles and aerial drones, or the wireless transfer of power over long distance.

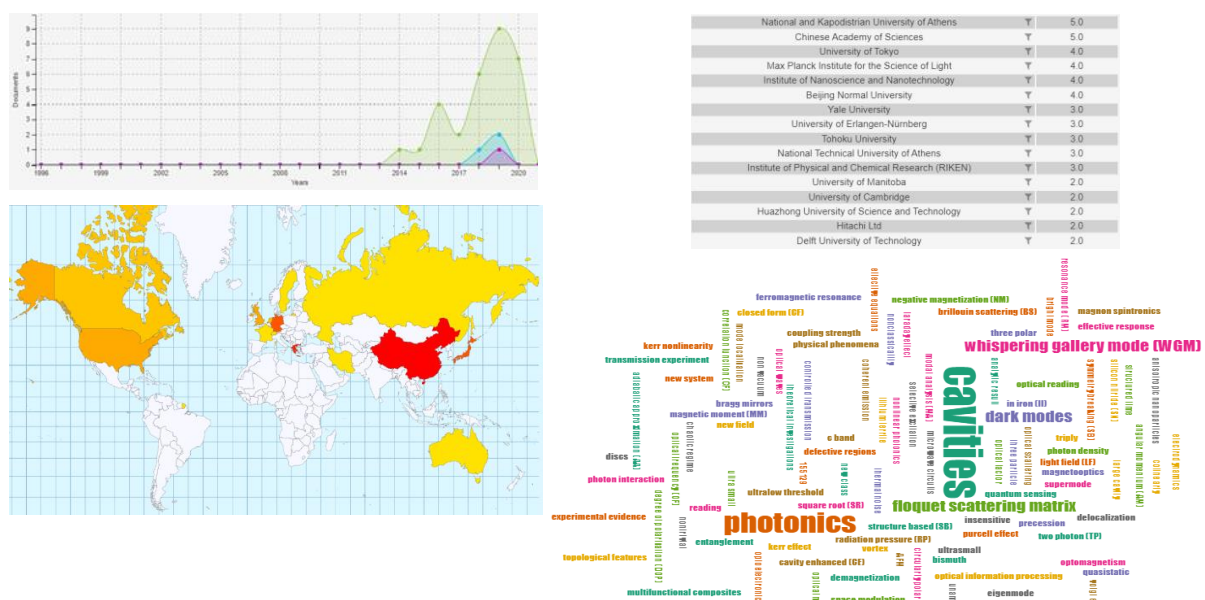
Figure 7: Visualisations for optical wireless power transmission



Optomagnonic

is an emerging field dealing with the photon-spin coupling in solid state systems, in particular using optical and microwave cavities, and related to the fast development of quantum technologies. New class of quantum systems and new physics are being explored mixing photonics, electronics, and spintronics.

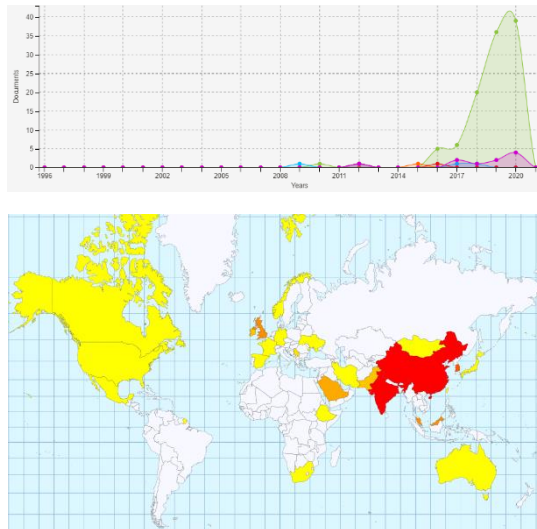
Figure 8: Visualisations for Optomagnonic



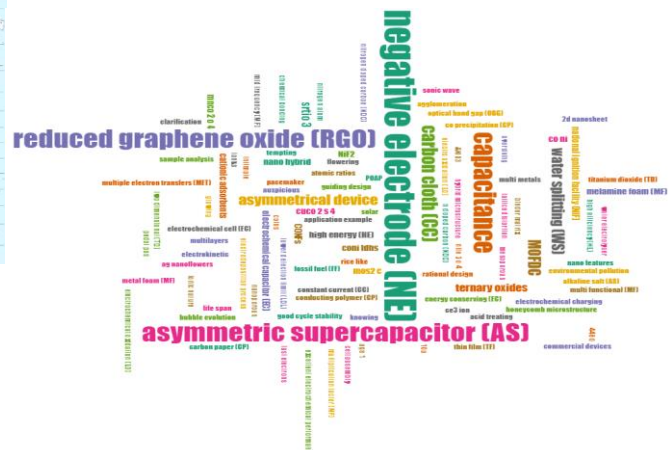
Supercapattery

is a term that has been invented in 2008 to designate hybrid electrochemical energy storage devices that combines the merits of rechargeable battery (high energy density) and of supercapacitor (long life cycle and high power density). Supercapattery devices gained a lot of attention over the recent years as they have the potential to meet a shortcoming of today's batteries i.e. combining a high energy density with little to no constrain on power density.

Figure 9: Visualisations for Supercapattery



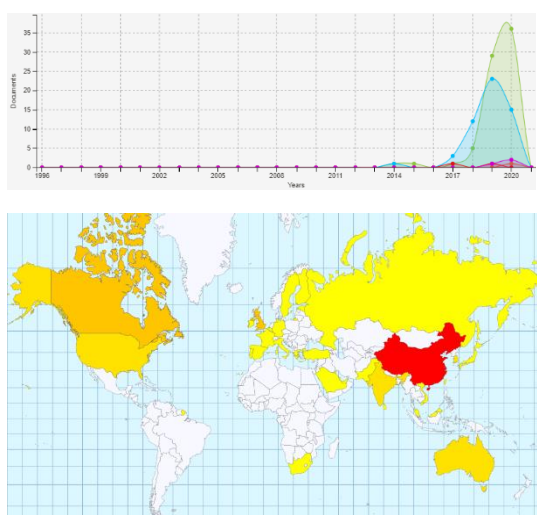
Chinese Academy of Sciences	Y	17
University of Nottingham	Y	15
University of Malaya	Y	14
University of Nottingham Ningbo China	Y	9
GK Institute of Engineering Sciences and Technology	Y	9
Bharathi University	Y	9
University College Cork	Y	8
Sunway University	Y	8
King Abdulaziz University	Y	7
Pusan National University	Y	5
Kyung Hee University	Y	5
Kwangwoon University	Y	5
University of Belgrade	Y	4
Pondicherry University	Y	4
Majmaah University	Y	4
Yonsei University	Y	3
Sunchon National University	Y	3
Lviv Polytechnic National University	Y	3
Kalatsalingam Academy of Research and Education	Y	3
IND FOUND OF CHONNAM NATIONAL UNIV	Y	3



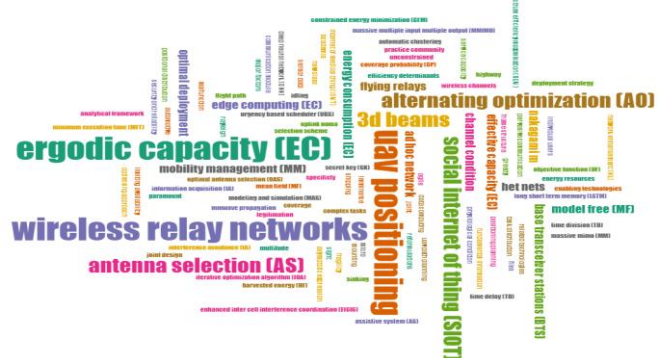
UAV assisted communication

This weak signal relates to the potential of Unmanned Aerial Vehicles (UAVs) to revolutionise various sectors like automotive, energy, or healthcare, by working as wireless relays to improve the connectivity with and between networks of connected devices on the ground.

Figure 10: Visualisations for UAV assisted communication



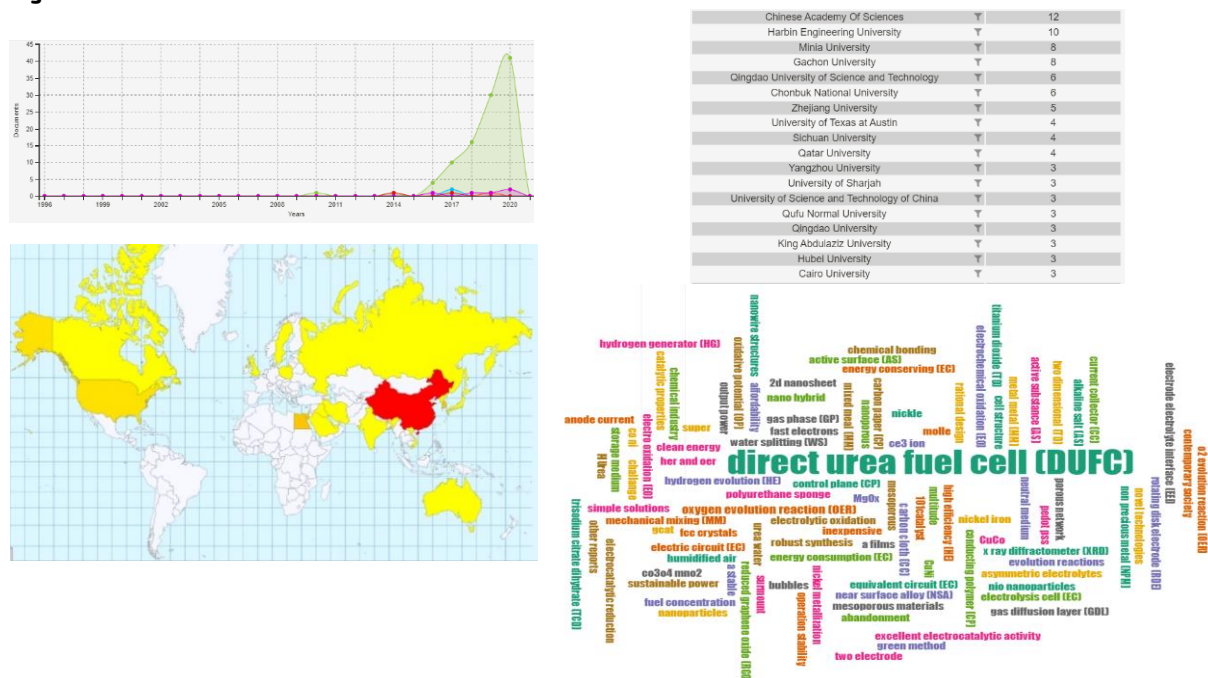
Beijing University of Posts and Telecommunications	Y	18
Southeast University	Y	11
Nanjing University of Posts and Telecommunications	Y	8
University of Electronic Science and Technology of China	Y	7
Chinese Academy of Sciences	Y	7
Carleton University	Y	6
National Institute of Technology	Y	5
King's College London	Y	5
University of New South Wales	Y	4
National Research Tomsk Polytechnic University	Y	4
Chinese Academy of Sciences	Y	4
China University of Mining and Technology	Y	4
XIDIAN UNIVERSITY	Y	3
University of Victoria	Y	3
School of Information and Electronics	Y	3
Qatar University	Y	3
North Carolina State University	Y	3
National University of Singapore	Y	3



Urea oxidation reaction in fuel cell

The global drive for greener energy production processes induces intense R&D activities toward innovative electrochemical energy devices with an optimized ratio energy density/emissions. Fuel cells base on the oxidation of urea are attracting interest: abundance of urea in waste waters, high energy density, good ratio output (discharging)/input (charging) capacity, and low-cost catalysts.

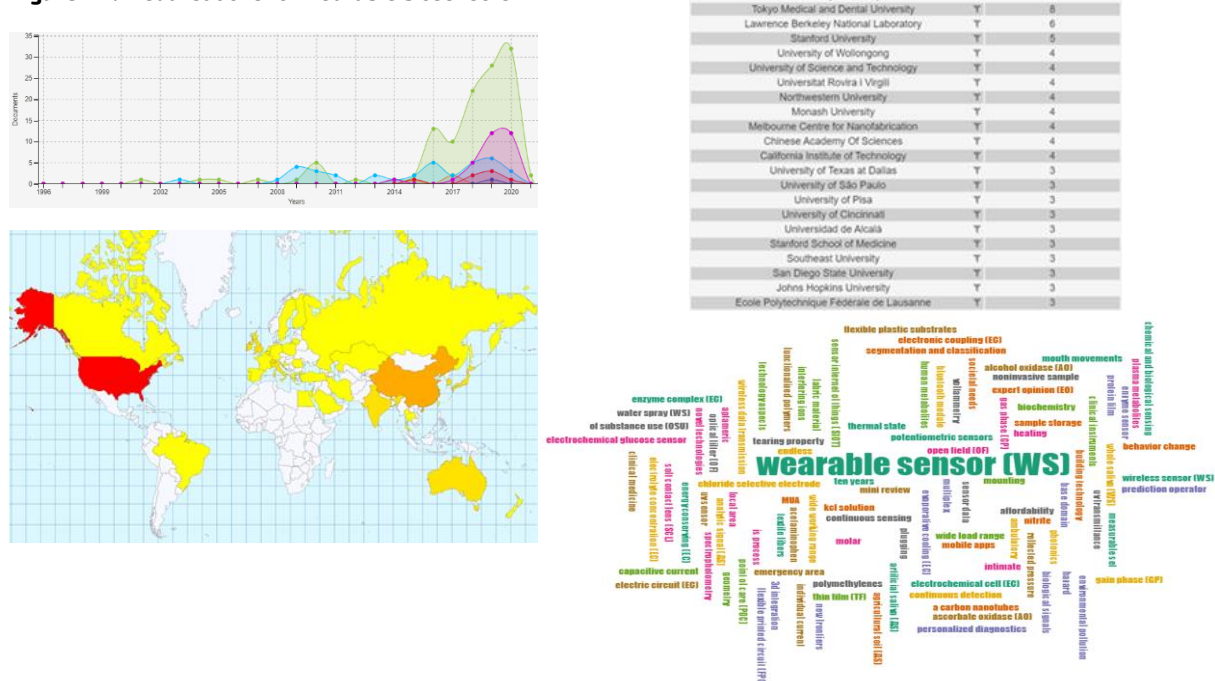
Figure 11: Visualisations for Urea oxidation reaction in fuel cell



Wearable biosensors

will soon become essential tools for remote monitoring of human health by on-the-skin detection. These sensors will detect human metabolites and/or biomarkers for disease. Human sweat, tears or saliva are rich in molecules and biomarkers and can be monitored in a non-invasive manner.

Figure 12: Visualisations for wearable biosensors

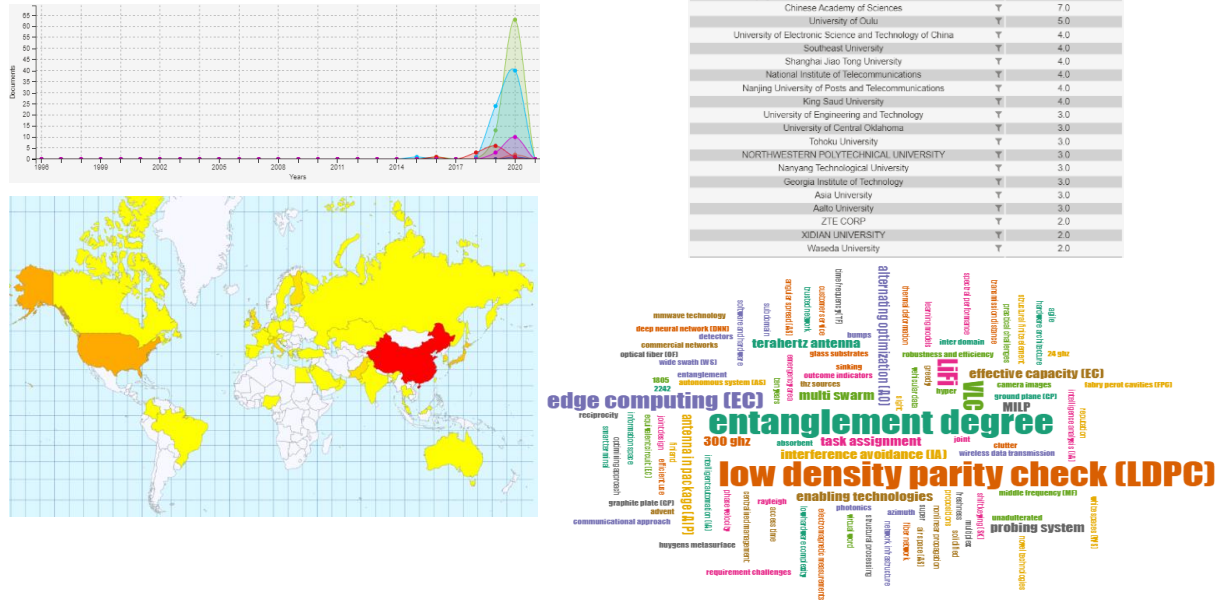


2.2 Information & Communication technologies

6G Network

will extend the performance of 5G applications and allow the development of innovative applications in wireless connectivity, cognition, sensing and imaging. 6G will use higher frequencies and will enable much faster sampling rates and higher data rates. Edge computing should also be an in-built feature of 6G.

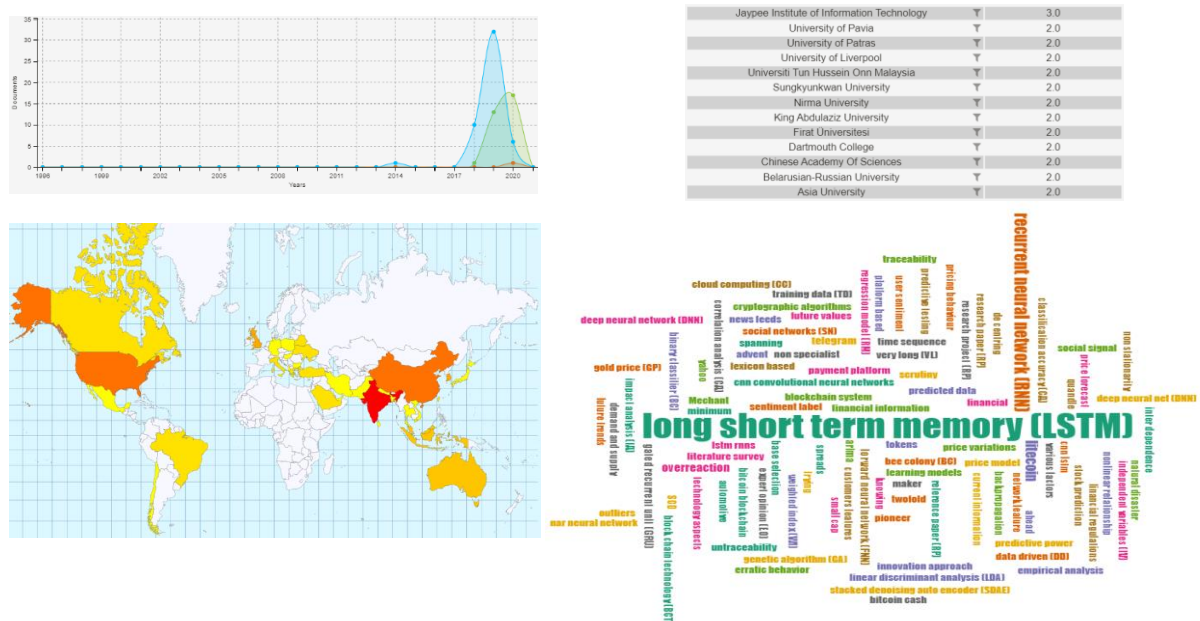
Figure 13: Visualisations for 6G networks



Cryptocurrency price prediction

Cryptocurrencies are subject to price volatility and accurate price predictions can assist investors towards making the right decisions as well as supporting policy makers and researchers in studying the behaviour of cryptocurrency markets.

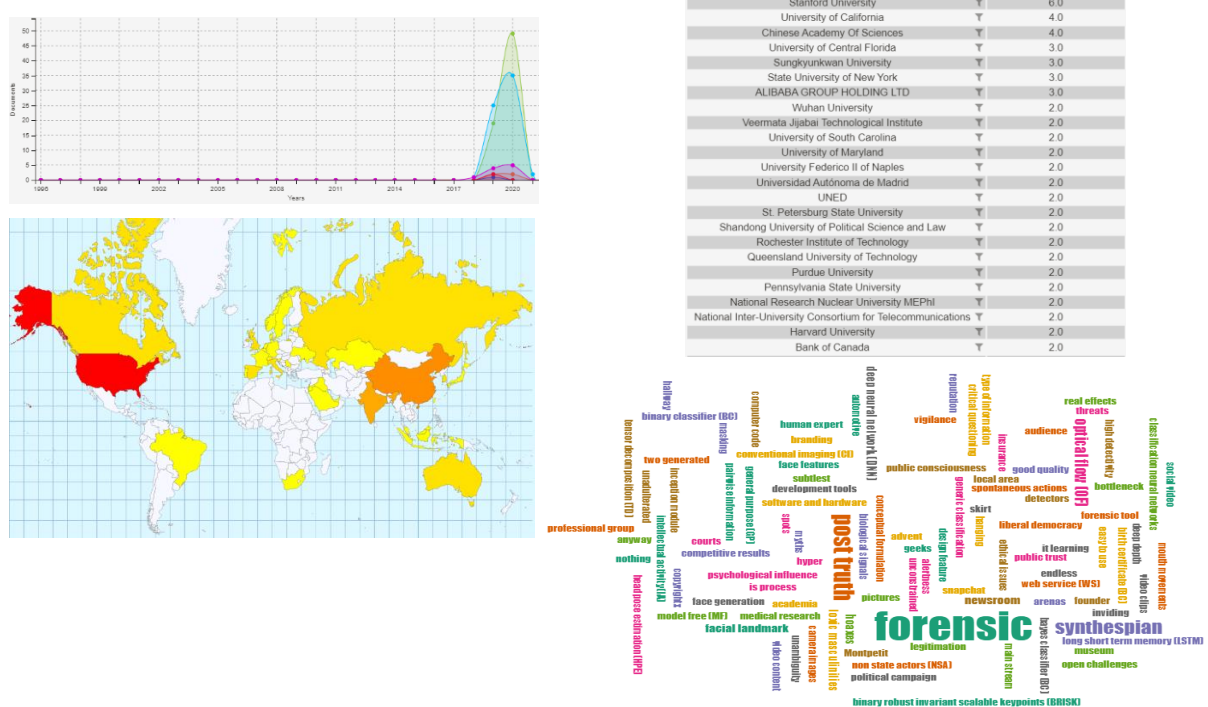
Figure 14: Visualisations for Cryptocurrency price prediction



Deepfake

in itself is not a new technology but its rapid dissemination and its potential impact on society makes it an emerging research area. Deepfake encompasses various face-swapping technologies that enable the making of realistic fake videos or images. The weak signal also includes developing techniques to detect deepfakes. These technologies are creating ethical, social, technical and legal challenges, but also opportunities.

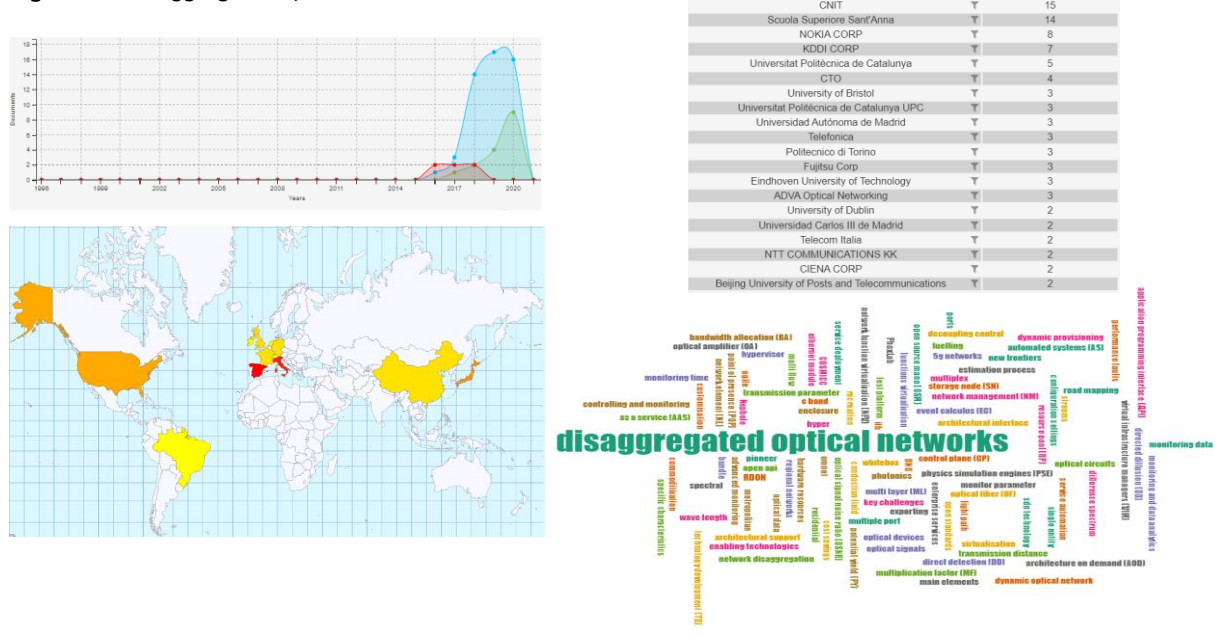
Figure 15: Visualisations for Deepfake



Disaggregated optical networks

Is a technology that could enable network slicing, a key aspect of 5G networks that enables the multiplexing of virtualized and independent logical networks on the same physical network infrastructure. The link between network slicing and the underlying (optical) network virtualization is a growing research topic.

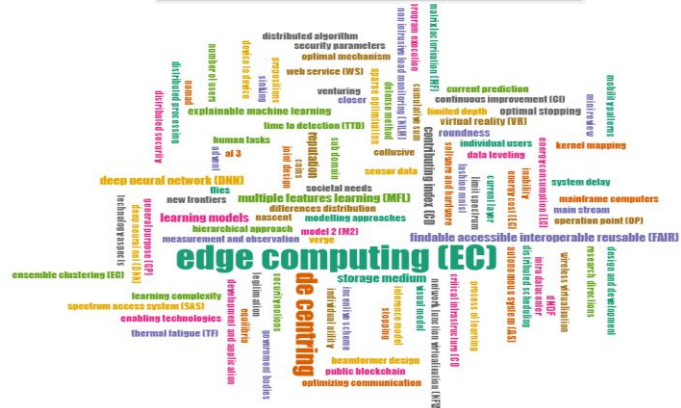
Figure 16: Disaggregated optical networks



is an emerging machine learning technique for training computing models with data collected by devices at the edge (e.g. mobile devices). As data collected is not transmitted to a central place, this technique provides privacy for mobile owners while simultaneously ensuring high learning performance.

The figure consists of two panels. The top panel is a line graph showing the daily new cases of COVID-19 from 1999 to 2020. The x-axis represents years from 1999 to 2020, with major ticks every three years. The y-axis represents the number of cases, ranging from 0 to 70 in increments of 5. The graph shows a very low number of cases until early 2020, followed by a sharp increase. A blue line with circular markers represents the daily new cases, which peaks at approximately 65 cases in early 2020. A green shaded area represents the confidence interval, which is wider at the peak. A purple shaded area represents the expected number of cases, which is much lower, peaking at around 10 cases in early 2020. The bottom panel is a world map showing the global distribution of COVID-19 cases by country. The map uses a color scale from yellow to red to indicate the number of cases. China is colored red, indicating the highest number of cases. The United States and the United Kingdom are colored orange, indicating a high number of cases. Most other countries are colored yellow, indicating a lower number of cases. The map also shows the distribution of cases by region, with higher concentrations in North America, Europe, and Asia.

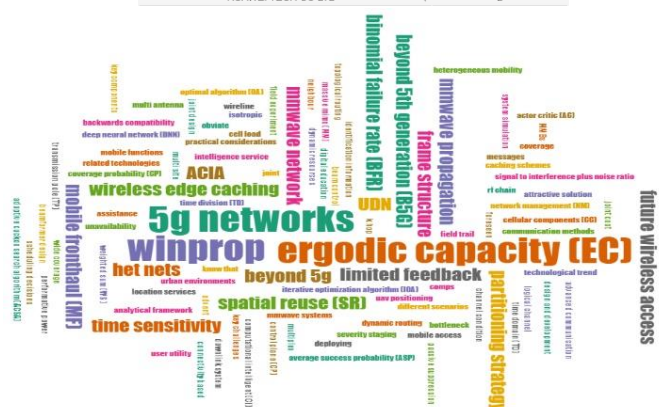
Nanyang Technological University	Y	15
IBM Corp	Y	12
Princeton University	Y	8
Hong Kong University of Science and Technology	Y	8
University of Electronic Science and Technology of China	Y	7
Kyung Hee University	Y	7
Beijing University of Posts and Telecommunications	Y	7
University of Technology Sydney	Y	6
University of Houston	Y	6
Hong Kong Polytechnic University	Y	6
University of Sydney	Y	5
University of Oulu	Y	5
TENCENT TECHNOLOGY CO., LTD.	Y	5
Singapore University of Technology and Design	Y	5
Zhejiang University	Y	4
XIDIAN UNIVERSITY	Y	4
King's College London	Y	4
GOOGLE INC	Y	4
Georgia Institute of Technology	Y	4
University of Science and Technology	Y	3
University of Hong Kong	Y	3
University of Colorado at Colorado Springs	Y	3
Hainan University	Y	3
Sungkyunkwan University	Y	3
National Engineering Laboratory for Textile Fiber Materials a	Y	3
Imperial College London	Y	3
Fraunhofer Heinrich Hertz Institute	Y	3



or Integrated Access and Backhaul, is one of the main novelties of 5G. With this type of networks, the operator can use part of the available radio resources for wireless backhauling. This would provide backhaul and cellular services in the same node, creating more flexibility and reducing the implementation cost.

Figure 1 is a line graph showing the number of publications per year from 1980 to 2020. The y-axis is labeled 'Publications' and ranges from 0 to 24 in increments of 2. The x-axis is labeled 'Years' and ranges from 1980 to 2020 in increments of 5 years. Three data series are plotted: 'All' (red line with circular markers), 'China' (green line with circular markers), and 'USA' (blue line with circular markers). The 'All' series shows a sharp increase starting around 2014, peaking at 22 publications in 2018, and then declining to 19 in 2019. The 'China' series shows a sharp increase starting around 2014, peaking at 10 publications in 2019, and then declining to 8 in 2020. The 'USA' series shows a sharp increase starting around 2014, peaking at 11 publications in 2018, and then declining to 9 in 2020. Below the graph is a world map with a grid. The USA and China are highlighted in red, while other countries are highlighted in yellow.

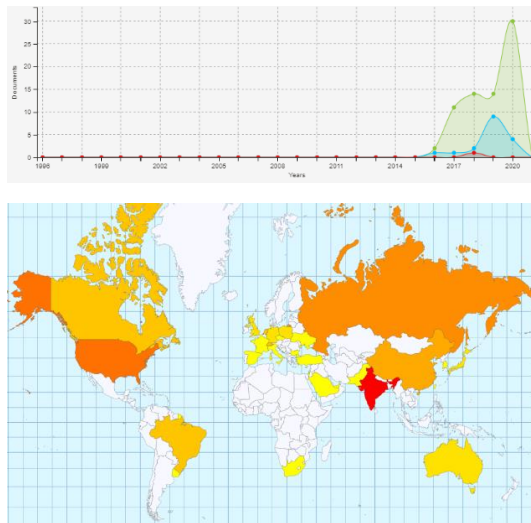
AT&T CORP	Y	10
IBM Corp	Y	6
KT CORP	Y	5
Virginia Tech	Y	4
University of Padova	Y	4
Inter Digital Communications, Inc.	Y	3
Florida International University	Y	3
Ericsson Research	Y	3
University of California	Y	2
Samsung Corp	Y	2
NORTHWESTERN POLYTECHNICAL UNIVERSITY	Y	2
NOKIA TECH LTD	Y	2
NOKIA CORP	Y	2
HUAWEI TECH CO LTD	Y	2



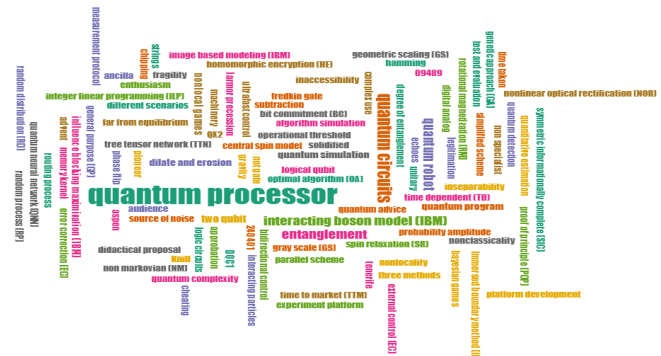
IBM Quantum processor

is a weak signal related to experiments performed by researchers on the online platform “IBM Quantum Experience” that gives public users access to a set of prototype quantum processors. Over 20 devices are part of the experience (number from early 2021), six of which are freely accessible. These quantum processors are made up of superconducting transmon qubits, located in a dilution refrigerator at IBM Research headquarters.

Figure 19: Visualisations for IBM quantum processor



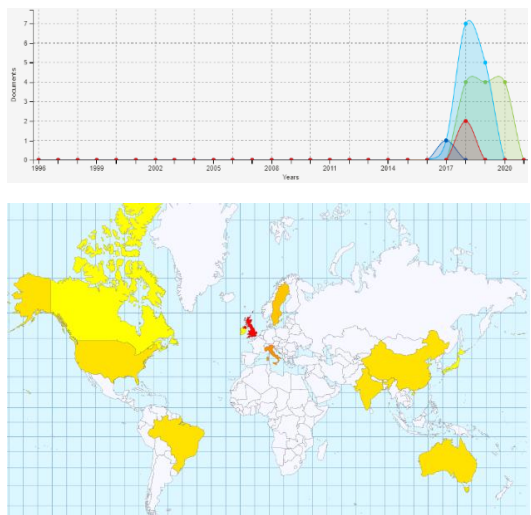
Indian Institute of Science Education and Research Kolkata	Y	19
Russian Academy of Sciences	Y	10
QUANTUM CORP	Y	10
National Research Nuclear University MEPhI	Y	8
Russian Quantum Center	Y	5
University of Science and Technology of China	Y	4
National Research University of Electronic Technology MIET	Y	4
Jaypee Institute of Information Technology	Y	4
Institute of Automatics	Y	4
University of Science and Technology	Y	3
Moscow Institute of Physics and Technology	Y	3
IBM Corp	Y	3
Delft University of Technology	Y	3
Università di Parma	Y	2
University of Waterloo	Y	2
University of Technology Sydney	Y	2
University of New Brunswick	Y	2
University of Guelph	Y	2
University of Groningen	Y	2
Universidade Federal Fluminense	Y	2



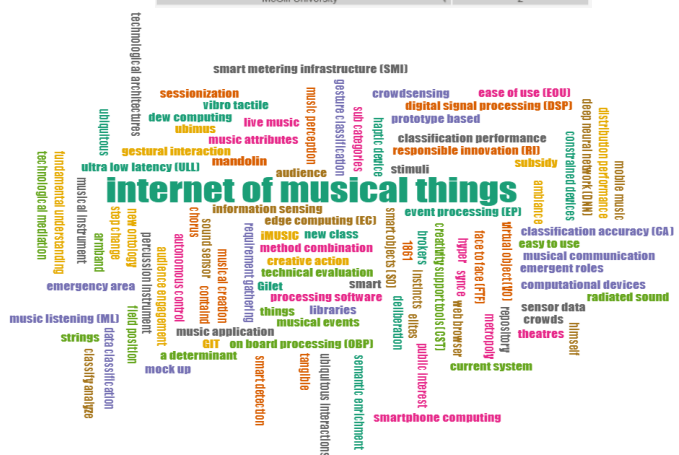
Internet of musical things

is the extension of the Internet of Things to the musical world and refers more specifically to the network of physical musical objects dedicated to the production of musical content. Musical things, such as smart musical instruments or wearables, are connected through an infrastructure that enables multidirectional communication.

Figure 20: Visualisations for internet of musical things



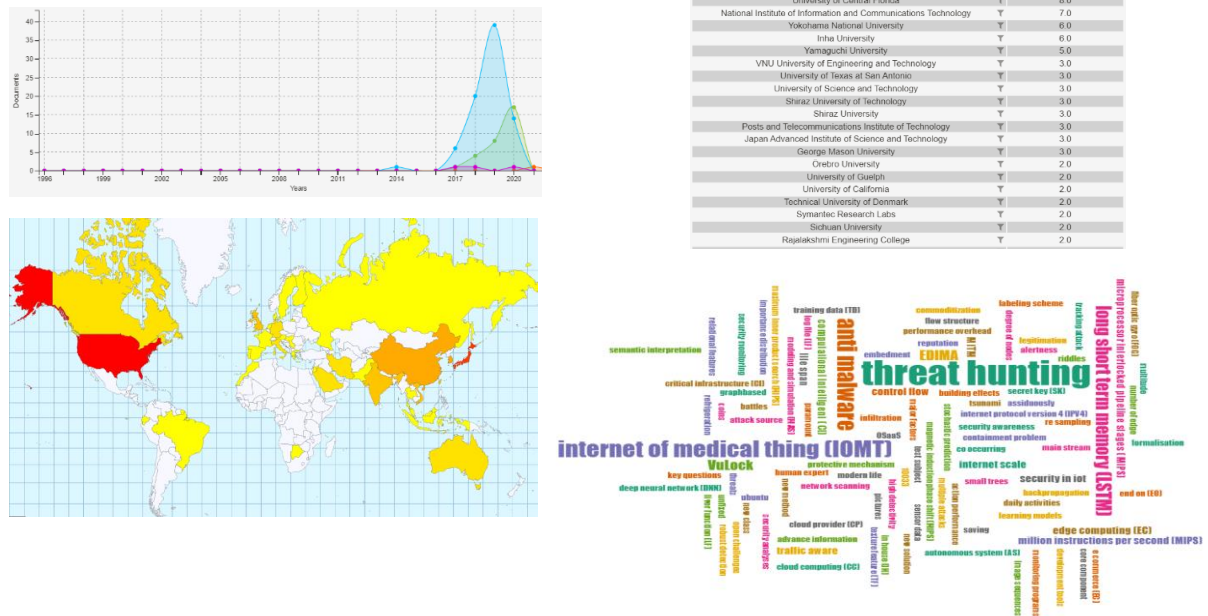
Queen Mary University of London	Y	19
University of Trento	Y	5
University of Western Australia	Y	3
University of Bologna	Y	3
KTH Royal Institute of Technology	Y	3
West Bengal University of Technology	Y	2
McGill University	Y	2



IoT malware

are malicious software targeting the Internet of Things. This area of research has become one of the focus of the security research community over the last years as threats are multiplying.

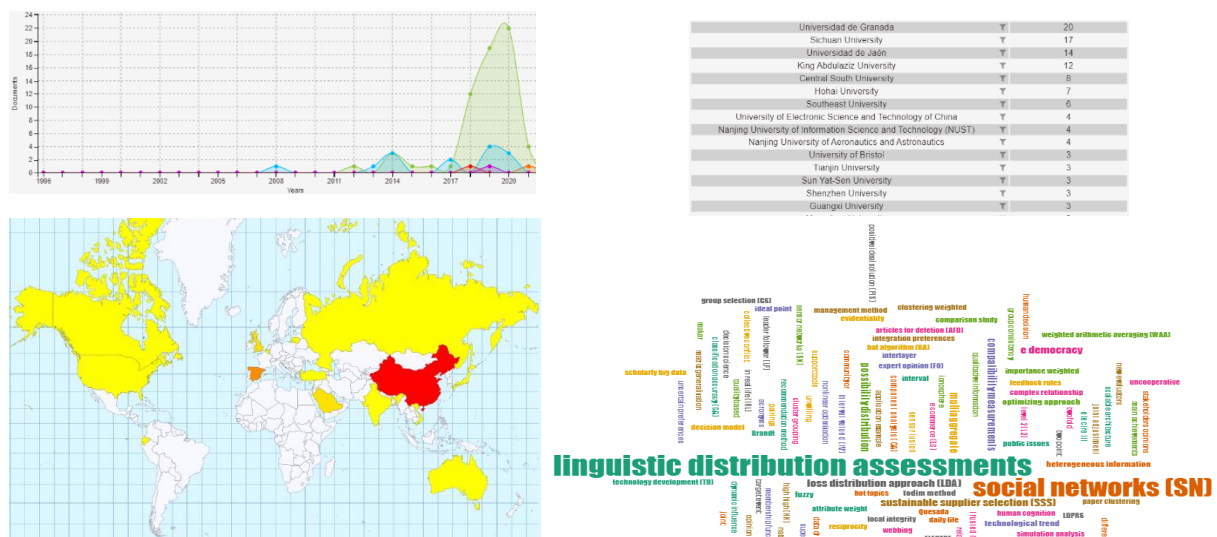
Figure 21: Visualisations for IoT malware



Large scale group decision making

The increasing complexity of our society makes decision-making tasks more and more difficult to manage and take. In the recent years, new technologies and communication means are being investigated to improve large-scale group decision-making processes.

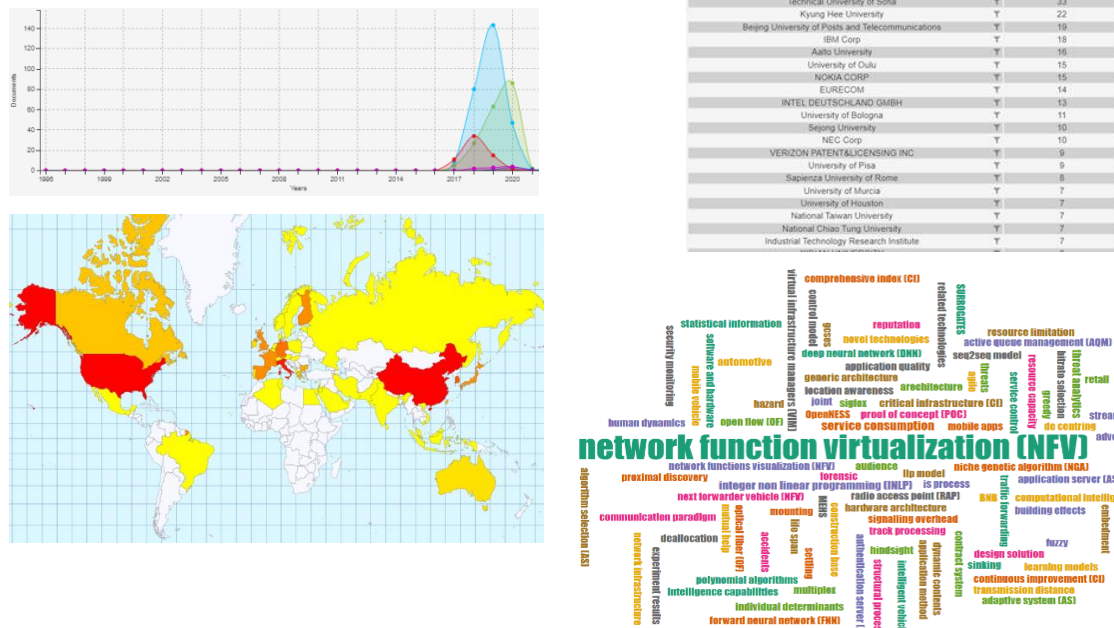
Figure 22: Visualisations for large scale group decision making



Multi access edge computing

is an important enabling technology for 5G architecture aiming at the reduction of network latency and traffic. It will offer cloud-computing capabilities and a full IT environment at the edge of the network.

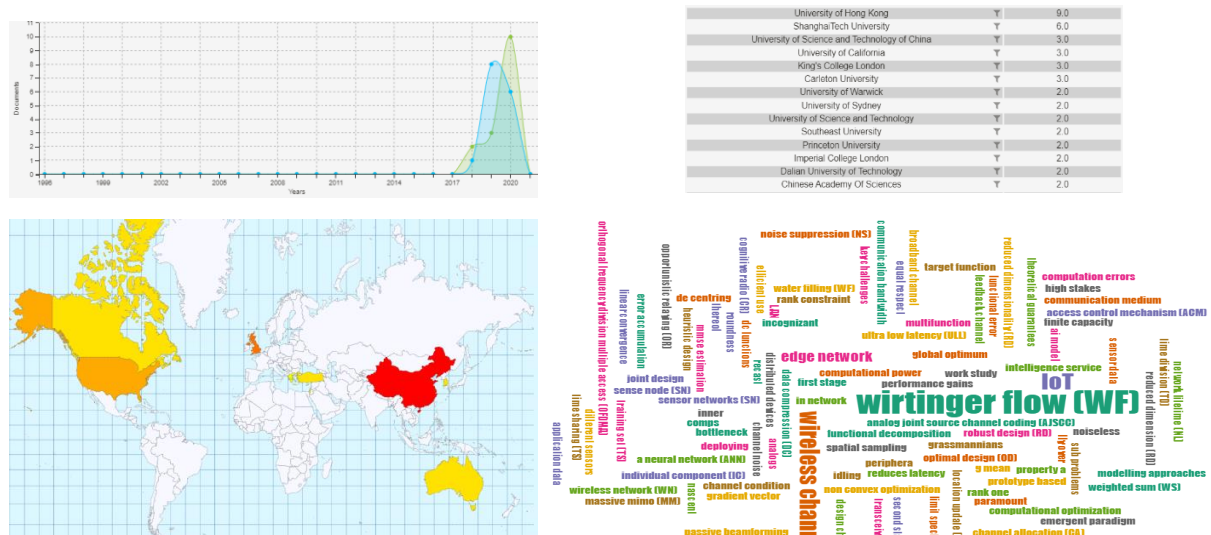
Figure 23: Visualisations for multi access edge computing



Over the air computation

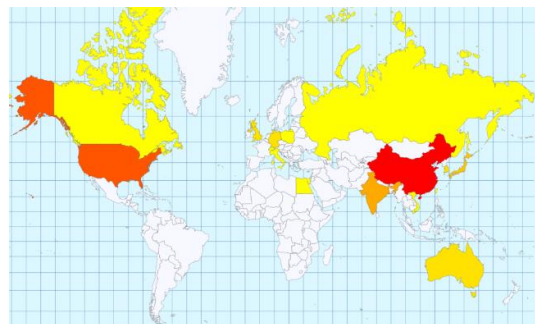
will enable the data collection and computation from concurrent sensors by combining communication and computation efficiently, utilizing the superposition property of wireless channels. This is an important technology for the future of the IoT where the collection and interpretation of data from numerous smart sensors is challenging.

Figure 24: Visualisations for over the air computation

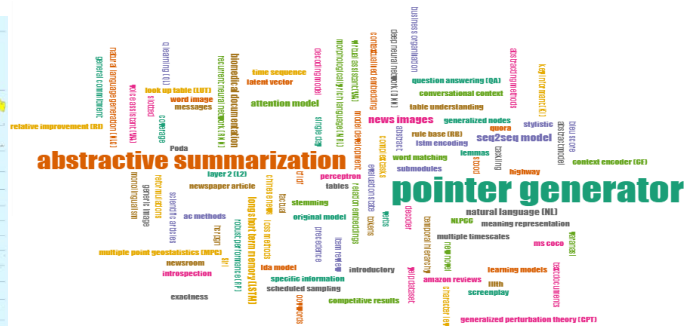


are used in natural language processing to improve automated text summarization, a tricky process in which many algorithms fail to detect the essential parts of long documents.

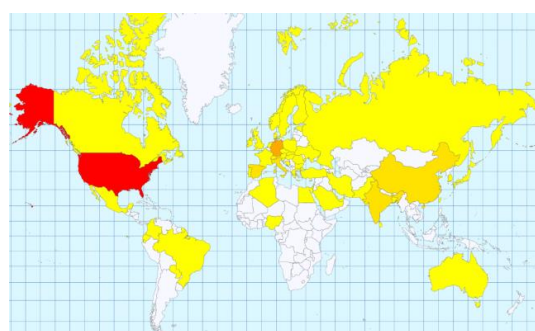
Year	Documents
1996	0
1997	0
1998	0
1999	0
2000	0
2001	0
2002	0
2003	0
2004	0
2005	0
2006	0
2007	0
2008	0
2009	0
2010	0
2011	0
2012	0
2013	0
2014	0
2015	0
2016	0
2017	0
2018	1
2019	23
2020	12



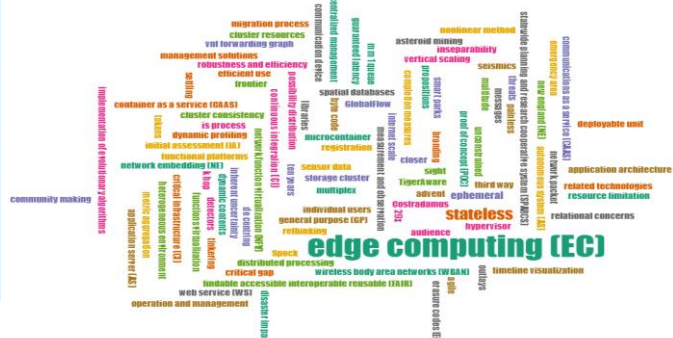
GOOGLE INC	¥	3.0
Amazon	¥	3.0
Tsinghua University	¥	2.0
Singapore Management University	¥	2.0
Samsung Corp	¥	2.0
PricewaterhouseCoopers	¥	2.0
Chinese Academy Of Sciences	¥	2.0



is emerging as an evolution of cloud computing for the deployment of applications and services. Serverless architecture brings the advantage of offloading the management and server configuration from the user to the provider.



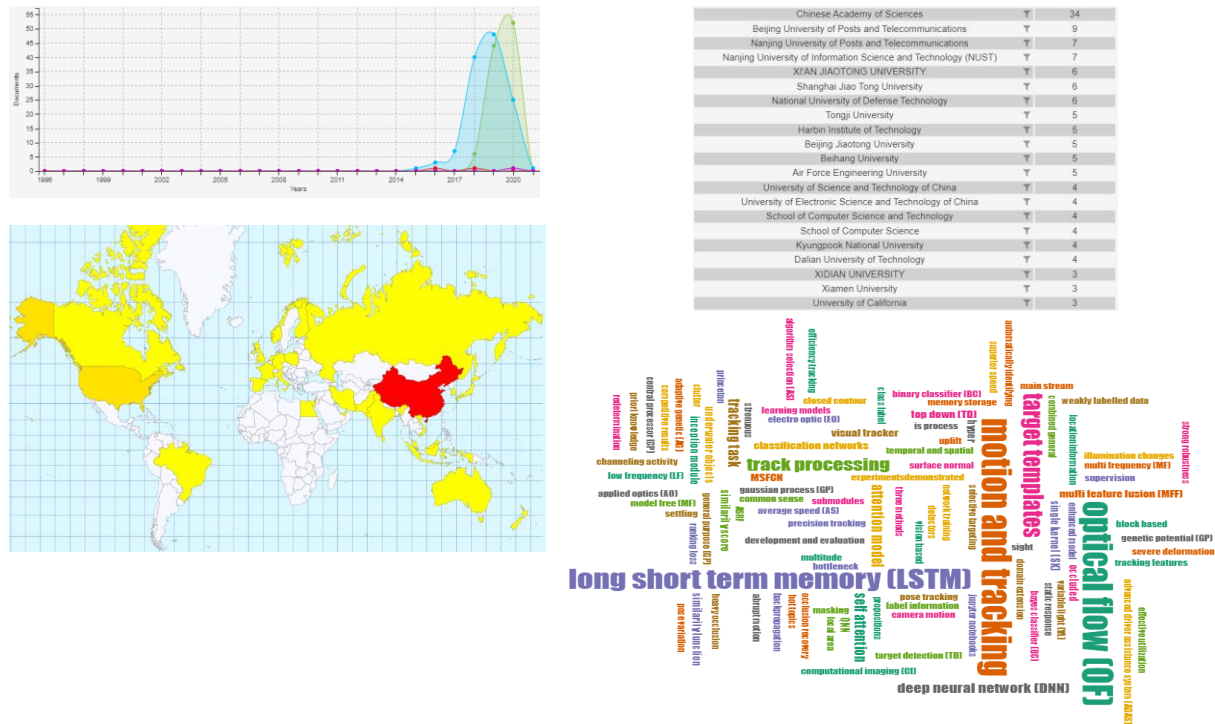
IBM Corp	Y	28
University of California	Y	7
Universitat Rovira i Virgili	Y	6
University of Washington	Y	7
University of Tartu	Y	6
University of Bamberg	Y	6
UC Berkeley	Y	6
Stanford University	Y	6
Imperial College London	Y	6
Escuela Superior Politécnica del Litoral	Y	5
Zürich University of Applied Sciences	Y	5
Universidad Politécnica de Valencia	Y	5
TU Berlin	Y	5
HUAWEI TECH CO LTD	Y	5
CISCO TECH INC	Y	5
Vrije Universiteit Amsterdam	Y	4
VMWARE INC	Y	4
University of Würzburg	Y	4
University of Wisconsin-Madison	Y	4
University of Stuttgart	Y	4



Siamese network for object tracking

This type of neural networks have achieved remarkable results in application such as (multiple) tracking of objects, a very intense area of research with applications in robotics, video surveillance, unmanned vehicles or activity tracking and recognition.

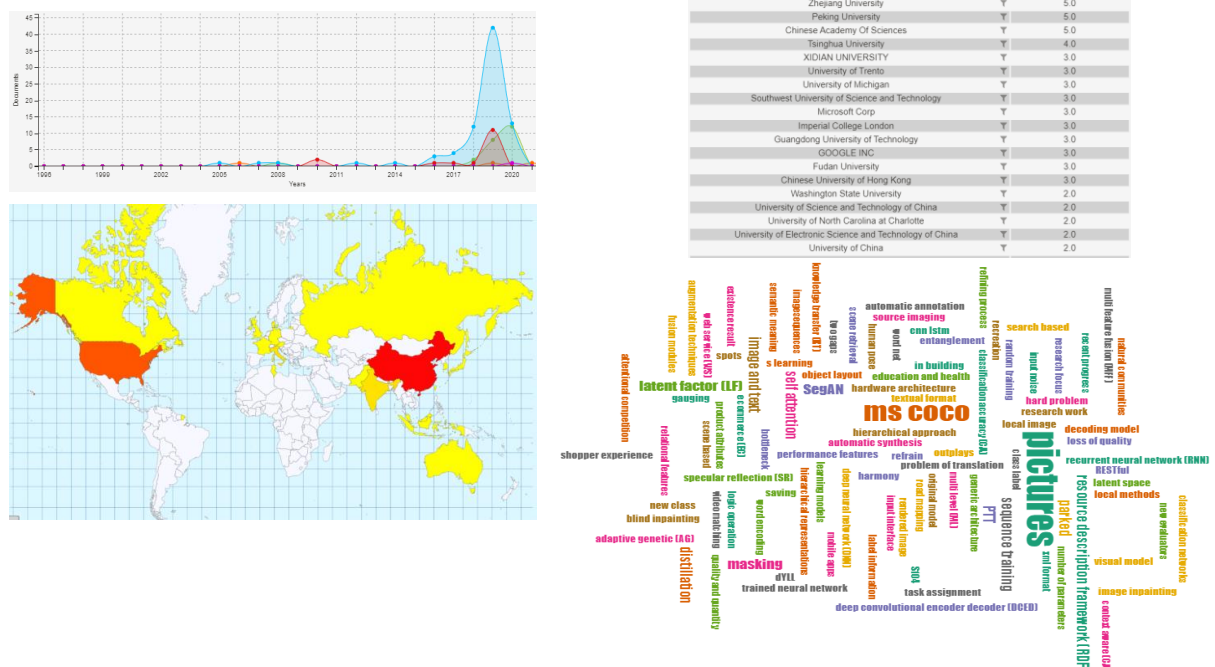
Figure 27: Visualisations for Siamese network for object tracking



Text to image synthesis

Neural networks, and in particular generative adversarial networks, are emerging as efficient tools to generate images or videos from a text description.

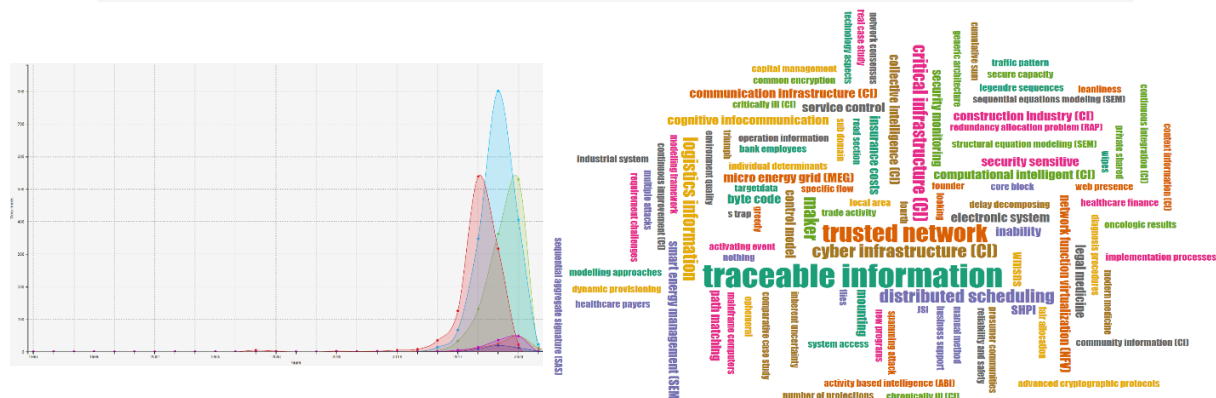
Figure 28: Visualisations for text to image synthesis



The blockchain technology appeared in 2008 and is being applied in an ever growing number of applications. This open distributed ledger can record data transactions between two parties and is by design resistant to data alteration. Weak signals of emerging applications of blockchain have been detected in sectors as diverse as healthcare or disinformation.

Figure 29: Visualisations for blockchain related weak signals.
(distribution of documents and wordcloud for all WS on blockchain)

blockchain - inter planetary file system	topic:("inter planetary file system" OR (IPFS AND blockchain))
blockchain as a service	topic:("blockchain as a service"~2)
blockchain disinfo	topic:(blockchain AND ("fake news" OR disinformation))
blockchain for anti-counterfeiting	topic:(blockchain AND "anti counterfeiting")
blockchain for democracy	topic:(blockchain AND (democracy OR "e voting" OR "electronic vote"))
blockchain for vehicular networks	topic:(blockchain AND ("vehicular network" OR vehicle))
blockchain in health	topic:(blockchain AND (health OR (medical AND record)))
blockchain in maritime sector	topic:(blockchain AND (maritime OR shipping))
blockchain security	topic:("blockchain security"~1)
mobile blockchain	topic:("mobile blockchain" OR (blockchain AND "edge computing"))
permissioned blockchain	topic:("permissioned blockchain"~2)

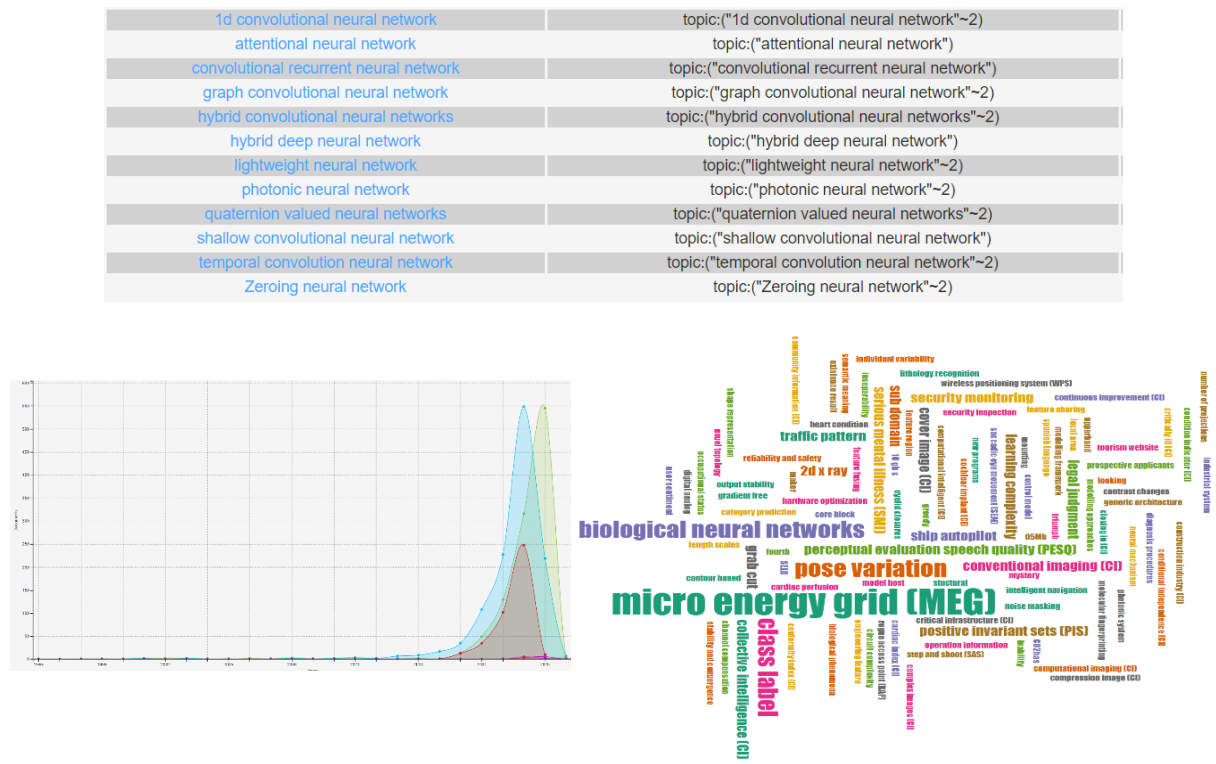


Journal categories recently pervaded by blockchain technologies
(Score is activeness 2019-2020 i.e. the % of articles published in 2019-2020 for this journal category)

Tourism, Leisure and Hospitality Management	Y	100	Aerospace Engineering	Y	85
Radiology Nuclear Medicine and imaging	Y	100	Engineering	Y	85
Pollution	Y	100	Materials Science	Y	85
Physics and Astronomy	Y	100	Safety Research	Y	85
Pharmacology, Toxicology and Pharmaceuticals	Y	100	Process Chemistry and Technology	Y	85
Mechanics of Materials	Y	100	Engineering (miscellaneous)	Y	85
Health, Toxicology and Mutagenesis	Y	100	Environmental Science	Y	84
Economics, Econometrics and Finance (miscellaneous)	Y	100	Electrical and Electronic Engineering	Y	84
Earth and Planetary Sciences	Y	100	Mathematics	Y	84
Bioengineering	Y	100	Urban Studies(RT)	Y	83
Biochemistry, Genetics and Molecular Biology	Y	100	Marketing	Y	83
Economics and Econometrics	Y	96	Fluid Flow and Transfer Processes	Y	83
Applied Mathematics	Y	95	Computer Vision and Pattern Recognition	Y	82
Social Sciences (miscellaneous)	Y	95	Business and International Management	Y	82
Analytical Chemistry	Y	95	Signal Processing	Y	81
Accounting	Y	93	Control and Optimization	Y	81
Development	Y	93	Strategy and Management	Y	81
Political Science and International Relations(RT)	Y	92	Information Systems	Y	81
Computational Mathematics	Y	92	Decision Sciences (miscellaneous)	Y	81
Atomic and Molecular Physics, and Optics	Y	92	Media Technology (NEW)	Y	80
Management, Monitoring, Policy and Law	Y	90	Automotive Engineering	Y	80
Computational Theory and Mathematics	Y	90	Instrumentation	Y	80
Biochemistry	Y	89	Food Science	Y	80
Geography, Planning and Development	Y	89	Energy Engineering and Power Technology	Y	80
Management Information Systems	Y	88	Information Systems and Management	Y	79
Ocean Engineering	Y	87	Energy	Y	78
Transportation	Y	86	Software	Y	78
Management of Technology and Innovation	Y	86	Environmental Engineering	Y	78
Energy (miscellaneous)	Y	85	Control and Systems Engineering	Y	78
Condensed Matter Physics	Y	85	Civil and Structural Engineering	Y	78

Neural networks are an effective means of performing machine learning. Numerous weak signals related to neural networks have been detected, of which the most relevant are listed below. Similarly to blockchain technologies, neural networks permeate all fields of science and technologies, as shown by the list of most recently pervaded journal categories.

Figure 30: Visualisations for Neural networks related weak signals
(distribution of documents and wordcloud for all WS on neural networks)



Journal categories recently pervaded by neural networks
(Score is activeness 2019-2020 i.e. the % of articles published in 2019-2020 for this journal category)

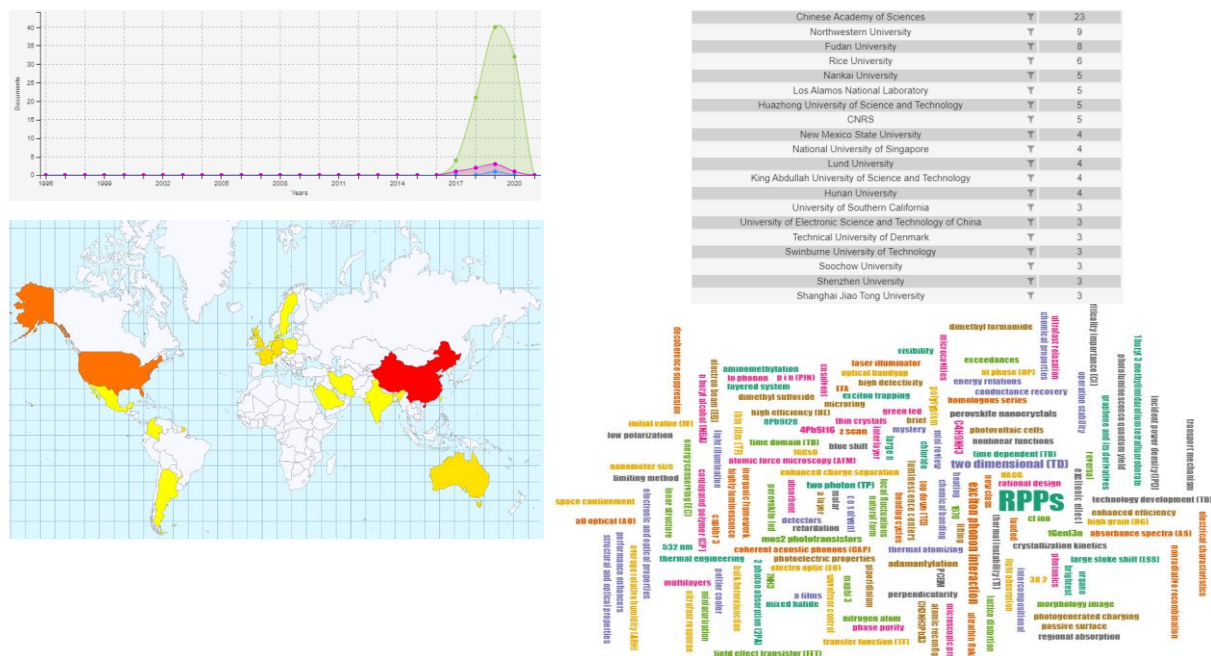
Strategy and Management	Y	100	Industrial and Manufacturing Engineering	Y	86
Statistics, Probability and Uncertainty	Y	100	Analytical Chemistry	Y	86
Fuel Technology	Y	100	Nuclear Energy and Engineering	Y	85
Environmental Engineering	Y	100	Forestry	Y	85
Chemistry (miscellaneous)	Y	100	Energy	Y	85
Biotechnology	Y	100	Earth and Planetary Sciences (miscellaneous)	Y	85
Transportation	Y	95	Computer Science (miscellaneous)	Y	85
Neuroscience	Y	94	Algebra and Number Theory	Y	85
Fluid Flow and Transfer Processes	Y	92	Library and Information Sciences	Y	84
Mathematics	Y	91	Renewable Energy, Sustainability and the Environment	Y	83
Process Chemistry and Technology	Y	91	Engineering (miscellaneous)	Y	83
Materials Science	Y	91	Instrumentation	Y	83
Radiological and Ultrasound Technology	Y	90	Automotive Engineering	Y	81
Decision Sciences (miscellaneous)	Y	90	Public Health, Environmental and Occupational Health	Y	80
Computers in Earth Sciences	Y	90	Physical and Theoretical Chemistry	Y	80
Spectroscopy	Y	88	Molecular Medicine	Y	80
Structural Biology	Y	87	Horticulture	Y	80
Physics and Astronomy (miscellaneous)	Y	87	Geometry and Topology	Y	80
Management, Monitoring, Policy and Law	Y	87	Discrete Mathematics and Combinatorics	Y	80
Management Information Systems	Y	87	Biomaterials	Y	80
Health Information Management	Y	87	Bioengineering	Y	80
Civil and Structural Engineering	Y	87	Atmospheric Science	Y	80
Building and Construction (NEW)	Y	87	Agronomy and Crop Science	Y	80
Engineering	Y	87	Safety, Risk, Reliability and Quality	Y	79
Chemical Engineering	Y	86	Biochemistry	Y	79

2.3 Chemistry and Materials

2D ruddlesden popper perovskites

This type of perovskite materials have attracted a lot of attention due to their excellent optoelectronic properties. They are promising materials for a number of applications in solar cells and as photodetectors.

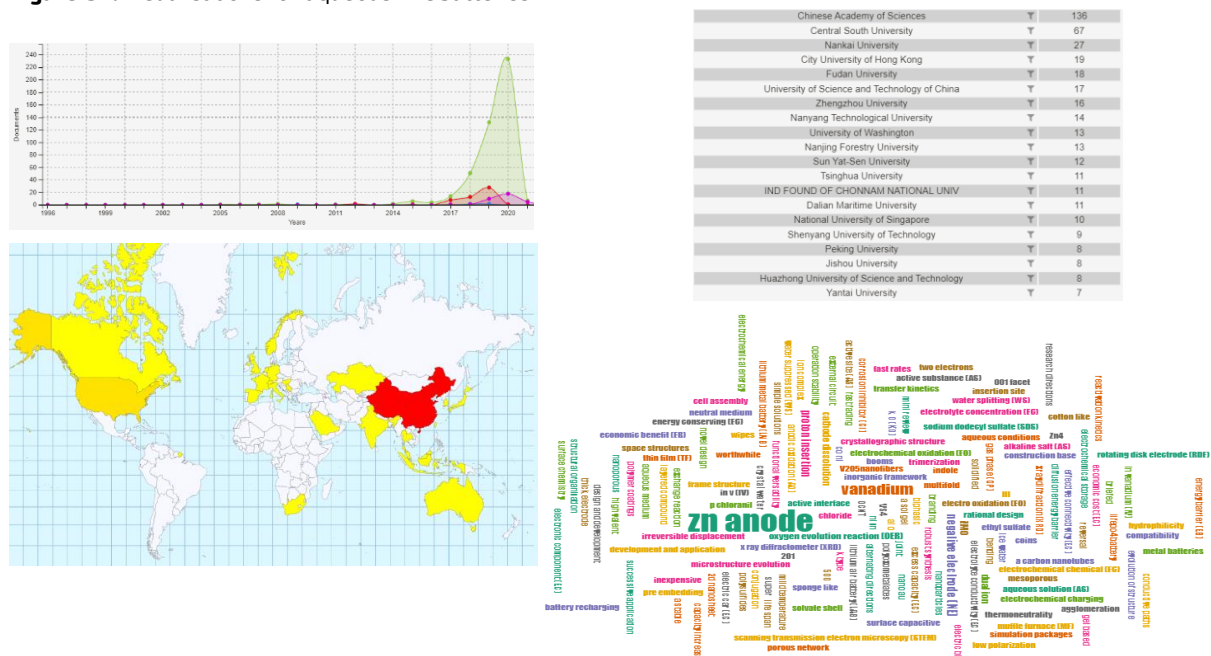
Figure 31: Visualisations for 2D ruddlesden popper perovskites



Aqueous zinc batteries

are promising energy storage systems due to the combination of low cost, high safety and higher capacity compared to lithium ion batteries. There are still some challenges to be solved, mainly related to the development of optimised materials for the cathodes and anodes.

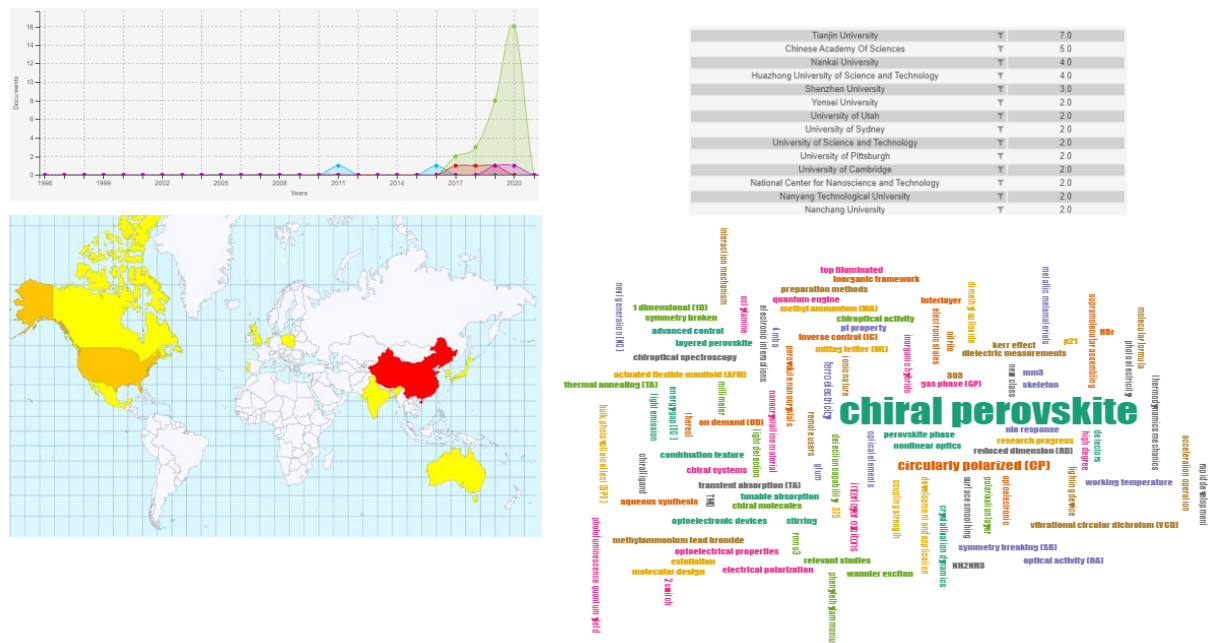
Figure 32: Visualisations for aqueous Zinc batteries



Chiral perovskite

are emerging as promising new materials for applications in ferroelectrics, spintronics and chiroptoelectronics.

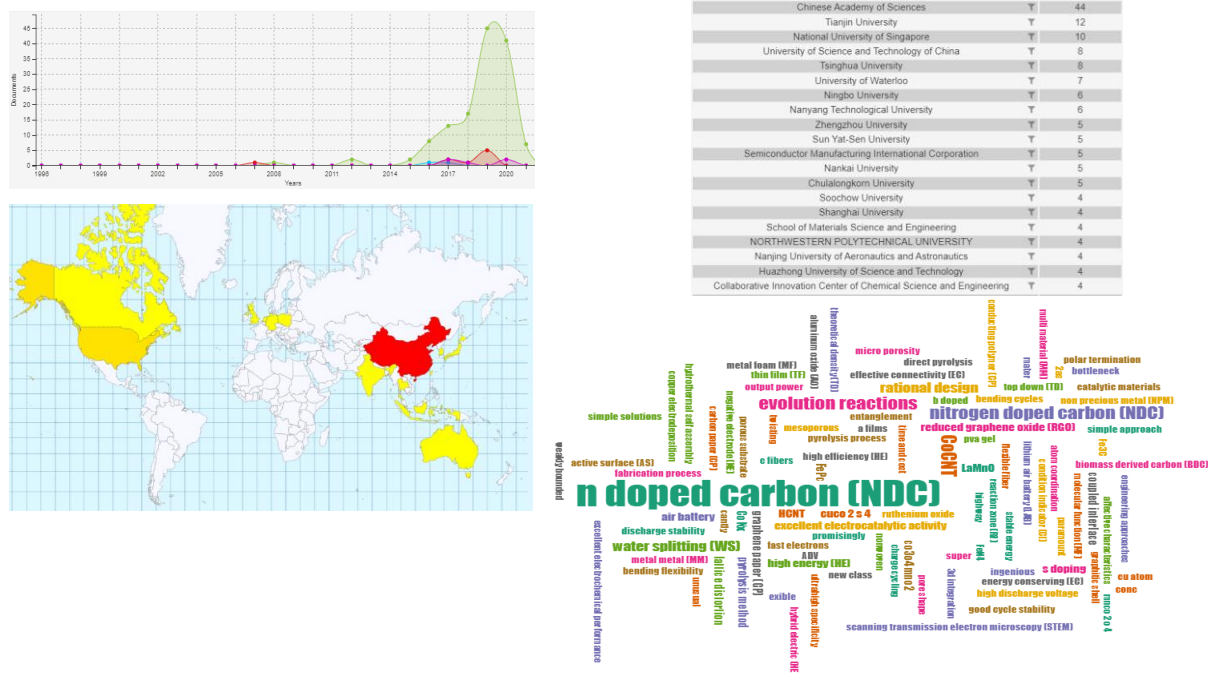
Figure 33: Visualisations for chiral perovskites



Flexible Zinc-air batteries

have seen a remarkable increase in research papers over the two last years, justifying to be in the list of weak signals. Due to its high safety, energy density, and relatively low cost of production, this type of battery is a promising candidate for the next generation of batteries that will fuel the internet of things and the myriad of flexible electronic devices that will invade our daily life.

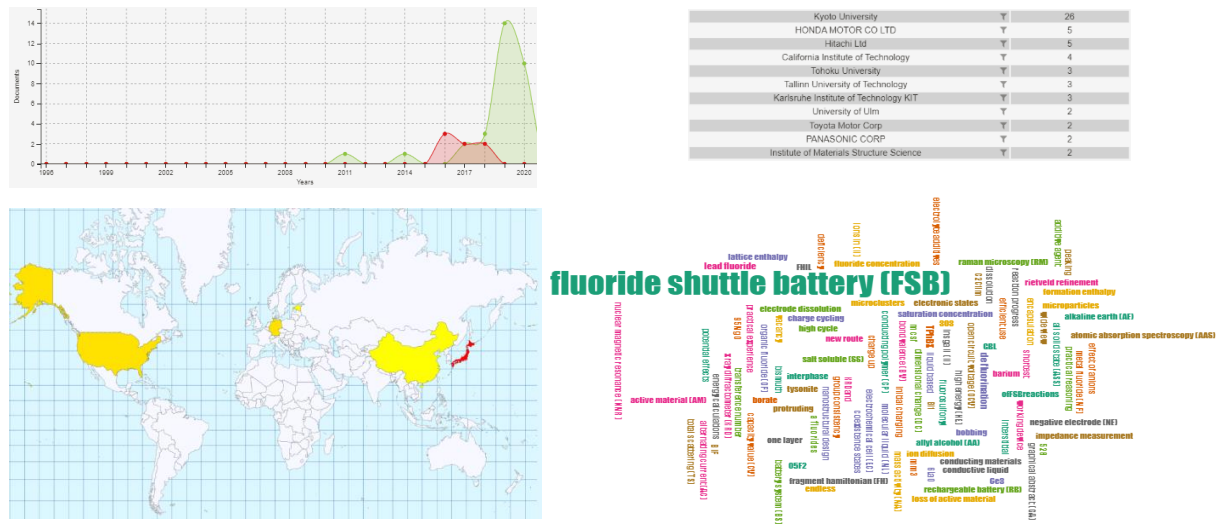
Figure 34: Visualisations for flexible Zinc-air batteries



Fluoride shuttle batteries

can theoretically provide high energy densities and are considered as potential candidate to replace traditional Li-ion batteries. R&D efforts are needed to improve their current performance.

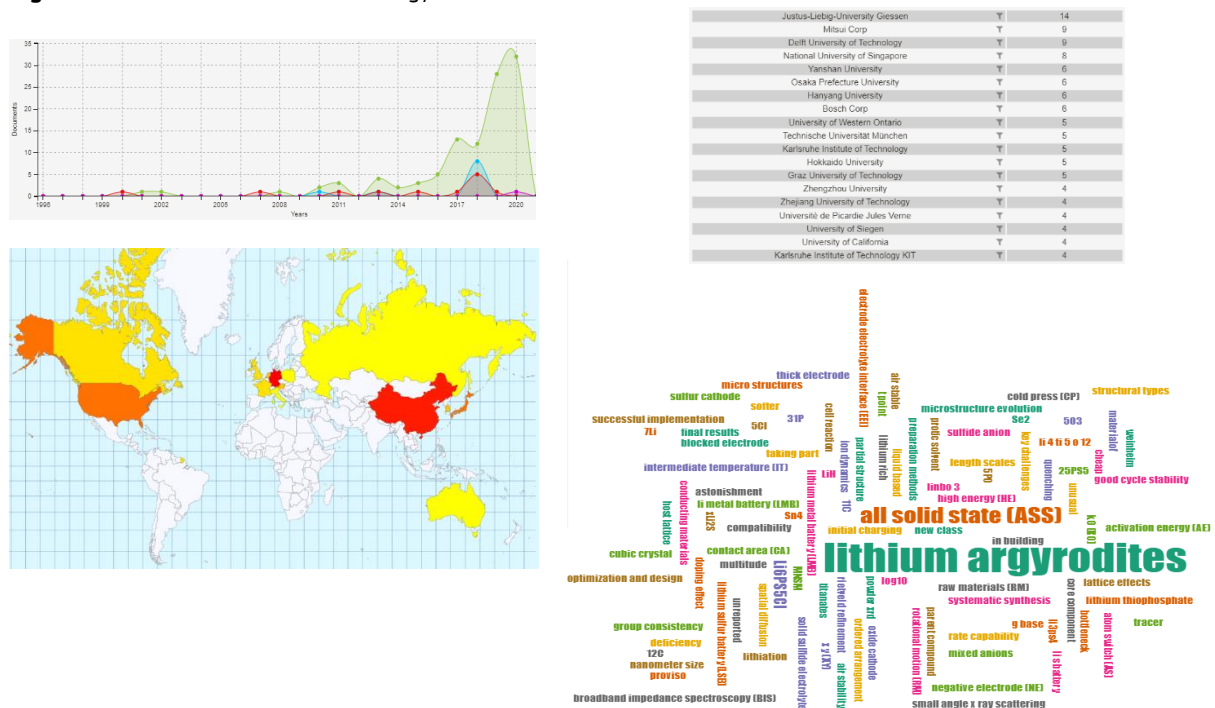
Figure 35: Visualisations for blockchain-related weak signals



Lithium argyrodites

are materials that are being considered as electrolytes for all-solid-state batteries. This type of battery works in the same way as the traditional Li-ion batteries but are safer, have a longer duration and a higher energy density.

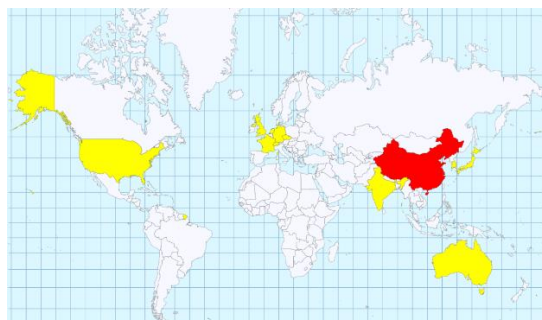
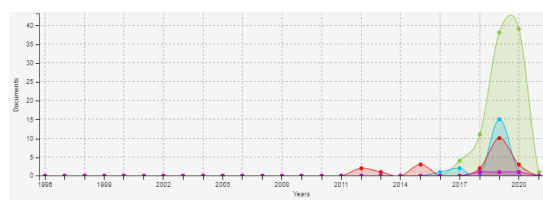
Figure 36: Visualisations for Lithium argyrodites



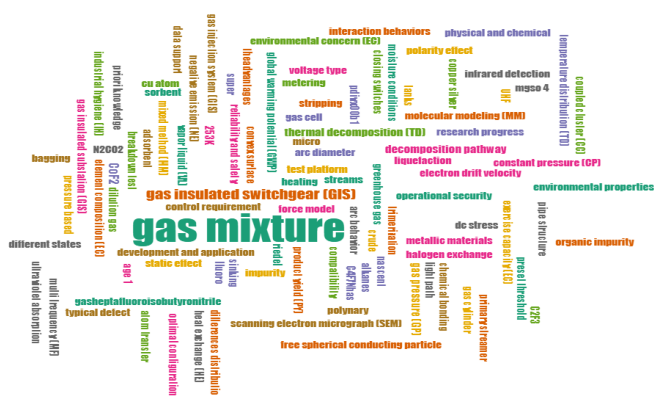
Hepta/perfluoroisobutyronitrile

Heptafluoroisobutyronitrile and perfluoroisobutyronitrile gases are promising candidates to replace the greenhouse gas SF₆ that is widely used in electrical insulators and suppressant devices for electric arcs.

Figure 37: Visualisations for Hepta/perfluoroisobutyronitrile



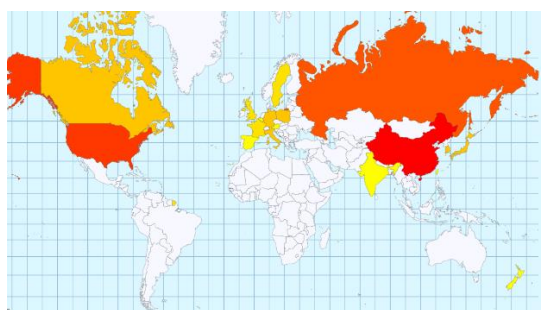
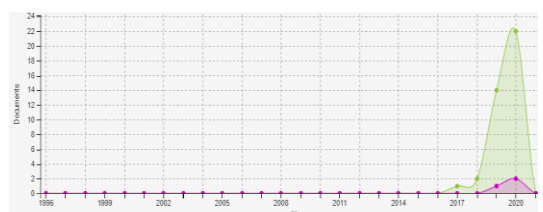
Wuhan University	Y	49
XIAN JIAOTONG UNIVERSITY	Y	32
ANHUI ELECTRIC POWER RESEARCH INSTITUTE	Y	17
CHINA ELECTRIC POWER RESEARCH INSTITUTE	Y	16
Electric Power Research Institute	Y	8
PINGGAO GROUP CO., LTD.	Y	6
North China Electric Power University	Y	6
Hubei University of Technology	Y	6
CHINA ACADEMY OF SPACE TECHNOLOGY	Y	6
General Electric Co	Y	5
Chongqing University	Y	5
YUNNAN POWER GRID CO., LTD.	Y	4
STATE GRID CORPORATION OF CHINA	Y	4
ETH Zurich	Y	4
XIAN UNIVERSITY OF TECHNOLOGY	Y	3
State Grid Zhejiang Electric Power Research Institute	Y	3
STATE GRID	Y	3
Shenyang University of Technology	Y	3
Shanghai Jiao Tong University	Y	3
CSIRO Manufacturing	Y	3



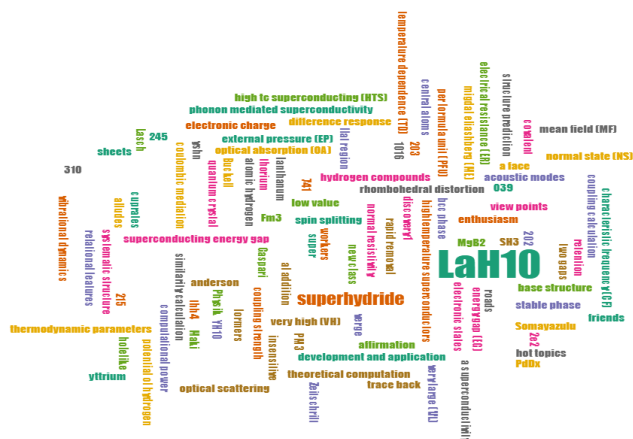
Lanthanum decahydride

is one of two materials (with H₃S) that has recently provided the first glimpse to room temperature superconductivity, the holy grail of condensed matter physics.

Figure 38: Visualisations for Lanthanum decahydride



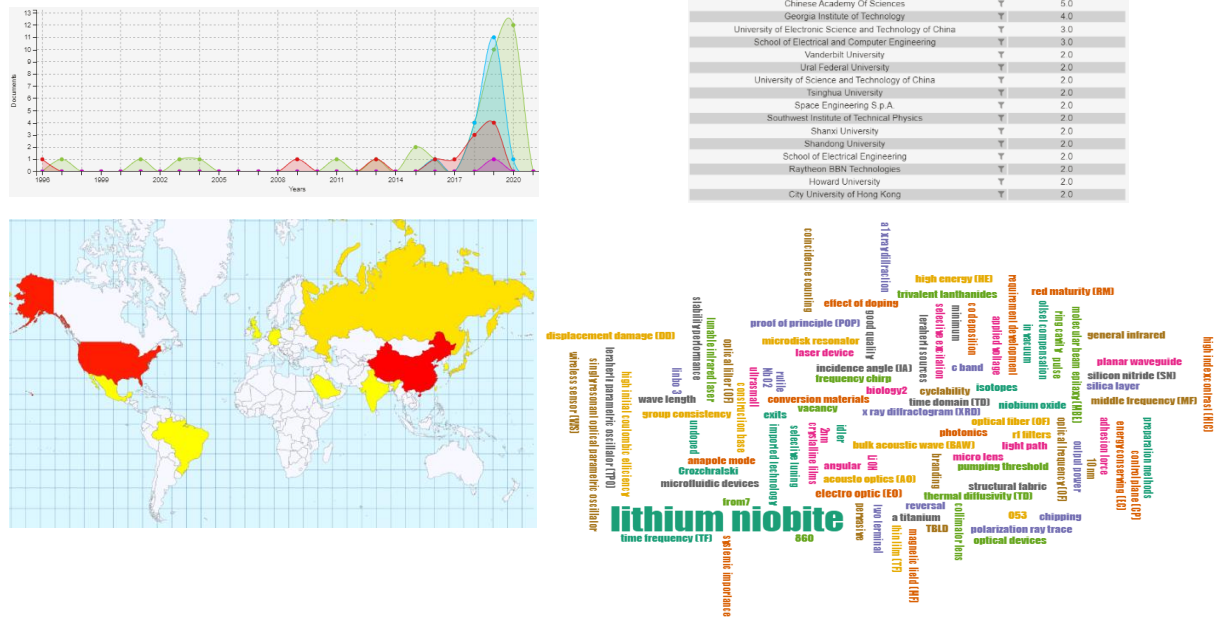
Russian Academy of Sciences	Y	7.0
Sikovo Innovation Center	Y	5.0
NORTHWESTERN POLYTECHNICAL UNIVERSITY	Y	5.0
Jilin University	Y	5.0
Chinese Academy of Sciences	Y	5.0
Ural Federal University	Y	4.0
Ningbo University	Y	4.0
Jiangsu Normal University	Y	4.0
Hangzhou University	Y	4.0
Carnegie Institution of Washington	Y	4.0
University of Chicago	Y	3.0
Moscow Institute of Physics and Technology	Y	3.0
George Washington University	Y	3.0
Czechoslovakia University of Technology	Y	3.0
Uppsala University	Y	3.0
University of Tokyo	Y	2.0
University of Saskatchewan	Y	2.0
University of Guelph	Y	2.0
University of Cambridge	Y	2.0
Tohoku University	Y	2.0



Lithium niobite

is a material with interesting electro-optic, acousto-optic, elasto-optic, piezoelectric and nonlinear characteristics. It holds great promises in numerous potential applications e.g. batteries, memristors, neuromorphic circuitry or optoelectronics.

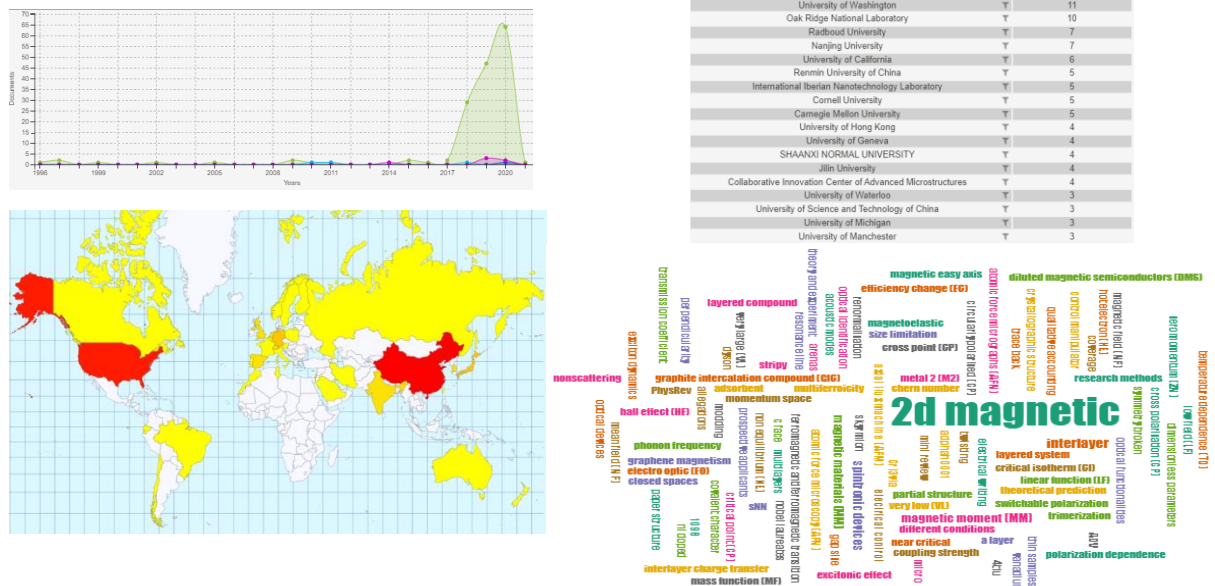
Figure 39: Visualisations for lithium niobite



Magnetic chromium trihalide

is a novel two-dimensional material with unique magnetic properties with potential applications in electronics and spintronics.

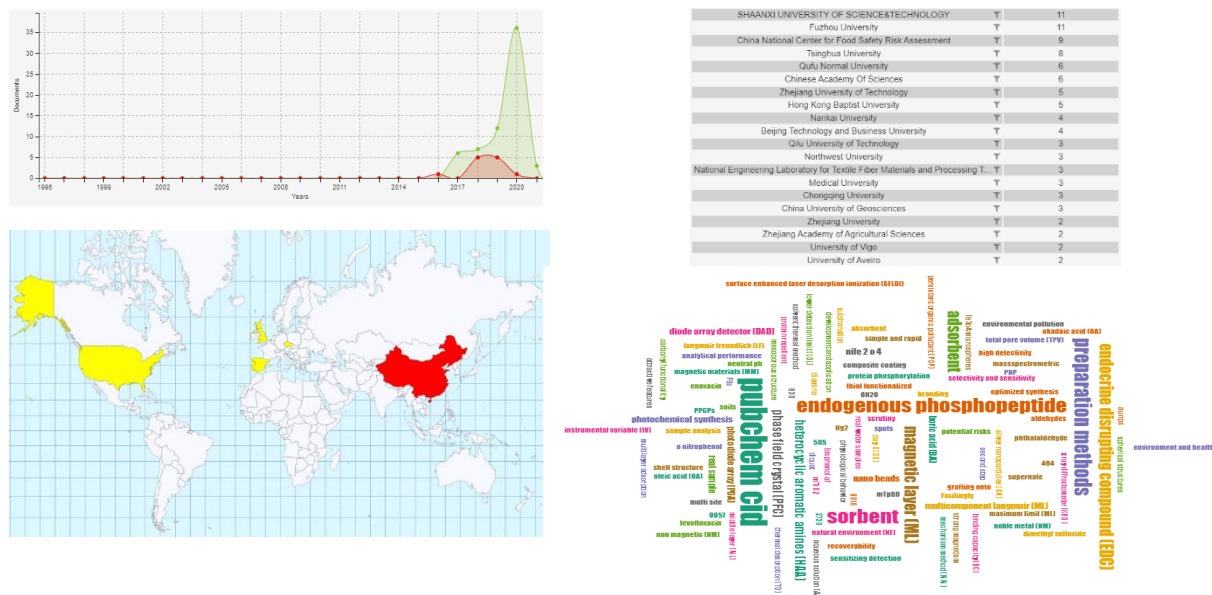
Figure 40: Visualisations for magnetic chromium trihalide



Magnetic covalent organic frameworks

are investigated recently for their use in the remediation of wastewaters. They have a high adsorbing capacity for environmental pollutants like perfluorinated compounds, endocrine disruptors, insecticides or even mercury.

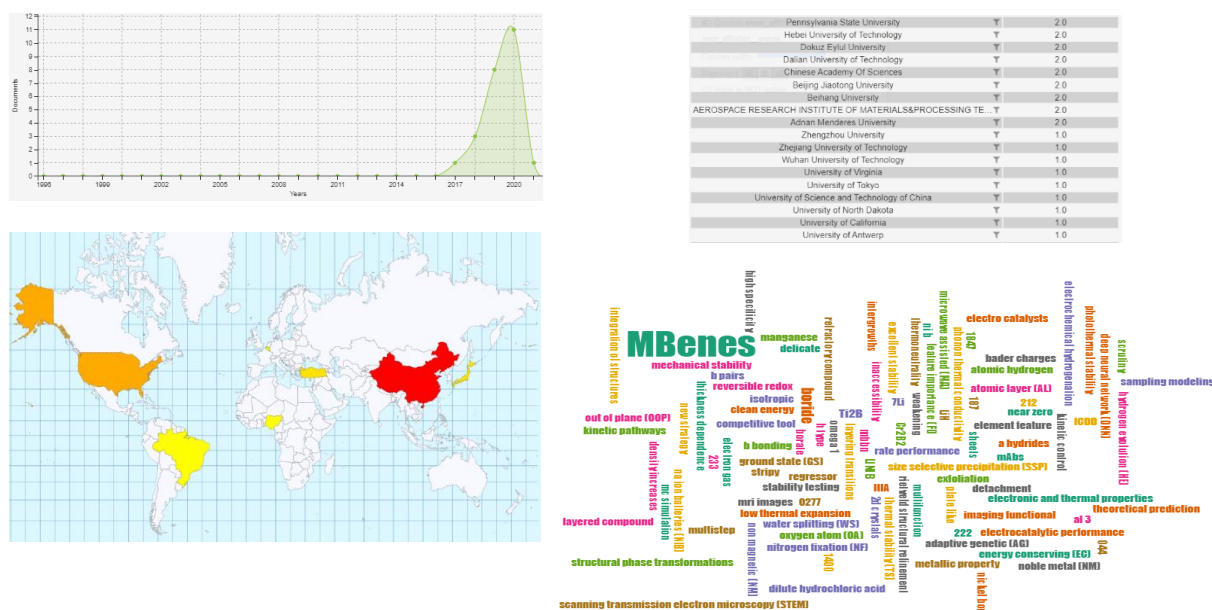
Figure 41: Visualisations for magnetic covalent organic frameworks



Mbenes

are an emerging class of two-dimensional transition metal borides. They are promising materials for applications in electronics and catalysis, or as 2D ferromagnets or as material for energy conversion/energy storage.

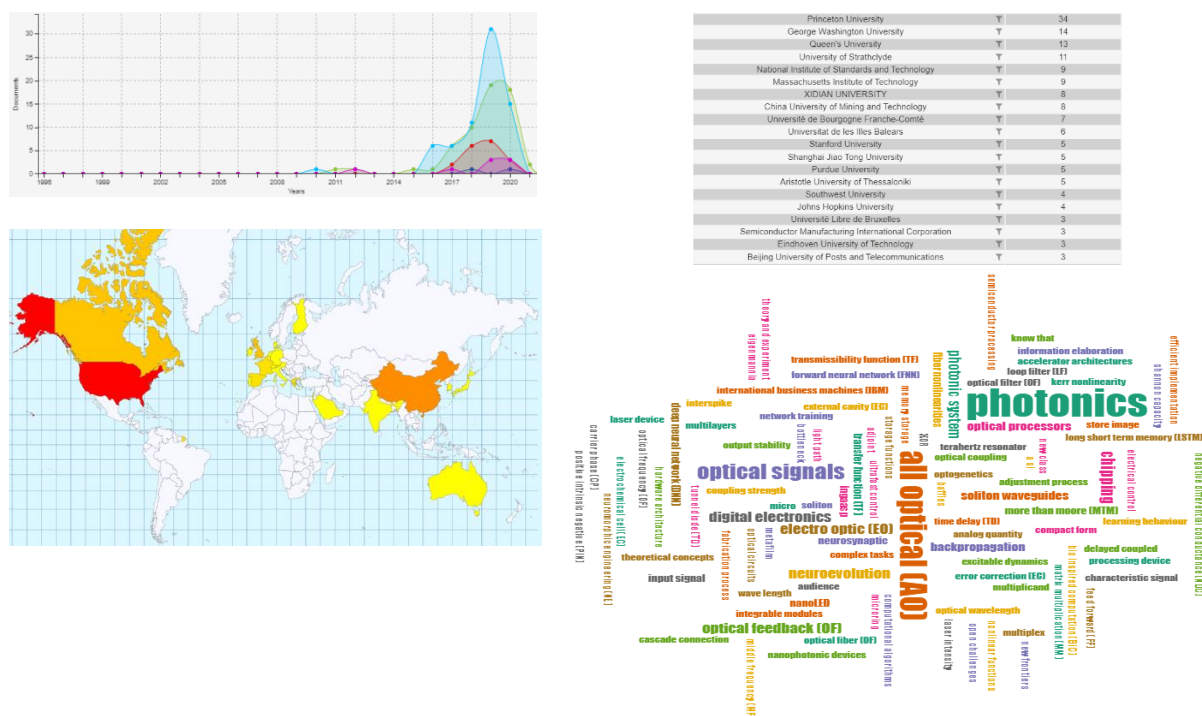
Figure 42: Visualisations for Mbenes



Neuromorphic photonics

Photonic neural networks are physical/hardware networks (as opposed to algorithmic neural networks) inspired by the structure of the human brain. They are under investigation for their potential advantages (speed, energy consumption) in computational tasks (e.g. image recognition, speech processing, machine learning).

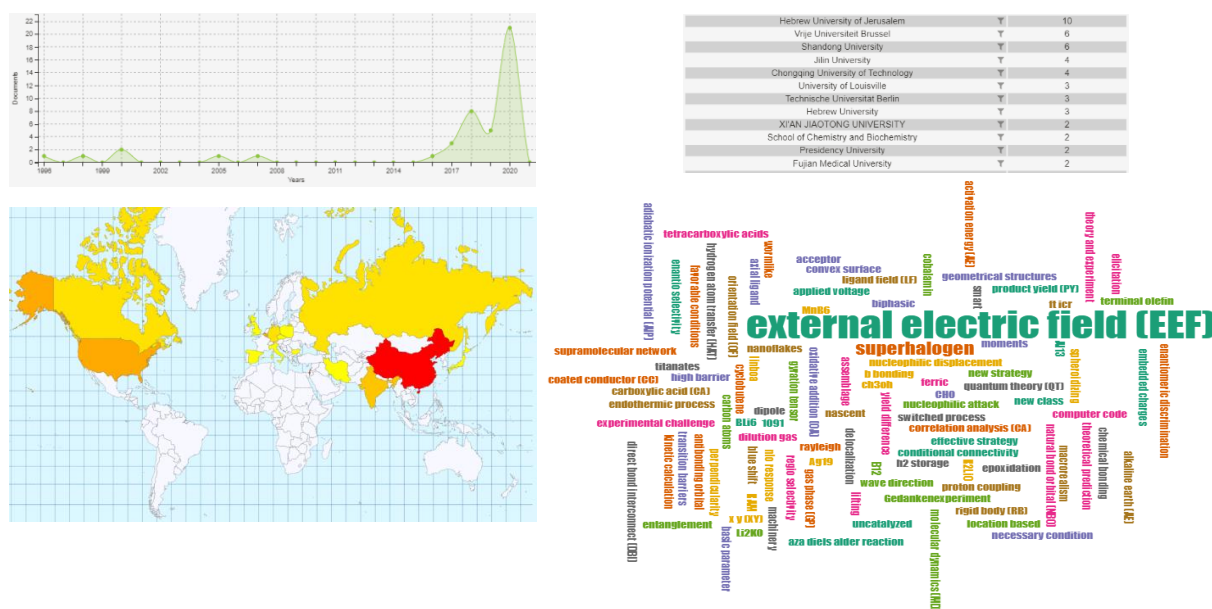
Figure 43: Visualisations for neuromorphic photonics



Oriented external electric fields

have been shown to provide unprecedented control over chemical reactions, catalysis and kinetics of reactions, as well as selectivity, allowing to synthesize improved materials for a wide variety of applications.

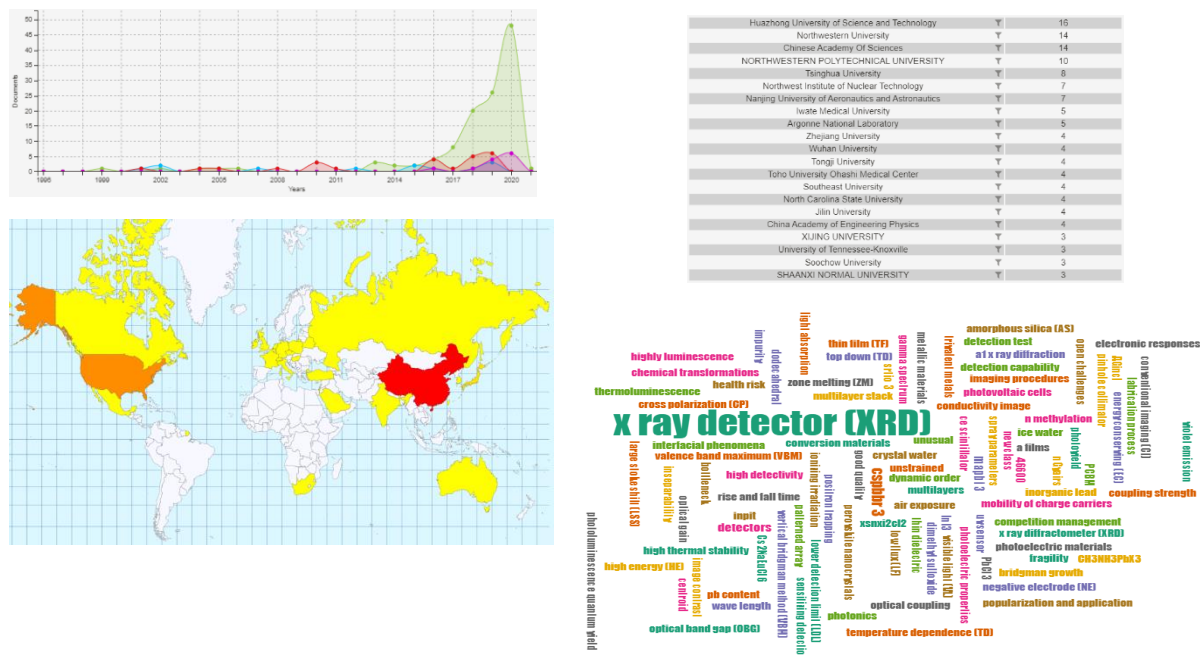
Figure 44: Visualisations for oriented external electric field



Perovskite X-ray

is yet another promising application of perovskite materials. Halide perovskites, in particular, have been reported recently as promising materials to detect X-rays, owing to their strong X-ray stopping capacity, high sensitivity, and low cost manufacturing.

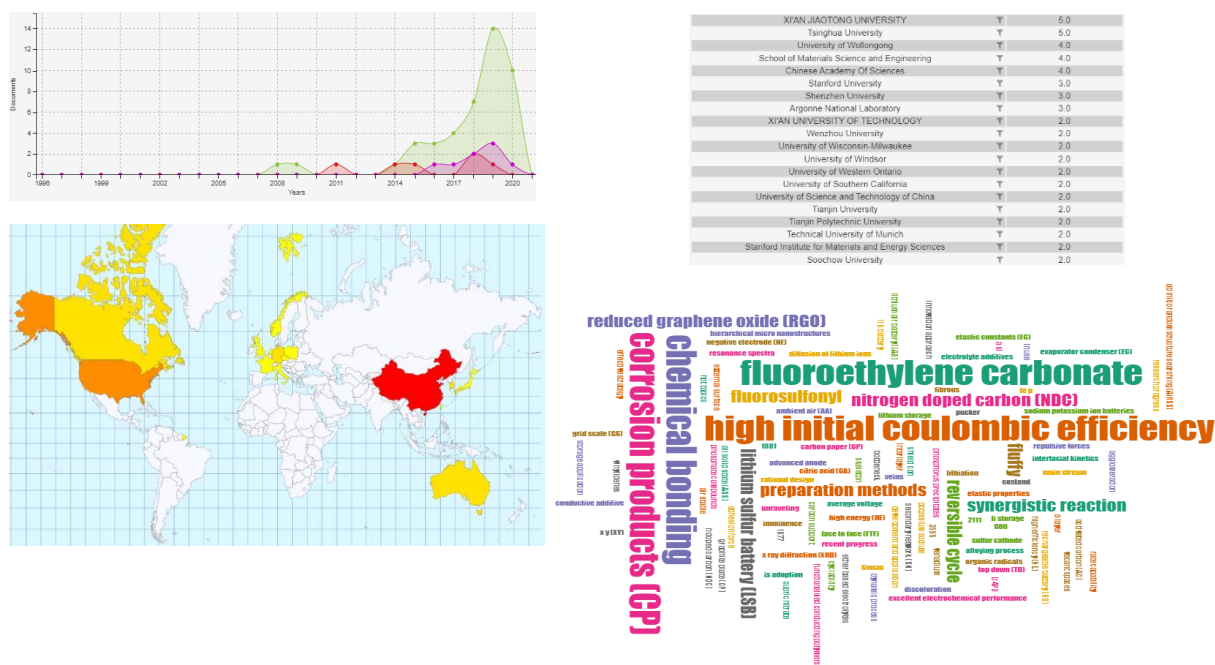
Figure 45: Visualisations for perovskite X-ray



Phosphorus anodes

show great potential as negative electrodes for alkaline metal ion batteries due to their characteristics, natural abundance, and environmental friendliness. Alkaline metal ion batteries (e.g. lithium ion batteries) are increasingly used in many applications in consumer electronics or for electric vehicles and energy storage because of their high energy and power density and their long life cycle.

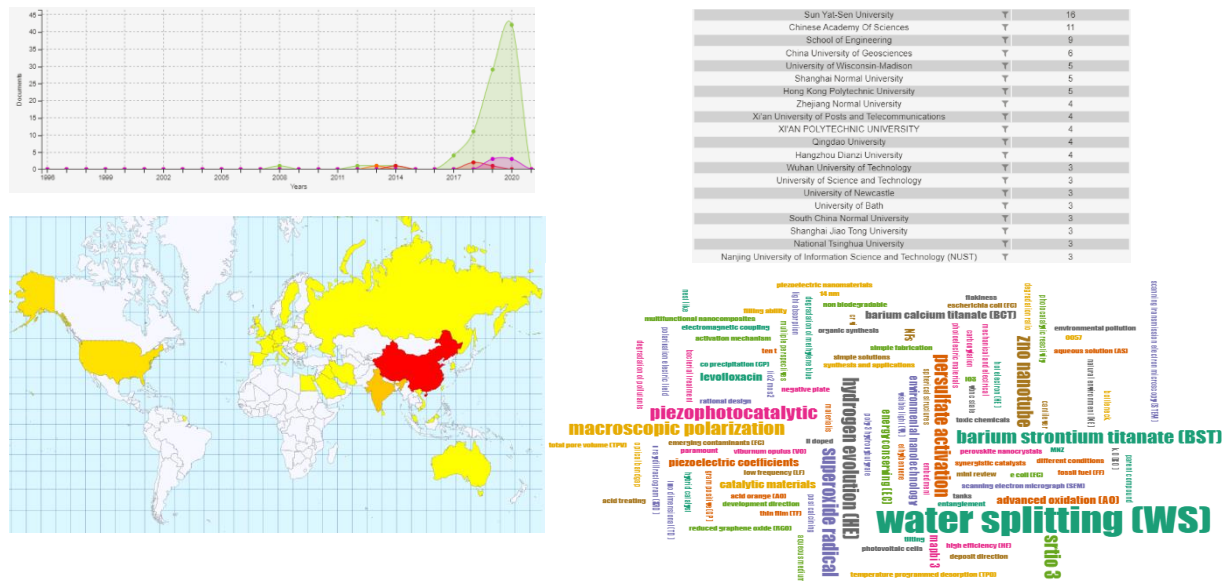
Figure 46: Visualisations for lithium niobite



Piezocatalysis

consists in converting mechanical vibration into energy that can be used to catalyse chemical reactions. It has recently emerged as a promising technique for example in water-splitting (production of H₂) or for disinfection applications.

Figure 47: Visualisations for piezocatalysis

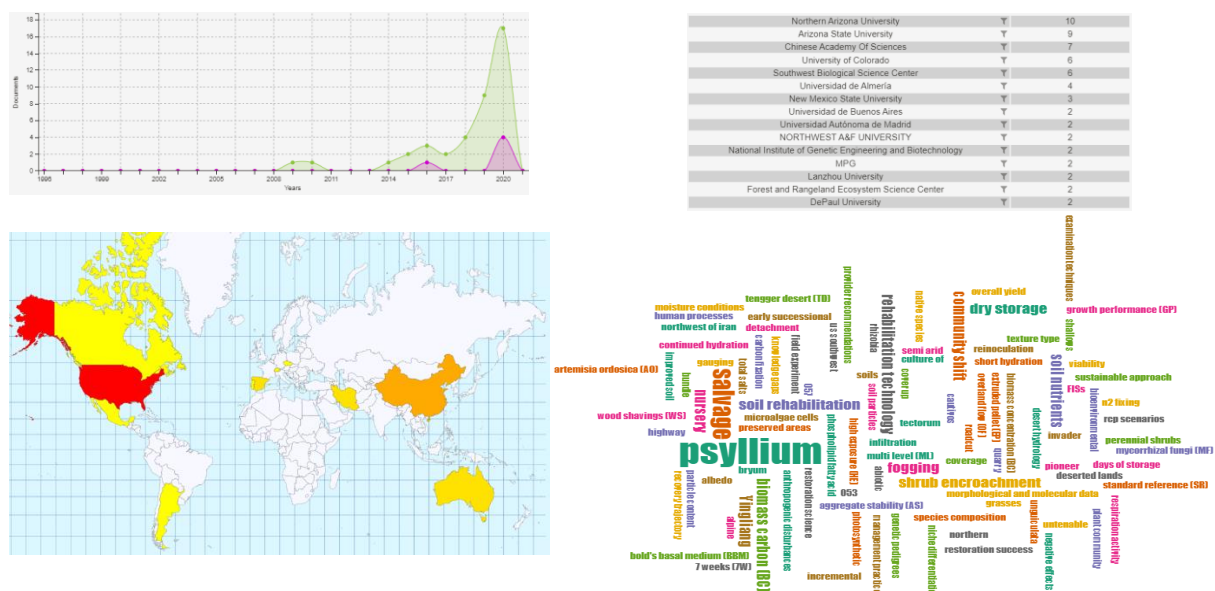


2.4 Environment

Biocrust restoration

Biocrusts are multifunctional communities of cyanobacteria, algae, lichens and other organisms that are increasingly being used to restore degraded or damaged ecosystems. In particular, they are used to restore drylands ecosystems (40% of earth surface) that are facing increasing degradation due to human activity.

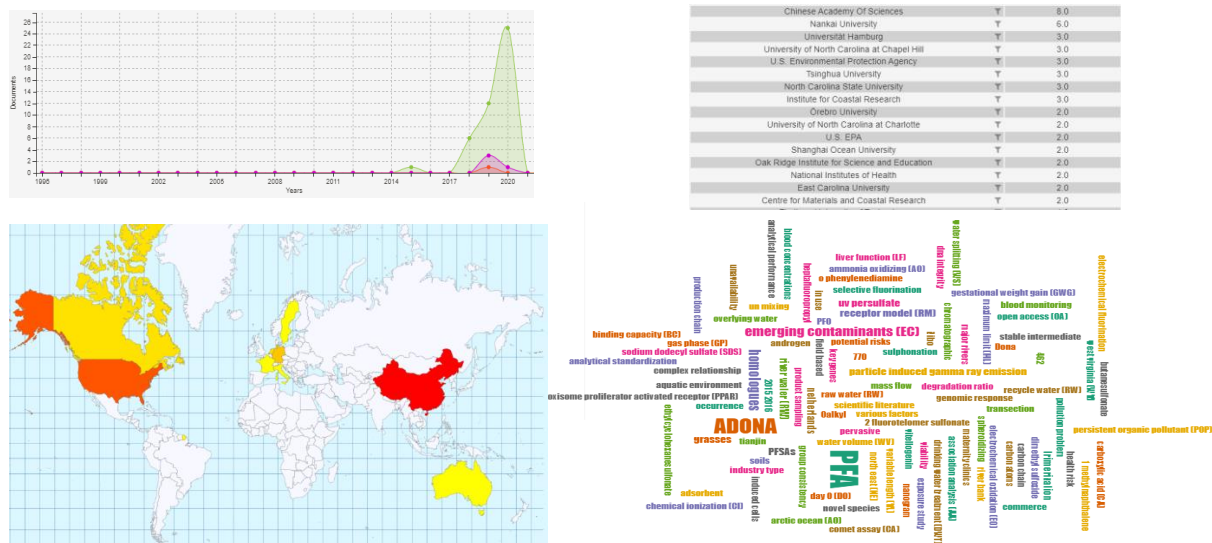
Figure 48: Visualisations for biocrust restoration



Hexafluoropropylene oxide dimer acid

Perfluoroalkyl and polyfluoroalkyl substances are emerging persistent organic pollutants. Widely used, their persistence in the environment, their bioaccumulation and toxicity calls for their replacement by new compounds.

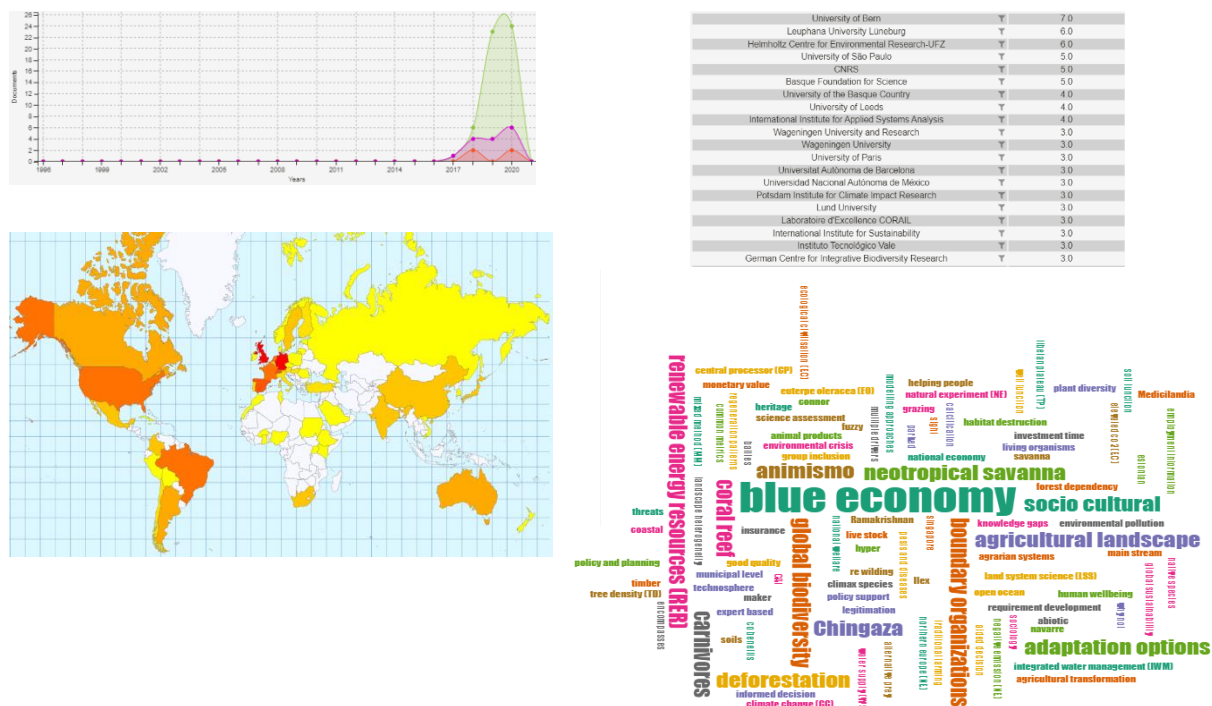
Figure 49: Visualisations for Hexafluoropropylene oxides contamination



Nature's Contribution to People

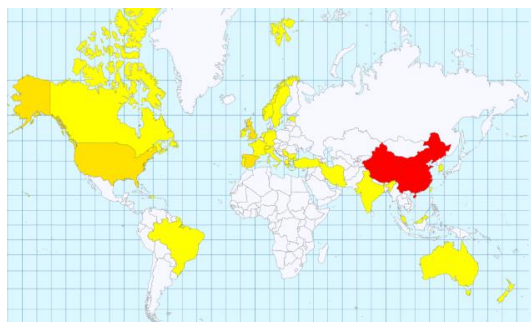
is a new trend in policy making that aims at including the valuation of nature's contribution to people and society when designing new policies.

Figure 50: Visualisations for Natures's contribution to people

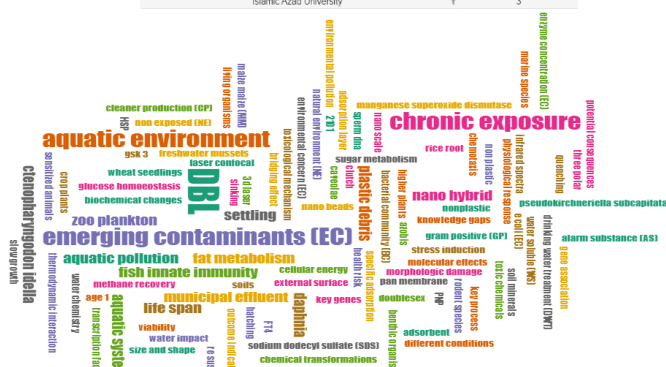


It is not surprising to find a signal related to nanoplastics among the list of weak signals. There is no doubt that micro- and nanoplastics are accumulating in the environment and research has been performed recently on their detection/identification in the environment and toxicity mechanisms.

Figure 1 is a line graph showing the number of documents published per year from 1999 to 2020. The x-axis represents the year, and the y-axis represents the number of documents, ranging from 0 to 70. The graph shows a sharp increase in publications starting around 2015, peaking at approximately 70 documents in 2020, and then declining to about 10 documents in 2021. A green shaded area represents the confidence interval around the data points.

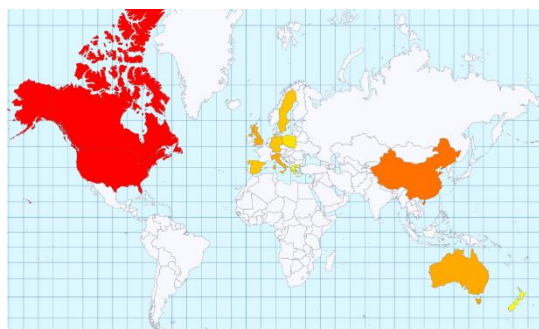
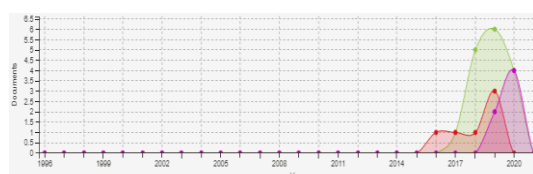


Southeast University	Y	28
Jinan University	Y	11
East China Normal University	Y	8
TENCENT TECHNOLOGY CO., LTD.	Y	6
University of Geneva	Y	5
University of Aveiro	Y	5
Shandong University	Y	5
Nanjing University	Y	5
Nankai University	Y	4
Nanyang Agricultural University	Y	4
Chinese Academy Of Sciences	Y	4
University of Tennessee	Y	3
University of Siena	Y	3
University of Murcia	Y	3
Universitat Autònoma de Barcelona	Y	3
Universidad de Cádiz	Y	3
South China Agricultural University	Y	3
Shahid Beheshti University of Medical Sciences	Y	3
National Research Council	Y	3

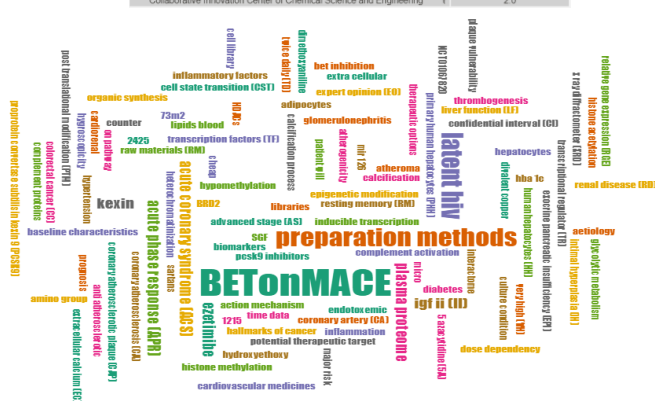


Apabetalone

Figure 52: Visualisations for Apabetalone



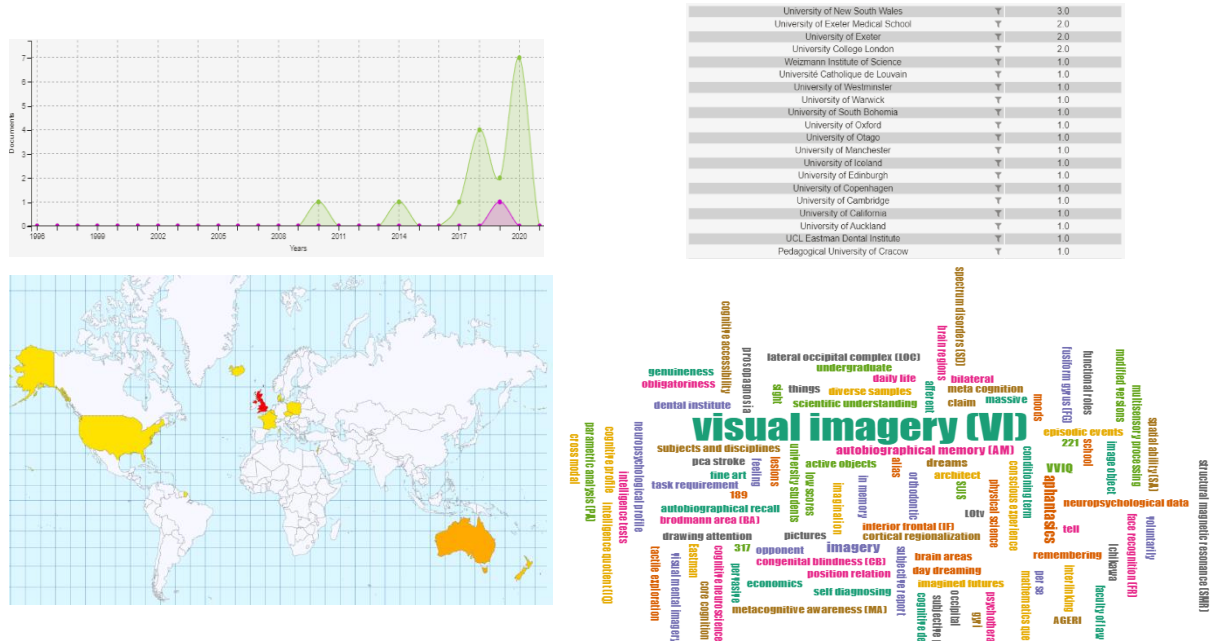
University of California	Y	5.0
University of Colorado School of Medicine	Y	4.0
Veterans Affairs Medical Center	Y	3.0
University of Calgary	Y	3.0
UCLA Fielding School of Public Health	Y	3.0
Karolinska University Hospital	Y	3.0
Imperial College London	Y	3.0
Veterans Affairs Salt Lake City Healthcare System	Y	2.0
University of California Irvine Medical Center	Y	2.0
University of Adelaide	Y	2.0
University Hospital	Y	2.0
Polish Mother's Memorial Hospital Research Institute	Y	2.0
Monash University	Y	2.0
Johns Hopkins University School of Medicine	Y	2.0
IRCCS SDN	Y	2.0
Columbia University	Y	2.0



Aphantasia

a spectrum disorder characterized by a total lack of ability to generate visual forms of mental imagery, and in some cases any form of sensory representation. It is now estimated that 2–3% of the population may have this disorder. Study of aphantasia may lead to a better understanding of mental imagery in other cognitive processes.

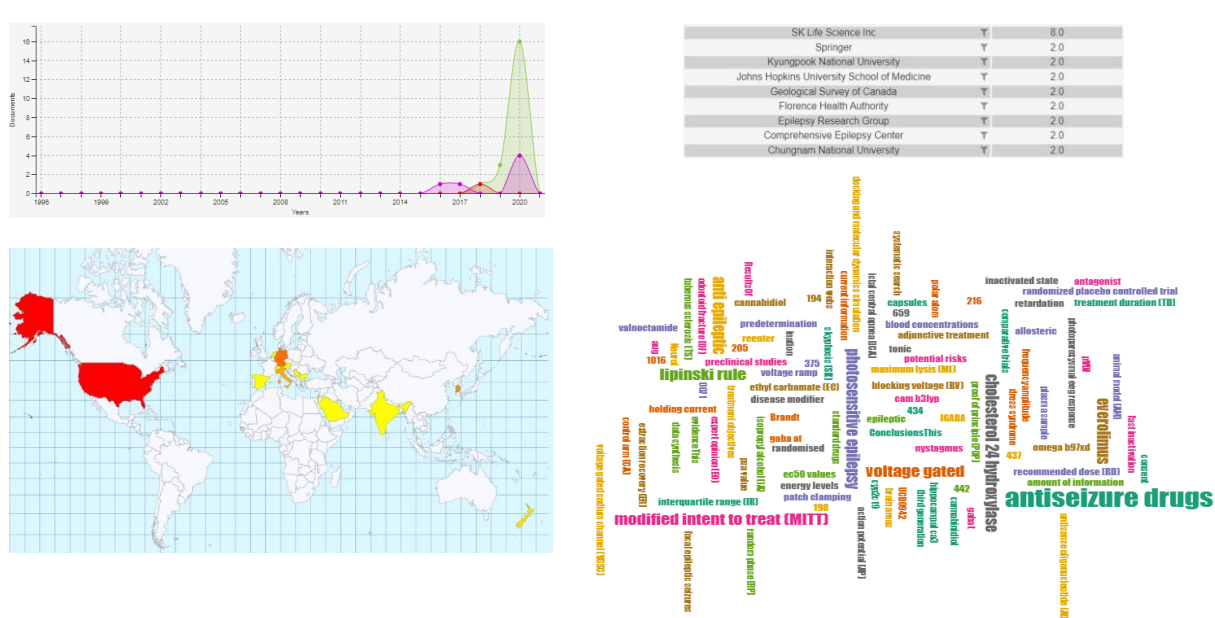
Figure 53: Visualisations for aphantasia



Cenobamate antiepileptic

Cenobamate is a new antiseizure drug that has showed high efficacy in clinical trials, promising new perspective for the treatment of drug-resistant epilepsies.

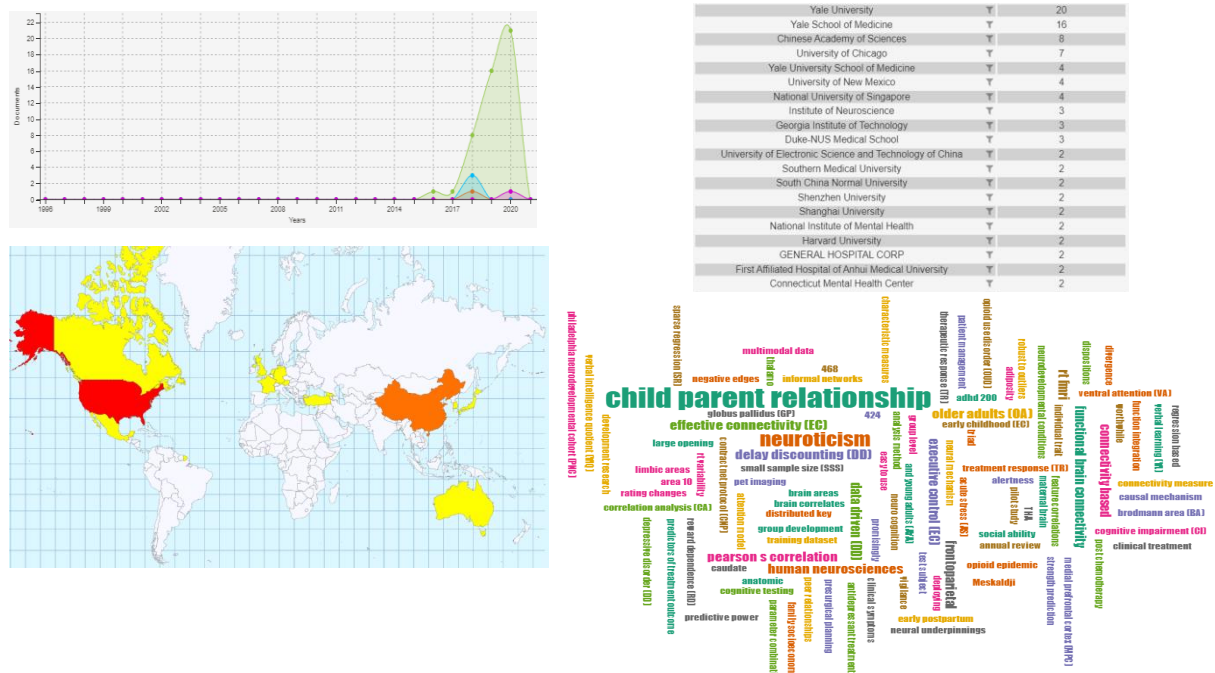
Figure 54: Visualisations for Cenobamate antiepileptic



Connectome-based Predictive Modelling

was recently developed to predict individual differences in traits and behaviours of people on the basis of their unique functional brain connectivity, measured with functional magnetic resonance imaging.

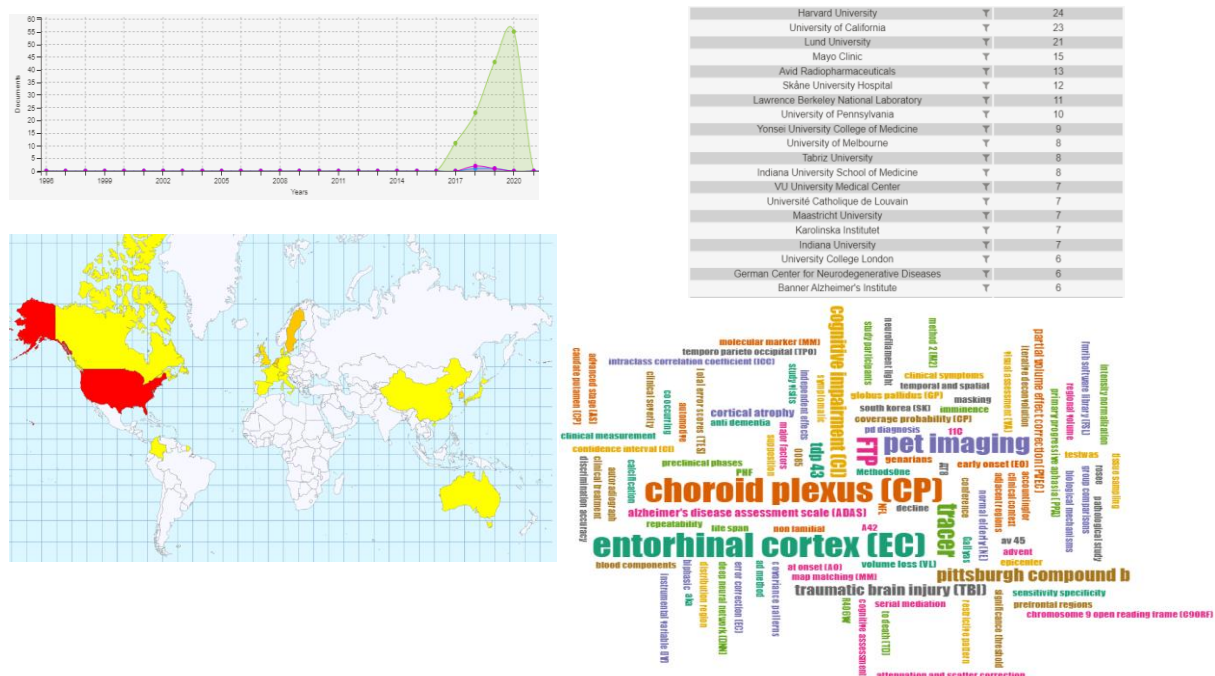
Figure 55: Visualisations for connectome-based predictive modelling



Flortaucipir

is a tracer used in targeted positron emission tomography that makes it possible to investigate the development of tau and amyloid- β in and the related development of cognitive impairment due to Alzheimer's disease.

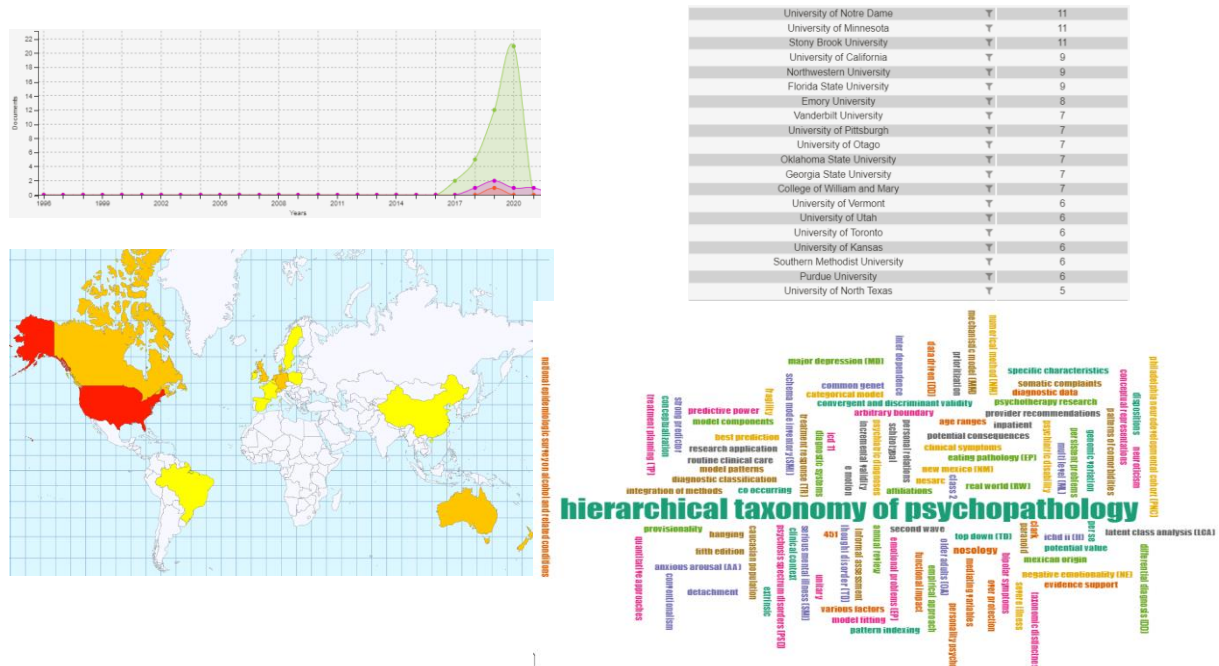
Figure 56: Visualisations for Flortaucipir



Hierarchical taxonomy of psychopathology

is a new classification of mental illness resulting from research efforts by a consortium of 70 investigators. It aims at addressing several shortcomings of traditional taxonomies and provide a better framework of reference for both clinical and research activities.

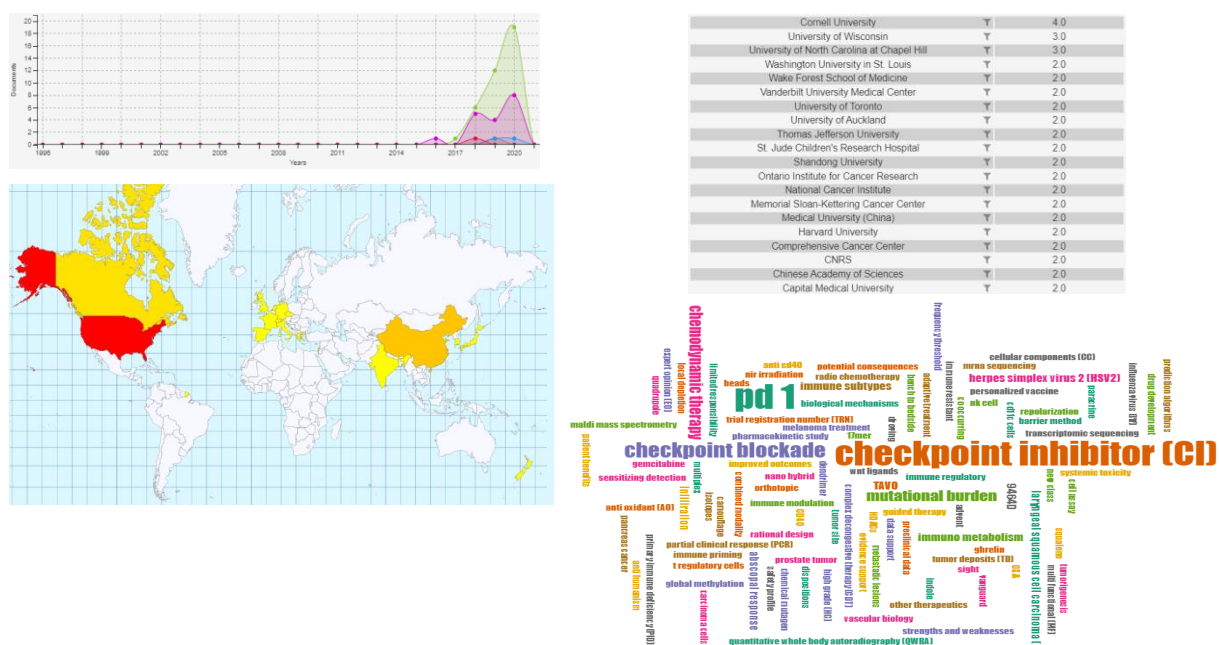
Figure 57: Visualisations for hierarchical taxonomy of psychopathology



Immunotherapy for cold tumors

Cold tumors are cancer tumors that exhibit very low to no immunological response to immunotherapy. A key challenge for treating certain type of cancers is to transform these cold tumors into “hot” ones that will respond to immunotherapy.

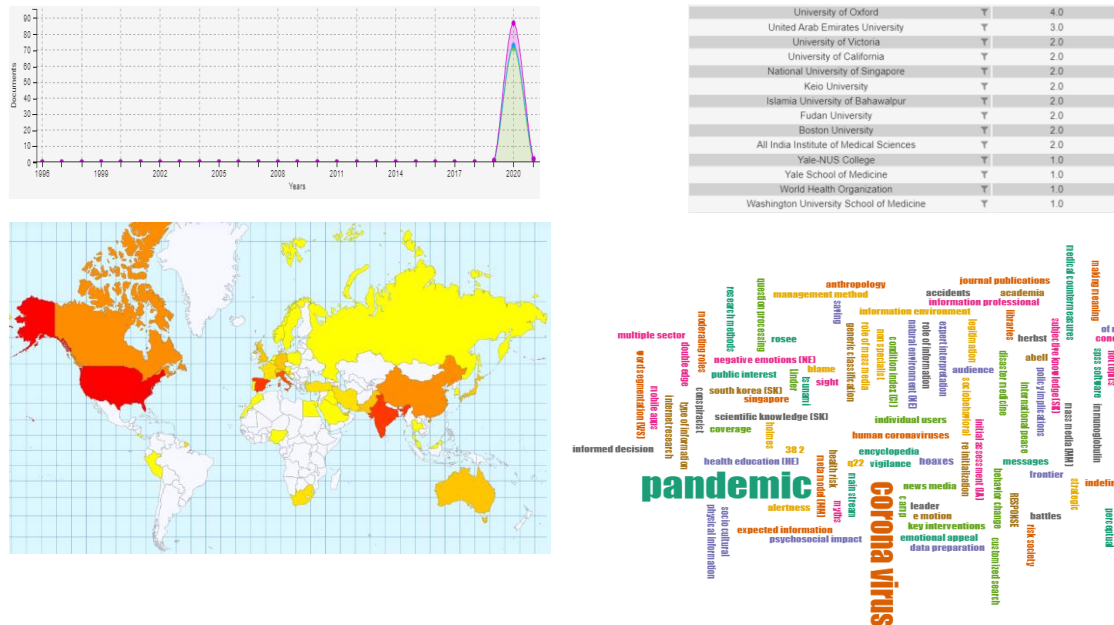
Figure 58: Visualisations for immunotherapy for cold tumors



Infodemic

With the dissemination of fake news, hoaxes, misleading content or conspiracy theories, it is safe to say that the COVID-19 pandemic was also a disinformation pandemic. This unprecedented infodemic is triggering research in various fields e.g. machine learning, educational sciences or public health policy.

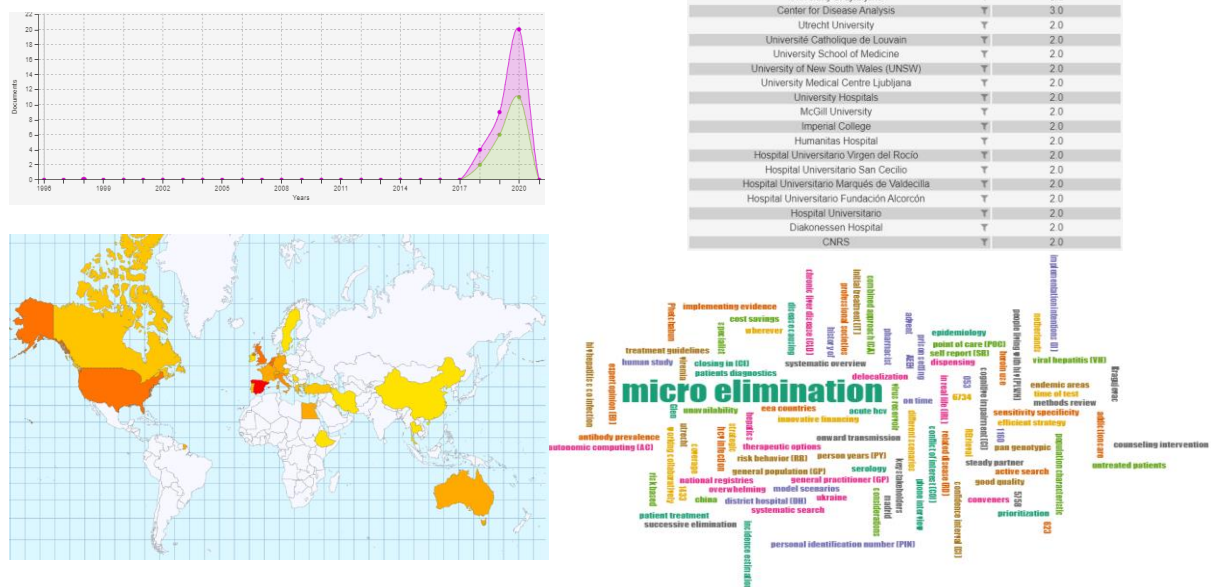
Figure 59: Visualisations for infodemic



Micro elimination of hepatitis C virus

This weak signal is directly related to the decision by the WHO target to eliminate hepatitis C virus by 2030. A micro-elimination approach where discrete populations are targeted seems to be promising to reach this ambitious goal.

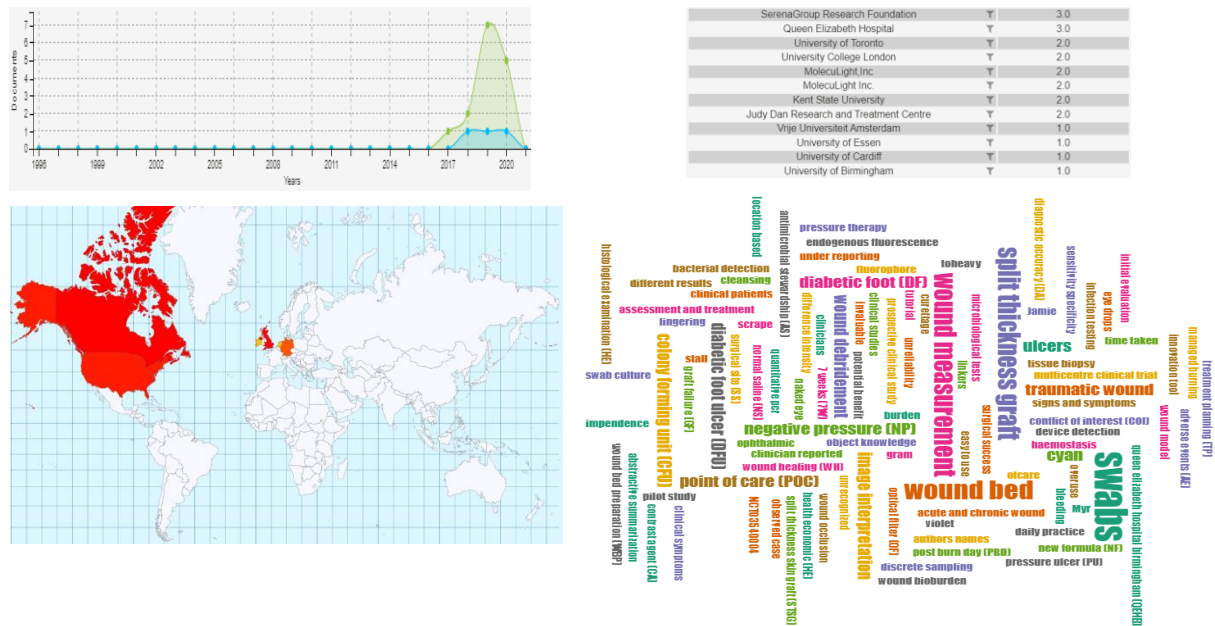
Figure 60: Visualisations for micro elimination of hepatitis C virus



Moleculight

is a weak signal related to the testing of an innovative device used to visualise the bacterial load in a wound, potentially reducing infection risks.

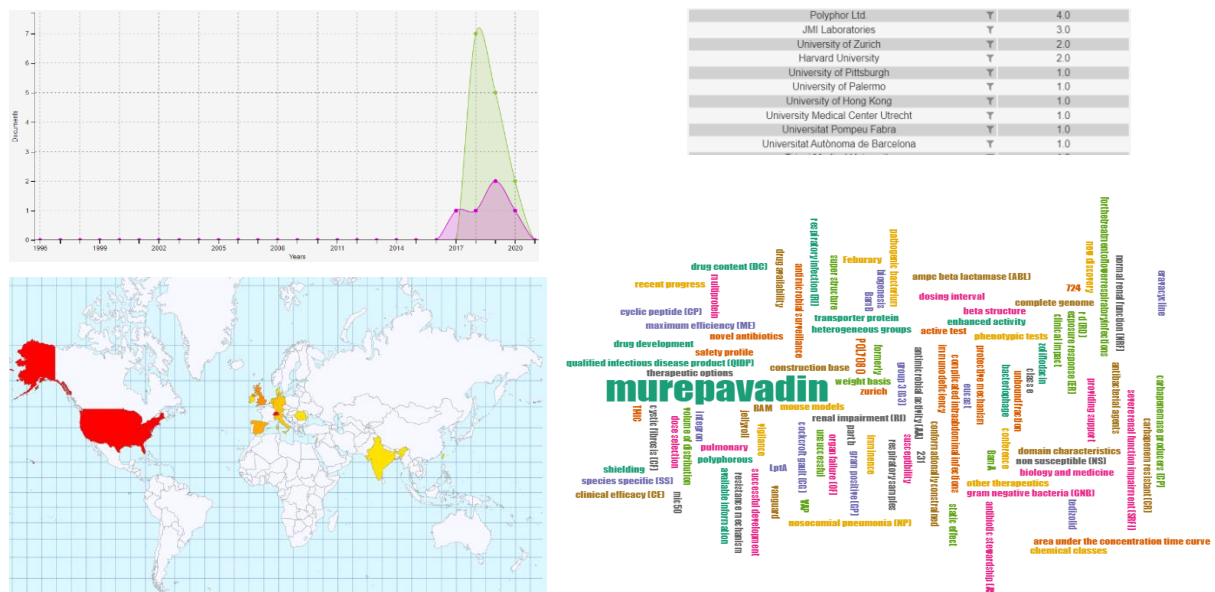
Figure 61: Visualisations for Moleculight



Murepavadin

is a novel antibiotic under development for the treatment of infectious diseases related to Gram-negative bacteria.

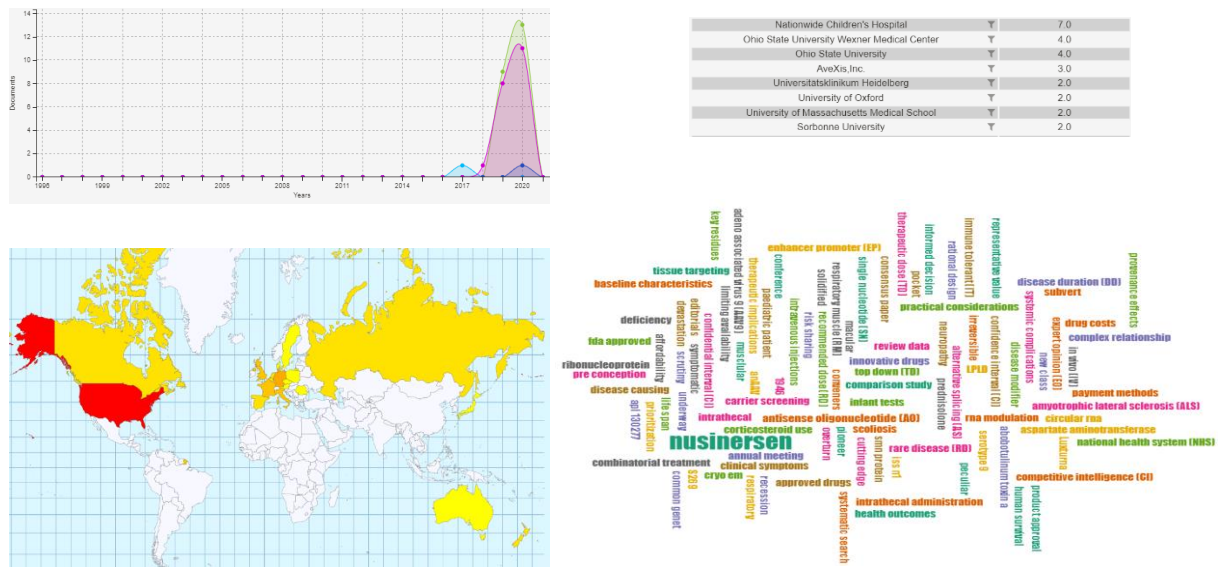
Figure 62: Visualisations for Murepavadin



Onasemnogene abeparvovec

are novel gene-based therapies to treat the orphan disease Spinal Muscular Atrophy.

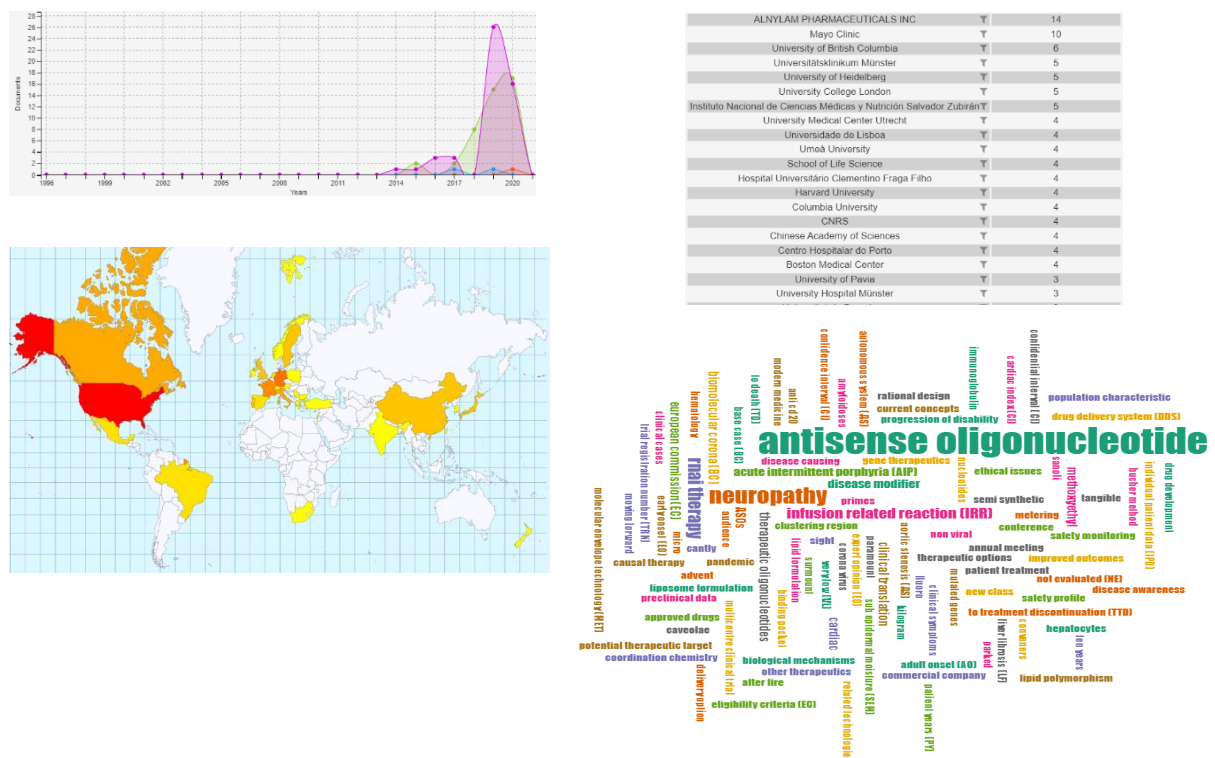
Figure 63: Visualisations for Hexafluoropropylene oxides contamination



Patisiran

is a new RNAi therapeutic for the treatment of polyneuropathy caused by the hereditary rare disease transthyretin-mediated amyloidosis.

Figure 64: Visualisations for Patirisan



Weak signals related to SARS-coV-2

A significant number of weak signals related to SARS-coV-2 was expected. 106 signals have been found, each containing at least 50% of articles directly mentioning SARS-coV-2 and all with an activeness (2019-2020) above 70%. These weak signals account together for more than 35k scientific publications and are listed here below. They were not analysed further and are not included in the online dashboard.

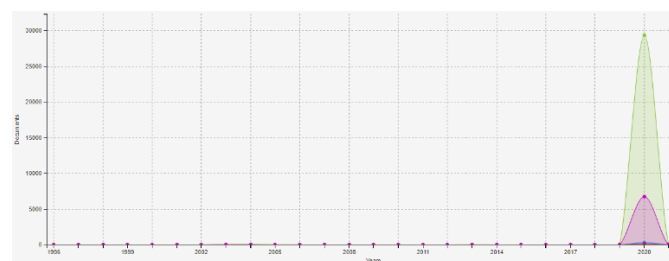
Figure 65: Visualisations for weak signals related to SARS-coV-2

2019 novel corona virus	cytokine storm syndrome (CSS)	lianhua qingwen	post covid 19
3cl hydrolase	D614G	LitCovid	post viral olfactory dysfunction
6LU7	diamond princess	lock down	protective personal equipment (PPE)
ace2 receptor	digital contact tracing	lockdown measures	proximity traces
biorxiv	EarlyR	major public health emergencies	qingfei paidu decoction (QPD)
BLINDING	emergency remote teaching (ERT)	MASKING	RaTG13
chilblain like lesions	enhanced community quarantine (ECQ)	medRxiv	remdesivir
columbia university irving medical center (CUIMC)	epidemic prevention and control	mild covid 19	Sarbecovirus
community quarantine	fangcang shelter hospital	MoHFW	SARSr
corona pandemic	fear of covid 19	movement control order (MCO)	seiar model
coronaphobia	flatten the curve	multisystem inflammatory syndrome	seird model
coronavirus 2	galidesivir	national health commission (NHC)	SIRD model
coronavirus crisis	GC376	national lockdown	self quarantine
coronavirus disease	george floyd	navirus	sentinel 5p
coronavirus epidemics	GISAID	neurocovid	SEORL
coronavirus outbreak	gs 441524	non covid	severe covid 19
coronavirus pandemic	gs 5734	non placement work integrated learning	SFJDC
coronavirus pneumonia	Guanggu	openwho	social lockdown
coronavirus sars cov 2	home quarantine	ORF1ab	state of alarm
CoV2	homemade mask	Orthocoronavirinae	TriNetX
covid	Huoshenshan	pandemic containment	umifenovir
covid 2019	id now	pandemic crisis	videoconferencing psychotherapy
covid19 pandemic	infection fatality rate (IFR)	pandemic times	wastewater surveillance
covid toes	infodemics	panther fusion	Worldometer
CR3022	Jinyintan	par agerfalk	wuhan coronavirus
crises sanitaires	kieran conboy	pediatric covid 19	wuhan pneumonia
cytokine release storm (CRS)	Leishenshan		

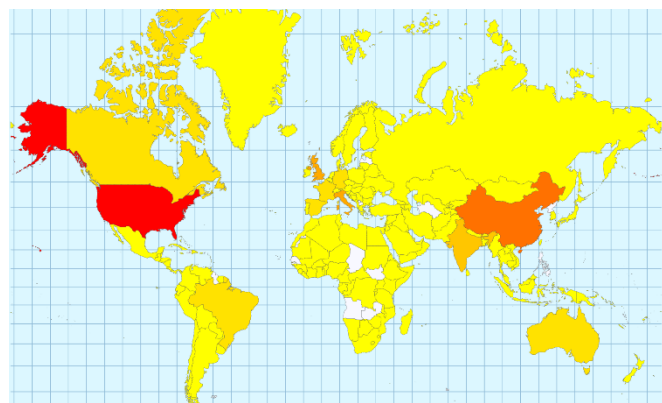
List of weak signals related to SARS-coV-2 (with at least 50% of articles mentioning covid19 and with activeness2019-2020>70%)

Huazhong University of Science and Technology	388
Harvard University	311
University of California	258
CNRS	230
University Hospital	209
University of Hong Kong	187
Chinese Academy Of Sciences	187
People's Hospital	168
University of Oxford	157
University of Toronto	149
All India Institute of Medical Sciences	149
Fudan University	140
Tehran University of Medical Sciences	136
Capital Medical University	134
Zhongnan Hospital of Wuhan University	115
Wuhan University	115
University College London	113
Cornell University	113
GENERAL HOSPITAL CORP	108
Columbia University	104
University of Washington	103
China University of Geosciences	103
University of Michigan	101
National University of Singapore	101
Imperial College London	100
Icahn School of Medicine at Mount Sinai	99
Chinese University of Hong Kong	99
University of Paris	98
Medical Center	98
Central South University	98
Sichuan University	97
University of Pennsylvania	95
Renmin Hospital of Wuhan University	95
School of Medicine	94
University of São Paulo	93
Sapienza University of Rome	92
King's College London	90
National Institutes of Health	88
University of Melbourne	84
Zhejiang University	83
University of Rome II Tor Vergata	83
University of British Columbia	83
Sun Yat-Sen University	80
Monash University	80
Mayo Clinic	79
Shahid Beheshti University of Medical Sciences	78
King Saud University	77
Iran University of Medical Sciences	63
Shiraz University of Medical Sciences	60

Top 50 organisations



Document distribution



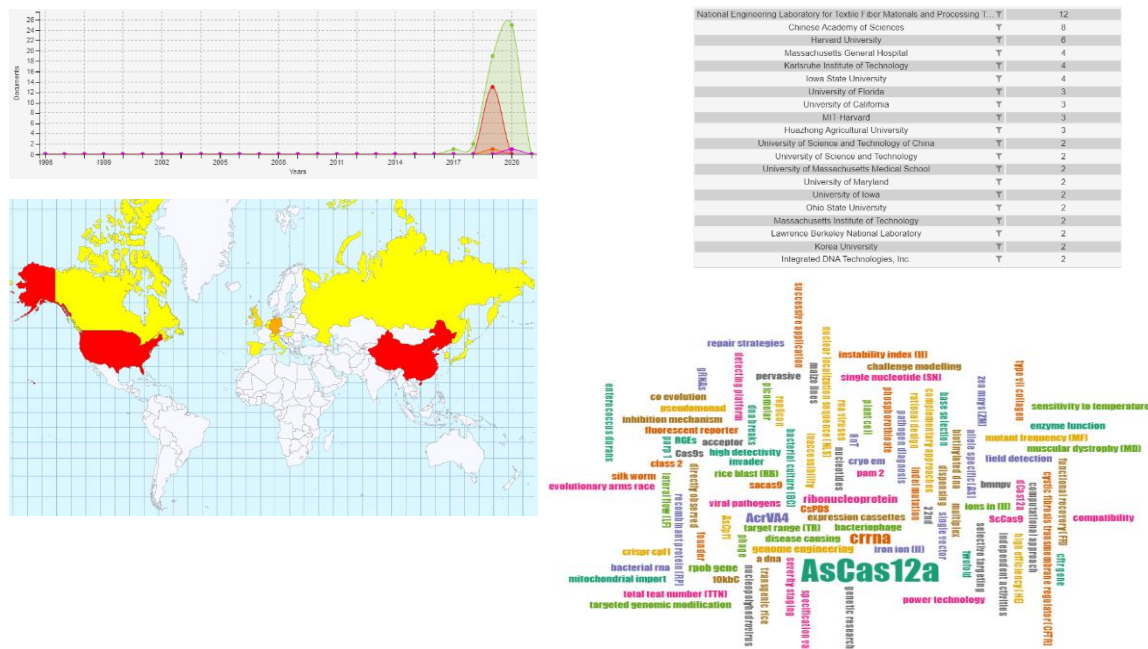
Country of origin of organisations publishing on SARS-coV-2

2.6 Biotechnologies

Cas12a orthologs

The Cas12a endonuclease (previously Cpf1) offers several advantages over Cas9, the other endonuclease used in the CRISPR-Cas technique. This makes Cas12a promising for many genome engineering applications. New Cas12a orthologs are being tested to further expand the possibilities of the Cas12a genome editing toolbox.

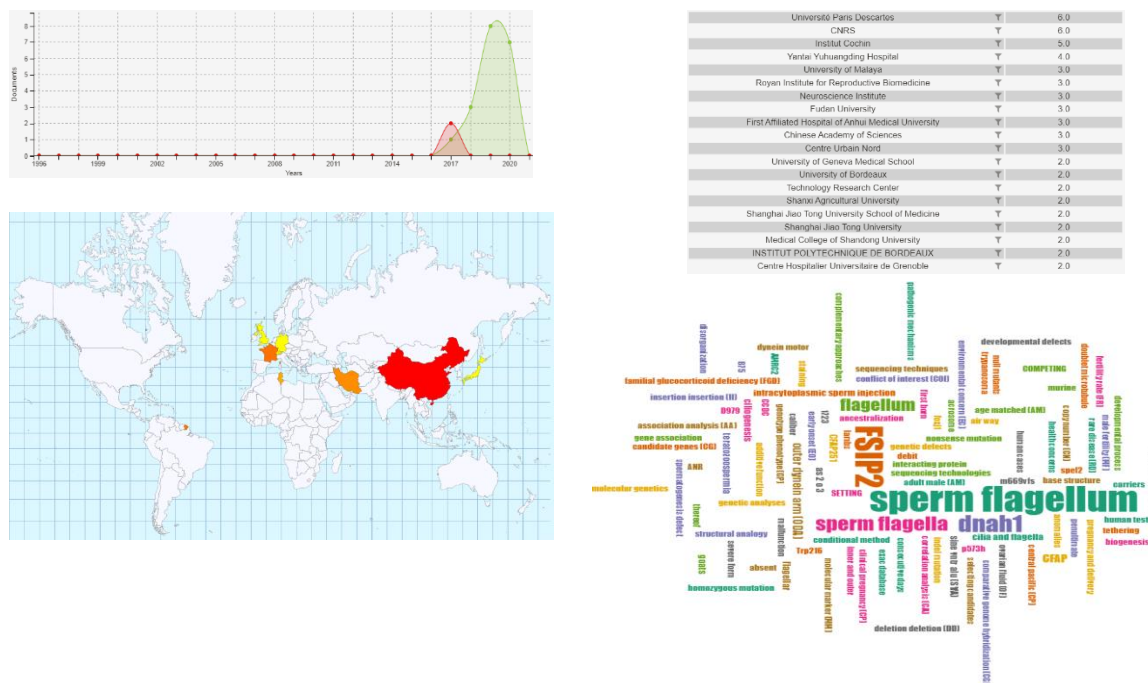
Figure 66: Visualisations for Cas12a orthologs



Cfap43 cfap44 in male infertility

Genetic mutations on Cfap43 and Cfap44 genes have been found to be responsible for many cases of male infertility. The pathogenic mechanisms remain unclear and are being investigated.

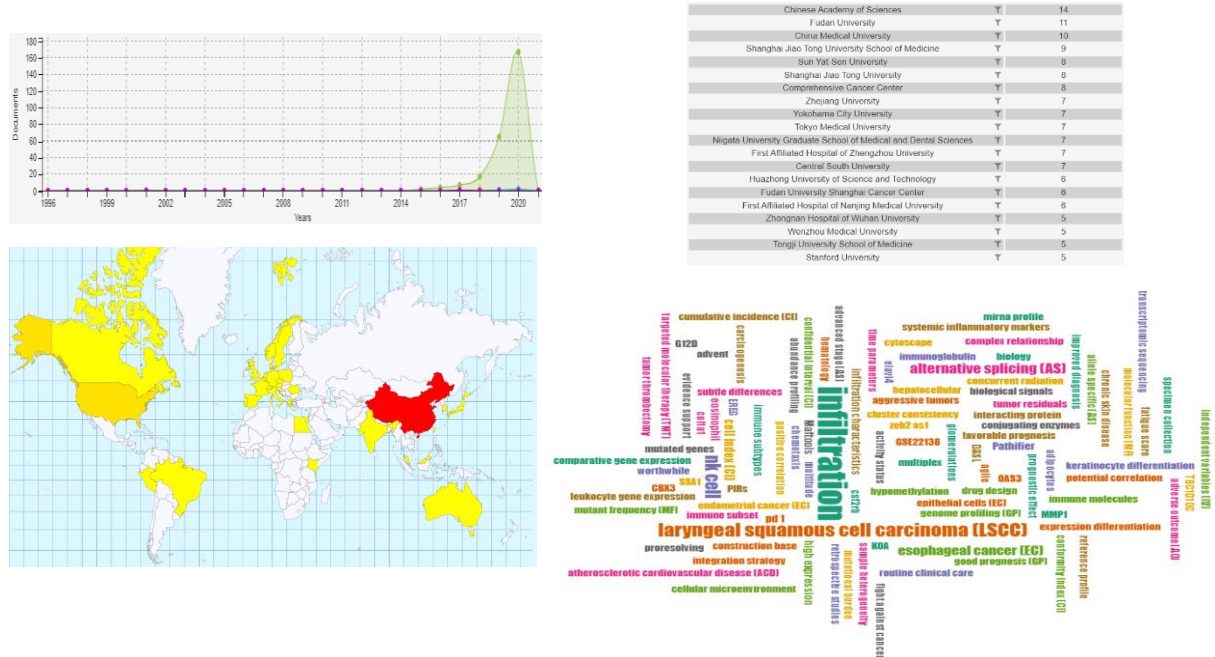
Figure 67: Visualisations for cfap43 and cfap44 in male infertility



Cibersort

combines genetic with computational methods to characterize with a high precision the cell composition of complex tissues from their gene expression profile. It is more and more used to determine the composition of tumors to adapt therapies and predict therapeutic effects.

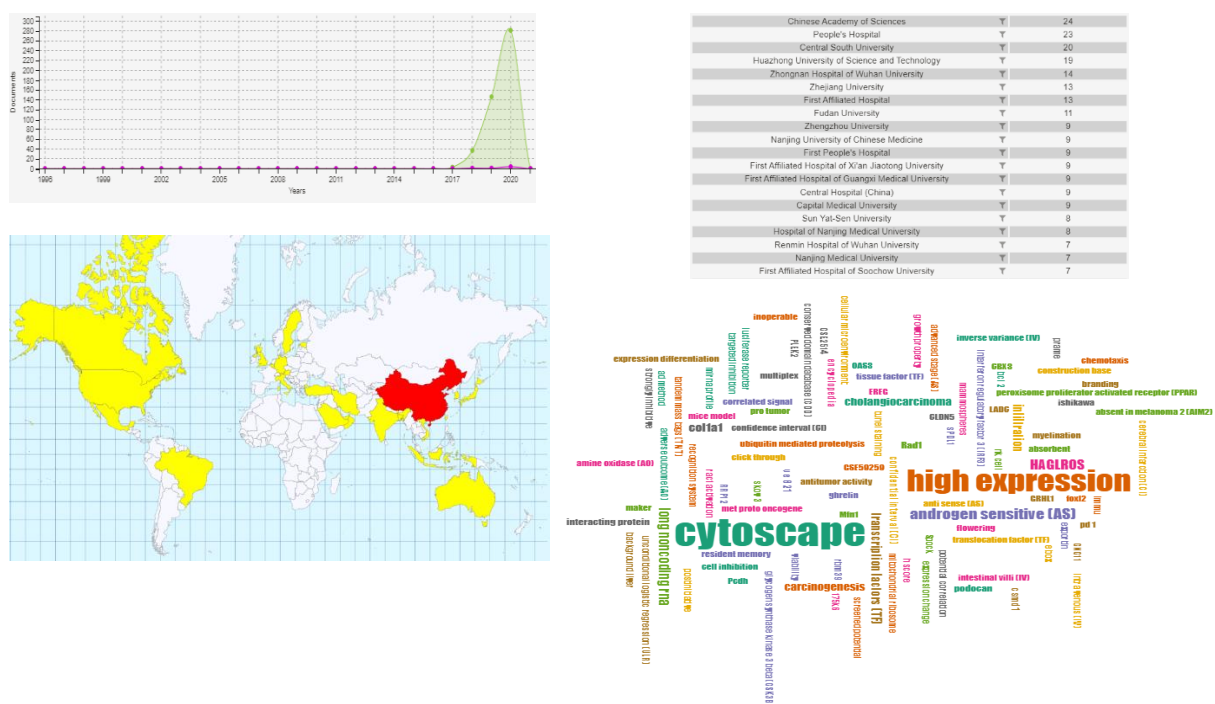
Figure 68: Visualisations for cibersort



GEPIA

Stands for Gene Expression Profiling Inter Analysis, an interactive online tool for cancer prognosis analysis based on gene expression. Prognostic biomarkers help to predict the chance of survival of patients with cancer, are used to adjust the treatments, to elucidate tumorigenesis mechanisms, and to identify therapy targets.

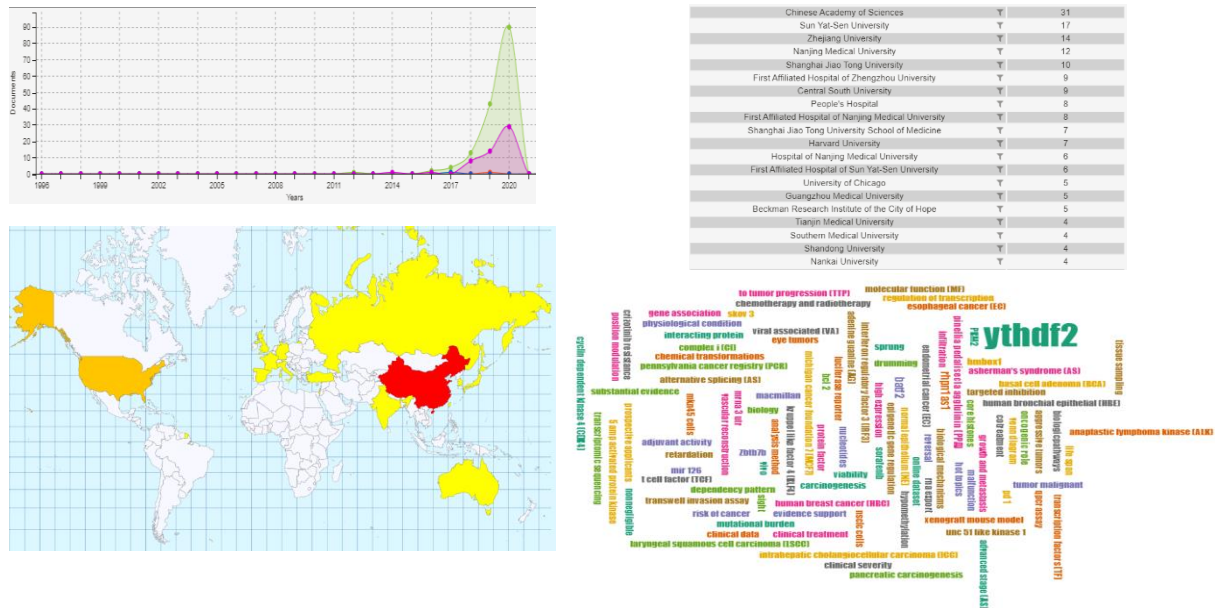
Figure 69: Visualisations for GEPIA



M6A RNA methylation modulators and cancer

Modifications of the RNA N6-methyladenosine (m6A) have recently been discovered to have a crucial role in the progression of cancer. Aberrant modifications contribute to tumorigenesis and metastasis. It has also been reported to have an impact on the resistance of malignant tumors to chemotherapy and radiotherapy.

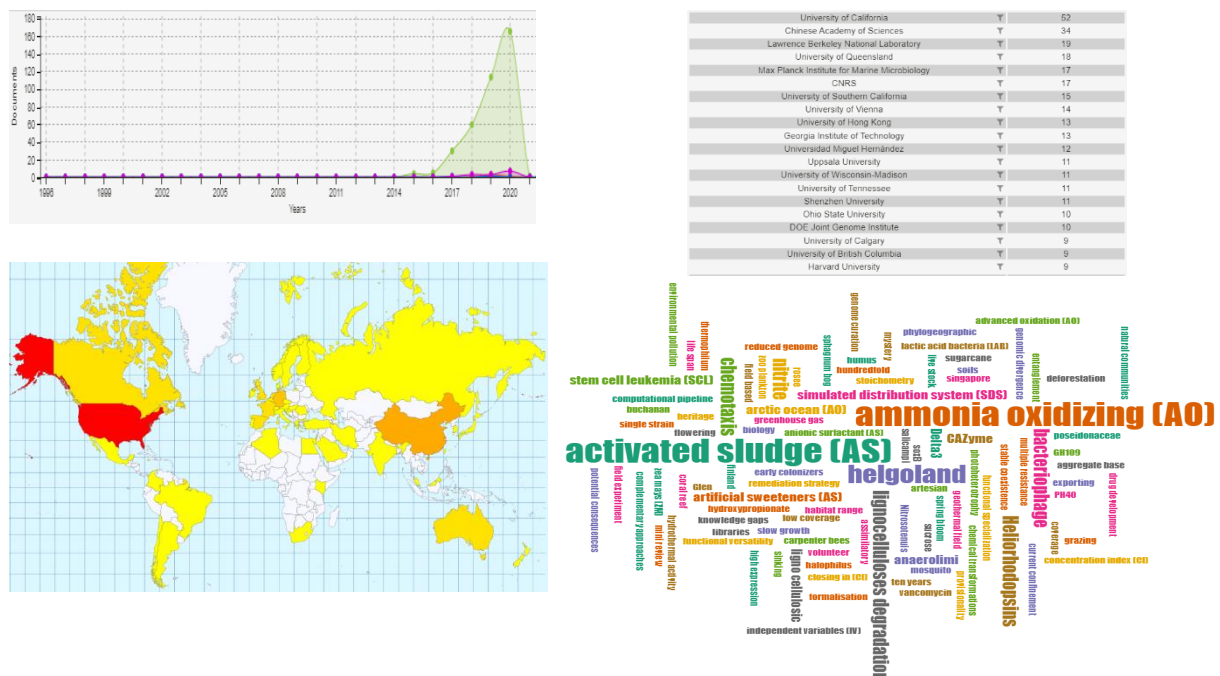
Figure 70: Visualisations for M6A RNA methylation modulators and cancer



Metagenome-Assembled Genome

is an approach that facilitates the sequencing of whole genomes from environmental samples (instead of using pure cultures); several genomes from a sample are assembled to generate the metagenome-assembled genome. This method is mainly used on phylogenetic analysis of microbial populations. However, recent research investigates its potential use in public-health microbiology for surveillance of virulence factor and antimicrobial resistance genes.

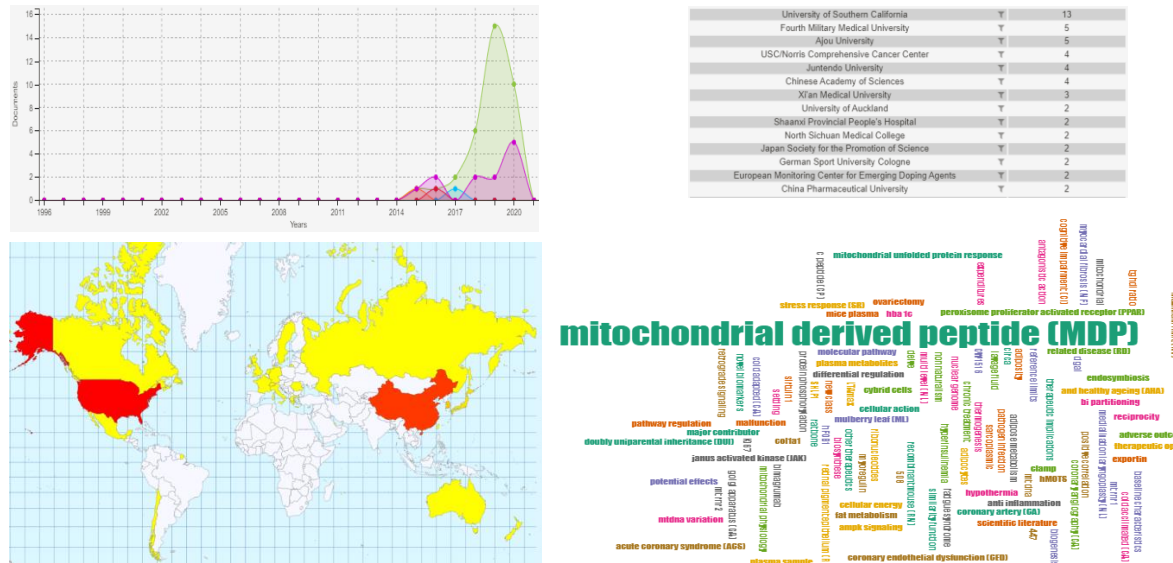
Figure 71: Visualisations for metagenome-assembled genome



MOTS-c

Mitochondrial-derived peptides are a novel class of bioactive microproteins that modify cell metabolism. Among them, MOTS-C is being studied for its potential use in Alzheimer's disease, prostate cancer, macular degeneration, cardiovascular disease, diabetes, obesity, and others.

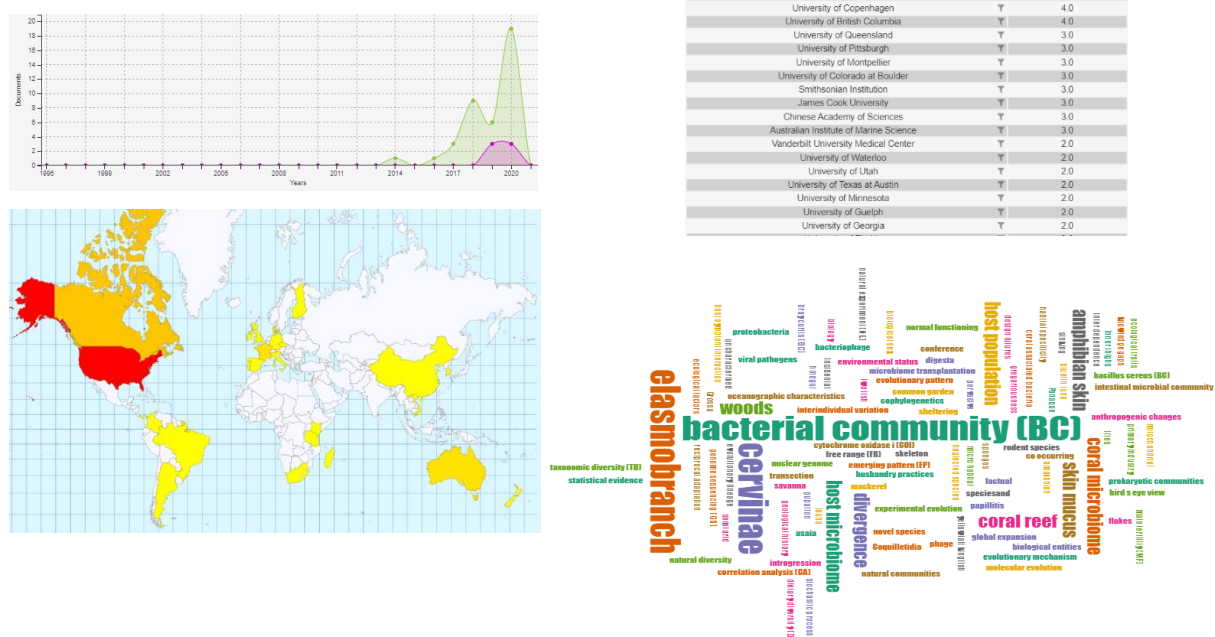
Figure 72: Visualisations for metagenome-assembled genome



Phylosymbiosis

Microbiome of plants and animals often show a degree of correlation with the phylogeny of the host, an eco-evolutionary pattern known as phylosymbiosis. Given that phylosymbiosis has been shown to relate to functional components of host fitness, researching the processes that contribute to these patterns will be important for better understanding the ecology and evolution of host-microbe interactions.

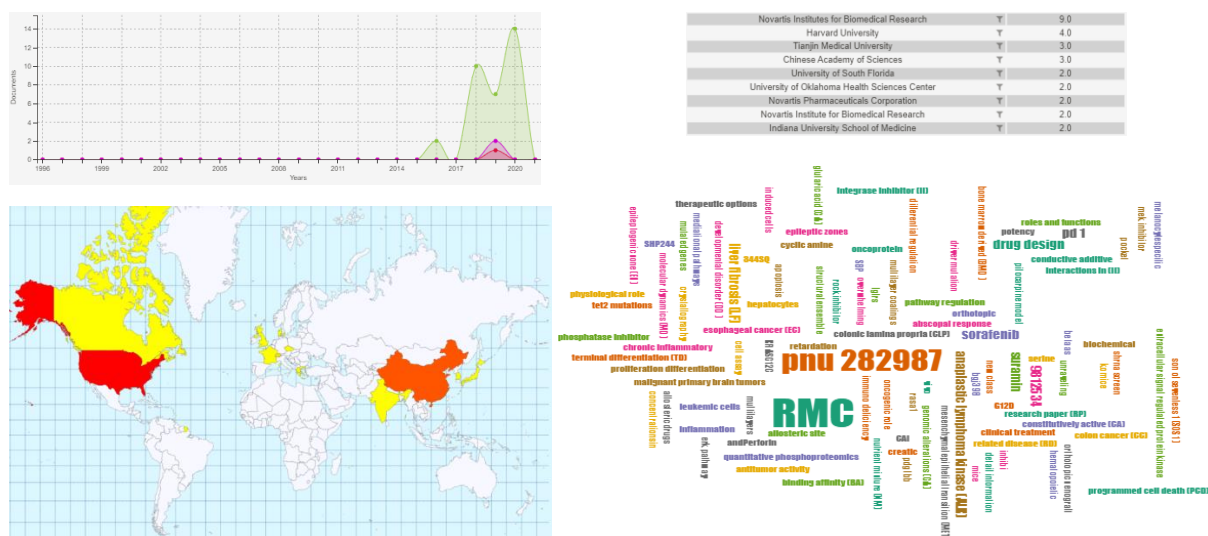
Figure 73: Visualisations for phylosymbiosis



Shp2 inhibitors for cancer

Src homology 2 domain-containing phosphatase 2 (SHP2), and its inhibitor SHP099, are being investigated for their potential as therapeutic target for human cancers and other human diseases.

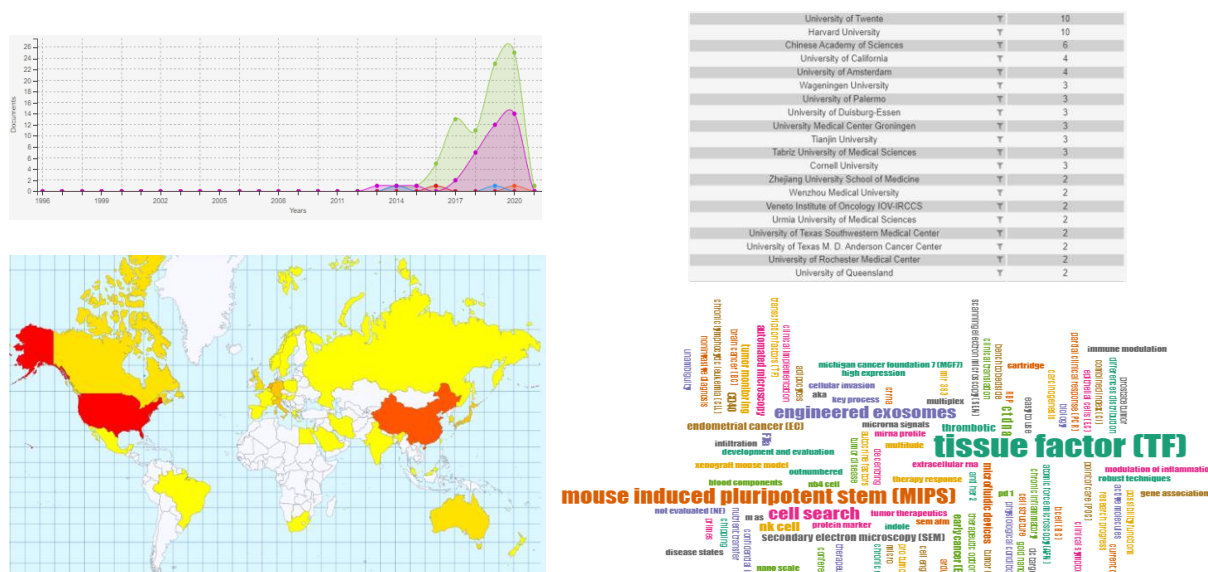
Figure 74: Visualisations for Shp2 inhibitors for cancer



Tumour-derived extracellular vesicle

are important signals in tumor-host cell communication and have a role in preparing tumor-free organs to become hosts for new tumors by transferring biologically active molecules that facilitate the malignant growth, metastatic process, and resistance to chemotherapy.

Figure 75: Visualisations for tumor-derived extracellular vesicle



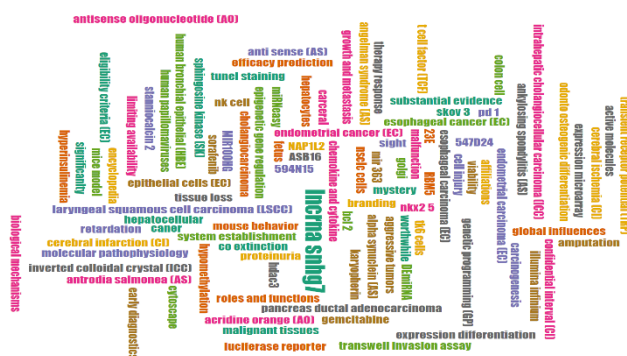
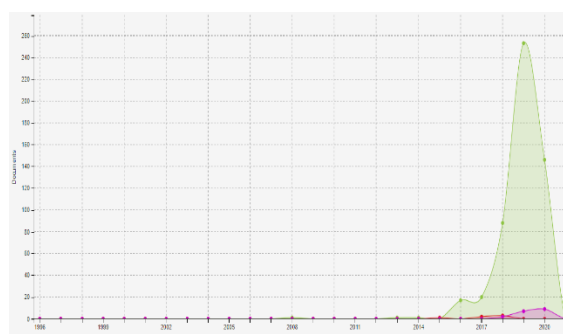
Proximity labelling techniques are used to define specific protein interactions and to identify spatially or temporally restricted local proteomes, which helps to better grasp cellular processes. Two recently developed highly active biotin ligase variants (TurboID and miniTurbo) allow to overcome some limitations of traditional labelling techniques like cell toxicity, long incubation time and high incubation temperature.

[illegible]

Circular RNA and long non coding RNA are subject to intense research in the recent years for their possible role in ageing, cancers and other diseases. Investigations on circRNA and lncRNA are blooming in many medical fields, as can be seen in the list of the most recently pervaded journal categories.

Figure 76: Visualisations for weak signals related to RNA
(distribution of documents and wordcloud for all WS on RNA)

awpph	topic:awpph
cdri1as	topic:(cdri1as AND ("circular RNA" OR circRNA))
circRNA back splicing	topic:(circRNA AND "back splicing")
circrna miRNA mrna network	topic:("circRNA miRNA mRNA network"~2)
foxd2 as1	topic:"foxd2 as1"
haglros	topic:haglros
hand2 as1	topic:"hand2 as1"
linc00460	topic:linc00460
Magi2 as3	topic:("Magi2 as3" AND (cancer OR tumor))
pcat6	topic:pcat6
sbf2 as1	topic:"sbf2 as1"
snhg14	topic:snhg14
snhg16	topic:snhg16
snhg5	topic:snhg5
snhg7	topic:snhg7



Rheumatology	Y	100
Pharmacology, Toxicology and Pharmaceutics	Y	100
Hepatology	Y	100
Clinical Neurology	Y	100
Biochemistry, medical	Y	100
Clinical Biochemistry	Y	98
Pathology and Forensic Medicine	Y	95
Biomedical Engineering	Y	90
Pulmonary and Respiratory Medicine	Y	90
Pharmaceutical Science	Y	90
Medicine (miscellaneous)	Y	90
Endocrinology, Diabetes and Metabolism	Y	88
Genetics(clinical)	Y	88
Molecular Medicine	Y	87
Ageing	Y	87
Physiology (medical)	Y	85
Neuroscience	Y	84
Structural Biology	Y	83
Obstetrics and Gynaecology	Y	83
Histology	Y	83
Drug Discovery	Y	83
Applied Mathematics	Y	83
Immunology and Microbiology	Y	81
Modelling and Simulation	Y	80
Epidemiology	Y	80

Endocrinology	7	80
Pharmacology (medical)	7	79
Biotechnology	7	78
Cell Biology	7	78
Gastroenterology	7	77
Cardiology and Cardiovascular Medicine	7	77
Computational Mathematics	7	76
Pharmacology	7	76
Medicine	7	76
Genetics	7	75
Cancer Research	7	75
Statistics and Probability	7	75
Developmental Biology	7	75
Physiology	7	73
Biochemistry	7	73
Oncology	7	73
Hematology	7	72
Organic Chemistry	7	72
Agricultural and Biological Sciences	7	72
Radiology Nuclear Medicine and Imaging	7	71
Physical and Theoretical Chemistry	7	70
Computer Science Applications	7	69
Spectroscopy	7	68
Inorganic Chemistry	7	68
Catalysis	7	68

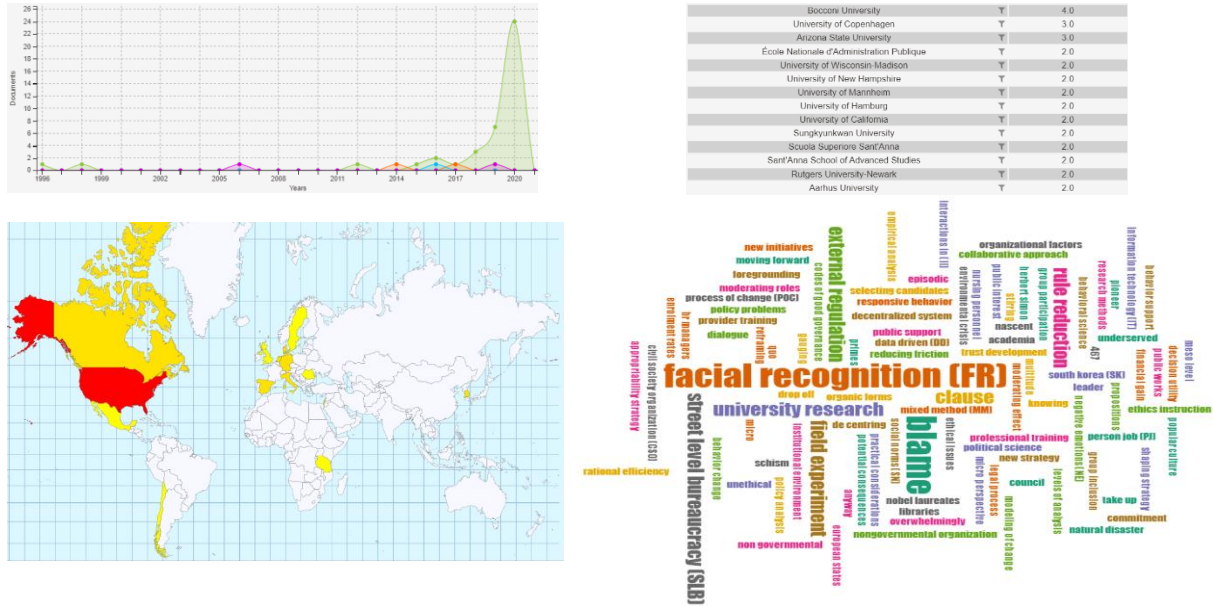
Journal categories recently pervaded by lncRNA and circRNA
(Score is a activeness 2019-2020 i.e. the % of articles published in 2019-2020 for this journal category)

2.7 Social sciences

Behavioral public administration

is a new concept that combines behavioral science with theories of public administration. Proponents of the behavioral public administration call for using theories from psychology and experimental research designs to improve the rigor of public administration research.

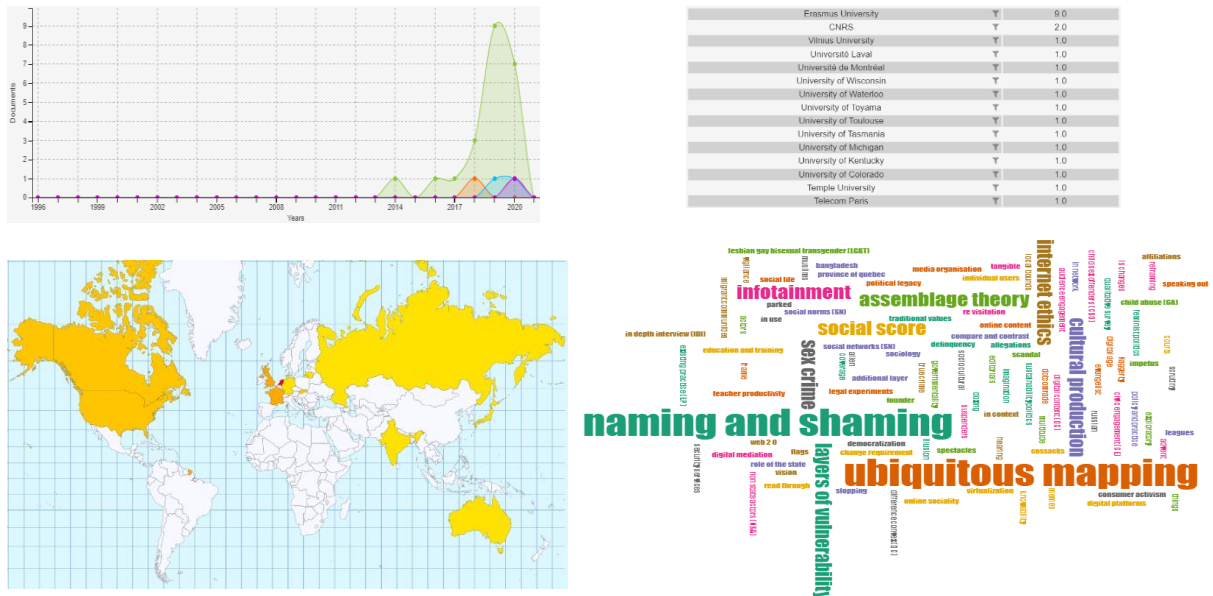
Figure 77: Visualisations for behavioral public administration



Digital vigilantism

is an emerging practice where citizens are using modern IT technologies for societal vigilantism i.e. a parallel criminal justice with no moral or legal legitimacy.

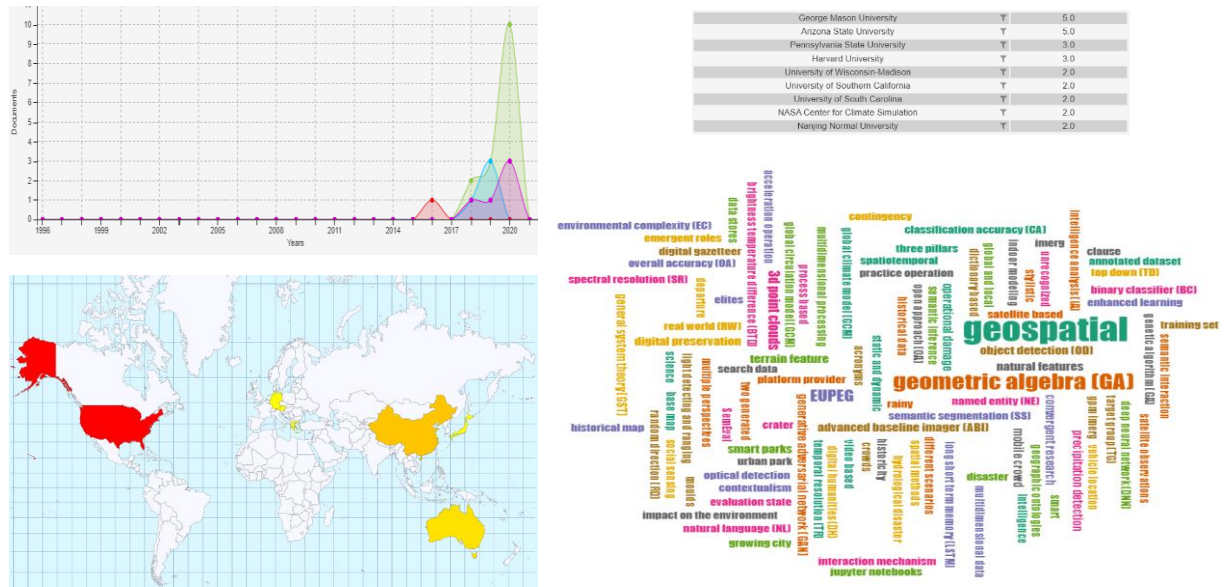
Figure 78: Visualisations for digital vigilantism



Geospatial AI

is what happens when geospatial computing and analysis meets big data and artificial intelligence. New AI techniques are being developed for geospatial data management, processing, analysis, modeling, and visualization.

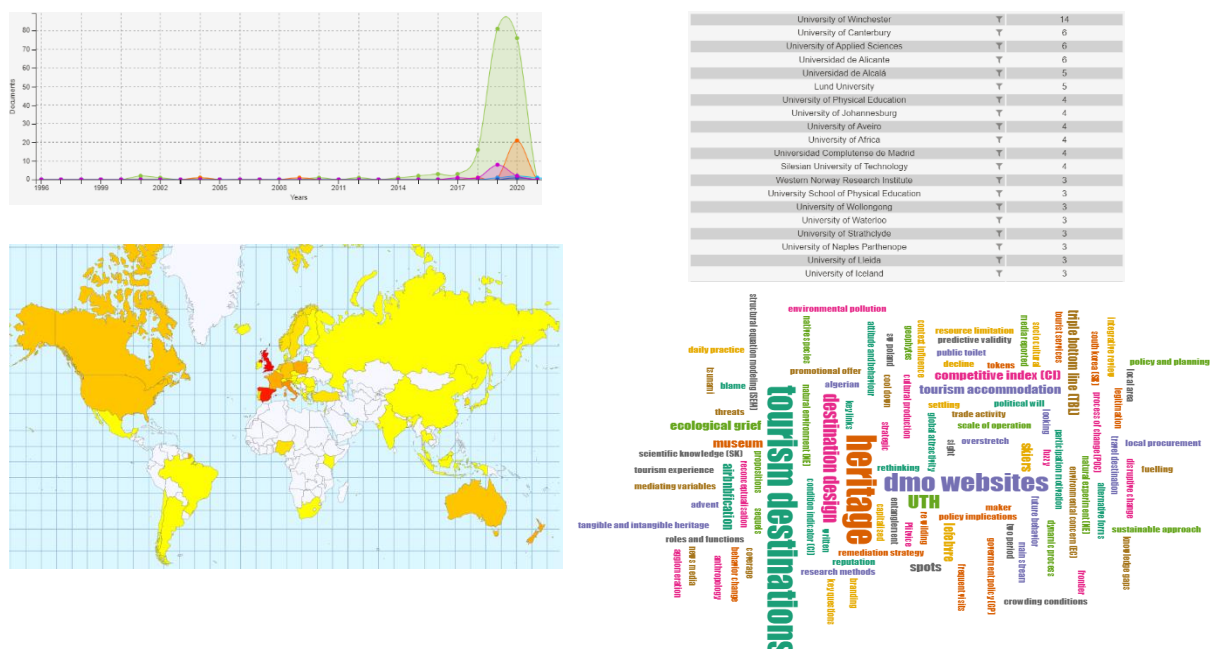
Figure 79: Visualisations for geospatial AI



Tourism phobia

Touristic pressure on local populations has received much attention recently in the media as tensions related to social, economic or environmental change have grown in many destinations. In reaction, anti-tourism movements are now more organised, vocal, and active at a political level.

Figure 80: Visualisations for tourism phobia



3 Methodology

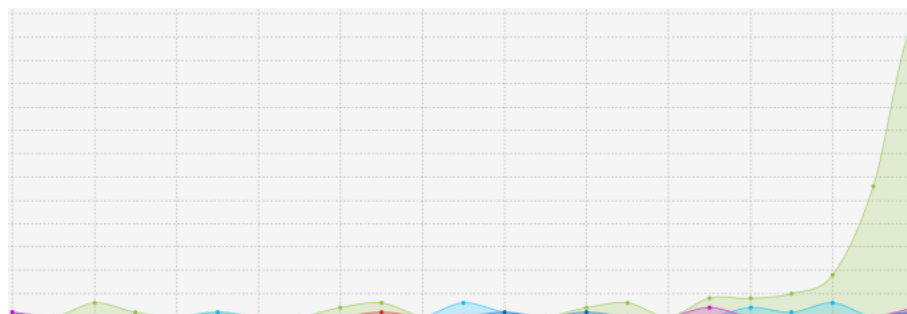
3.1 Building datasets

A dictionary of multi-word concepts is generated from a corpus of documents using text mining techniques. To capture the recent vocabulary used in scientific publications, documents from the last five years (2016-2020) of the Scopus database are used as corpus (~2.5 million scientific publications). Single words, multi-word terms and acronyms are extracted from the title, abstract or author keywords of the publications. The TF*IDF⁵ method is then used to select the most relevant keywords, and stemming is applied to group words with similar basic meaning. The resulting dictionary is composed of more than four million relevant concepts, each of them subsequently used in an automated query process that builds an equivalent number of datasets. These contain the documents retrieved by the search from scientific publications dating from 1996 to 2020⁶.

3.2 Detection of raw weak signals

A custom-built indicator called "activeness" is used to sort the datasets obtained by the text mining process. 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 1996-2020. For example, activeness[2018-2020] corresponds to the ratio $[\text{\#documents published during the period 2018-2020}] / [\text{\#documents published during the period 1996-2020}]$. A high activeness score means that a higher percentage of documents have been published during the selected period. Several activeness indicators for different periods have been used to detect the weak signals in the Scopus database.

Figure 81: Typical shape of a weak signal on a graph #documents (Y-axis) Vs years (X-axis).



⁵ Term frequency–inverse document frequency (TF-IDF) is a numerical statistic method that calculates how important a word is to a document in a collection or in a corpus.

⁶ Detecting weak signals implies looking into the past to verify novelty.

3.3 Selection of relevant weak signals

Various filters are used to refine the list of raw weak signals, which inevitably also contains false positives. First, a simple filter is applied to reject datasets that do not reach a certain minimum number of documents. Then, a more elaborate filter relying on "semantic compactness"⁷ 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). Manual filtering is also used to reject datasets resulting from errors in the original corpus (e.g. spelling mistakes). Finally, custom-made indicators are used to further refine the list of weak signals. To complete the selection, the remaining weak signals are reconstructed in the TIM Technology system, which, in addition to scientific publications, also contains patents and EU R&D grants. The search queries are optimised to increase the recall of documents and to further validate the list of weak signals.

⁷ The semantic compactness indicator allows evaluating the semantic proximity of a collection of documents. It relies on the cosine similarity matrix, calculated for the collection of documents. To build the matrix, a vector of relevant semantic concepts is built for each document; these vectors are then used to calculate the cosine similarity of each document to the others. The indicator then displays the compactness of the set of documents from a semantic perspective.

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