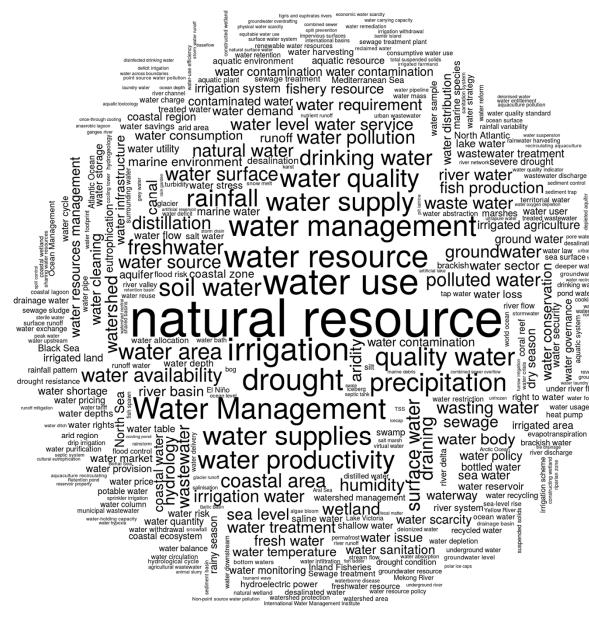
ature of Water: esults of a Text Mining Study

Ilya Kuzminov,

Institute for Statistical Studies and Economics of Knowledge





* Future of water wordcloud: analytic reports

omy Future of Water: Is There an Alternative?

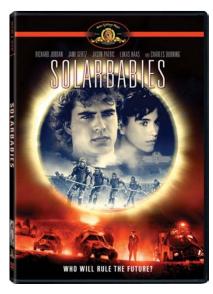
only scientists fear the future world suffering from ution, depleted resources, poverty, dying ans, and the dire greenhouse effects

TLENT GREEN

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er scarcity, water pollution, water ecosystems adation, devastating climate change effects on er resources have long become common features of copular culture. **Everyone fears water scarcity**

In many places, including the developed countries, the nightmares already comes



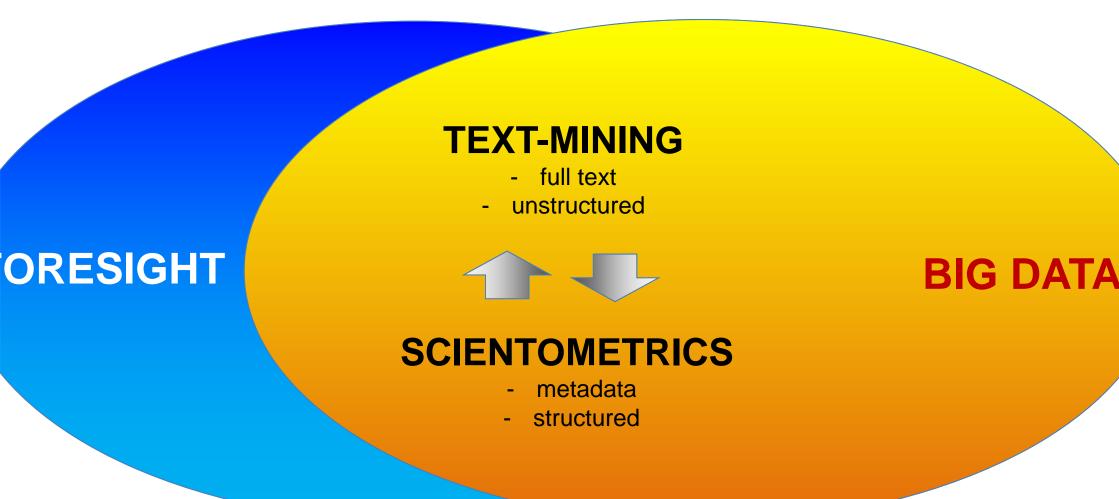


Frounds, scope, methodology and sources of the study Place of water-related problems in environmental studies Place of water management innovation landscape R&D vs media – coverage of water-related topics

case study: future of water purification



In the era of the Big Data revolution, data mining & text mining become an integral part of any scientifically sound foresight students.

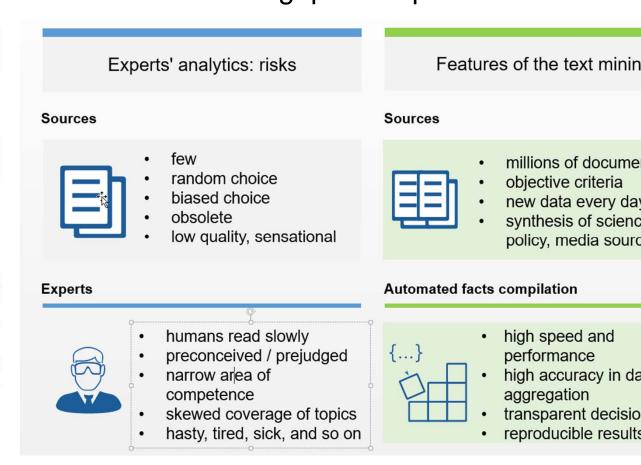




Importance of semantic analysis, knowledge discovery and concept landscape mapping will only increase in the future

t mining methods are of use in many conents of typical foresight pipeline ...

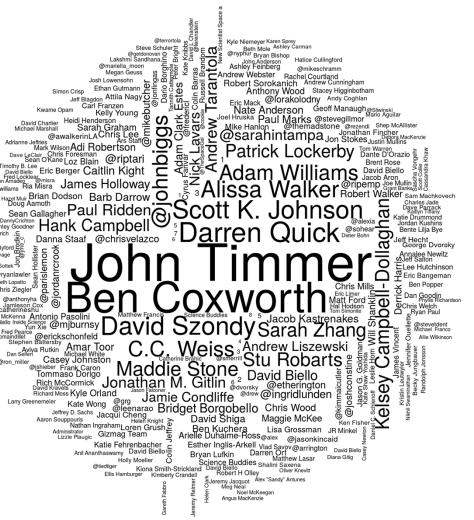
Forming pool of Forecast model development Data collection and preprocessing experts Requests to state (government) information systems Stakeholders matrix Scenarios development Bibliometric analysis Crawling, scanning, accumulation of data Global processes modelling Setting expert panels Set of preliminary analytic and forecast data Expert panels Delphi survey Expert validation of Delphi System analysis, quantitative estimates PR of the Forecast results The use of the Forecast Recommendations for technology and ... because they can significantly improve objeand eliminate gaps in expert desk researc





We have implemented a data mining of over 1 000 000 full-text posts from leading science, technology and innovation news aggregators

Most important technology and innovation journalists and bloggers



Source: NRU HSE GTMS system

Most important media data sources

SOURCE	NUMBER OF
Business Insider	1
techcrunch.com	1
huffingtonpost.com	1
New Scientist	
venturebeat.com	
Ars Technica	
time.com	
wired.com	
The Verge	
engadget	
Gizmodo	
Gizmag	
scientific 2.0	
Scientific American	
popularmechanics.com	
agriculture.com	
Gigaom.com	
zdnet.com	



Also, we have analyzed 200 000 of international analytic and forecast reports by hundreds of global and national organization

U.S. Department of Agriculture Columbia University in the City of New York Department for Environment Food & Rural Affairs	Cie. Department of Agriculture	
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Source: NRU HSE GTMS system

Top publishers of analytic		
reports		
MarketLine		
OECD		
IEA		
Springer		
Elsevier		
EU		
Wolters Kluwer		
ITF		
World Bank		
EFMN		
ECMT		
European Biotechnology Network		
US		
John Wiley & Sons		
FAO		
Oxford University Press		
ВМЈ		
Lancet		
McKinsey		
Asian Development Bank		
Emerald		

Number of useful snippets (contexts) by publisher

OECD	4
Elsevier	2
FAO	2
Springer	
IEA	
MarketLine	
World Bank	
Zhejiang University	
EU	
Cambridge University Press	
African Highlands Initiative	
ECMT	
UNEP	
Eurostat	
National Intelligence Council	
NSW EPA	
IDRC	
ITF	
IPCC	
OPEC	
U.S. Environmental Protection Agency	



We processed 1800000 of open-access research papers' abstracts as we

brane Science salination ote Sensing nsors And ctuators matography ine Pollution aration And ırification chnology ic Toxicology and Compounds rogen Energy

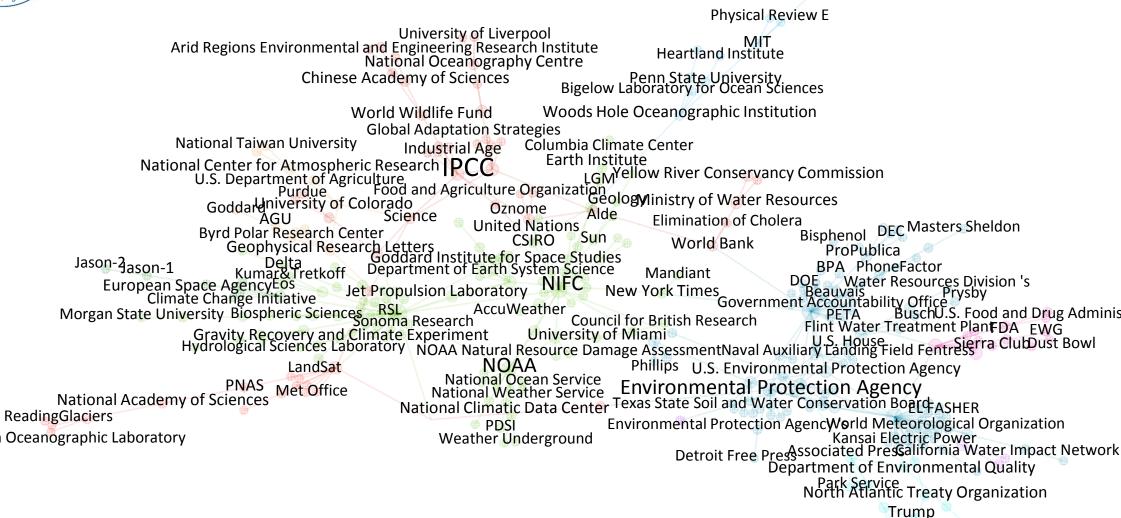
Number of relevant abstracts by Journal		
Journal Of Hazardous Materials	2917	
Water Research	2795	
Bioresource Technology	2295	
Chemical Engineering Journal	1741	
Journal Of Hydrology	1598	
Journal Of Membrane Science	1561	
Science Of The Total Environment	1484	
Chemosphere	1467	
Desalination	1268	
Palaeogeography Palaeoclimatology Palaeoecology	1133	
Proceedings Of The National Academy Of Sciences Of The	1054	
United States Of America	1034	
Marine Ecology Progress Series	1048	
Global Change Biology	973	
Remote Sensing Of Environment	916	
Earth And Planetary Science Letters	886	
Sensors And Actuators B-Chemical	818	
Journal Of Chromatography A	799	
Applied Catalysis B-Environmental	790	
Marine Pollution Bulletin	725	
Geomorphology	688	
Environmental Pollution	641	
Hydrological Processes	640	
Journal Of Alloys And Compounds	625	
Estuarine Coastal And Shelf Science	622	
Food Chemistry	616	
Separation And Purification Technology	613	
Deep-Sea Research Part II -Topical Studies In Oceanography	583	

Wordcloud of scientific journals relevan water resources





We found thousands information on hundreds of organizations - global centers of competence in the area of water management innovations



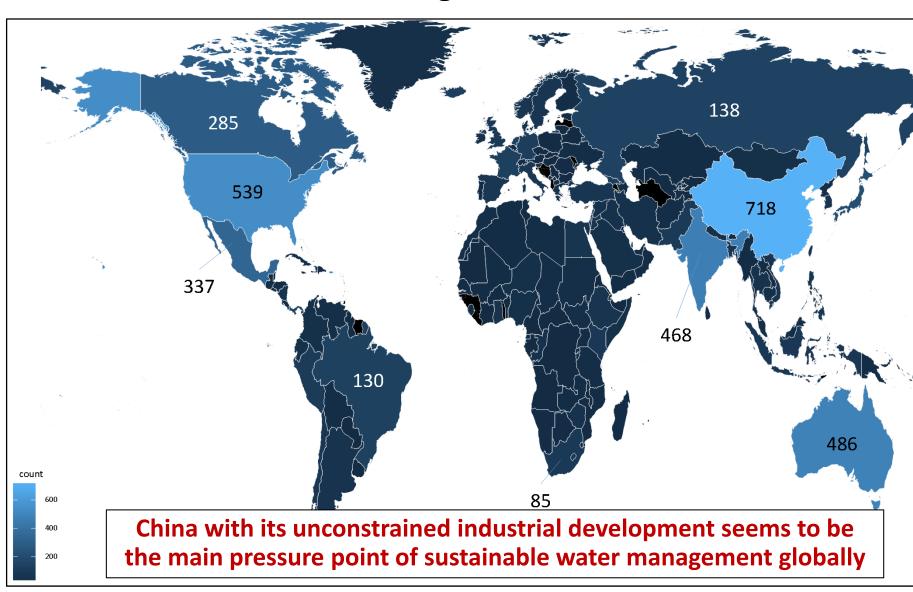
Maryland Department of Environment

US Geological Survey National Water - Quality Assessmen



We built an automatic map of how frequently are world countries mention in the context of water resources management

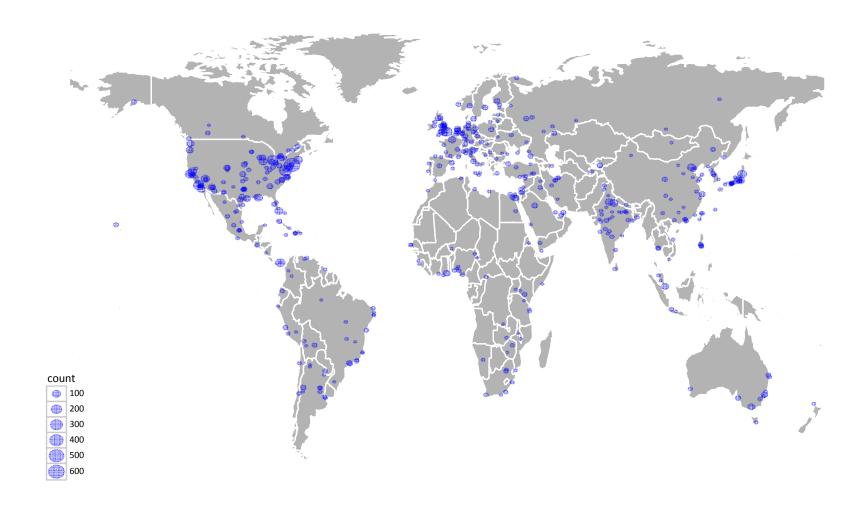
rtunately, Africa its dire water city conditions cussed by itists and nology neers far less the problems gest loped and key loping tries with dry ite on part of territories





We built a map of cities mentioned in the context of water management, water technologies, and water innovation

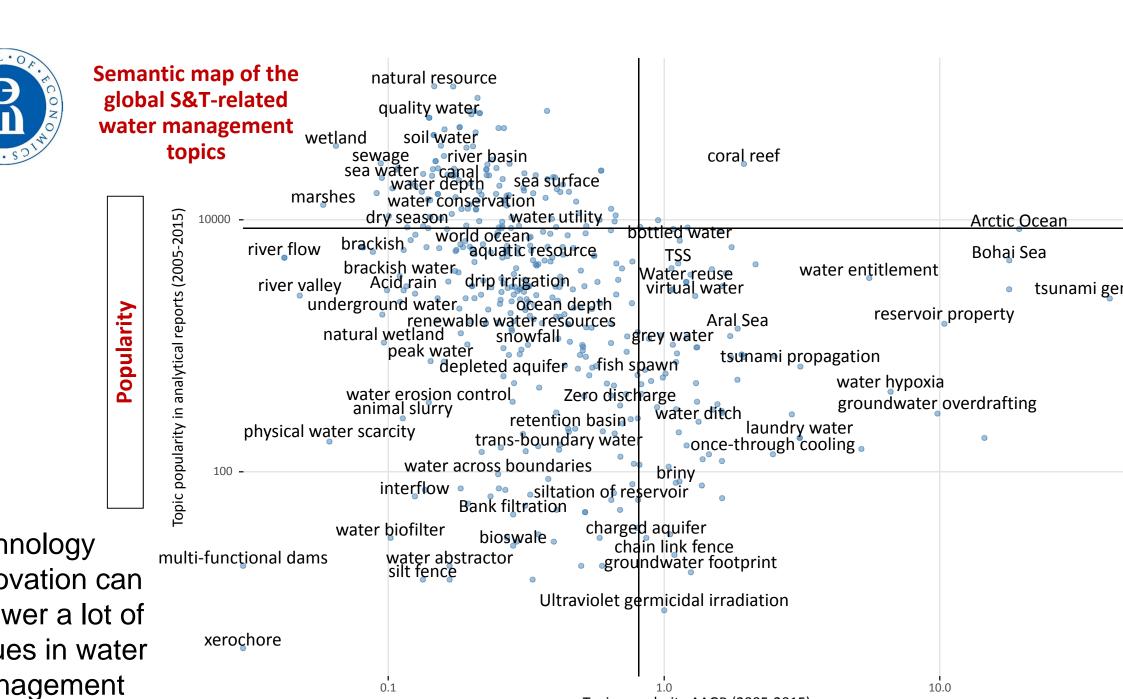
he **developed** untries, these cities mostly the global es - locations of the in universities, earch centers, and porations in the er management d. In **developing** untries - they are es suffering from er inefficiencies





Water related topics are discussed in approximately 22% of highly cited publications about environment

Semantic map of the global environmental topics greenhouse control post-combustion non-fossil fuel flue-gas desulfurization reduction amine post-combustion capture soil conservation continuous emission monitoring biogas algal biofuel algal culture biomass integrated gasification combined cycle autonomous underwater vehicle nox reduction carbon capture non-methane volatile organic compound recovery x-ray fluorescence soil management anaerobic digestion natural resource man grated natural resource managementvariable renewab clean water_{nanoscale} zero-valent iron small renewable en conventional biofuel desalination tidal energy membrane filtration artificial reef ocean energy radioactive disposal waste recovery tidal streammarine energy on shore wind



Source: NRU HSE GTMS system

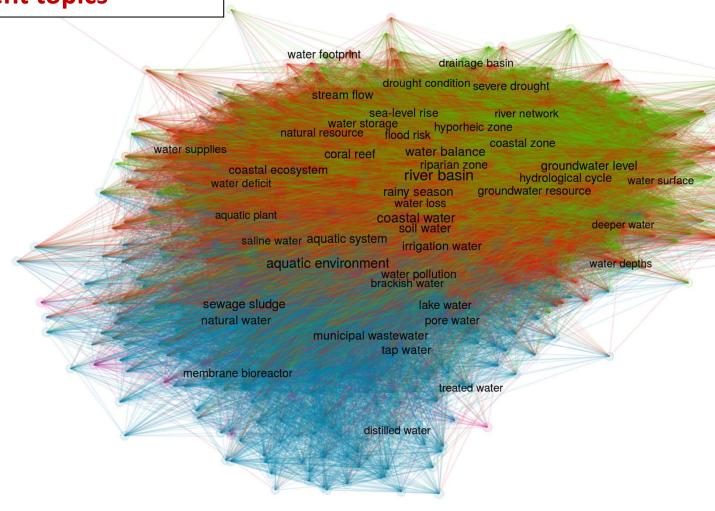
Trending

Topic popularity AAGR (2005-2015)



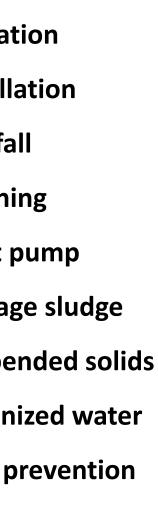
Semantic map of the global environment-related water management topics

Vater scarcity, negative limate change effects n water resources, *r*aterborne diseases, gro&energy water potprint, dying water cosystems, Global Ocean vulnerability, ew water purification nd water desalination echnologies seem to e in the center of xpert debate orldwide

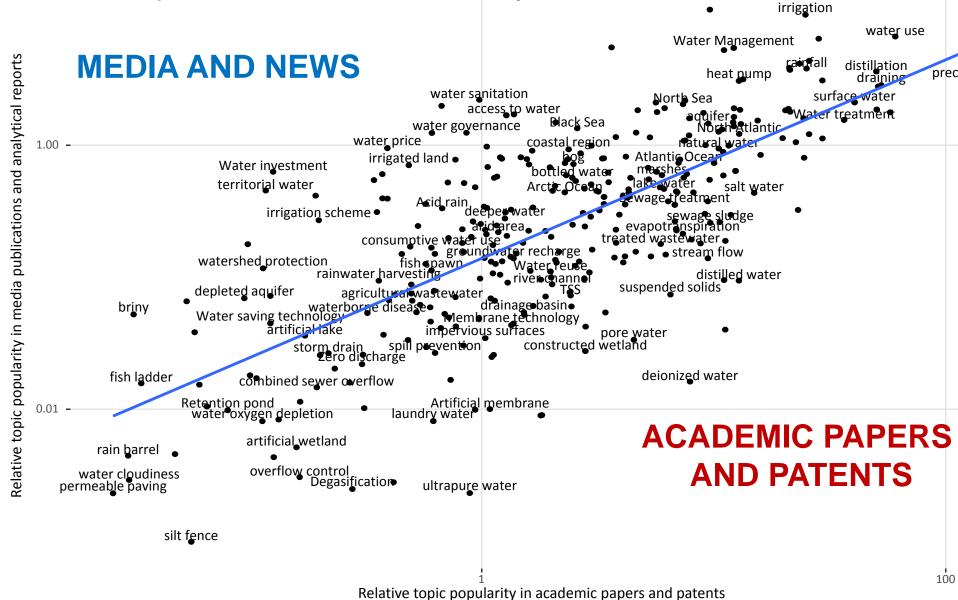




Coverage of the key topics in water management: **media vs. research**Scientific concepts in water use effectively translate into the media disco



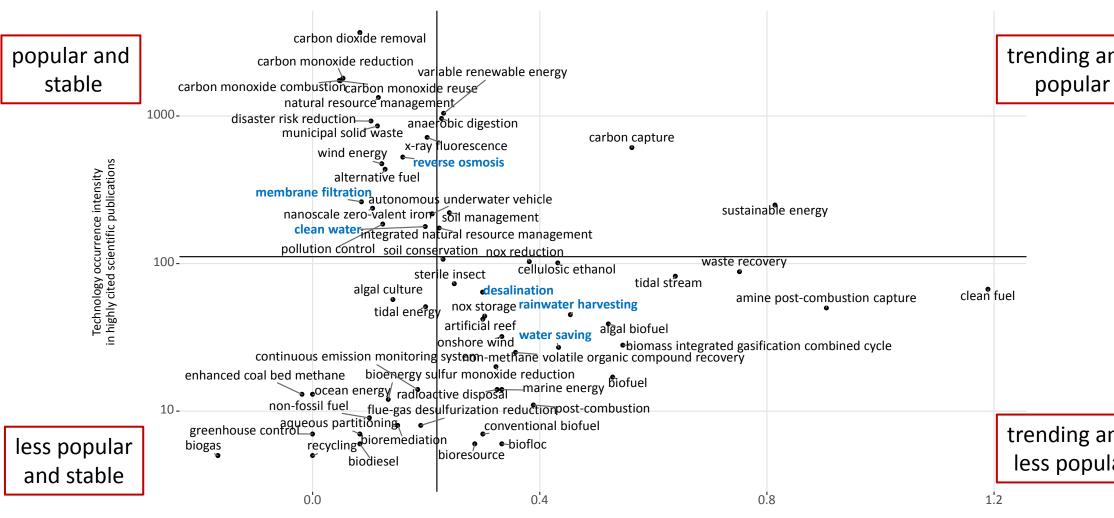
nbrane





Water on the map of environmental technologies:

Water-treatment techniques and hardware stay in the shadow of decarbonization, renewable energy, biofuels and waste utilization



Average growth rate of technology occurrence in highly cited scientific publications



Knowledge discovery snapshot: WATER SCARCITY

Water scarcity is a very hot topic: on the agenda of global institutions + a lot of models, projections and expert quantitative estimates

, the number of people living under <mark>severe water stress</mark> is expected to increase by more than 1 billion **to 3.9 billion people**, nearly ected world population OECD. **(2009)** Green At Fifteen? How 15-Year-Olds Perform In Environmental Science And Geoscience In Pl aris: OECD

se projections to 2050 suggest that the water supply to some **47% of the world's population (compared to 35% in 2005)**, mostly in ing countries, will be under <mark>severe stress</mark>, largely because of developments outside of agriculture. OECD/FAO. **(2011)** OECD-FAO ural Outlook 2011-2020.OECD/FAO

ent, **agriculture** accounts for over **70% of water use** globally, but both the absolute amount of water available for agriculture and it ected to **decline (to 40% by 2050)**. OECD/FAO. **(2012)** OECD-FAO Agricultural Outlook 2012-2021.OECD/FAO

reshwater resources will be further strained in the future in many regions, with **over 40% of the world's population** projected to b basins experiencing **severe water stress by 2050**. **(2013)** Global Food Security CHALLENGES FOR THE FOOD AND AGRICULTURAL S

ide, researchers have recently called for ... a reduction in the **proportion of animal protein in diets from the current 20% to 5% in** about water ... security amid population increase. Abbas El-Zein. **(2014)** Health and ecological sustainability in the Arab world: a r val The Lancet383. (2) p. 458--476

vater demand ... are **projected to increase by 55% by 2050**, mainly because of the growing demands from **manufacturing (400%)**, electricity generation (140%) and domestic use (130%). Walsh, Brendan P.; Murray, Sean N.; O'Sullivan, D.T.J. **(2015)** The water er . / Water Resources and Industry10. (06) p. 15-28



Knowledge discovery snapshot: CLIMATE CHANGE EFFECTS ON WATER RESOURCES

e climate change is generally perceived by expert community as a threat to water resou inability, there are still very few quantitative evidence.

e are more than 17 times more qualitative statements on climate change in relation to warders than quantitative ones in our text mining database

OECD analysis suggests that without intensified policy action, global greenhouse gas (GHG) emissions are likely to increase 2050. OECD. (2011) Fostering Innovation for Green Growth. PARIS: OECD

liest global **effects of climate change, including water stress and scarcity**, will begin to occur in Sub-Saharan Africa **by 2025** Il intelligence council, US Government. (2008) Global trends 2025: a transformed world. Washington: National intelligence . US Government

the gravest consequences of climate change are **likely to be felt after 2030**, it will affect living standards and food security pating water and food scarcity long before then ... Institute for Security Studies European Union . (2012) European Strategy analysis System (ESPAS) Global trends 2030 ...

orld Bank estimates that by 2025 climate change will result **in 1.4 billion people** across 36 countries **facing crop or water sc**allion people in 21 countries are currently affected by this). Institute for Security Studies European Union . (2012) European y and Policy Analysis System (ESPAS) Global trends 2030 ...



Knowledge discovery snapshot: EXTREME HYDROLOGICAL EVENTS

Destructive floods are among the major concerns related to water sector globally Increasing floods risks are generally perceived by experts as caused mainly by climate change and overpopulation of lowlands.

e seems to be a number of quantitative models to predict climate change effects on floo but mostly in relation to sea level rise.

CD Environmental Outlook to 2050 emphasizes the consequences of inaction in terms of growing competition among water users to vater resources of adequate quality, **growing vulnerability to floods**, and increasing pressures on water quality. OECD. (2013) Water for Better Lives. PARIS: OECD

, flood risks are projected to affect more than 1.6 billion people (nearly 20% of the world's population) and the value of assets at ficantly higher than today. OECD. (2013) Water Security for Better Lives. PARIS: OECD

etherlands alone, the cost of implementing a comprehensive set of flood protection and flood risk management measures is projection of the cost of implementing a comprehensive set of flood protection and flood risk management measures is projection of the cost of the co

2011) estimated that commercial, industrial, road, rail, and residential assets worth more than AUD 226 billion would be at risk of s ... by 2100 ... OECD. (2015) Climate Change Risks and Adaptation: Linking Policy and Economic. PARIS: OECD

Water pollution and water purification

