

Al/ML Applications for Water Resources Management Dr. Koen Verbist, Programme Specialist, Intergovernmental Hydrological Programme, UNESCO





Brief introduction of UNESCO's Natural Sciences Sector Work on Al

AI for the Planet Alliance



Advisory Board





Framework for Using AI in Combating Climate Change

Topics	🛧 Mitigation			Ac	Adaptation and Resilience			Fundamentals	
	Measurement	Reduction	Removal	Hazard For	ecasting	Vulnerability and Exposure manageme			
Subtopics and examples	Macro-level measurement e.g., estimating remote carbon natural stock	Reducing GHG emissions intensity e.g., supply forecasting	Environmental removal	Projecting long-term e.g., regionalize	trends	Managing crises e.g., monitoring epidemic		e.g., modeling of economic	
		for solar energy Improving energy efficiency e.g., encouraging behavioral change	e.g., monitoring encroachment on forests and other natural reserves	of sea-level rise or extreme events such as wildfires and floods		Strengthening infrastructure e.g., intelligent irrigation		and social transition	
	Micro-level measurement e.g., calculating the carbon footprint of individual products		Technological	Building		Protecting populations e.g., predicting large-scale		e.g., forecasting carbon prices	
		Reducing greenhouse effects e.g., accelerating aerosol and chemistry research	removal e.g., assessing carbon-capture storage sites	warning systems e.g., near-term prediction of extreme events such as cyclones		migration patterns Preserving biodivers e.g., identifying and counting species	sity Education, nudging, and behavioral change e.g., recommendations for climate-friendly consumption		
Uses for AI	Gather, complete, and process data Satellite and IoT data Filling gaps in temporally and spatially sparse data	Policy and climate-risk Modeling of higher-ord Bionic managem	analytics Supply chai ler effects Simulation	ize ses n optimization environments	timization Vertical data sharing		(Encourage climate- positive behaviors Climate-weighted suggestions ate-friendly optimization functions	

Sources: BCG project experience; Climate Change AI, "Tackling Climate Change with Machine Learning"; Global Partnership on AI, "Climate Change and AI: Recommendations for Government Action."

Note: GHG = greenhouse gas; IoT = Internet of Things.



Activities of AI for the the Planet Alliance

AI for the Planet Alliance is a newly formed neutral and international alliance to drive AI solutions for climate change at scale, seeks to catalyze global efforts in this domain through research and advocacy.

Promote innovation

in applying advanced analytics and artificial intelligence (AI) to climate challenges, supported by global experts from academia, startups, and the public and private sectors.

Act as a global platform

for identifying and prioritizing the leading tools and uses for AI in addressing the climate crisis.

Identify and champion the most promising solutions

to address climate change mitigation, as well as adaptation and resilience, especially in the Global South, giving the solutions visibility and recognition.

Ensure impact at scale

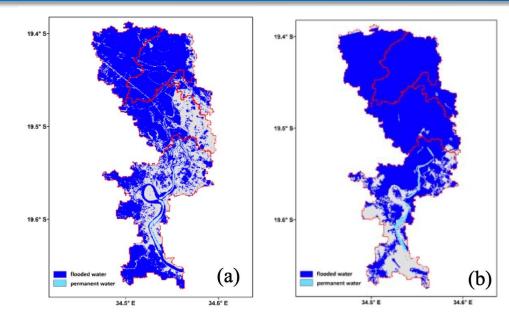
through concrete and measurable actions such as building access to funding and to practitioners on the ground.

Facilitate the development of networks

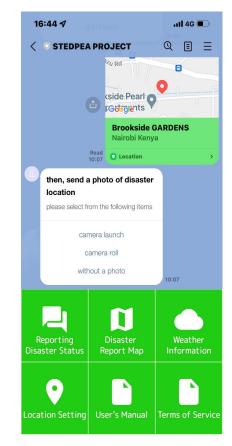
among project teams, investors, and experts in the field— including startups, corporations, and the public sector.



Other AI pilot activities



24-hour forecast of inundated areas at 30-m resolution for the five subcatchments of the lower Pungwe Basin, and b) effectively inundated areas during Cyclone Idai



AI Chatbot to improve the communication of disaster risk reduction

Publication on AI for Hydrology (end of 2024)

Applications of Al/ML in water management





By tracking the functionality of the integrated School-Road Networks, the Al algorithm calculates an optimized solution to minimize the disruption of education during flood and earthquake hazards





Al/ML applications for water resource management



Al: Artificial or synthetic Intelligence

Definitions (source: Chat-GPT):

• Artificial Intelligence (AI) is the theory en development of computer systems that can perform tasks that normally require *human intelligence*, such as visual perception, speech recognition, decision-making and translation between languages.

... and can repeatedly improve itself based on gathered information.

- Machine learning: a subset of AI where algorithms can improve their performance over time as they are exposed to more data.
- **Deep learning**: a subset of machine learning where multilayer neural networks learn from vast amounts of data.
- **Neural Network**: series of algorithms used in machine learning that can recognize patterns and relationships in large amounts of data. Neural networks use a logical structure inspired by the human brain and form the basis for deep learning algorithms.



Artificial Intelligence as a part of 'Data Science'

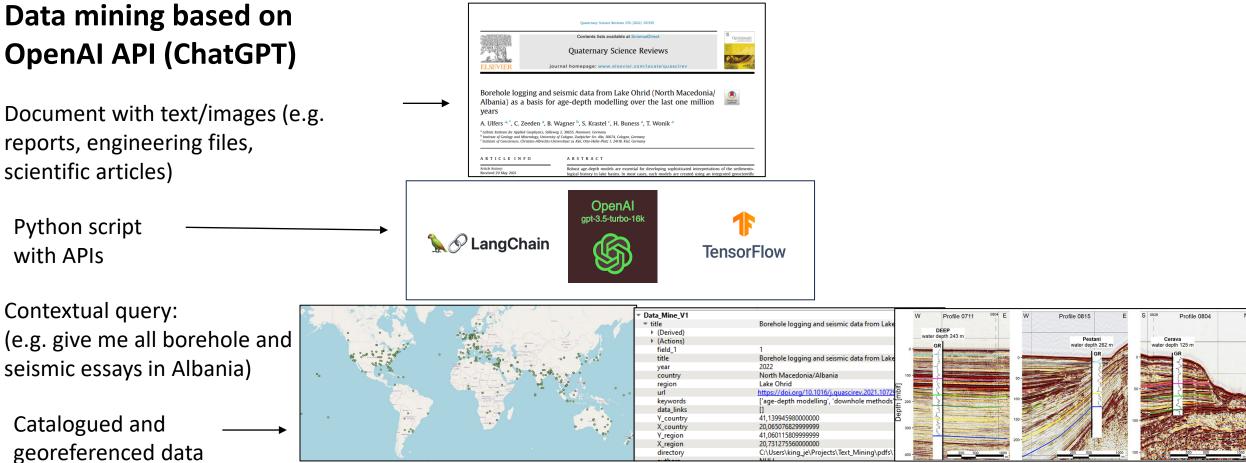
AI 'Fields of Work':

- 1. Generative Al
 - Large Language Models (LLM's)
 - e.g. ChatGPT by OpenAI: advanced chatbot
- 2. Al-based processing and analysis of large datasets
 - Photo's, video's, remote sensing data
- 3. 'Data-driven' model building
 - Classification
 - Regression
 - Clustering
- 4. Emulators or 'Surrogate Models'
 - Simulating existing numerical models



1. Generative Al

Extractie of grondwater data from 'grey literature'



1. Select georeferenced data

2. Check information 3. Extract automatically classified images



1. Generative Al

Better and faster coding of software

Easier coding of (tooling)software:

• <u>GitHub Copilot</u>: developed by GitHub in collaboration with OpenAI, works like a virtual co-coder that helps developers write better codes faster.

Recent (januari 2024):

• OpenAl:

"We're launching the GPT Store to help you find useful and popular <u>custom versions</u> of ChatGPT"



2. AI-based processing and analysis of large datasets

Computer Vision CNN

Automated detection of infrastructure from remote sensing (Dams detection)

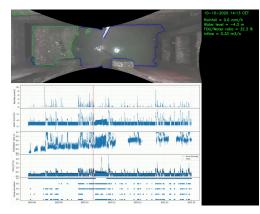
- Missing infrastructure (dams) in public/government records. Knowing the location, type and characteristics of dams is essential for quantifying and managing risk.
 - 1. Automated detection/classification of reservoirs
 - 2. Detection and segmentation of dam bodies and dam type (relevant for failure probability)
 - 3. Early Warning Systems for floating Vegetation Events

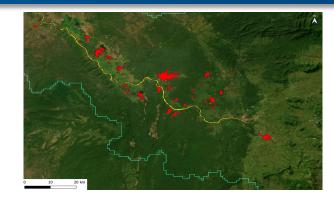
Laboratory setups

Hydraulic Laboratory – Automated plastics detection and 3D path reconstruction.
 Image processing for targeted object detection and time-space tracking.

FATracker

Pumping station fat-oil-grease detection









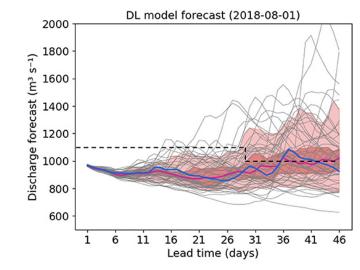
3. 'Data-driven' model building

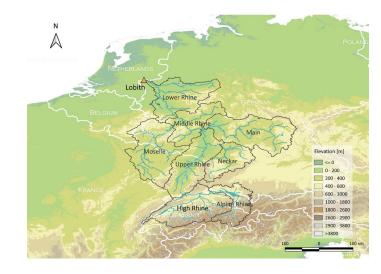
Operational low-flow forecasting model near Lobith

- Long-Short-Term-Memory-based model architecture has been designed to use both historical observations and predicted meteorological data to perform low water level forecasting for the Rhine at Lobith on a daily basis, with lead times of up to 46 days in advance.
- Long-Short-Term-Memory (LSTM) neural networks have outperformed traditional Rainfall-Runoff (RR) models in quality for several years:
- An RR model is a 'black box model'; it contains no deterministic concepts, precipitation and downstream discharge are 'fitted'.
- A neural network is a form of 'multi-dimensional regression' and 'discovers' patterns that are not in the fitted 'black-box' model.

Recent HESS-artikelen, by Kratzert et al. :

- Towards learning universal, regional, and local hydrological behaviors via machine learning applied to large-sample datasets
- <u>Toward Improved Predictions in Ungauged Basins: Exploiting the Power of Machine Learning</u>







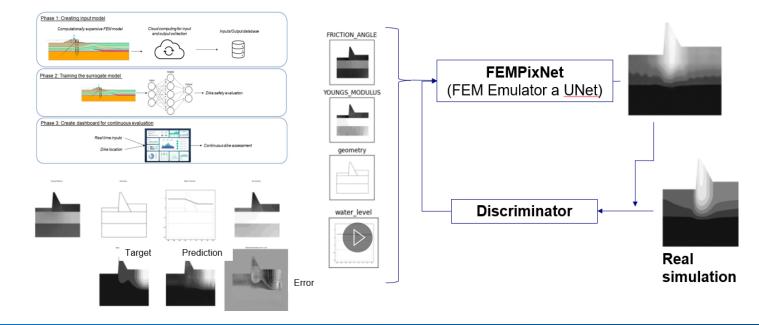
4. Emulators or 'Surrogate Models'

2D flood modeling:

• D-Flow FM, 3Di, HEC-RAS, TUFLOW, etc. contain physical deterministic concepts, for example, 'flooding over land surface'; however, they have long computation times.

Model Emulation: GAN based emulator of a sheet pile installation (FEMPixNET)

- Computationally expensive FEM model of a sheet pile (Kratos + STEM)
- 5000 simulations (cloud-based as training set)





Thank you





United Nations Educational, Scientific and Cultural Organization