The ISIMIP Groundwater Sector: A Framework for Ensemble Modeling of Global Change Impacts on Groundwater

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Abstract

Groundwater serves as a crucial freshwater resource for people and ecosystems, vital playing a vital role in adapting to climate change. Yet, its availability and dynamics are affected by climate variations, changes in land use, and excessive extraction. Despite its importance, our understanding of how global change will influence groundwater in the future remains limited. Multi-model ensembles are powerful tools for impact assessments; compared to single-model studies, they provide a more comprehensive understanding of uncertainties and enhance the robustness of projections by capturing a range of possible outcomes. However, to ~~this point~~date, no ensemble of groundwater models has been ~~was~~ available. Here, we present the new G~~g~~roundwater sector within ISIMIP, which combines multiple global, continental, and regional-scale groundwater models. We describe the rationale for the sector, present the sectoral output variables, and show ~~first~~the initial~~first~~ results of a model comparison. We further~~, and~~ outline the synergies with other existing ISIMIP sectors, such as the global water sector and the water quality sector. Currently, eight models are participating in this sector, ranging from gradient-based groundwater models to specialized karst recharge models, each producing up to 19 out of 23 modeling protocol-defined output variables. Utilizing available model outputs for a subset of participating models, we find that the arithmetic mean global water table depth varies substantially between models (6 - 127 m) and shows a shallower water table compared to other recent studies. Groundwater recharge also differs greatly in the global mean (78 - 228 mm/y), which is consistent with recent studies on the uncertainty of groundwater recharge, but with different spatial patterns. Groundwater recharge changes between 2001 and 2006 show plausible patterns that align with droughts in Spain and Portugal during this period. The simplified comparison highlights the value of a structured model intercomparison project, which will help to better understand the impacts of climate change on the world's largest accessible freshwater store – groundwater.

1 Introduction

Groundwater is the world's largest accessible freshwater resource, vital for human and environmental well-being (Huggins et al., 2023; Scanlon et al., 2023), serving as a critical buffer against water scarcity and surface water pollution (Foster and Chilton, 2003; Schwartz and Ibaraki, 2011). It supports irrigated agriculture, which supports 17% of global cropland and 40% of food production (Döll and Siebert, 2002; Perez et al., 2024; United Nations, 2022; Rodella et al., 2023). However, unsustainable extraction in many regions has led to declining groundwater levels, the drying of rivers, lakes and wells, land subsidence, seawater intrusion, and aquifer depletion (e.g., Bierkens and Wada (2019); de Graaf et al. (2019); Rodell et al. (2009)).

The pressure on groundwater systems intensifies due to the combined effects of population growth, socioeconomic development, agricultural intensification, and climate change, e.g., through a change in groundwater recharge (Taylor et al., 2013; Reinecke et al., 2021). Rising temperatures and altered precipitation patterns are already reshaping water availability and demand, with significant implications for groundwater use. For instance, changing aridity is expected to influence groundwater recharge rates (Berghuijs et al., 2024), yet the consequences for groundwater level~~s~~ dynamics remain limited (Moeck et al., 2024; Cuthbert et al., 2019). It is further unclear how these shifts will affect groundwater's role in sustaining ecosystems, agriculture, and human water supplies.

Understanding the impacts of climate change and the globalized economy on groundwater systems requires a large-scale perspective (Haqiqi et al., 2023; Konar et al., 2013; Dalin et al., 2017). While groundwater management is traditionally ~~occurs~~conducted at local or regional scales, aquifers often span administrative boundaries, and over-extraction in one area can have far-reaching effects not captured by a local model. Moreover, groundwater plays a critical role in the global hydrological cycle, influencing surface energy distribution, soil moisture, and evapotranspiration through processes such as capillary rise (Condon and Maxwell, 2019; Maxwell et al., 2016) and supplying surface waters with baseflow (Winter, 2007; Xie et al., 2024). These interactions underscore the importance of groundwater in buffering climate dynamics over extended temporal and spatial scales (Keune et al., 2018) and ~~require~~underscore the need for a global perspective of~~n~~ the water-climate cycle. While large-scale climate-groundwater interactions are starting to become understood (Cuthbert et al., 2019), current global water and climate models may not always capture these feedbacks as most either do not consider groundwater at all or only include a simplified storage bucket, limiting our understanding of how climate change will affect the water cycle as a whole.

The inclusion of groundwater dynamics in global hydrological models remains a considerable challenge due to data limitations and computational demands (Gleeson et al., 2021). Simplified representations, e.g., linear reservoir (Telteu et al., 2021), often fail to capture the complexity of groundwater-surface water interactions, lateral flows at local or regional scales, or the feedback between groundwater pumping and streamflow (de Graaf et al., 2017; Reinecke et al., 2019). These processes are crucial for evaluating water availability, particularly in regions heavily dependent on groundwater. For instance, lateral flows sustain downstream river baseflows and groundwater availability, which, in turn, impact~~ing~~ water quality and ecological health (Schaller and Fan, 2009; Liu et al., 2020). N~~ and n~~ot including head dynamics may lead to overestimation of groundwater depletion (Bierkens and Wada, 2019). Multiple continental to global-scale groundwater models have been developed in recent years to represent these critical processes (for an overview, see also Condon et al. (2021) and~~;~~ Gleeson et al. (2021).

While current model ensembles of global water assessments have not yet ~~included~~incorporated gradient-based groundwater processes, they have already significantly advanced our ~~large-scale~~ understanding of the large-scale groundwater system. The Inter-Sectoral Impact Model Intercomparison Project (ISIMIP), analogous to the Coupled Model Intercomparison Project (CMIP) for climate models (Eyring et al., 2016a), is a well-established community project to carry out model ensemble experiments for climate impact assessments (Frieler et al., 2017; 2024; 2025). The current generation of models in the Global Water Sector of ISIMIP often represents groundwater as a simplified storage that receives recharge, releases baseflow, and can be pumped (Telteu et al., 2021). Still, it lacks lateral connectivity and head-based surface-groundwater fluxes. Nevertheless, the ISIMIP water sector provided important insights on, for example, future changes and hotspots in global terrestrial water storage (Pokhrel et al., 2021), environmental flows (Thompson et al., 2021), the planetary boundary for freshwater change (Porkka et al., 2024), uncertainties in the calculation of groundwater recharge (Reinecke et al., 2021), and the development of methodological frameworks to compare model ensembles (Gnann et al., 2023).

Here, we present a new sector in ISIMIP called the ISIMIP Groundwater Sector, which integrates models of the groundwater community ~~currently available groundwater models~~ that operate at regional (at least multiple km^2 (Gleeson and Paszkowski, 2014)) to global scales and are committed to providing model simulations to this new sector. The G~~g~~roundwater sector aims to provide a comprehensive understanding of the current state of groundwater representation in large-scale models, identify groundwater-related uncertainties, enhance the robustness of predictions regarding the impact of global change on groundwater and connected systems through model ensembles, and provide insight into how to most reliably and efficiently model groundwater on regional to global scales. The new G~~g~~roundwater sector is a separate but complementary sector to the existing G~~g~~lobal

W~~w~~ater sector. To our knowledge, there are currently no long-term community efforts for a structured model intercomparison project for groundwater models. While studies have benchmarked different modeling approaches (e.g., Maxwell et al. 2014), ~~or~~ compared model outputs (Reinecke et al., 2021; 2024), or collected information on where and how we model groundwater (Telteu et al., 2021; Zipper et al., 2023; Zamrsky et al., 2025), no effort yet aims at forcing different groundwater models with the same climate and human forcings for different scenarios.

Specifically, the ISIMIP G~~g~~roundwater sector will compile a model ensemble that enables us to assess the impact of global change on various groundwater-related variables and quantify model and scenario-related uncertainties. These insights can then be used to quantify the impacts of global change on, for example~~e.g.~~, water availability and in relation to other sectors impacted by changes in groundwater. The ISIMIP G~~g~~roundwater sector has natural linkages with other ISIMIP sectors, such as G~~g~~lobal W~~w~~ater, W~~w~~ater Q~~q~~uality, R~~r~~egional W~~w~~ater, and A~~a~~griculture. This paper will highlight the connections between groundwater and ~~these other~~different ISIMIP sectors, providing an opportunity to ~~improve~~enhance our understanding of how modeling choices affect groundwater simulation dynamics.

2 The ISIMIP framework

ISIMIP aims to provide a framework for consistent climate impact data across sectors and scales. It facilitates model evaluation and improvement, enables climate change impact assessments across sectors, and provides robust projections of climate change impacts under different socioeconomic scenarios. ISIMIP uses a subset of bias-adjusted climate models from the CMIP6 ensemble. The subset is selected to represent the broader CMIP6 ensemble while maintaining computational feasibility for impact studies (Lange, 2021).

ISIMIP has undergone multiple phases, with the current phase being ISIMIP3. The simulation rounds consist of two main components: ISIMIP3a and ISIMIP3b, each serving distinct purposes. ISIMIP3a focuses on model evaluation and the attribution of observed climate impacts, covering the historical period up to 2021. It utilizes observational climate and socioeconomic data and includes a counterfactual "no climate change baseline" using detrended climate data for impact attribution. Additionally, ISIMIP3a includes sensitivity experiments with high-resolution historical climate forcing. In contrast, ISIMIP3b aims to quantify climate-related risks under various future scenarios, covering pre-industrial, historical, and future projections. ISIMIP3b is divided into three groups: Group I for pre-industrial and historical periods, Group II for future projections with fixed 2015 direct human forcing, and Group III for future projections with changing socioeconomic conditions and representation of adaptation. Despite their differences in focus, time periods, and data sources, both ISIMIP3a and ISIMIP3b require the use of the same impact model version to ensure consistent interpretation of output data, thereby contributing to ISIMIP's overall goal of providing a framework for consistent climate impact data across sectors and scales.

The creation of a new ISIMIP Groundwater sector is not linked to any funding and is a community-driven effort that includes all modeling groups that wish to participate. During the creation process, multiple groups and institutions were contacted to participate, and additional modeling groups are welcome to join the sector in the future. Models participating in the sectors do not need to be able to model all variables and scenarios defined in the protocol. ISIMIP sectors can be linked to broader thematic concepts, such as Agriculture, or can focus on specific components of the Earth system, such as Lakes or Groundwater (see also https://www.isimip.org/about/#sectors-and-contacts). The separation into these sectors is driven by the availability of models that can be integrated into a model-intercomparison framework, which is based on the same climatic and human forcings and produces a set of comparable output variables. We would like to note that groundwater is not an isolated system, but rather part of the water cycle and the Earth system as a whole. ~~Still, f~~Focusing on it within a dedicated sector aligns well with the existing models and is useful for studying groundwater systems in a thematically focused way. Collaboration (and perhaps integration) with sectors like the Global Water sector is possible and ~~also~~ desirable in the future. ~~While intersectoral collaboration is desirable, it is not a necessity; w~~We discuss possible future synergies with other existing ISIMIP sectors in Section 5.

In the short term, the G~~g~~roundwater sector will focus on the historical period from 1901 to ~~-~~2019 in ISIMIP3a (https://protocol.isimip.org/#/ISIMIP3a/water_global/groundwater), utilizing~~ with the~~ climate-related forcing based on observational data (obsclim) and the direct human forcing based on historical data (histsoc). We aim to use~~tilize~~ these simulations for an in-depth model comparison, including a comparison to observational data such as time series of groundwater table depth (e.g., Jasechko et al.~~ ~~, ~~(~~2024~~)~~) and by utilizing so-called functional relationships (Reinecke et al., 2024; Gnann et al., 2023). Functional relationships can be defined as covariations of variables across space and/or time, and they are a key aspect of our theoretical knowledge of Earth's functioning. Examples include relationships between precipitation and groundwater recharge (Gnann et al. 2023; Berghuijs et al. 2024) or between topographic slope and water table depth (Reinecke et al., 2024).~~We aim to utilize these simulations for an in-depth model comparison, including a comparison to observational data such as time series of groundwater table depth (e.g., Jasechko et al. (2024)) and by utilizing functional relationships (Reinecke et al., 2024).~~

This will yield a new understanding of how these models differ, what the reasons for these differences are, and how they could be improved. In addition, it will provide a basis for implementing impact analyses with ensemble runs based on future scenarios using ISIMIP3b inputs.

3 The current generation of groundwater models in the sector

Many large-scale groundwater models are already participating in the sector (Table 1), and we expect it to expand further. The current models are mainly global-scale, with some having a particular regional focus, and primarily using daily timesteps.

While the ~~main~~primary modeling purpose of most models is to simulate parts of the terrestrial water cycle, they all focus on different aspects (such as karst recharge or sea-water intrusion), most investigate interactions between groundwater and land surface processes, and account for human water uses. Two models (V2KARST and GGR) have distinct purposes in modeling groundwater recharge and do not model any head-based groundwater fluxes. Conceptually, the models may be classified according to Condon et al. (2021) into five categories: lumped models with static groundwater configurations of long-term mass balance (a), saturated groundwater flow with recharge, and surface water exchange fluxes as upper boundary conditions without lateral fluxes (b), quasi 3D models with variably saturated flow in the soil column and a dynamic water table as a lower boundary condition (c), saturated flow models solving mainly the Darcy equation (d), and variably saturated flow which is calculated as three-dimensional flow throughout the entire subsurface below and above the water table (e). See Condon et al. (2021) and also Gleeson et al. (2021) for a more detailed overview and discussion of approaches. Half of the models (Table 1) simulate a saturated subsurface flux (d), while V2KARST and GGR mainly use a 1D vertical approach (b), and others simulate a combination of multiple approaches (ParFlow, Table 1) or can switch between different approaches (CWatM, Table 1).

The sector protocol is defined at https://protocol.isimip.org/#/ISIMIP3a/groundwater and will be updated over time. We have defined multiple joint outputs for this sector (23 variables in total), but not all models can yet provide all outputs (Table 2). Models can provide 1-19 outputs (11 on average), and multiple models have ~~further~~additional outputs that are currently under development. The global water sector also contains groundwater-related variables (Table A2), enabling groundwater-related analysis. We list them here to show their close connection to the global water sector and facilitate an overview of future groundwater-related studies.

The current sector protocol defines a targeted spatial resolution of 5 arcmin, as this represents not only the resolution achievable by most global models but also the coarsest resolution at which meaningful representation of groundwater dynamics, particularly lateral groundwater flows and water table depths, can still be captured (Gleeson et al., 2021). ISIMIP3 also specifies experiments with different spatial resolutions, but whether this is achievable with a sub-ensemble of the presented models remains unclear, as it depends on the available computational time, flexibility of model setups, and data availability. To ensure consistency and comparability, the model outputs are currently post-processed by the modeling groups to aggregate their outputs to the protocol-specified spatial and temporal resolutions.

Table 1: Summary of all models participating in the ISIMIP G~~g~~roundwater sector. This table lists only models that add new variables to the ISIMIP protocol. Models already part of the global water sector and providing other groundwater-related variables are not listed here. (GMD discussion formatting requires a portrait instead of a landscape table)

Model name	**Main model purpose**	**Coupling with other models**	**Spatial domain and resolution**	**Temporal resolution**	**Hydrogeological configuration, e.g. number of layers**	**Conceptual model according to Condon et al.**	**Calibrated**	**Representation of groundwater use**	**Main Reference**
Water Balance Model (WBM)	Representation of the terrestrial hydrologic cycle, including	-	Global and regional. Spatial resolution defined by the input	Sub-daily, Daily, Multi-day	1 soil layer, 2 groundwater layers	d.	Globally: no, regional: yes (NE, US)	Through calculated abstractions from groundwater.	Grogan et al. (2022) With groundwater methods based on

	human interactions.		river network.						de Graaf et al. (2015); de Graaf et al. (2017).
Community Land Model (CLM)	To simulate surface and sub-surface hydrologic processes, including crop growth, irrigation, and groundwater withdrawal.	Community Earth System Model (CESM)	Global and regional (0.05 (regional), 0.1, 0.25, and 0.5 degree (global))	Sub-Daily	20 soil layers extending up to 8.5 m; 1 aquifer layer, unconfined	c.	No	Yes	Felfelani et al. (2021) Lawrence et al. (2019)
Community Water Model (CWatM)	To reproduce main hydrologic processes, including water management on regional to global scales.	MODFLOW (optional)	Global, regional, subbasin (30 arcseconds, 1 km, 1 arc-min, 5 arc-min, 30 arc-min)	Daily	Standard: 1 with MODFLOW: variable	Standard: a./b. With MODFLOW: d.	Globally: yes (with discharge), regional: tailored	Yes	Guillaumot et al. (2022); Burek et al. (2020)
Global Gradient-based Groundwater Model (G³M)	Understanding of surface water, coastal, and ecosystem interaction with groundwater.	WaterGAP (Müller Schmied et al., 2016)	Global (5 arc minutes)	Daily, monthly, or yearly	2 layers, second layer with a reduced hydraulic conductivity	d.	No	Through calculated net abstractions from groundwater of WaterGAP	Reinecke et al. (2019); Kretschmer et al. (2025)
VIC-WUR-MODFLO	Grid-based macro-	WOFOST (WOrld FOod	Regionally and globally:	Sub-daily to monthly	3 soil layers (variable	d.	Globally: no,	Through calculated demands	Liu et al in prep.;

W (VIC-wur)	scale hydrological model that solves both the surface energy balance and water balance equations.	STudies) (Droppers et al 2021)	5 arcminutes		thickness), 2 groundwater layers (variable thickness, confined/unconfined systems.		regional: yes	and allocation to surface water/ groundwater.	Droppers et al. 2020.; Liang et al. (1994)
V2KARST	A grid-based vegetation–recharge model for the global karst areas.	-	Globally: 0.25 arc degree	Daily	three soil layers and one epikarst layer	b.	Yes, based on global karst landscapes	no	Sarrazin et al. (2018)
Global Groundwater Rain-fed Recharge (GGR) ~~GGR~~	A grid-based three-layer water balance model to estimate the daily global rain-fed groundwater recharge	-	180.0°W to 180.0°E longitudes and 60.0°N to 60.0°S latitudes, 0.1 degree	Daily	2 soil layers and 1 groundwater layer of variable thickness	b.	No	No	Nazari et al. (2025)
ParFlow	3D continuum simulations of variably saturated groundwater-surface water and land surface processes.	Common Land Model, CLM (Maxwell and Miller, 2005; Kollet and Maxwell, 2008), Terrestrial Systems Modeling Platform	Regionally and globally, 10^0 – 10^1km	Variable	Variable	a. - e.	Yes, in engineering applications	Yes	Kuffour et al. (2020)

		(Gasper et al., 2014), WRF (Maxwell et al., 2011)							

Table 2: List of output variables in the ISIMIP3a ~~global G~~Groundwater sector. The spatial resolution is five arcminutes (even if some models simulate at a higher or coarser resolution), and the temporal resolution is monthly. Most models also simulate daily timesteps, but as most groundwater movement happens across longer time scales, we unified the unit to months. A "*" indicates that a model is able to produce the necessary output. A "+" indicates that this output is currently under development. (GMD discussion formatting requires a portrait instead of a landscape table)

Groundwater sector output variables		Unit	WBM	*CLM*	*CWatM*	G³M	*VIC-wur*	V2KARST	*GGR*	*ParFlow*
Name	**Description**									
Capillary rise	Upward flux from groundwater to soil (leaving aquifer = negative value).	m3 m-2 month-1		*	*		*			*
Diffuse groundwater recharge	Downwards flux from soil to groundwater (entering aquifer = positive value). The unit kg m^{-2} s^{-1} is equal to mm s^{-1}. Unit is kept equal to the global water sector.	kg m-2 s-1	*	*	*		*	*	*	*
Groundwater abstractions	Groundwater pumped from the aquifer.	m3 m-2 month-1	*	*	*		+		+	
Groundwater abstractions (domestic)	*Groundwater abstractions* that are intended for domestic water use.	m3 m-2 month-1	*		*		+		+	

Groundwater abstractions (industries)	*Groundwater abstractions* that are intended for industrial water use.	m3 m-2 month-1	*		*		+		+	
Groundwater abstractions (irrigation)	*Groundwater abstractions* that are intended for irrigational water use.	m3 m-2 month-1	*	*	*		+		+	
Groundwater abstractions (livestock)	*Groundwater abstractions* that are intended for livestock water use.	m3 m-2 month-1	*		*		+			
Groundwater demands	Gross water demand	m3 m-2 month-1	*	*	*		+			
Groundwater depletion	Long-term losses from groundwater storage	m3 m-2 month-1	*	*		*	+			*
Groundwater drainage/surface water capture	Exchange flux between groundwater and surface water. Groundwater leaving the aquifer = negative value; entering the aquifer = positive value	m3 m-2 month-1	*	*	*	*	*			*
Groundwater drainage/surface water capture from lakes	Exchange flux between groundwater and surface water (lakes); if available, additional to the sum of exchange fluxes (Groundwater drainage/surface water capture) also separate components can be provided/ Leaving the aquifer = negative values; entering the aquifer = positive value.	m3 m-2 month-1				*	*			*
Groundwater drainage/surface water capture from rivers	Exchange flux between groundwater and surface water (rivers); if available, additional to the sum of exchange fluxes (Groundwater drainage/surface water capture) also separate components can be provided/ Leaving the aquifer = negative values; entering the aquifer = positive value.	m3 m-2 month-1	*			*	*			*
Groundwater drainage/surface water capture from springs	Exchange flux between groundwater and surface water (springs); if available, additional to the sum of exchange fluxes (Groundwater drainage/surface water capture) also separate components can be provided/ Leaving the aquifer = negative	m3 m-2 month-1				*	*			*

	values; entering the aquifer = positive value.									
Groundwater drainage/surface water capture from wetlands	Exchange flux between groundwater and surface water (wetlands); if available, additional to the sum of exchange fluxes (Groundwater drainage/surface water capture) also separate components can be provided/ Leaving the aquifer = negative values; entering the aquifer = positive value.	m3 m-2 month-1				*	*			*
Groundwater return flow	Return flow of abstracted groundwater (not yet separated into different sources).	m3 m-2 month-1	*	*			.		.	*
Groundwater storage	Mean monthly water storage in groundwater layer in kg m^{-2}. The spatial resolution is 0.5° grid.	m3 m-2 month-1	*	*		*	*			*
Hydraulic head	Head above sea level in m. If more than one aquifer layer is simulated, report the heads on the top productive aquifer (confined or unconfined).	m	*			*	*			*
Lateral groundwater flux (front face)	Cell-by-cell flow (front)	m3 m-2 month-1	*	*		*	*			*
Lateral groundwater flux (right face)	Cell-by-cell flow (right)	m3 m-2 month-1	*	*		*	*			*
Lateral groundwater flux (net)	Net cell-by-cell flow	m3 m-2 month-1	*	*		*	*			*
Lateral groundwater flux (lower face)	Cell-by-cell flow (lower) when more than 1 groundwater layer is simulated.	m3 m-2 month-1	*			*	*			*
Submarine groundwater discharge	Flow of groundwater into oceans. The definition may vary by model. But in principle also models without density driven flow can submit this variable.	m3 m-2 month-1	*			*				*
Water table depth	Depth to the water table below land surface (digital elevation mode, DEM) in m.	m	*	*		*	*			*
Number of groundwater output	Counting only currently available		**19**	**13**	**9**	**14**	**14**	**1**	**1**	**17**

variables in model										

4 Unstructured experiments point out model differences that should be explored further

The ISIMIP groundwater sector is in an early development stage, and we hope that an ensemble of groundwater models driven by the same meteorological data will be available soon. Yet, to provide first insights into the models, their outputs, and how these can be compared, we collected existing outputs from the participating models (see Table A1 for an overview). We opted for a straightforward initial comparison due to the various data formats, model resolutions, and forcings that complicate a more thorough examination of a specific scientific inquiry. One of our goals in the Groundwater sector is to conduct extensive analysis to better illustrate and understand the model differences. The analysis presented here is intended solely as an introductory overview to provide a sense of the rationale behind our initiative. Some overlap with recent model comparison studies naturally exists (e.g., Gnann et al., 2023; Reinecke et al., 2024, Reinecke et al. 2021); however, ~~even though this brief~~ the presented~~current work~~ analysis contains a different ensemble of models~~,~~ and thus ~~thus~~ provides~~s~~ ~~some~~ new insights. ~~Thus~~Hence, this descriptive analysis serves as an introductory overview that highlights the present state of the art and identifies model discrepancies warranting further investigation. In addition, relevant output data are not yet available for all models. We focused on the two variables with the largest available ensemble: water table depth (G^{3}M, CLM, WBM, and VIC-wur; Table 1) and groundwater recharge (CLM, CWatM, GGR, VIC-wur, V2KARST, WBM; Table 1), only on historical periods rather than future projections.

The arithmetic mean (not weighted by cell area) global water table depth varies substantially (6 m – 127 m) between the models at the start of the simulation (1980 or steady-state) (Fig. 1a). On average, the water table of G^{3}M (28 m) and CLM (6 m) are shallower than WBM (127 m) and VIC-wur (81 m), whereas the latter two also show a larger standard deviation (WBM: 133 m, VIC-wur: 105 m) than the other two models (G^{3}M: 49 m, CLM: 3 m). The consistently shallower WTD of CLM impacts the ensemble mean WTD (Fig. 1b), which is shallower compared to other model ensembles (5.67 m WTD as global mean here compared to 7.03 m in Reinecke et al. (2024)).

-This difference in ensemble WTD points to conceptual differences between the models. G^{3}M and CLM both use the relatively shallow WTD estimates of Fan et al. (2013) as initial state or spin-up, which could explain the overall shallow water table depth. The difference between G^{3}M and VIC-wur is consistent with the findings in Reinecke et al. (2024), which showed a deeper water table simulated by the de Graaf et al. (2017) groundwater model, which developed an aquifer parameterization adapted and conceptually similar to VIC-wur and WBM. This difference may be linked to the implementation of groundwater drainage/surface water infiltration or transmissivity parameterizations (Reinecke et al., 2024) as well as differences in groundwater recharge (Reinecke et al., 2021). Furthermore, the models are not yet driven by the same climatic and human forcings, thereby possibly causing different model responses. The newly initiated ISIMIP Groundwater sector offers an opportunity to investigate these differences much more systematically in future studies, for example, by ruling out forcing as a driver of the model differences and by exploring spatial and temporal relationships with key groundwater drivers such as topography (e.g., Reinecke et al., 2024). In addition, the ISIMIP Groundwater sector provides a platform for using the modelling team's expertise on their model implementations (e.g., model structures and parameter fields) to better understand the origins of these differences~~This difference in ensemble WTD points to conceptual~~

differences between the models, which should be investigated further, for example, by exploring spatial and temporal differences and relationships with important groundwater drivers (Reinecke et al., 2024).which should be investigated further, for example, by exploring spatial and temporal differences and relationships with important groundwater drivers (Reinecke et al., 2024).

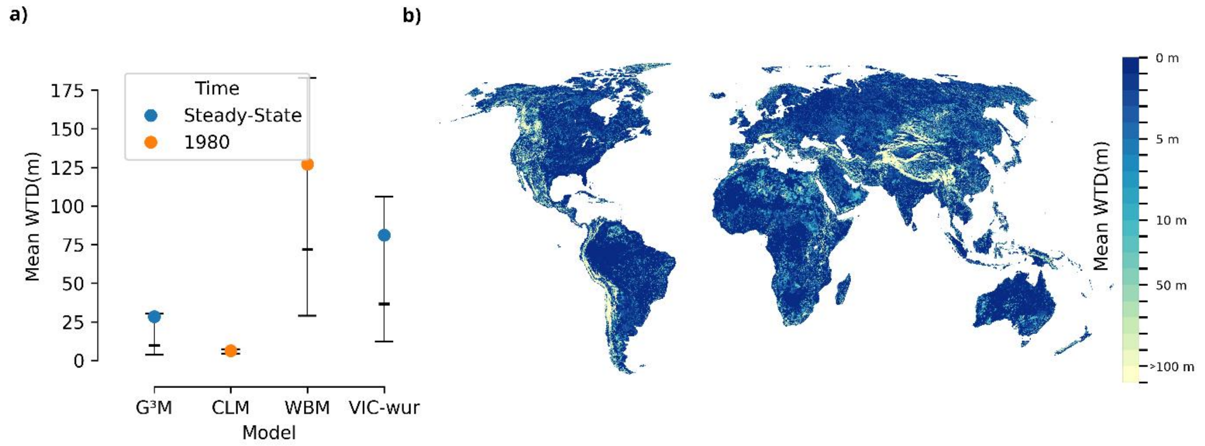

Figure 1: Global water table depth (WTD) at simulation start (1980) or the used steady-state. The simplified boxplot (a) shows the arithmetic model mean as a colored dot and the median as a black line. Whiskers indicate the 25th and 75th percentiles, respectively. The global map (b) shows the arithmetic mean of the model ensemble. Models shown are not yet driven by the same meteorological forcing (see also table A1).

Similarly, the global arithmetic mean groundwater recharge (not weighted by cell area) differs by 332 mm/y between models (150 mm/y excluding V2KARST since it calculates recharge in karst regions only) (Fig. 2a). This difference in recharge is more pronounced spatially (Fig. 2b) than differences in WTD shown before (Fig. 1b). Especially in drier regions such as in the southern Africa, central Australia, and the northern latitudes show coefficient of variation of 1 or greater (white areas). In extremely dry areas such as the east Sahara and southern Australia, the model spread is close to 0 (dark green). While the agreement is higher in Europe and western South America, the global map differs slightly from other recent publications (e.g., compared to Fig. 1b in Gnann et al. (2023)). In light of other publications, highlighting model uncertainty in groundwater recharge (Reinecke et al., 2021, Kumar et al., 2025) and the possible impacts of long-term aridity changes on groundwater recharge (Berghuijs et al., 2024), an extended combined ensemble of the global water sector and the new Ggroundwater sector could yield valuable insights.

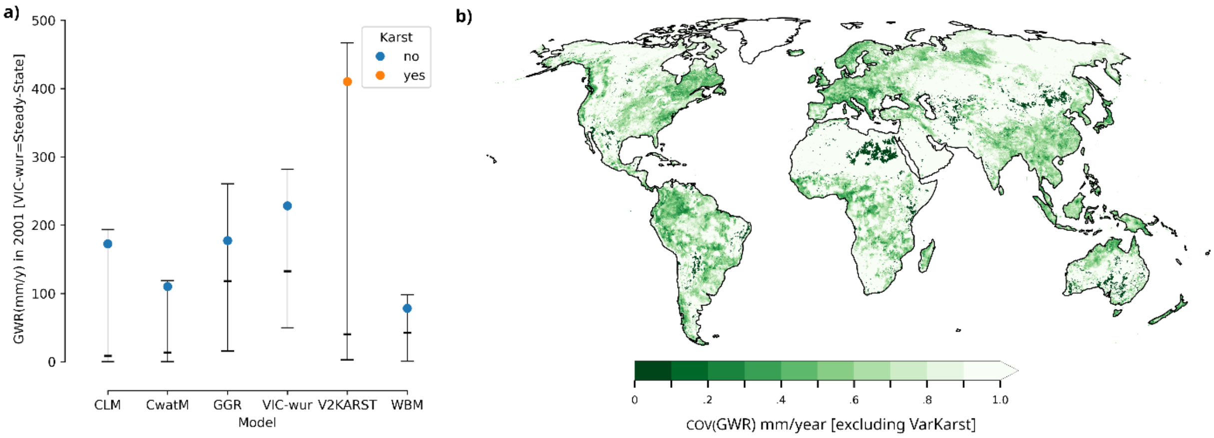

Figure 2: Global groundwater recharge (GWR) in 2001 or at steady-state (only VIC-wur). The simplified boxplot (a) shows the arithmetic model mean as a colored dot and the median as a black line. Whiskers indicate the 25th and 75th percentiles, respectively. The global map (b) shows the coefficient of variation of the model ensemble without V2KARST. Models shown are not yet driven by the same meteorological forcing (see also table A1).

We further calculated relative changes in groundwater recharge between 2001 and 2006 (Fig. 3) with an ensemble of 7 models (CLM, CWatM, GGR, VIC-wur, V2KARST, WBM, and ParFlow). The ensemble includes two models that only simulate specific regions (V2KARST: regions of karstifiable rock, ParFlow: Euro CORDEX domain). This result shows a potential analysis that should be repeated within the new Ggroundwater sector. Intentionally, we do not investigate model agreement on the sign of change or compare them with observed data. The ensemble still highlights plausible regions of groundwater recharge changes, such as in Spain and Portugal, which aligns with droughts in the investigated period (Paneque Salgado and Vargas Molina, 2015; Coll et al., 2017; Trullenque-Blanco et al., 2024). Relative increases in groundwater recharge are mainly shown for arid regions in the Sahara, the Middle East, Australia, and Mexico. However, it is likely that because we investigate relative changes, this might be related to the already low recharge rates in these regions.

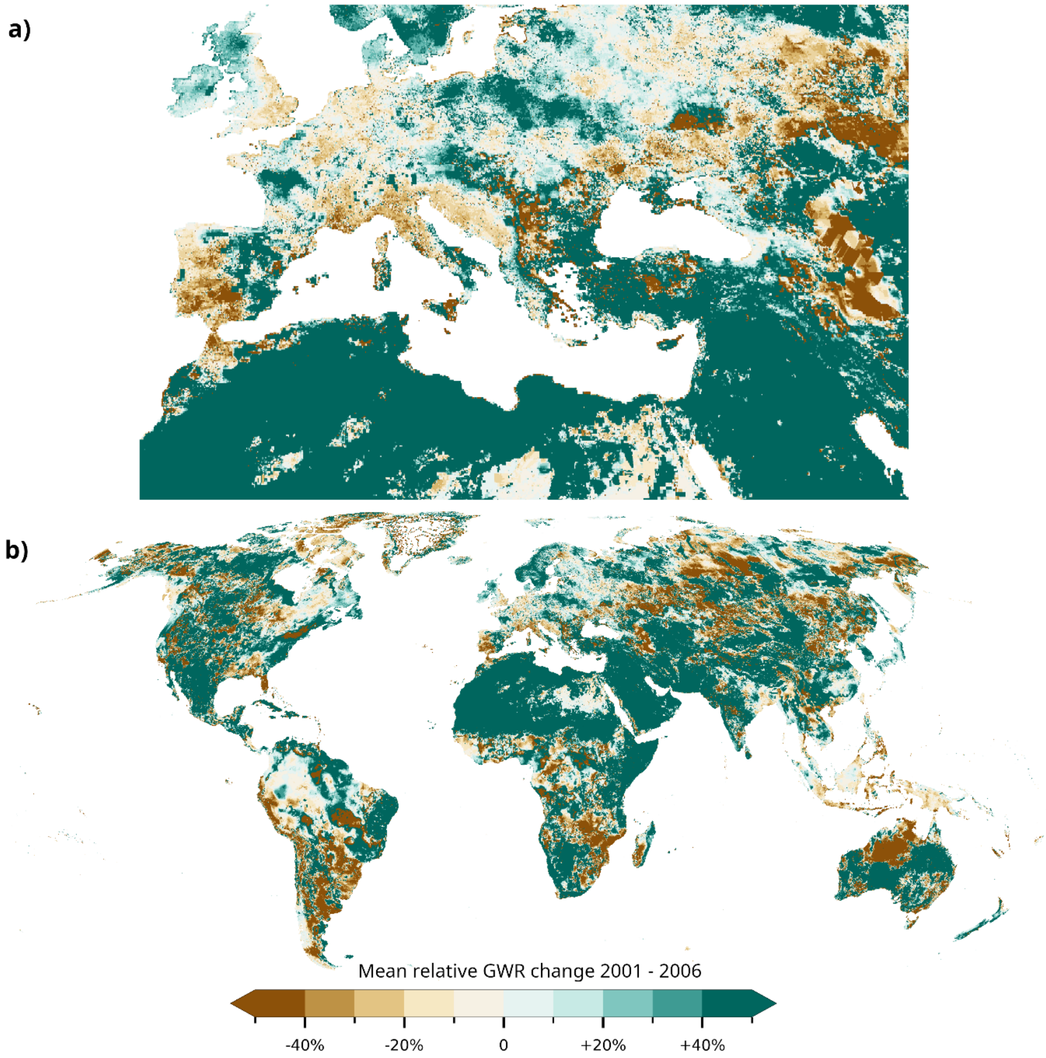

Figure 3: Mean relative percentage change of yearly groundwater recharge between 2001 and 2006 for Europe (a), and all continents except Antarctica (b). The ensemble consists of all models that provided data for the years 2001 and 2006 (CLM, CWatM, GGR, VIC-wur, V2KARST, WBM, and ParFlow). V2KARST (only karst) and ParFlow (only Euro CORDEX domain) were only accounted for in regions where data is available. Models shown are not yet driven by the same meteorological forcing (see also table A1).

5 Groundwater as a linking sector in ISIMIP

ISIMIP encompasses a wide variety of sectors. Currently, 18 sectors are part of the impact assessment effort. The G~~g~~roundwater sector offers a new and unique opportunity to enhance cross-sectoral activities within ISIMIP, foster interlinkages within ISIMIP, and thus deliver interdisciplinary assessments of climate change impacts.

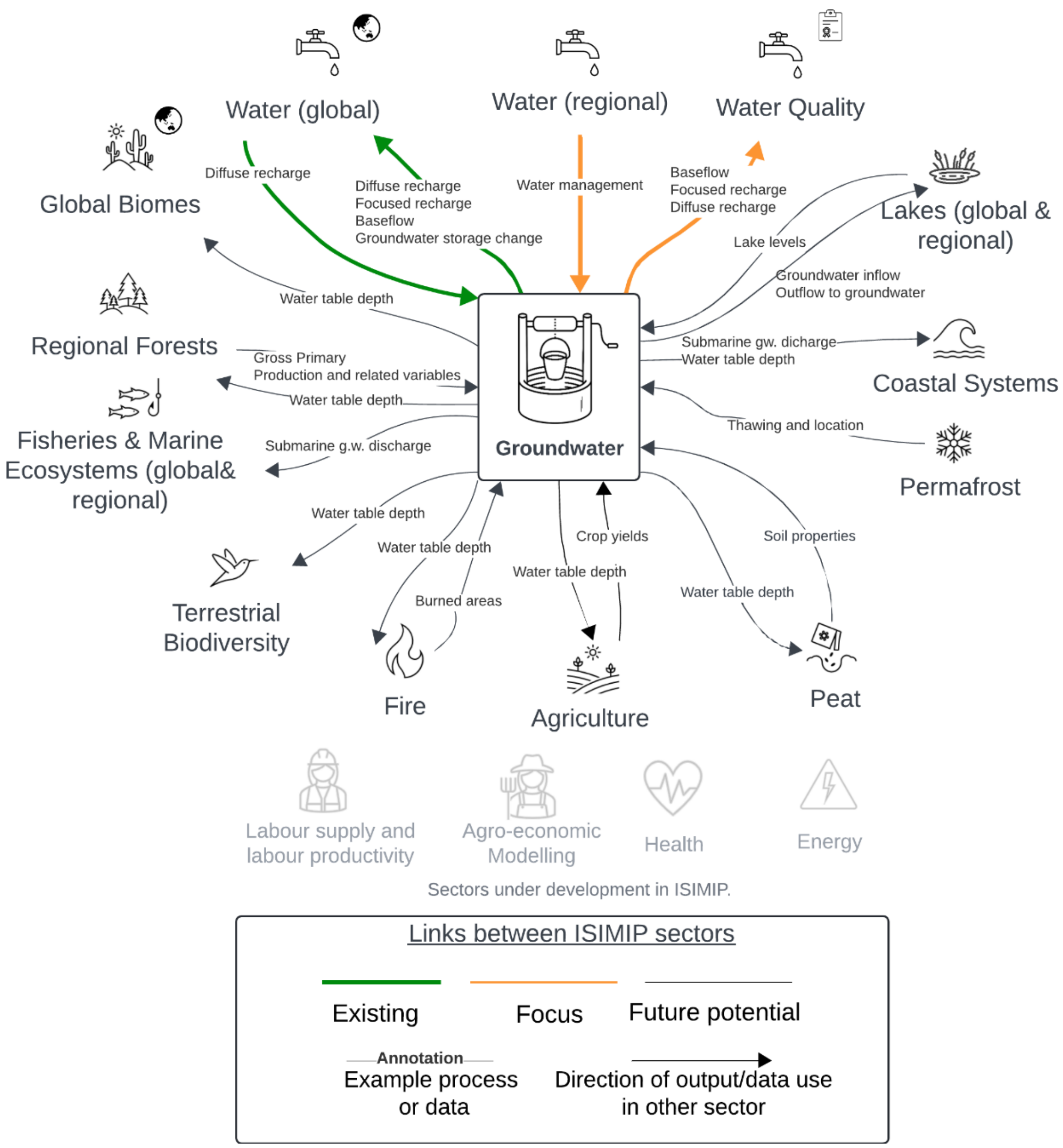

Figure 4: The G~~g~~roundwater sector provides the potential for multiple interlinkages between different sectors within ISIMIP. In the coming years, we will focus on links to three sectors (green and orange): W~~w~~ater (global), W~~w~~ater (regional), and W~~w~~ater Q~~q~~uality. Other cross-sectoral linkages between non-G~~g~~roundwater sectors (i.e., linkages between the outer circle) are not shown. Sectors that are currently under development or have not yet have data or outputs that could be shared or used for cross-sectoral assessments are shown in gray. Interactions between sectors are annotated with example processes, key variables, or datasets that can be shared between sectors.

Some links with other sectors within ISIMIP are more evident than others with regard to existing scientific community overlaps or existing scientific questions (Fig. 4). The examples of variables and data that can be shared among sectors shown in Fig. 4 provide a non-exhaustive description of current variables that the sectors already describe in their protocols. Whether cross-sectoral assessments will utilize this available data is up to the modeling teams that contribute to the sectors. ~~–~~For example, the new G~~g~~roundwater sector will focus on large-scale groundwater models, some of which are already part of global water models participating in the G~~g~~lobal W~~w~~ater S~~s~~ector or using outputs (such as groundwater recharge) from the G~~g~~lobal W~~w~~ater S~~s~~ector (see also existing groundwater variables in the global water sector Table A2). However, the Ggroundwater sector will also feature non-global representations of groundwater. Thus, collaborating with the Rregional Wwater sector could provide opportunities to share outputs and pursue common assessments. For example, the outputs of the groundwater model ensemble, such as water table depth variations or surface water groundwater interactions, could be used as input for some regional models that consider groundwater only as a lumped groundwater storage. Conversely, global and continental groundwater models can learn from validated regional hydrological models, which may provide insights into local runoff generation processes and benefit from validated regional hydrological models, which may provide valuable insights into local runoff generation processes and the impacts of water management.

Furthermore, the relevance of groundwater for water quality assessments is widely recognized (e.g., for phosphorous transport from groundwater to surface water (Holman et al., 2008), or for salinization (Kretschmer et al., 2025))), or as a link between warming groundwater and stream temperatures (Benz et al., 2024). And the community effort of Friends of Groundwater called for a global assessment of groundwater quality (Misstear et al., 2021). The Water Quality sector could incorporate model outputs from the Groundwater sector as input to improve, for example, their estimates of groundwater contributions to surface water quantity or leakage of surface water to groundwater. On the other hand, the Groundwater sector can utilize estimates of the Water Quality sector to better assess water availability by incorporating water quality criteria. Ultimately, this may also result in advanced groundwater models in the Groundwater sector that account for quality-related processes directly, which can then be integrated into a future modeling protocol. One of the models (G³M; see Table 1) is already capable of simulating salinization processes.

Leveraging such connections between sectors will provide valuable insights beyond groundwater itself. The outputs and models that can be used for intersectoral assessments depend on the research question and may necessitate the use of only a subset of models from an ensemble. Leveraging such connections will provide valuable insights beyond groundwater itself.

Specifically, considering groundwater quality, a collaboration between both sectors could be achieved in multiple aspects. Integrating groundwater availability with water quality helps ensure sufficient and safe drinking and irrigation water. Focusing on aquifer storage levels and pollutant loads can help maintain groundwater resilience, safeguard food security, and protect public health under changing climate and socioeconomic conditions. Further, integrating groundwater quantity data with pollution source mapping helps prioritize remediation efforts where aquifers are most vulnerable, ensuring both water availability and quality. Concerning observational data, a unified approach to collecting and developing shared databases for groundwater levels and water quality measurements across multiple agencies reduces bureaucratic hurdles and ensures consistent, comparable data. Using standardized procedures for dealing with observational uncertainties such as data gaps, scaling issues, and measurement inconsistencies, such as data gaps, scaling issues, and measurement inconsistencies, would support collaborative research further.

Research opportunities arise in other sectors as well. Groundwater is connected to the water cycle and social, economic, and ecological systems (Huggins et al., 2023). For example, health impacts (such as water- and vector-borne diseases) are closely related to water quantity and quality (e.g. Smith et al. (2024)), and the roles of groundwater for forest resilience (regional forest sector, (Costa et al., 2023; Esteban et al., 2021)) and forest fires (fire sector) under climate change are yet to be explored (Fig. 4). To prioritize our efforts and set a research agenda for the groundwater ISIMIP sector, we will first focus on existing and more straightforward connections to the global water sector, regional water sector, and the water quality sector and then expand to collaboration with other sectors (Fig. 4).

6 A vision for the ISIMIP groundwater sector

Given groundwater's importance in the Earth system and for society, it is imperative to expand our knowledge of groundwater and (1) how it is impacted by ~~global~~ climate change and other human forcings and (2) how, in turn, this will affect other systems connected to groundwater. This enhanced understanding is essential to equip us with the knowledge needed to address future challenges effectively. The ISIMIP G~~g~~roundwater sector serves as a foundation for examining and measuring the effects of global change on groundwater systems worldwide. It facilitates cross-sector investigations, such as those concerning water quality, examines the influence of various model structures on groundwater dynamics simulations, and supports the collaborative creation of new datasets for model parameterization and assessment.

Already in the short term, the creation of the G~~g~~roundwater sector has substantial potential to enhance large-scale groundwater research by developing better modeling frameworks for reproducible research (running the multitude of experiments targeted in ISIMIP requires an automated modeling pipeline) and forge a community that can critically examine current modeling practices. The simple model comparison presented ~~here sparks first~~ raises initial questions ~~on~~as to why models differ and invites us to explore model differences in ~~more~~greater depth. Such model intercomparison studies will enable us to quantify uncertainties and identify hotspots for model improvement. They will also ~~allow~~allow us ~~us~~ to assess the impact of climate and land use change on various~~different~~ groundwater-related variables, such as groundwater recharge and water table depth, and enable~~allow~~ ensemble-based impact assessments of~~n~~ future water availability. Model intercomparison and validation may also help identify models that perform better in specific regions or for specific output variables, thus allowing~~enabling~~ the provision of region- or variable-specific recommendations and uncertainty assessments to subsequent data users.

In the long term, the sector will enable us to jointly reflect on processes that we currently do not model or that require~~need~~ improvement, possibly also through new modeling approaches such as hybrid machine-learning models tailored to the large-scale representation of groundwater. These model developments will be incorporated~~luded~~ into the groundwater sector's contributions to upcoming ISIMIP simulation rounds, such as ISIMIP4~~–~~, which is scheduled~~et~~ to commence~~start~~ in 2026. Since groundwater is connected to many socio-ecological systems, groundwater models could also emerge as a modular coupling tool that can be integrated into multiple sectors. The newly established~~founded~~ groundwater sector already provides a first step in that direction by standardizing output names and units. If models are modular enough and define a standardized Application Programming Interface (API), they could also serve as a valuable tool for other science communities.

The lack of a community-wide coordinated effort to simulate the effects of climate change on groundwater at regional to global scale has precluded the comprehensive consideration of climate change impacts on groundwater in policy relevant reports, such as the European Climate risk assessment (EUCRA, 2024) or the Assessment Reports developed by the Intergovernmental Panel on Climate Change (IPCC) (e.g. Lee~~IPCC~~, 2024~~3~~). The anticipated groundwater sector contributions to ISIMIP3 and ISIMIP4, as described here, will address this gap by serving as scientific evidence in the second EUCRA round and ~~in~~ the upcoming IPCC seventh assessment cycle. As such, the anticipated outcomes of the new sector will pave the way for groundwater simulations to play an increasingly important role in international climate mitigation and adaptation policy.

In summary, the ISIMIP Groundwater sector aims to enhance our understanding of the impacts of climate change and direct human impacts on groundwater and a range of related sectors. To realize this goal, the new ISIMIP Groundwater sector will address numerous challenges. For instance, core simulated variables, such as water table depth and recharge, are highly uncertain and difficult to compare with observations. Further, tracing down explanations for inter-model differences will require the joint development and application of new evaluation methods (Eyring et al., 2016b) and protocols. Currently, models of the Groundwater sector operate at different spatial resolutions, and compared to other sectors, they often run at relatively high spatial resolutions, which will need to be addressed in evaluation and analysis approaches. Furthermore, depending on the model, executing single-model simulations already requires substantial amounts of computation time, and running all impact scenarios may be infeasible for some modeling groups. Lastly, running simulations for ISIMIP requires not only computational resources but also human resources, which might not be feasible for all groups. This has always been the case with ISIMIP, and it is an issue that other sectors have faced as well. Still, we are confident that the groundwater sector will ~~improve~~enhance our understanding of groundwater within the Earth system and help to promote dialogue and synthesis in the research community. With its various connections to other sectors, the Groundwater sector can be a catalyst for developing new holistic cross-sector modelling efforts that account for the multitude of interconnections between the water cycle and social, economic, and ecological systems.~~In summary, the ISIMIP groundwater sector aims to enhance our understanding of the impacts of climate change and direct human impacts on groundwater resources and a range of related sectors.~~

~~In summary, the ISIMIP groundwater sector aims to enhance our understanding of the impacts of climate change and direct human impacts on groundwater resources and a range of related sectors.~~

Data availability

The ensemble mean WTD and groundwater recharge trends are available at Reinecke (2025). For the original model data publications, see Table A1.

Author contribution

RR led the writing and analysis of the manuscript. RR and IG conceived the idea. All authors reviewed the manuscript and provided suggestions on text and figures.

Competing interests

None.

Appendix

Table A1: Original publications that describe the model outputs used in section 4.

Model	Simulation setup and used forcings	Reference
G^{3}M	Steady-state model of WTD on 5 arcmin without any groundwater pumping, forced with WaterGAP 2.2d (Müller Schmied et al., 2021) groundwater recharge mean between 1901-2001.	Reinecke et al. (2019)
V2KARST	Global karst recharge model at 15 arcmin, forced with the MSWEP V2 (Beck et al., 2019) precipitation and GLDAS (Li et al., 2018) air temperature, shortwave and longwave radiation, specific humidity and wind speed for the period of 1990-2020	Sarrazin et al. (2018)
GGR	Global ~~G~~groundwater rain-fed ~~R~~recharge model, A grid-based three-layer water balance model to estimate the daily global rain-fed groundwater recharge (2001-2020)	Nazari et al. (2025)
WBM	Time series simulation from 1980 to 2019 at 15 arc minutes, using the MERIT digital flow direction dataset (Yamazaki et al., 2019) including domestic, industrial, livestock, and irrigation water withdrawals. Forcings and key inputs: Climate: ERA5 (Prusevich et al., 2024), Reservoirs: GRanD v1.1 (Lehner et al., 2011), Inter-basin transfers (Lammers, 2022), Glaciers (Rounce et al., 2022), Impervious surfaces (Hansen and Toftemann Thomsen, 2020), Population density (Lloyd et al., 2019), Domestic and industrial water per capita demand: FAO AQUASTAT, Livestock density and water demand (Gilbert et al., 2018), Cropland: LUH2 (Hurtt et al., 2020), Aquifer properties (de Graaf et al., 2017) aquifer depth gap-filled with terrain slope data from Yamazaki et al. 2019, Soil	Multiple, see left column.

	available water capacity: FAO soil map, Root depth (Yang et al., 2016)	
VIC-wur	Global Hydrological model simulating the GWR and streamflow from 1970-2014 in natural condition. The mean GWR and streamflow were used to simulate the GWT in steady-state MODFLOW model in 5 arcmin. The model is forced by: GFDL-ESM4 climate model (Dunne et al., 2020), Aquifer properties (de Graaf et al., 2017).	Droppers et al. (2020)
CLM	The model was spun up for 1979 and subsequently simulated from 1979 to 2013 using the GSWPv3 atmospheric forcing dataset at a 0.1-degree resolution. Recharge, capillary rise, drainage, irrigation pumping and cell-to-cell lateral flow were simulated within the model.	Akhter et al. (2024) (under review in WRR)
ParFlow	The data provided here are based on Naz et al. (2023). In version 2 of the data, we provide variables including water table depth and groundwater recharge for time period of 1997-2006 at monthly time scale.	Naz et al. (2023)
CWatM	Community Water Model at 5 arcmin. Climate forcing with chelsa-W5E5v1.0 (5 arcmin) for temperature (average, maximum, minimum), precipitation, and shortwave radiation, and GSWP3-W5E5 (30 arcmin spline downscaled to 5 arcmin) for longwave radiation, wind speed, and specific humidity. Updates to Burek et al. (2020) include river network based on MERIT Hydro and upscaling with Eilander et al. (2021).	Burek et al. (2020)

Table A2: List of groundwater related output variables in the ISIMIP3a global water sector (https://protocol.isimip.org/#/ISIMIP3a/water_global). The unit of all variables is kg m^{-2} s^{-1}, the spatial resolution is 0.5° grid and the temporal resolution is monthly.

Groundwater-related output variable of the Global Water Sector	**Description**
Groundwater runoff	Water that leaves the groundwater layer. In case seepage is simulated but no groundwater layer is present, report seepage as *Total groundwater recharge* and *Groundwater Runoff.*
Total groundwater recharge	For models that consider both diffuse and focused/localised recharge this should be the sum of both; other models should submit the groundwater recharge component that the model simulates. See also the descriptions in *Focused/localised groundwater recharge* and *Diffuse groundwater recharge*.
Focused/localised groundwater recharge	Water that directly flows from a surface water body into the groundwater layer below. Only submit if the model separates focused/localised recharge from diffuse recharge.
Potential irrigation water withdrawal (assuming unlimited water supply) from groundwater resources	Part of *Potential Industrial Water Withdrawal* that is extracted from groundwater resources.
Actual irrigation water withdrawal from groundwater resources	Part of *Actual Irrigation Water Withdrawal* that is extracted from groundwater resources.
Potential Irrigation Water Consumption from groundwater resources	Part of *Potential Irrigation Water Consumption* that is extracted from groundwater resources.
Actual Irrigation Water Consumption from groundwater resources	Part of *Actual Irrigation Water Consumption* that is extracted from groundwater resources.
Potential Domestic Water Withdrawal from groundwater resources	Part of *Potential Domestic Water Withdrawal* that is extracted from groundwater resources.
Actual Domestic Water Withdrawal from groundwater resources	Part of *Actual Domestic Water Withdrawal* that is extracted from groundwater resources
Potential Domestic Water Consumption from groundwater resources	Part of *Potential Domestic Water Consumption* that is extracted from groundwater resources.

Actual Domestic Water Consumption from groundwater resources	Part of *Actual Domestic Water Consumption* that is extracted from groundwater resources.
Potential Manufacturing Water Withdrawal from groundwater resources	Part of *Potential Manufacturing Water Withdrawal* that is extracted from groundwater resources.
Actual Manufacturing Water Withdrawal from groundwater resources	Part of *Actual Manufacturing Water Withdrawal* that is extracted from groundwater resources.
Potential manufacturing Water Consumption from groundwater resources	Part of *Potential manufacturing Water Consumption* that is extracted from groundwater resources.
Actual Manufacturing Water Consumption from groundwater resources	Part of *Actual Manufacturing Water Consumption* that is extracted from groundwater resources.
Potential electricity Water Withdrawal from groundwater resources	Part of *Potential electricity Water Withdrawal* that is extracted from groundwater resources.
Actual Electricity Water Withdrawal from groundwater resources	Part of *Actual Electricity Water Withdrawal* that is extracted from groundwater resources.
Potential electricity Water Consumption from groundwater resources	Part of *Potential electricity Water Consumption* that is extracted from groundwater resources.
Actual Electricity Water Consumption from groundwater resources	Part of *Actual Electricity Water Consumption* that is extracted from groundwater resources.
Potential Industrial Water Withdrawal from groundwater resources	Part of *Potential Industrial Water Withdrawal* that is extracted from groundwater resources.
Actual Industrial Water Withdrawal from groundwater resources	Part of *Actual Industrial Water Withdrawal* that is extracted from groundwater resources.

Potential Industrial Water Consumption from groundwater resources	Part of *Potential Industrial Water Consumption* that is extracted from groundwater resources.
Actual Industrial Water Consumption from groundwater resources	Part of *Actual Industrial Water Consumption* that is extracted from groundwater resources.
Potential livestock Water Withdrawal from groundwater resources	Part of *Potential livestock Water Withdrawal* that is extracted from groundwater resources.
Actual Livestock Water Withdrawal from groundwater resources	Part of *Actual Livestock Water Withdrawal* that is extracted from groundwater resources.
Potential livestock Water Consumption from groundwater resources	Part of *Potential livestock Water Consumption* that is extracted from groundwater resources.
Actual livestock Water Consumption from groundwater resources	Part of *Actual livestock Water Consumption* that is extracted from groundwater resources.
Total Potential Water Withdrawal (all sectors) from groundwater resources	Part of *Total Potential Water Withdrawal* that is extracted from groundwater resources.
Total Actual Water Withdrawal (all sectors) from groundwater resources	Part of *Total Actual Water Withdrawal* that is extracted from groundwater resources.

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