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# Modeling Water in IAMs: Where are We and What can ESMs and IAVs Offer?

MOHAMAD HEJAZI

Joint Global Change Research Institute (JGCRI), Pacific Northwest National Laboratory (PNNL)  
Snowmass, 2016

- ▶ How to effectively incorporate a representation of the water system in IAMs? What are the different approaches?
- ▶ What are some of the limitations with the current approaches in term of their ability to resolve certain feedbacks?
- ▶ What can IAV and ESM provide to overcome some of the gaps in modeling water in IAMs?



Source: <https://www.carbontrust.com>

- ▶ Gaps in input data: what can't we get that we need to model water in IAMs?
- ▶ Gaps in tools: Downscaling and upscaling routines to exchange information to & from IAV/ESM

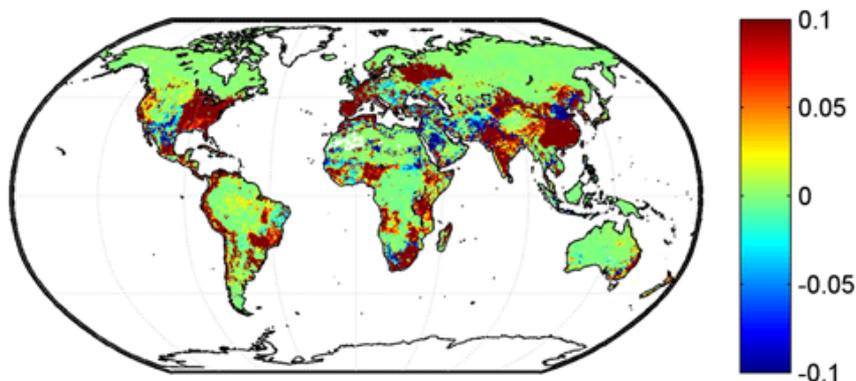
# Approaches for incorporating water in IAMs

- ▶ Employing existing water models (1-way exchange of information)
- ▶ Incorporate representations of water demand/supply/allocation endogenously to account for their feedbacks to IAMs (2-way exchange)

Model	Home Institution	Hydrologic model
<b>AIM</b> Asia Integrated Model	National Institutes for Environmental Studies, Tsukuba Japan	<b>H08</b>
<b>GCAM</b> Global Change Assessment Model	Joint Global Change Research Institute, PNNL, College Park, MD	<b>GCAM-Hydrology</b>
<b>IGSM</b> Integrated Global System Model	Joint Program, MIT, Cambridge, MA	<b>CLM-WSM</b>
<b>IMAGE</b> The Integrated Model to Assess the Global Environment	PBL Netherlands Environmental Assessment Agency, Bilthoven, The Netherlands	<b>LPJmL</b>
<b>MESSAGE</b> Model for Energy Supply Strategy Alternatives and their General Environmental Impact	International Institute for Applied Systems Analysis; Laxenburg, Austria	<b>GLOBIOM</b>
<b>REMIND</b> Regionalized Model of Investments and Technological Development	Potsdam Institute for Climate Impacts Research; Potsdam, Germany	<b>LPJmL</b>

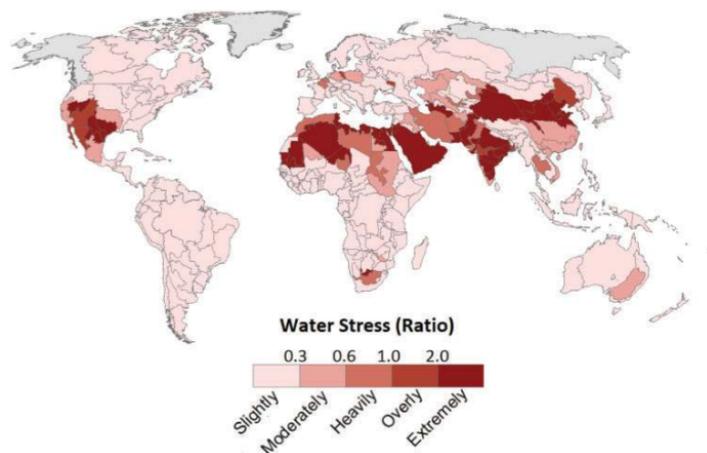
# 1-way coupling: Linking IAMs to existing water supply and demand models

## Change in water scarcity (GCAM-Hydrology)



Hejazi et al. 2014. Hydrology & Earth Sys. Sc.

## Water scarcity (IGSM-WSM)

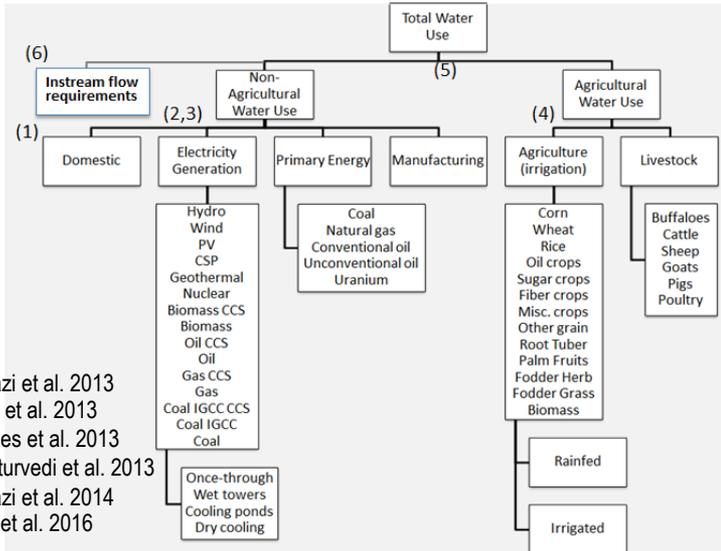


Schlosser et al., 2014. Earth's Future

- ▶ Takes advantage of existing modeling capabilities in the water sphere (ESMs, macro scale global hydrologic models, and global water management models)
- ▶ Assumes that unmet water demands have come from non-renewable resources → unable to capture the feedbacks of water constraints and the cost of water to the IAM decision makings
- ▶ Past efforts are mainly limited to passing info from IAMs to ESMs/IAVs, but not vise versa

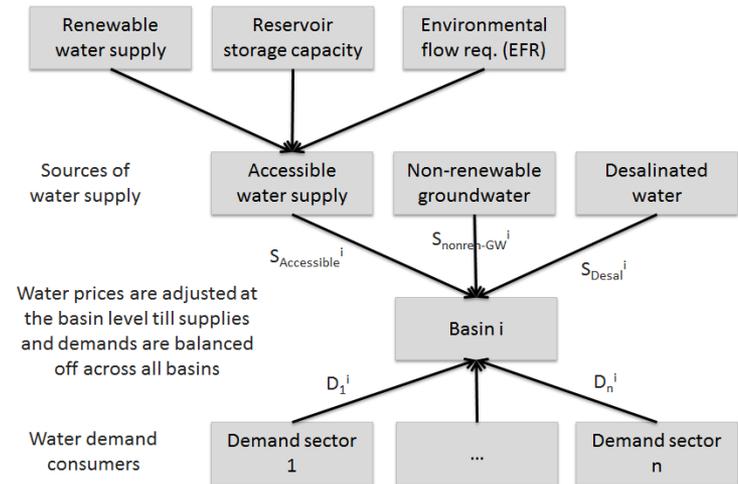
# 2-way coupling: Endogenous representation of water systems in IAMs (e.g., GCAM)

## IAM water demands



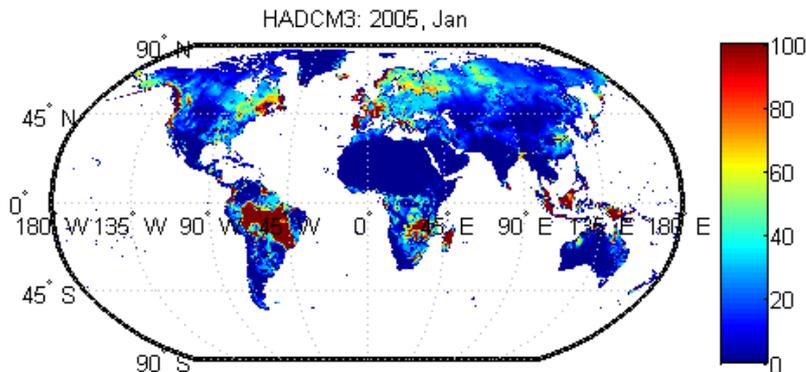
- 1) Hejazi et al. 2013
- 2) Kyle et al. 2013
- 3) Davies et al. 2013
- 4) Chaturvedi et al. 2013
- 5) Hejazi et al. 2014
- 6) Kim et al. 2016

## IAM water allocations



Kim et al. (2016). Climatic Change

## IAM water supplies

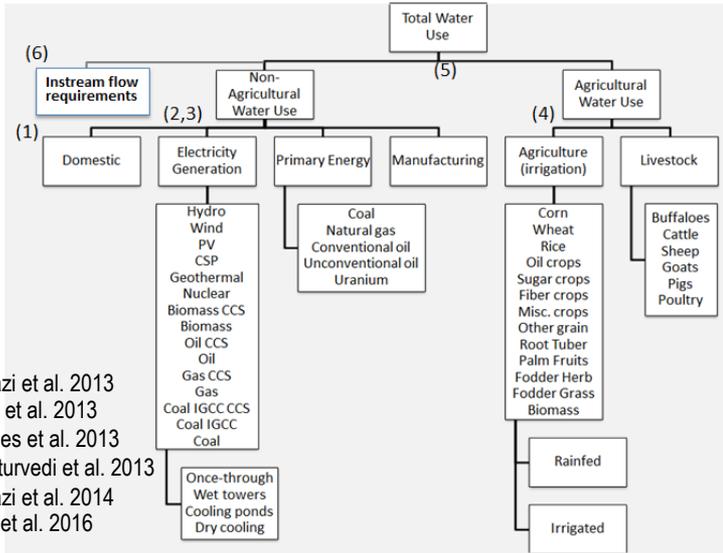


Hejazi et al. 2014. Hydrology & Earth Sys. Sc.

- ▶ Tailor-build simple and efficient water models within the IAM framework with dynamic feedbacks
- ▶ Opened a huge can of worms in term of building many more arrows of how water systems connect with the other IAM systems (e.g., energy and land)

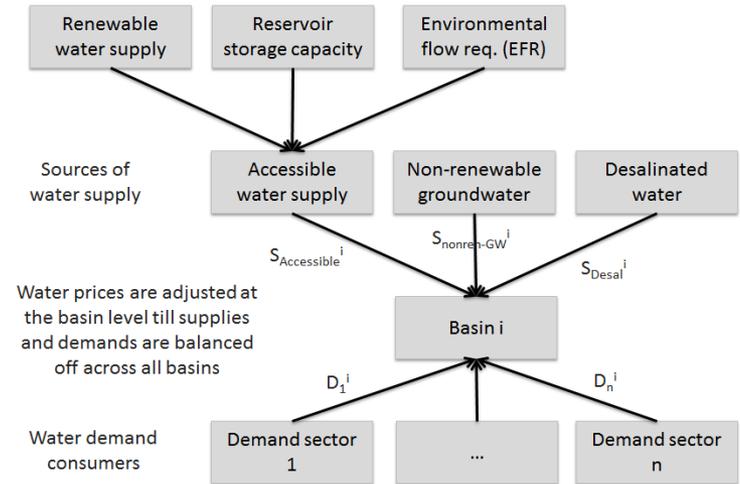
# 2-way coupling: Endogenous representation of water systems in IAMs (e.g., GCAM)

## IAM water demands



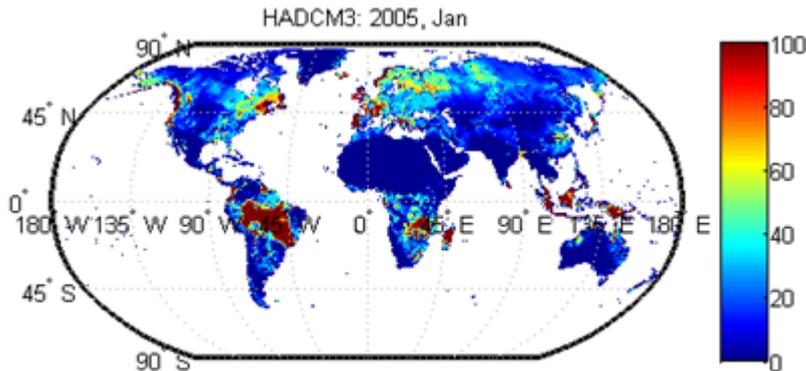
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## IAM water allocations



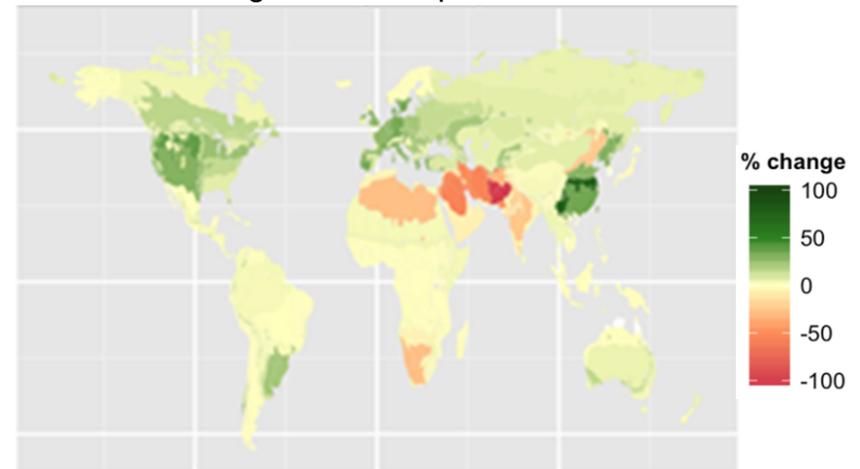
Kim et al. (2016). Climatic Change

## IAM water supplies



Hejazi et al. 2014. Hydrology & Earth Sys. Sc.

## Percent changes in wheat production in 2100



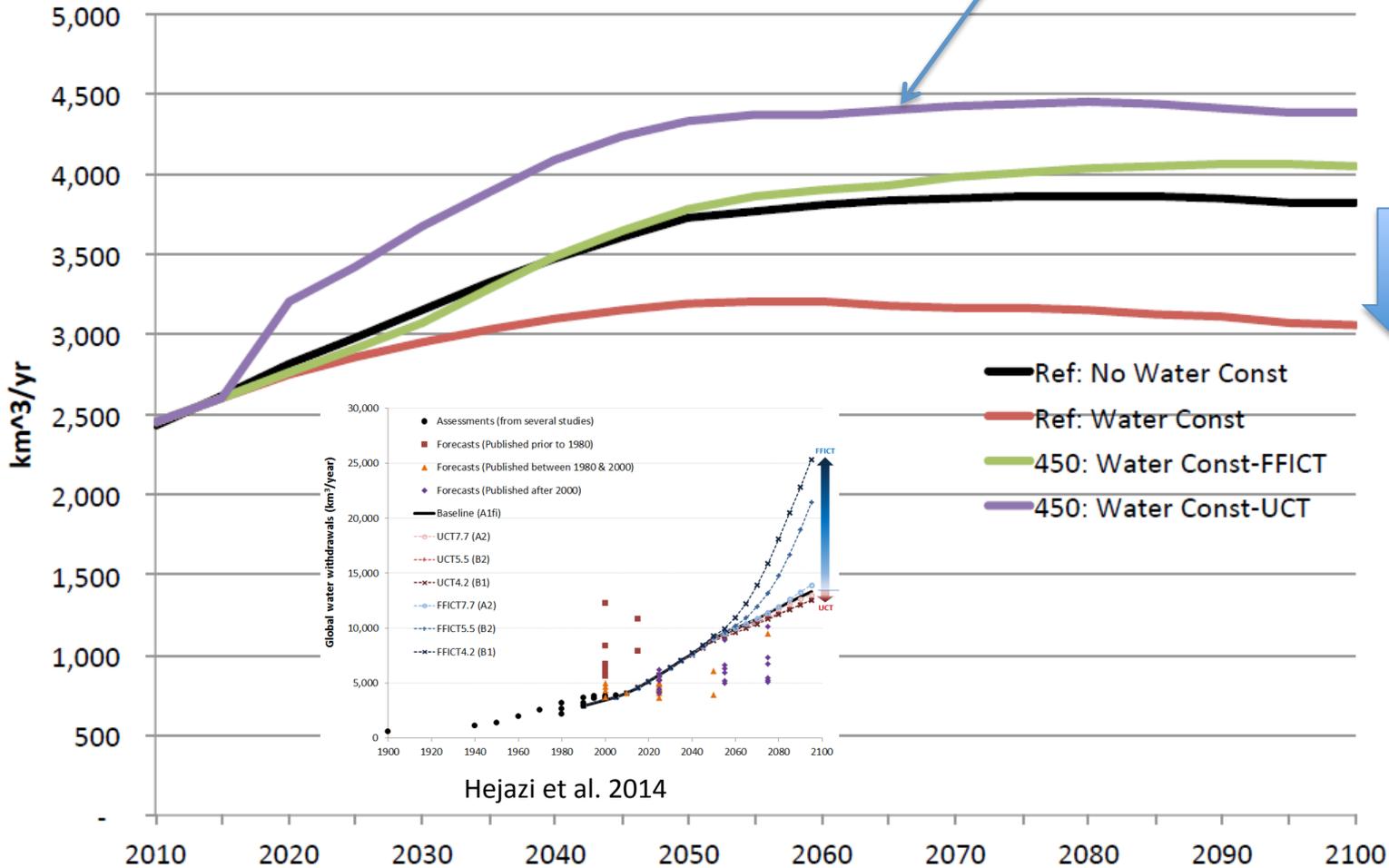
Kim et al. (2016). Climatic Change<sup>6</sup>

# How will constraining water alter the story?

► It is an energy-water-land story!

This differs from previous results

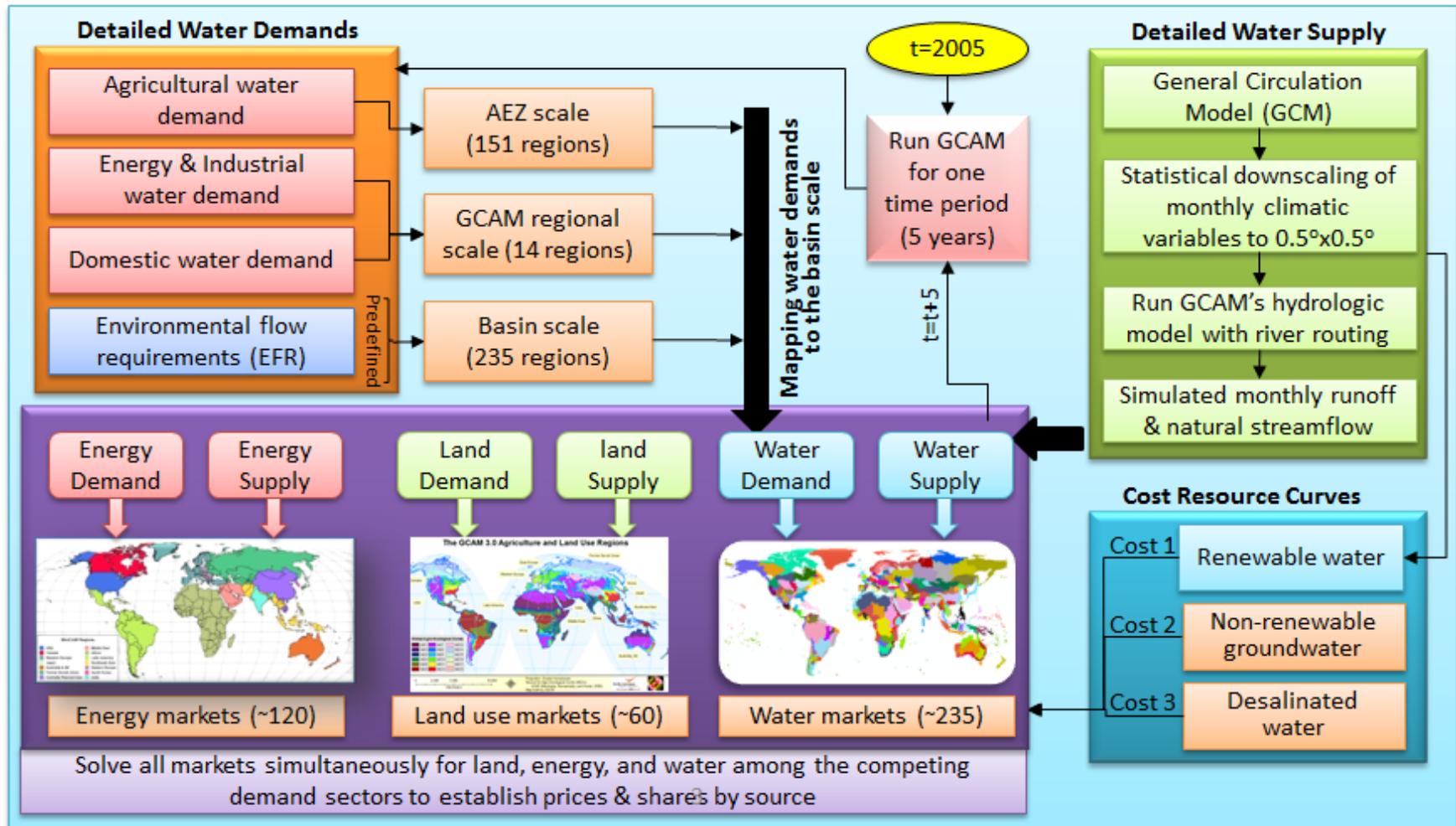
Global Freshwater Withdrawal for Agriculture



Effects of  
constraining  
water

# Looking under the hood of a 2-way coupling framework

Schematic of the overall market-based approach across all goods and services in GCAM



# Challenges and gaps in modeling water in IAMs: what can IAV-ESM offer?



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Model evaluation over history (e.g., 1975-2010) is a prerequisite to publish water modeling results

Water use at sub-annual scale or even at annual scale is hardly available

Mapping between geopolitical regions, AEZs, and river basins

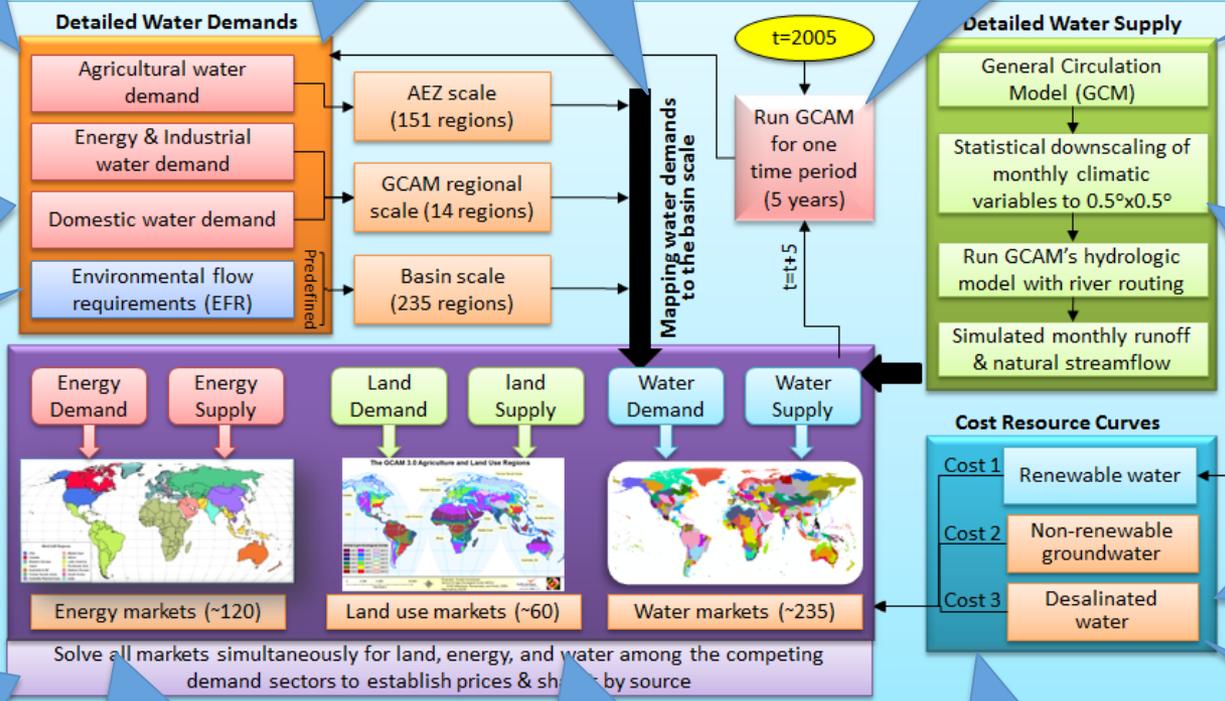
Time period in IAMs is too coarse to capture the inter- & intra-variability in water

Limited to the 4 RCPs for which there exists GCM simulations

The ability to store water (reservoirs) and reuse water

The impact of climate changes on water demands, and hydropower

The role of adaptation (irrig., cooling tech). How quickly can adaptation come in the future?



Water regulations are heterogeneous and water allocation are often not based on markets

Water is heavily subsidized in many regions and different sectors face different water prices

How much gw water is available and how much has already been depleted?

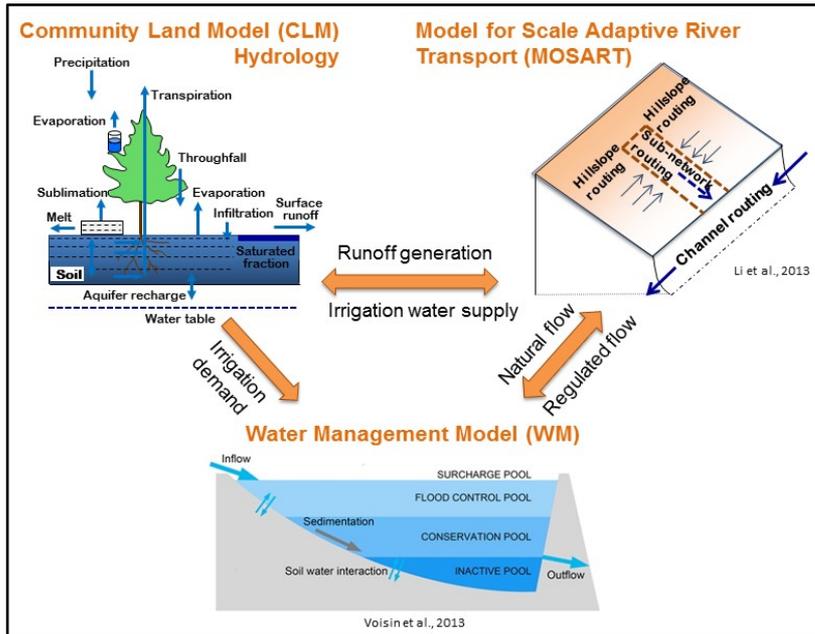
Energy use associated with extraction and treatment of water

# Let's look further at the issues of data exchange and scale in coupled frameworks

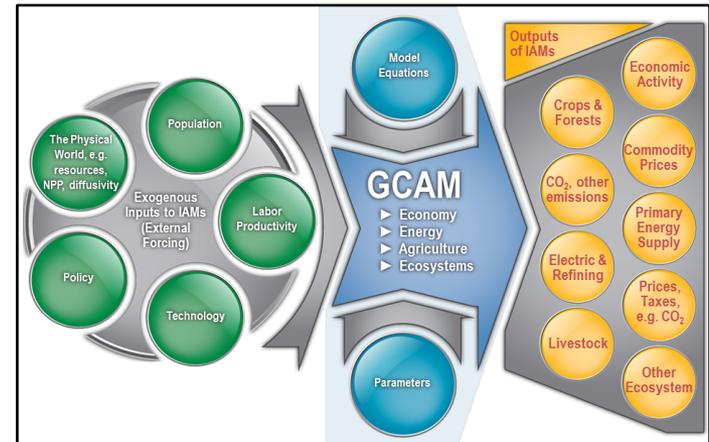
- ▶ Overlapping processes across models (water cycle in CLM & GCAM)
- ▶ Potential inconsistency among models
  - different land use and crop representations,
  - how to handle irrigation (rule-based, ranking, competitiveness)
- ▶ Lack of tools to downscale & upscale data to pass information at the appropriate scale across models – this is partially a data issue as well
- ▶ Scale (global–regional–local; decadal–annual–monthly–daily)
  - GCAM water allocation (annual accessible water vs monthly)
  - Reservoir operations (individual vs lumped)
  - Trends vs variability (e.g., monthly to multiple-year droughts)
- ▶ Withdrawal vs consumption
  - return flow, water reuse
- ▶ Economic vs physical frameworks
  - Water subsidies, costs, economically available resources, etc.

# Examples of linking IAV-ESM and IAMs: GCAM-USA (IAM) → CLM-MOSART-WM (ESM)

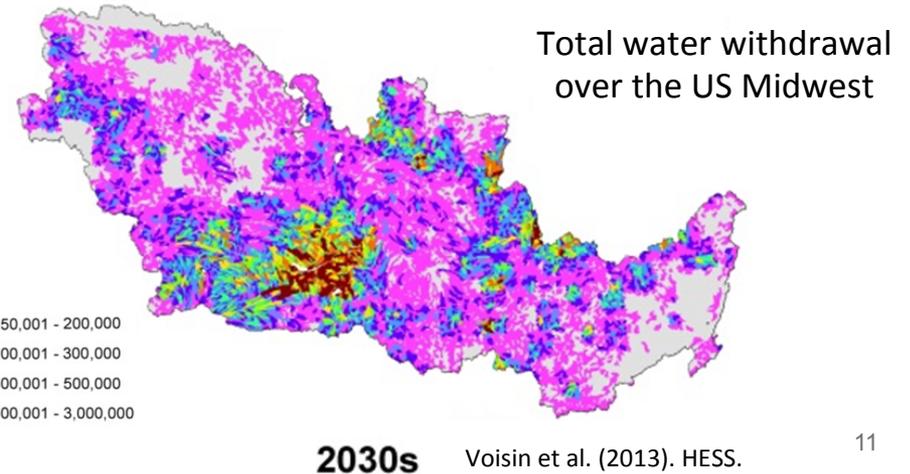
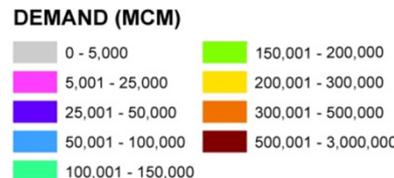
## Water supply: CLM-MOSART-WM



## Water demand: GCAM (downscaled to daily/grid scale)



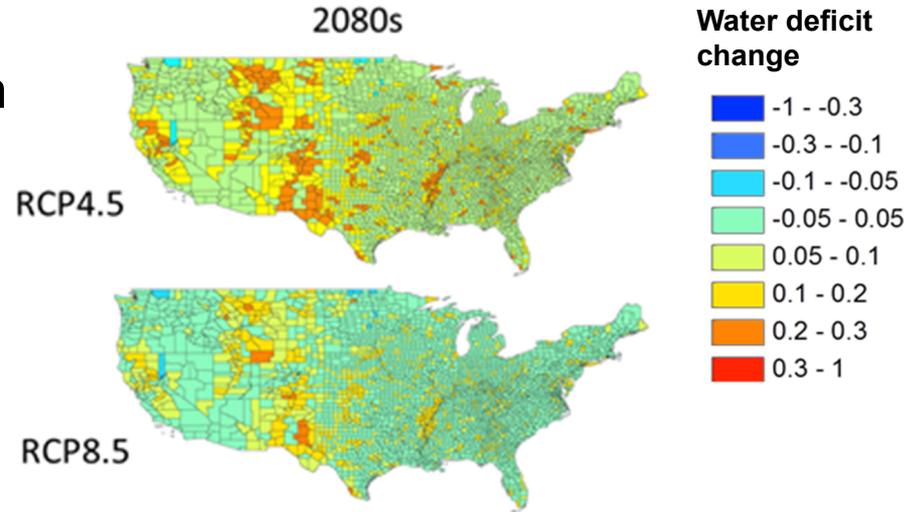
A coupled modeling framework: Focusing on regional water scarcity through model coupling



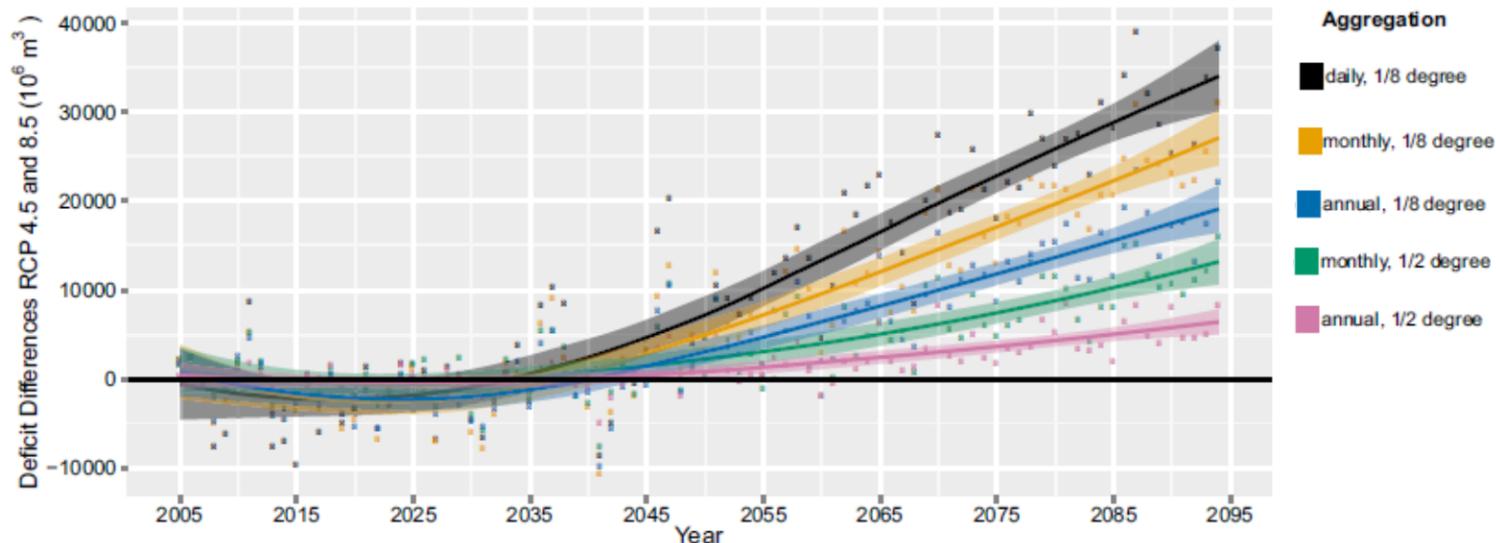
Total water withdrawal over the US Midwest

# Multi-model frameworks offer unique insights into system dynamics and the importance of scale

- ▶ Water deficit projected to increase more with climate change mitigation than under unconstrained climate change (largely due to increased biofuel production)
- ▶ Water deficits are significantly underestimated if computed at coarser spatial and temporal resolution

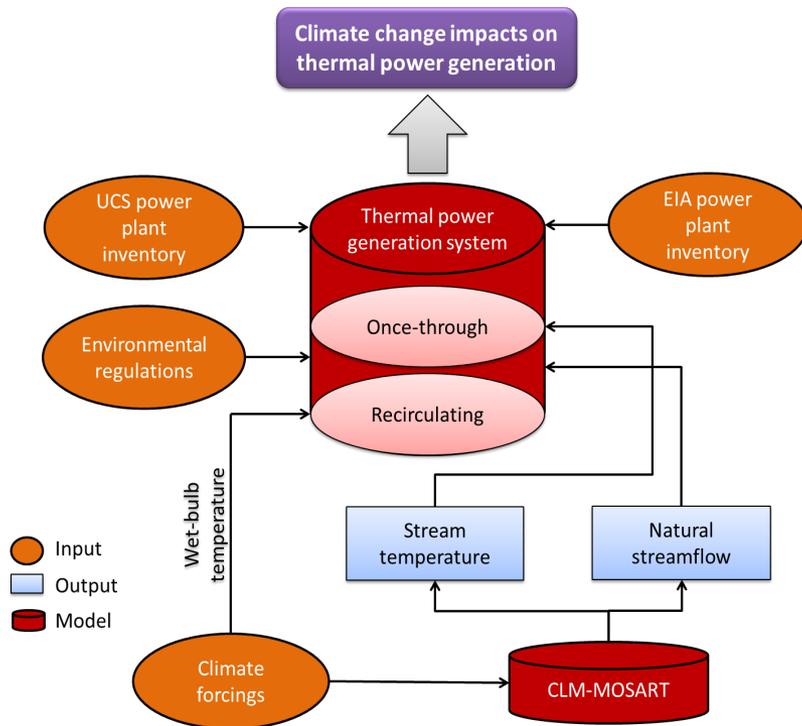


Hejazi et al. (2015)  
PNAS

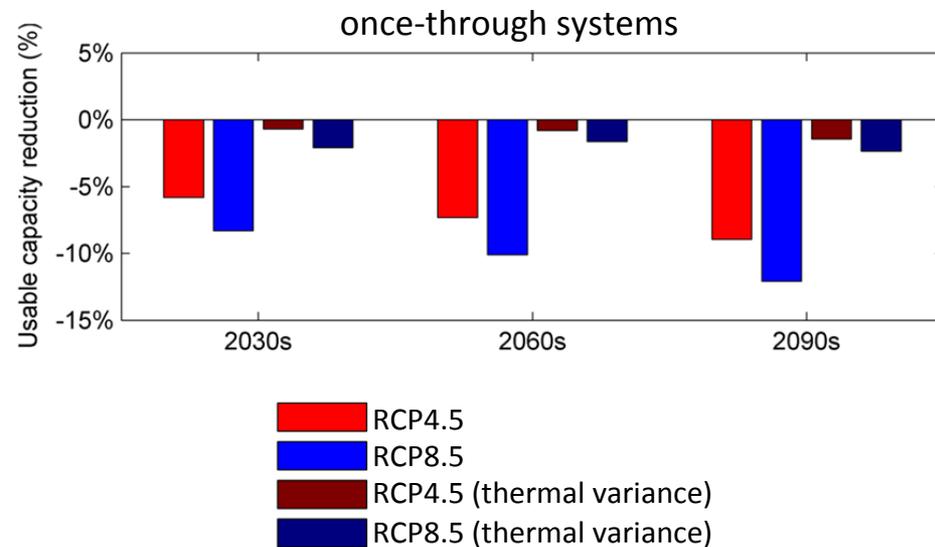


# Examples of linking IAV-ESM and IAMs: water temperature & power plant modeling over the US

## Schematic of modeling framework



## Comparison of projected mid-century usable capacity reduction under different scenarios



- 1) efficiency loss due to temperature fluctuations
- 2) water availability constraints for wet-cooling towers
- 3) regulatory constraints on thermal effluent



# Questions!

**Mohamad I. Hejazi, Ph.D.**  
Research Scientist  
Joint Global Change Research Institute  
Pacific Northwest National Laboratory  
5825 University Research Court, Suite 3500  
College Park, MD 20740  
[www.globalchange.umd.edu](http://www.globalchange.umd.edu)  
[mohamad.hejazi@pnnl.gov](mailto:mohamad.hejazi@pnnl.gov)