

# Water: Macro-scale process-based modeling of water

Steve Frolking  
Richard B. Lammers  
Danielle Grogan



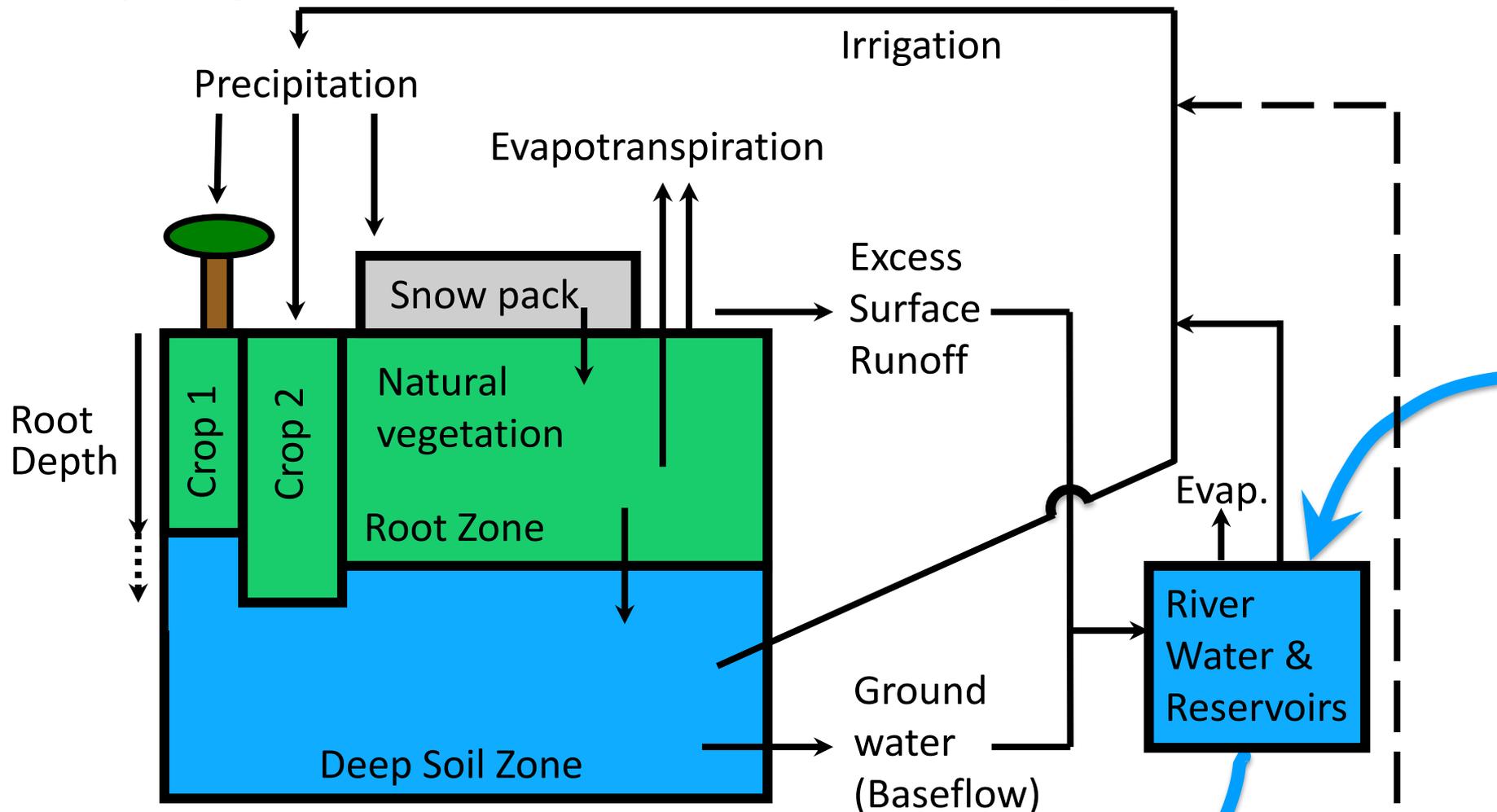
Water Systems Analysis Group  
Earth Systems Research Center  
University of New Hampshire  
Durham, NH, USA

## OUTLINE

1. Framework & methods
2. Context & questions
3. Some Outcomes
4. Relevance to IAMs

# 1. Framework & methods

## (UNH) Water Balance Model Structure - Single Grid Cell



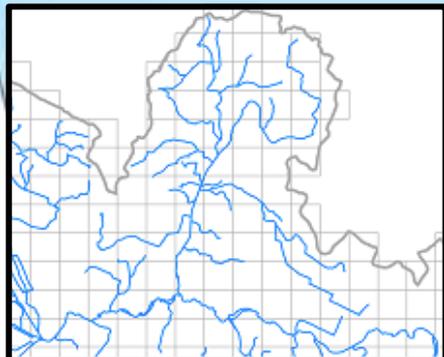
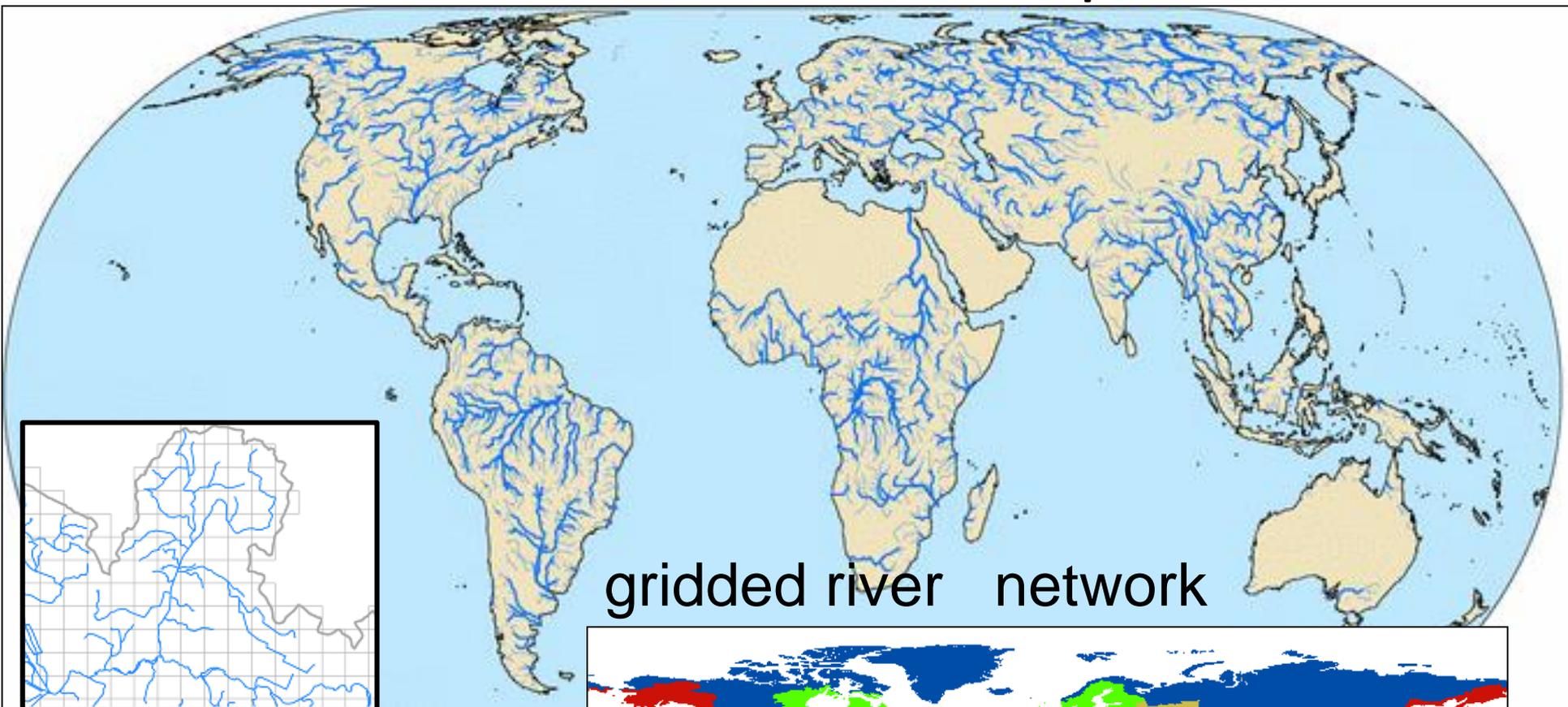
Irrigation: 31 crops/land cover  
(sub-grid fractions  
modeled separately)

Water Transport  
Model (WTM)

Unsustainable  
Irrigation  
(Fossil ground water)

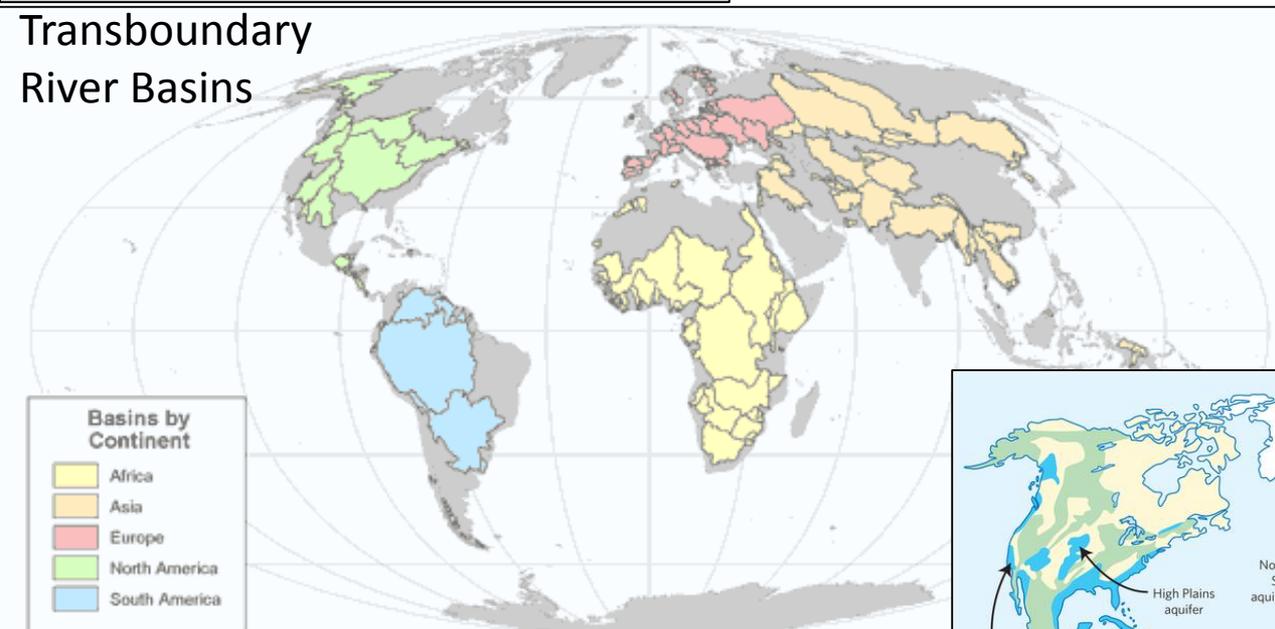
# 1. Framework & methods

## Horizontal Water Transport



# 1. Framework & methods

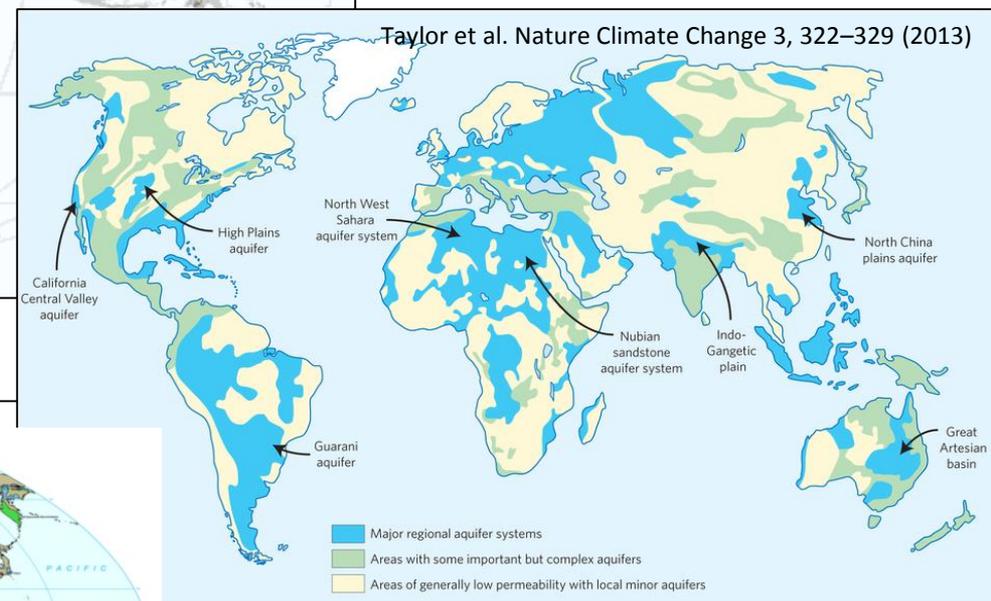
## Transboundary River Basins



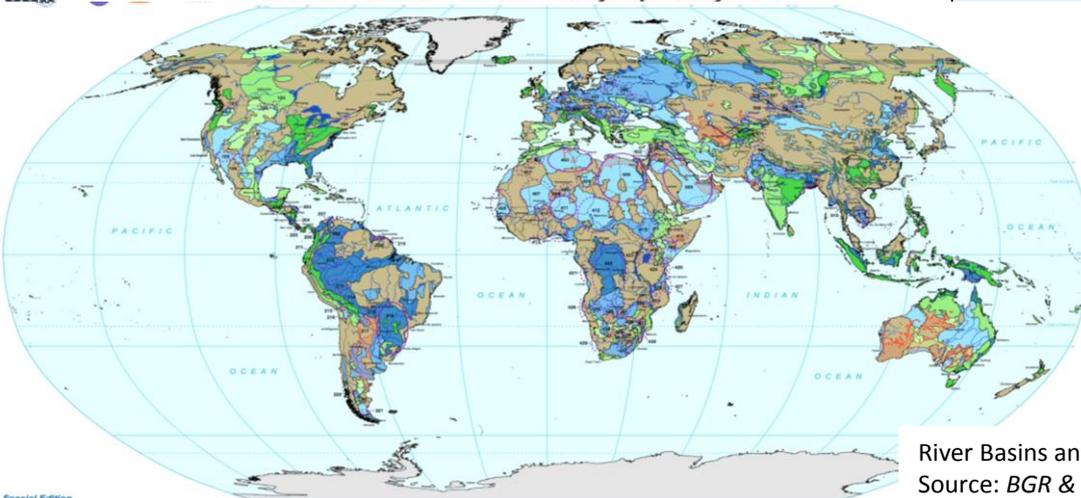
Wolf et al. 1999

[transboundarywaters.orst.edu/publications/atlas/atlas\\_html/interagree.html](http://transboundarywaters.orst.edu/publications/atlas/atlas_html/interagree.html)

## Global Aquifers (simplified)



## River Basins and Transboundary Aquifer Systems



## River Basins and Transboundary Aquifer Systems

Source: BGR & GRDC

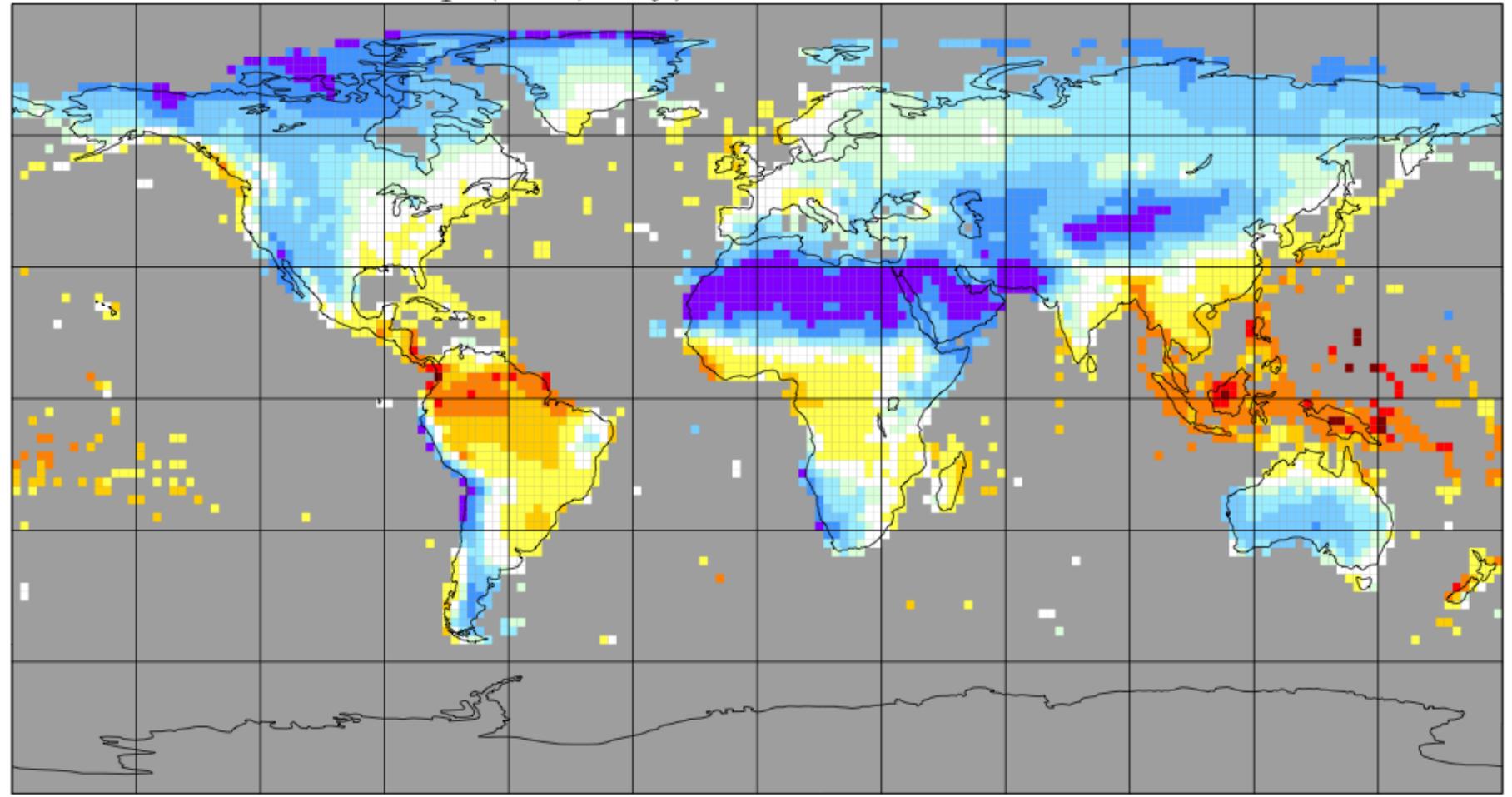
[www.whymap.org/whymap/EN/Downloads/Global\\_maps/globalmaps\\_node\\_en.html](http://www.whymap.org/whymap/EN/Downloads/Global_maps/globalmaps_node_en.html)

# 1. Framework & methods

## Precipitation Data (CRU TS 2.0)

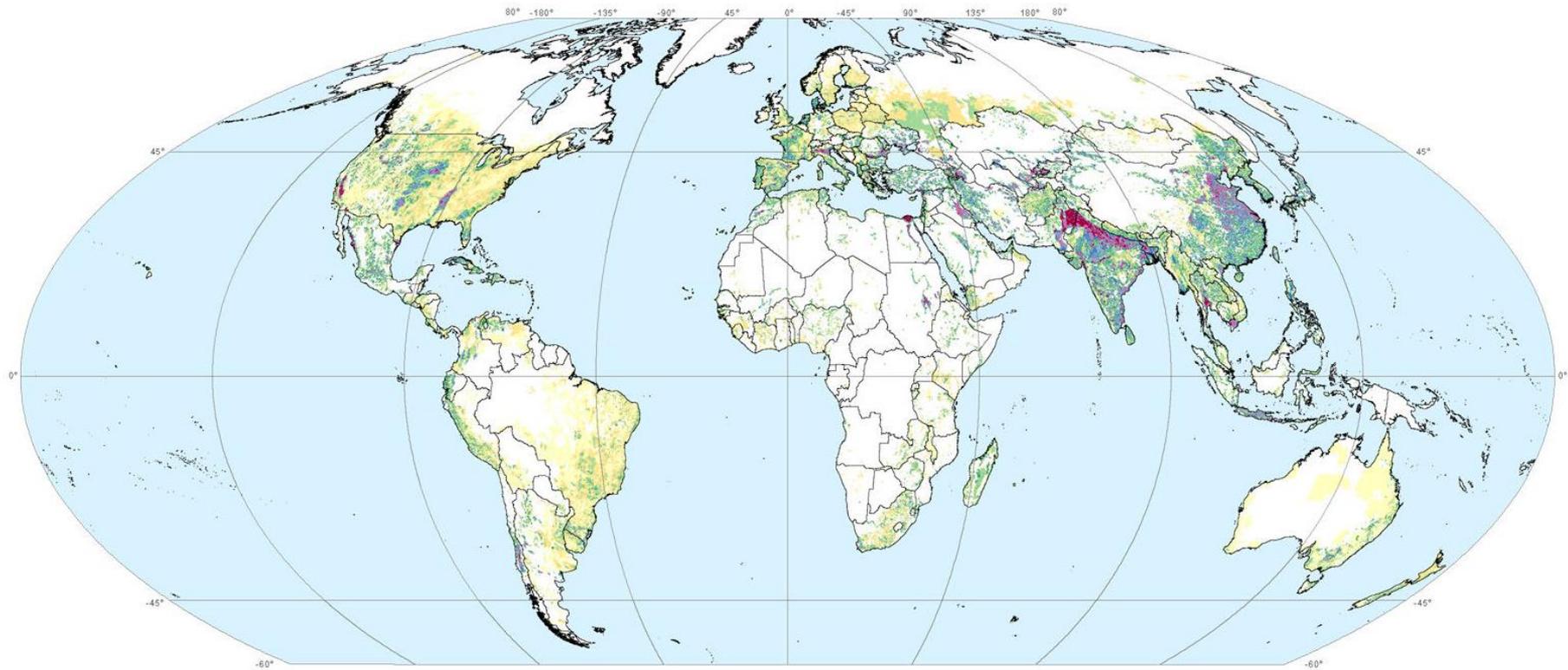
Ann 2000 Mean Precip (mm/day)

2.68

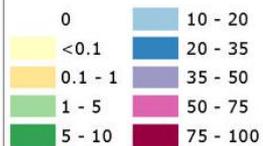


# 1. Framework & methods

## The digital global map of irrigation areas February, 2007



**Area under irrigation in percentage of land area**



The map depicts the area equipped for irrigation in percentage of cell area.  
For the majority of countries the base year of statistics is in the period 1997 - 2002.

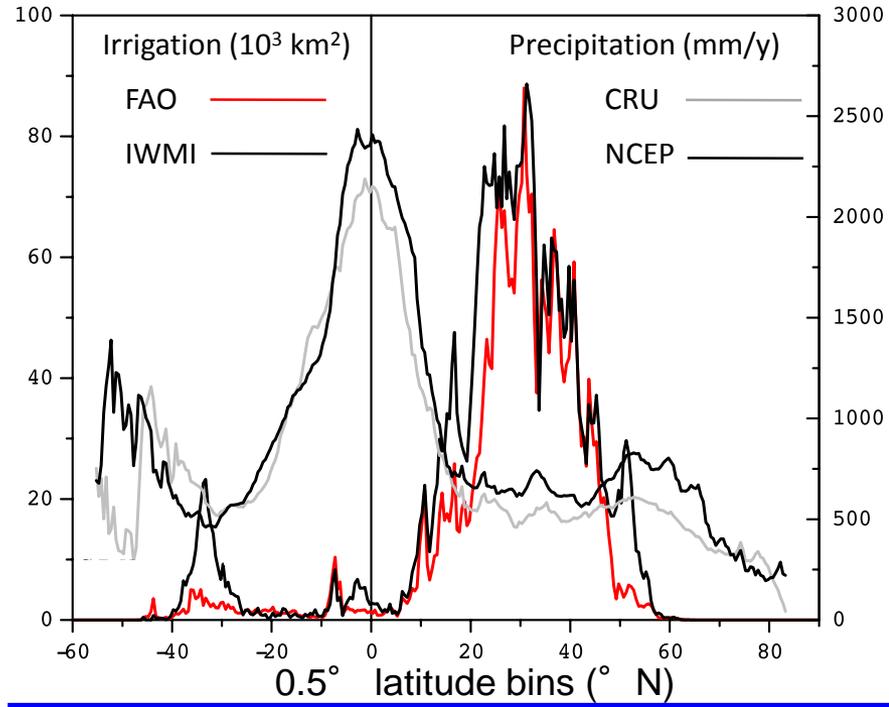
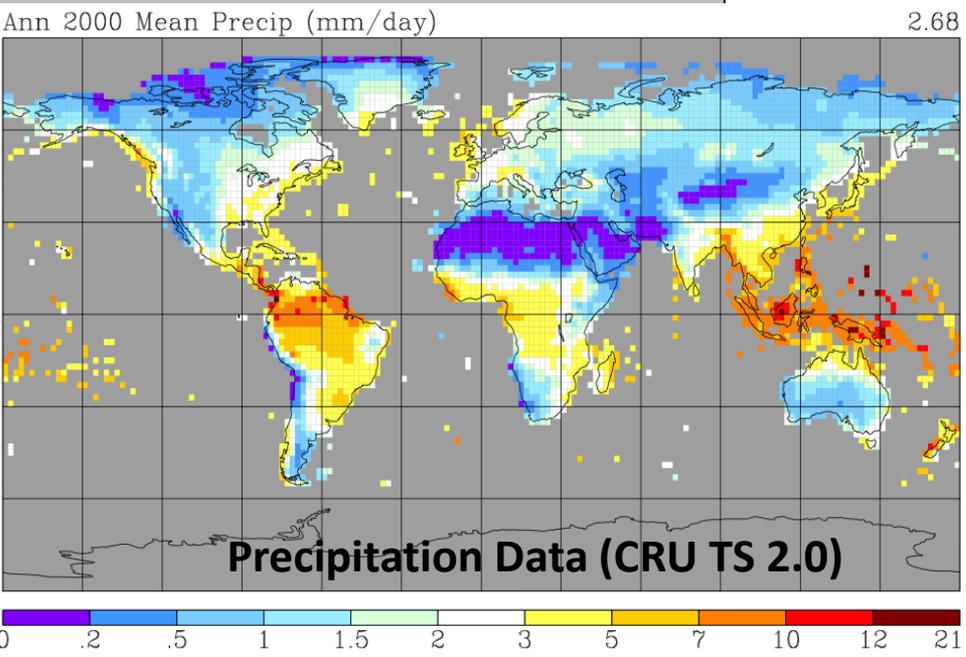
Projection: Mollweide

<http://www.fao.org/ag/agl/aglw/aquastat/irrigationmap/index.stm>

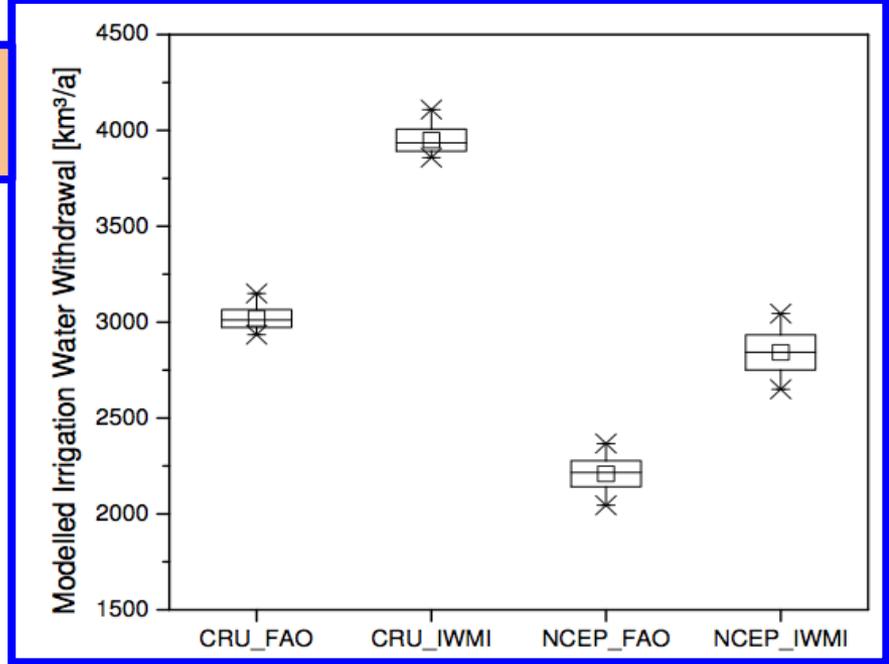
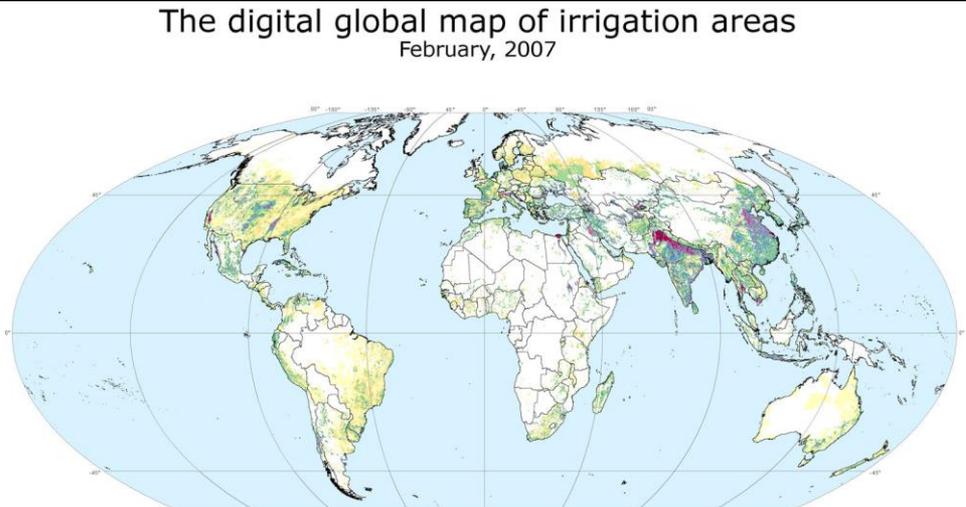
Stefan Siebert, Petra Döll, Sebastian Feick (Institute of Physical Geography, University of Frankfurt/M., Germany) and Jippe Hoogeveen, Karen Frenken (Land and Water Development Division, Food and Agriculture Organization of the United Nations, Rome, Italy)



# 1. Framework & methods



variation in 2 input datasets led to  $\sim 2000 \text{ km}^3/\text{y}$  range in modeled demand for irrigation water.



# 1. Framework & methods

## Reservoirs

Large

Small

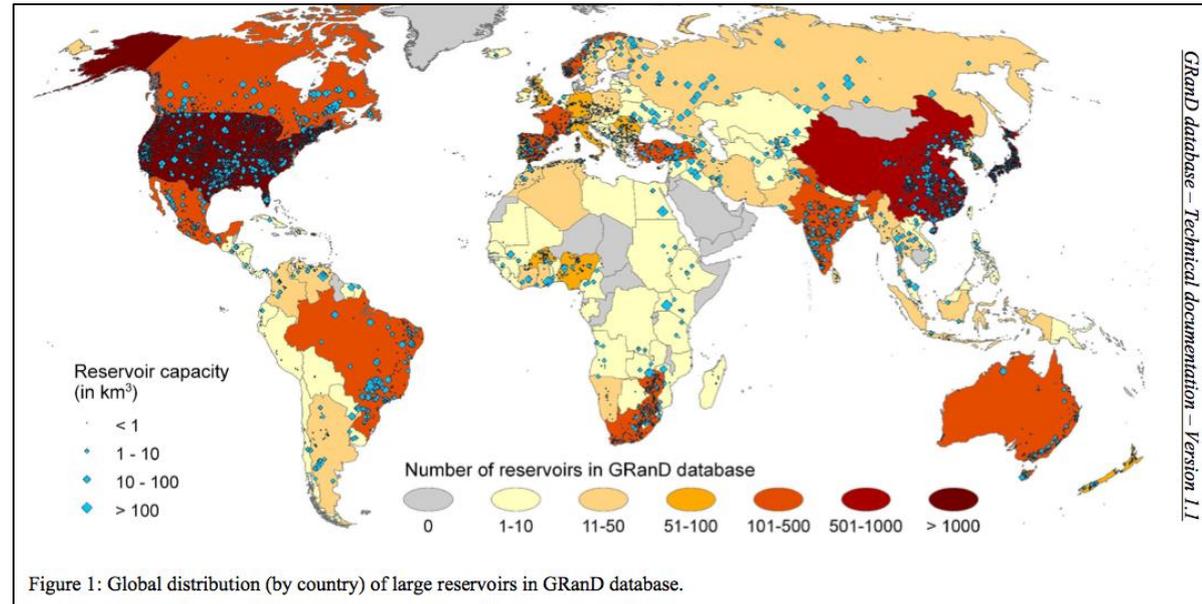


Figure 1: Global distribution (by country) of large reservoirs in GRanD database.

Large dam/reservoir database (GRanD; Lehner et al. 2011;  $n \sim 6500$ )  
hydropower; flood control; irrigation; navigation  
<http://www.gwsp.org/85.html>



US  
National  
Inventory  
of Dams

- Supply ~40% of irrigated areas in India.
- Increasingly considered an important option to increase food security.
- Store local runoff: capacity ~1000 m<sup>3</sup>.
- Irrigated area: 5-50 ha.

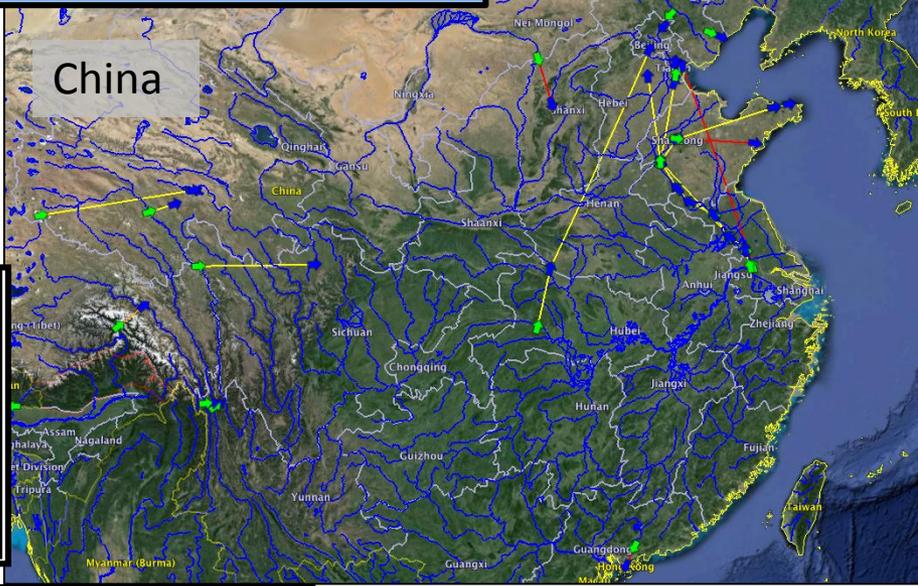
Wisser et al. 2010.  
*J. Hydrology*

# 1. Framework & methods

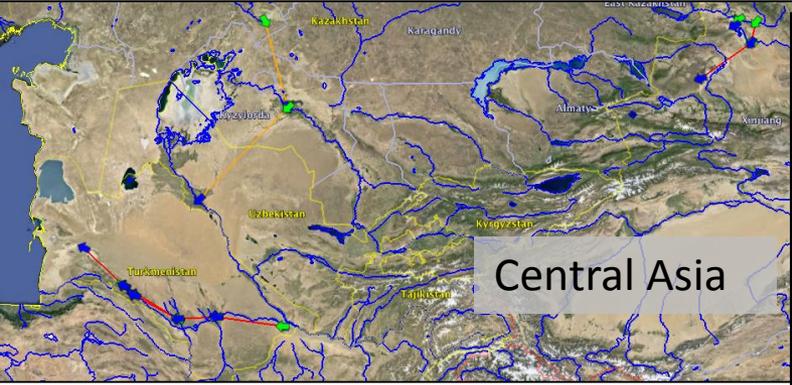
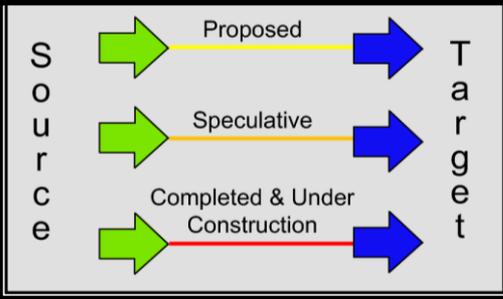
# Inter-basin water transfers



North America

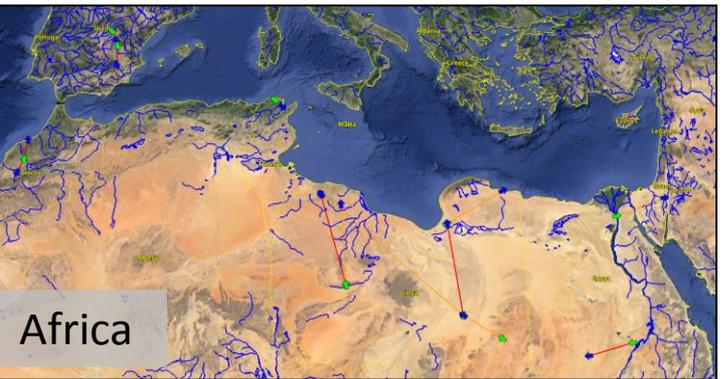


China



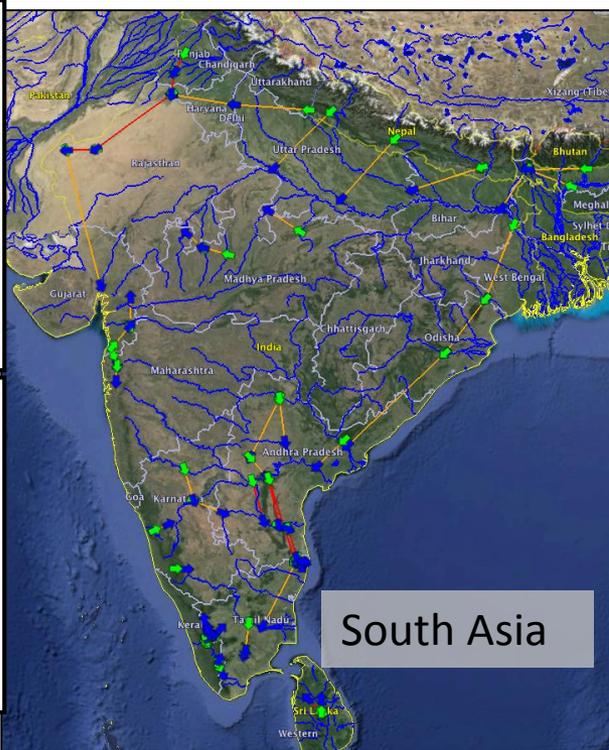
Central Asia

<u>Continent</u>	<u>Count</u>
Africa	13
Australia	3
Eurasia	80
North America	57
South America	11
<b>Total</b>	<b>164</b>



Africa

<u>Status</u>	<u>Count</u>
Completed	65
Under Construction	5
Proposed	21
Speculative	73
<b>Total</b>	<b>164</b>



South Asia

R Lammers (UNH) ms in prep.

# 2. Context & Questions

UNEP G-GRID ARENDAL CICERO Center for Global Warming Center for International Climate and Environmental Research - Oslo ICIMOD

HICIA FEASIBILITY STUDY 2007-2010 AND PROGRAMME 2011-2015

## TOO MUCH TOO LITTLE WATER

ADAPTATION TO CLIMATE CHANGE IN THE HINDU KUSH HIMALAYAS AND CENTRAL ASIA



FAO WATER REPORTS 36

### Climate change, water and food security

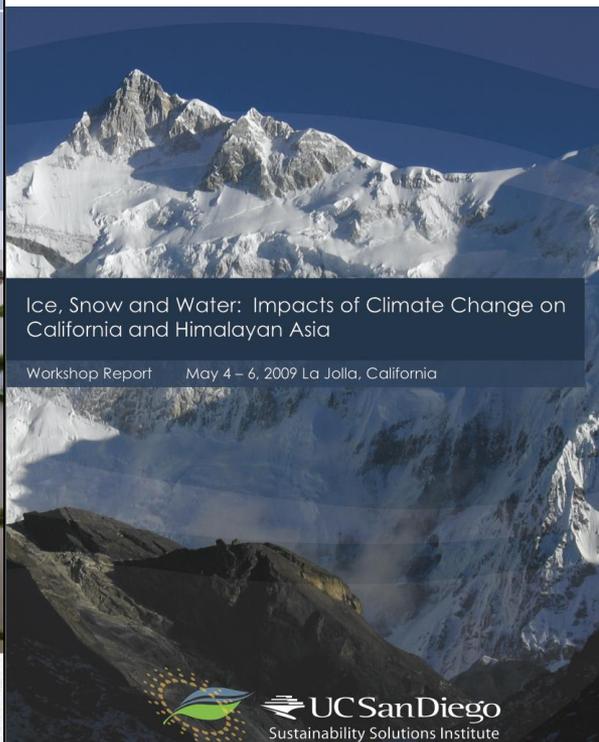


Irrawaddy Delta, Myanmar

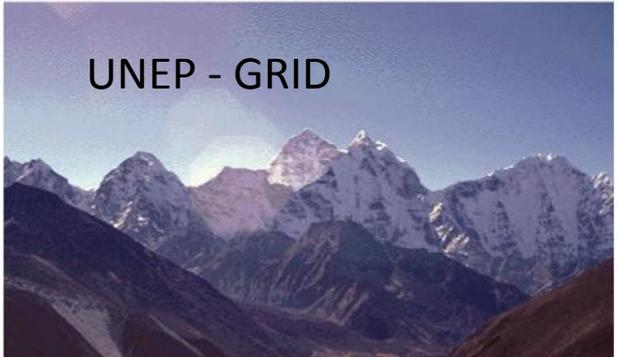


### Ice, Snow and Water: Impacts of Climate Change on California and Himalayan Asia

Workshop Report May 4 - 6, 2009 La Jolla, California



### UNEP - GRID



## The fall of the water

Emerging threats to the water resources and biodiversity at the roof of the world to Asia's lowland from land-use changes associated with large-scale settlement and piecemeal development

## Asia Society



### Asia's Next Challenge: Securing the Region's Water Future

A report by the Leadership Group on Water Security in Asia

## 2. Context & Questions

March 4, 2014 | vol. 111 | no. 9 | 3197-3646

PNAS

Proceedings of the National Academy of Sciences of the United States of America www.pnas.org



# The Inter-Sectoral Impact Model Intercomparison Project (ISI-MIP): Project framework

Lila Warszawski, Katja Frieler<sup>1</sup>, Veronika Huber, Franziska Piontek, Olivia Serdeczny, and Jacob Schewe  
Potsdam Institute for Climate Impact Research, 14412 Potsdam, Germany

**Table 1. Participating impact models**

Model (source)	Sector
LPJmL (15, 16)	Water/agriculture/ biomes
JULES (17, 18)	Water/biomes
VIC (19)	Water
H08 (20)	
WaterGAP (21)	
MacPDM.09 (22)	
WBM (23)	
MPI-HM (24)	
PCR-GLOBWB (25)	
MATSIRO (26)	
DBH (27)	
ORCHIDEE (28)	Biomes
Hybrid4 (29)	
SDGVM (30)	
JeDi (31)	
VISIT (32)	

**Table 1. Participating impact models**

Model (source)	Sector
VISIT (32)	
GEPIC (33)	Agriculture
EPIC (34)	
pDSSAT (35)	
PEGASUS (36)	
GAEZ-IMAGE (37)	
LPJ-GUESS (38)	
MARA (39)	Health (malaria)
Umea statistical model (40)	
LMM 205 (41)	
MIASMA (42)	
VECTRI (43)	
DIVA (44)	Coastal infrastructure
AIM (45)	(Agro-) economic effects
ENVISAGE (46)	
EPPA (47)	
GTEM (48)	
FARM (49)	
MAGNET (50)	
GCAM (51)	
GLOBIOM (51)	
IMPACT (53)	
MAGPIE (54)	

8 related research articles

# 2. Context & Questions

## The Predictability of Rainfall over the Greater Horn of Africa. Part I: Prediction of Seasonal Rainfall

SHARON E. NICHOLSON

*J. Hydrometeorology*, 2014, 15:1011-1027

Are people more interested in how much water they will have in the next rainy season, or in predictions for 2100?

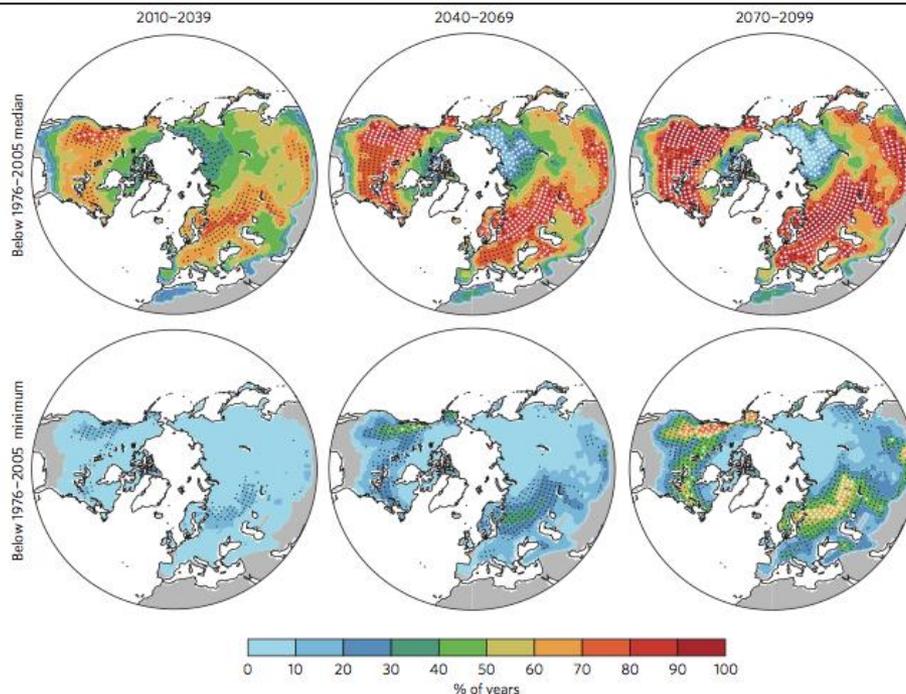
### Response of snow-dependent hydrologic extremes to continued global warming

nature climate change

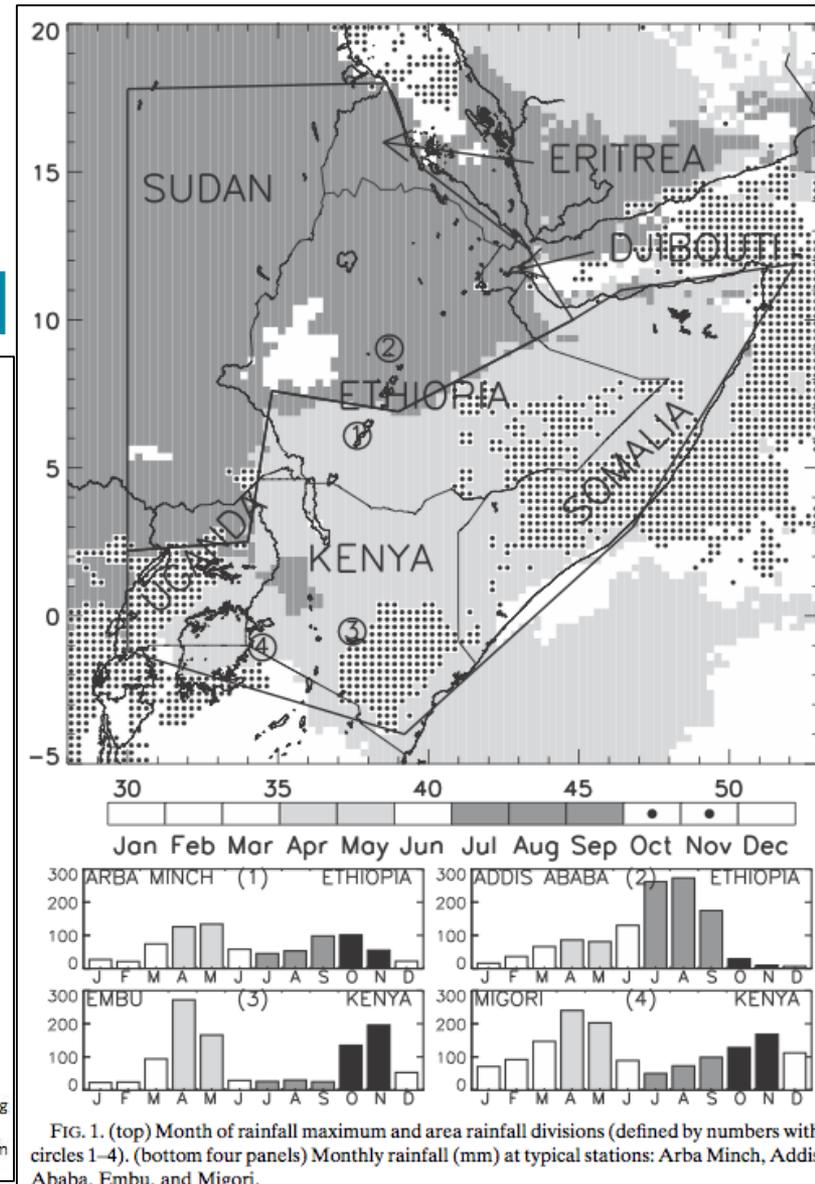
LETTERS

PUBLISHED ONLINE: 11 NOVEMBER 2012 | DOI:10.1038/NCLIMATE1732

Noah S. Diffenbaugh<sup>1\*</sup>, Martin Scherer<sup>1</sup> and Moetasim Ashfaq<sup>2</sup>



**Figure 2 | Emergence of low and extremely low snow years in the twenty-first century.** Percentage of years with accumulated March SWE below the simulated 1976-2005 median (top) or minimum (bottom) in three periods of RCP 8.5 (56 realizations from 26 models; Supplementary Table S1). Following ref. 21, stippling indicates areas where the magnitude of the multi-model ensemble mean occurrence divided by the multi-model standard deviation of occurrence exceeds 1.0 (black symbols) or 2.0 (white symbols). Grey denotes areas where at least half of the realizations have a median (top) or minimum (bottom) March SWE of zero in the 1976-2005 period.



**FIG. 1.** (top) Month of rainfall maximum and area rainfall divisions (defined by numbers with circles 1-4). (bottom four panels) Monthly rainfall (mm) at typical stations: Arba Minch, Addis Ababa, Embu, and Migori.

# 2. Context & Questions

WATER RESOURCES RESEARCH, VOL. 47, W05301, doi:10.1029/2010WR010090, 2011

## Hyperresolution global land surface modeling: Meeting a grand challenge for monitoring Earth's terrestrial water

Eric F. Wood,<sup>1</sup> Joshua K. Roundy,<sup>1</sup> Tara J. Troy,<sup>1</sup> L. P. H. van Beek,<sup>2</sup> Marc F. P. Bierkens,<sup>2,3</sup> Eleanor Blyth,<sup>4</sup> Ad de Roo,<sup>5</sup> Petra Döll,<sup>6</sup> Mike Ek,<sup>7</sup> James Famiglietti,<sup>8</sup> David Gochis,<sup>9</sup> Nick van de Giesen,<sup>10</sup> Paul Houser,<sup>11</sup> Peter R. Jaffé,<sup>1</sup> Stefan Kollet,<sup>12</sup> Bernhard Lehner,<sup>13</sup> Dennis P. Lettenmaier,<sup>14</sup> Christa Peters-Lidard,<sup>15</sup> Murugesu Sivapalan,<sup>16</sup> Justin Sheffield,<sup>1</sup> Andrew Wade,<sup>17</sup> and Paul Whitehead<sup>18</sup>

The never-ending quest for higher spatial resolution.

i.e., global 1-km modeling

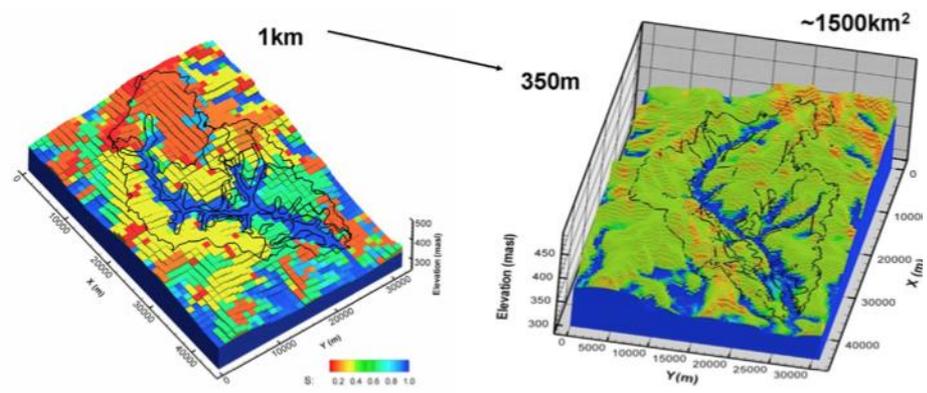


Figure 1. Higher-resolution modeling leads to better spatial representation of saturated and nonsaturated areas, with implications for runoff generation, biogeochemical cycling, and land-atmosphere interactions. Soil moisture simulations on the Little Washita showing the impact that the resolution has on its estimation

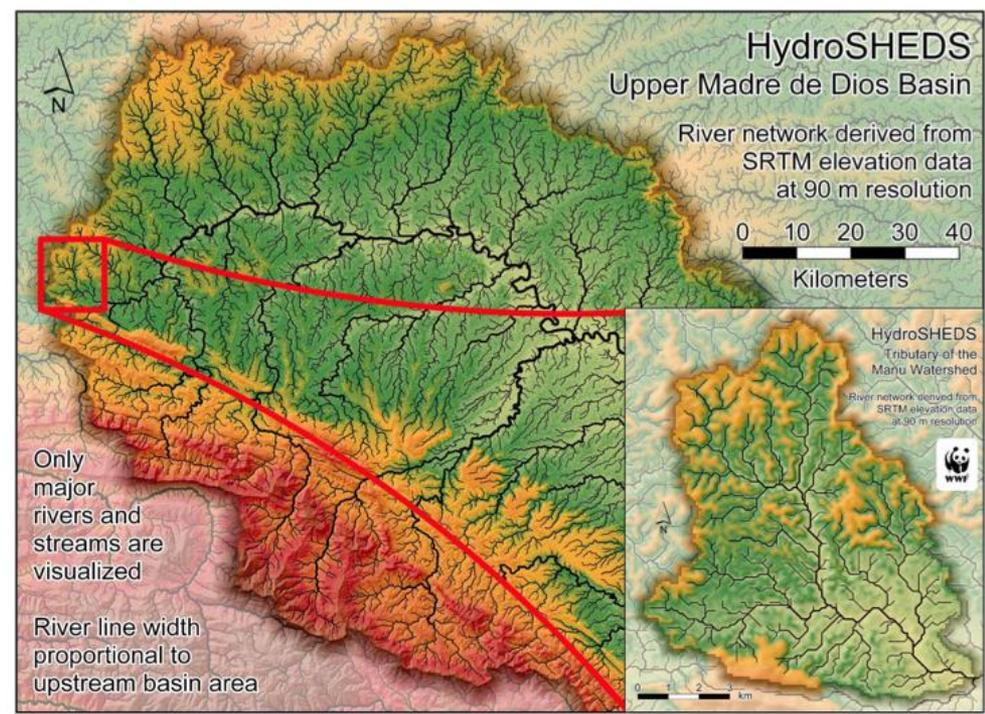
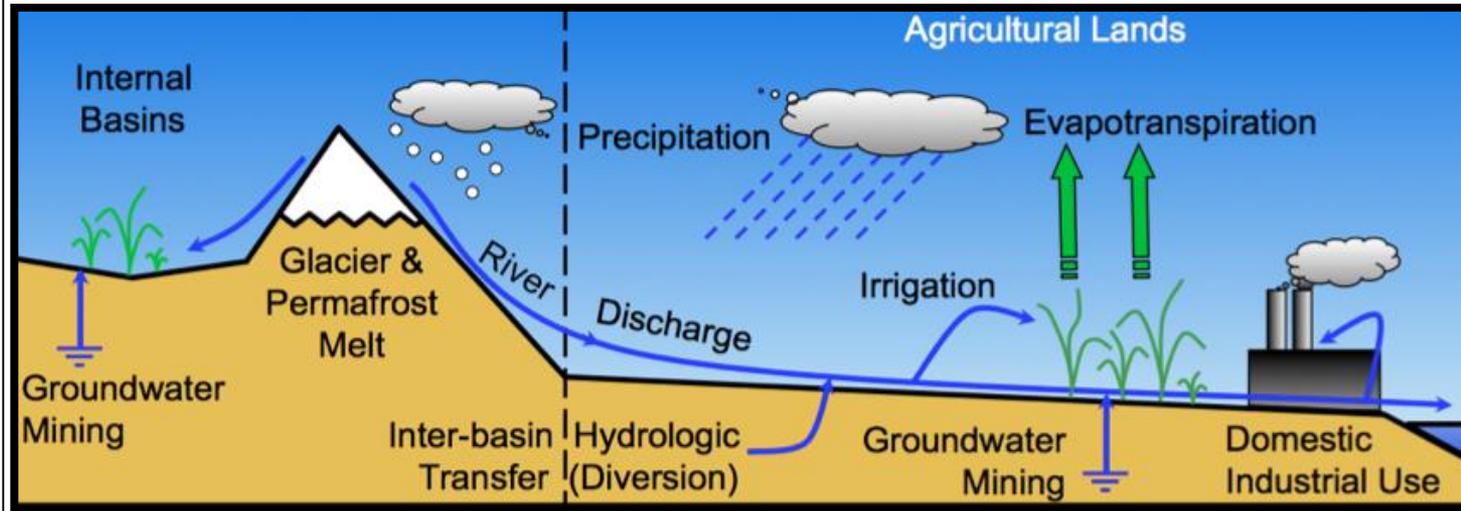


Figure 3. HydroSHEDS, an example of a global data set that will be needed for a hyperresolution hydrologic model. The data set consists of elevation, stream networks, watershed boundaries, drainage directions, and ancillary data layers such as flow accumulations, distances, and river topology at various resolutions from approximately 90 m to 10 km and is based on data from NASA's Shuttle Radar Topography Mission.

## 2. Context & Questions

# Crops, climate, canals, and the cryosphere in Asia – changing water resources around the earth's third pole

- **Univ. New Hampshire**  
*Water balance and crop yield modeling*
- **Boston University** –  
*Economic modeling; land use analysis and remote sensing*
- **Penn State University**  
*Economic modeling*
- **Univ. Alaska-Fairbanks**  
*Cryosphere modeling*



**1. Water and Climate:** What are potential impacts of climate change on water supply in Asia?

**2. Water and Food:** What are present relative contributions of local surface water, upstream runoff, and deep groundwater to water resources for food production and how will these relative contributions evolve? What are potential impacts of major inter-basin transfers and improvements in irrigation and crop water use efficiency?

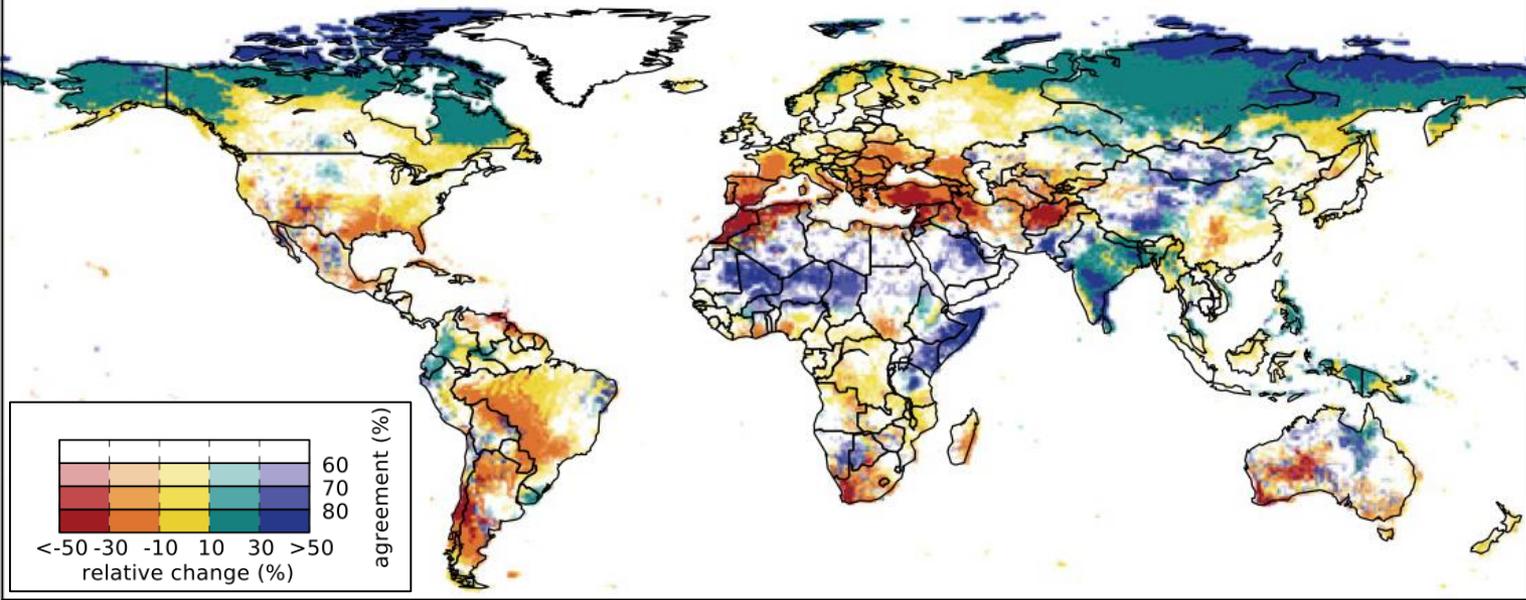
**3. Water, Climate, and Sustainability:** How will food and water pricing respond, and with what impacts on trade in food and virtual water, on water engineering efforts, on partitioning of water resources for agriculture, industrial, and municipal/domestic use, and on water resource policies?

# 3. Outcomes

## Multimodel assessment of water scarcity under climate change [PNAS, 2014, 111, 3245–3250](#)

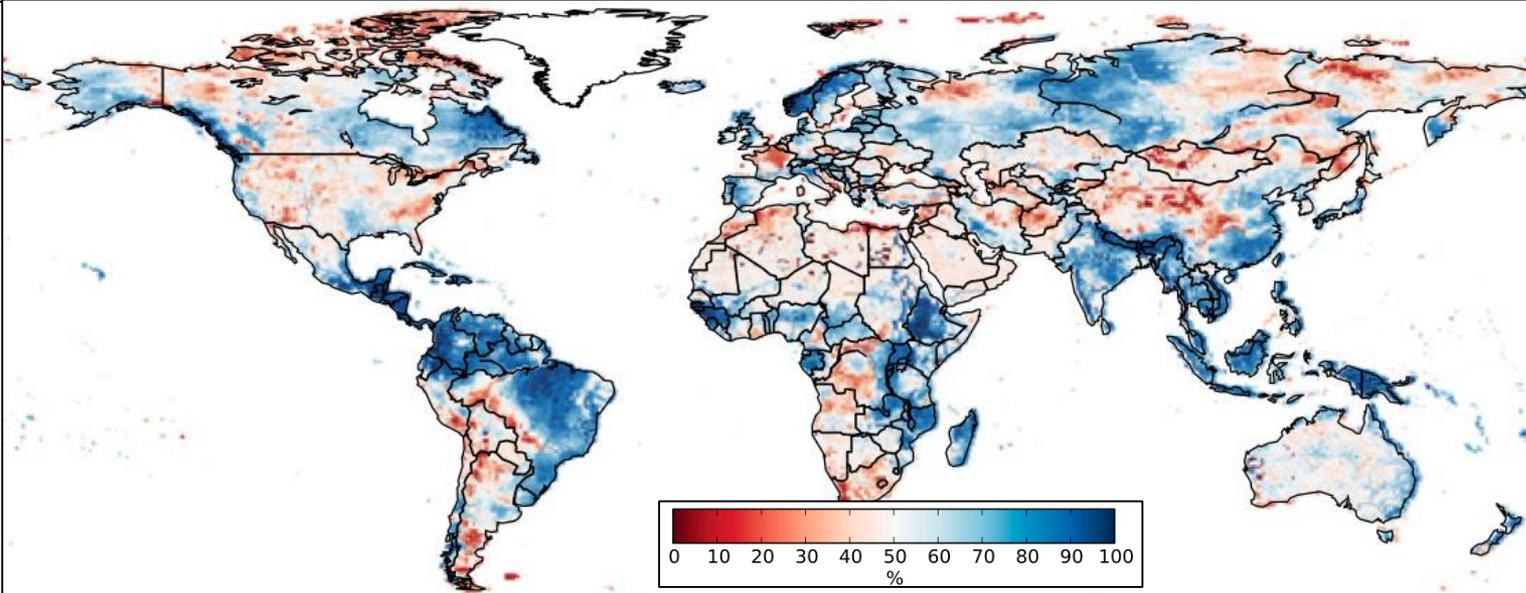
Jacob Schewe<sup>a,1</sup>, Jens Heinke<sup>a,b</sup>, Dieter Gerten<sup>a</sup>, Ingjerd Haddeland<sup>c</sup>, Nigel W. Arnell<sup>d</sup>, Douglas B. Clark<sup>e</sup>, Rutger Dankers<sup>f</sup>, Stephanie Eisner<sup>g</sup>, Balázs M. Fekete<sup>h</sup>, Felipe J. Colón-González<sup>i</sup>, Simon N. Gosling<sup>j</sup>, Hyungjun Kim<sup>k</sup>, Xingcai Liu<sup>l</sup>, Yoshimitsu Masaki<sup>m</sup>, Felix T. Portmann<sup>n,o</sup>, Yusuke Satoh<sup>p</sup>, Tobias Stacke<sup>q</sup>, Qihong Tang<sup>r</sup>, Yoshihide Wada<sup>f</sup>, Dominik Wisser<sup>s</sup>, Torsten Albrecht<sup>a</sup>, Katja Frieler<sup>a</sup>, Franziska Piontek<sup>a</sup>, Lila Warszawski<sup>a</sup>, and Pavel Kabat<sup>a,u</sup>

### The Inter-Sectoral Impact Model Intercomparison Project (ISI-MIP)



**Change (relative to present) in annual discharge at 2°C under RCP8.5.**

Colors show multimodel mean change, and saturation shows the agreement on the sign of change across all GHM–GCM combinations

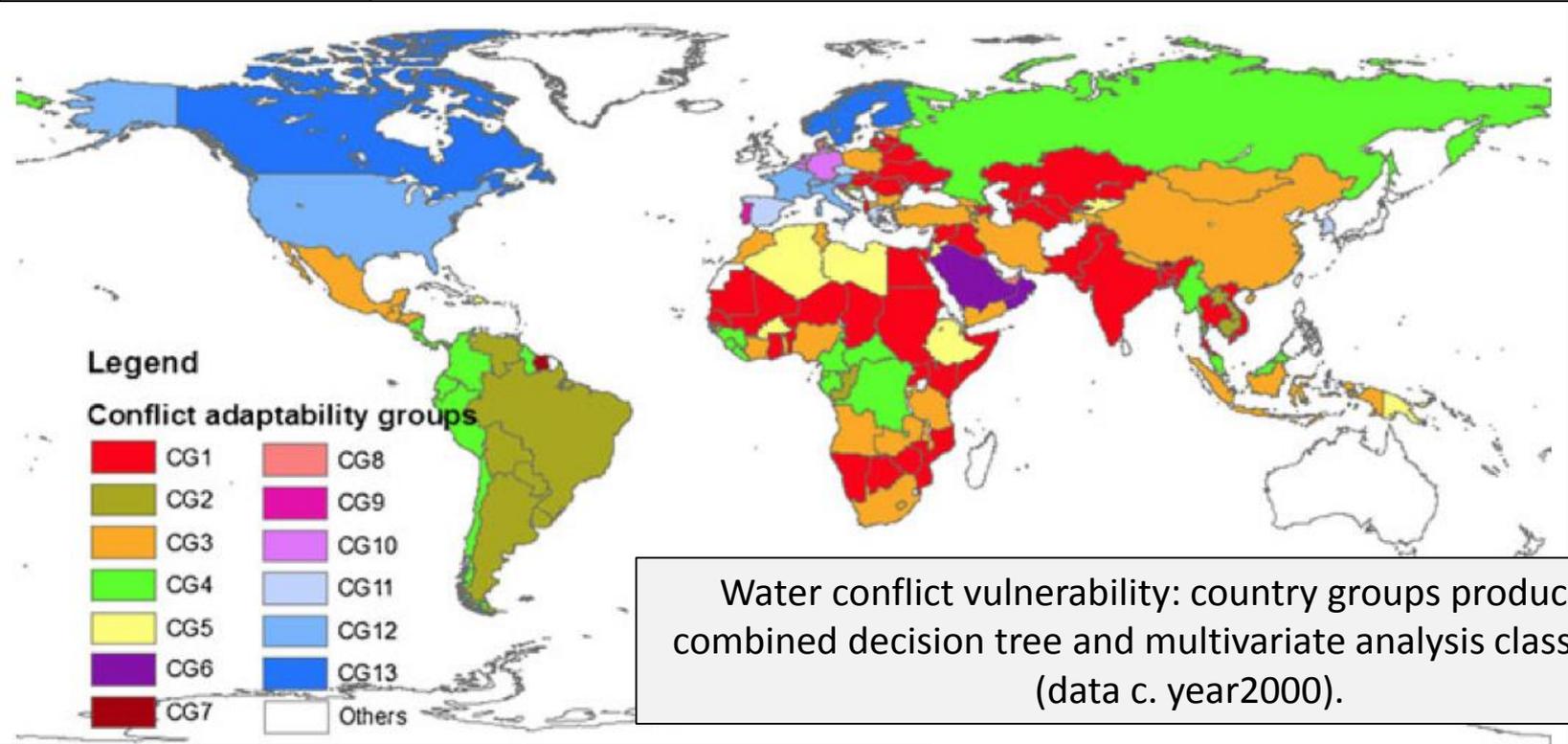


**Ratio of GCM variance to total variance.**

In red areas Global Hydrological Model variance predominates.

In blue areas Global Climate Model variance predominates.

# 3. Outcomes



Water conflict vulnerability: country groups produced by combined decision tree and multivariate analysis classification (data c. year2000).

group	groundwater dependency	external water dependency	water resources	income
1	low	HIGH	low	low
2	low	HIGH	HIGH	low
3	low	low	low	low
4	low	low	HIGH	low
5	HIGH	low	low	moderate
6	HIGH	low	low	moderate
7	HIGH	low	HIGH	low
8	HIGH	low	low	HIGH
9	low	HIGH	low	moderate
10	low	HIGH	low	HIGH
11	low	low	low	moderate
12	low	low	low	HIGH
13	low	low	HIGH	HIGH

Water Resour Manage (2014) 28:169–184  
DOI 10.1007/s11269-013-0478-x

## Water Conflict Risk due to Water Resource Availability and Unequal Distribution

N. K. Gunasekara • S. Kazama • D. Yamazaki • T. Oki

# 3. Outcomes

OPEN ACCESS

IOP PUBLISHING

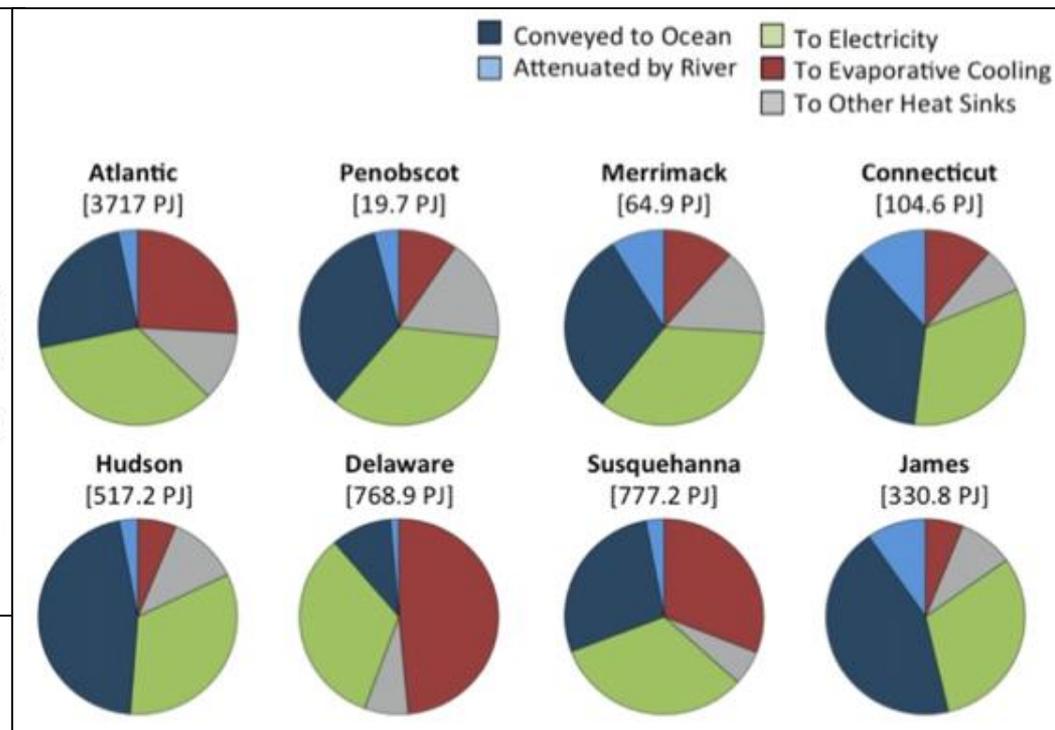
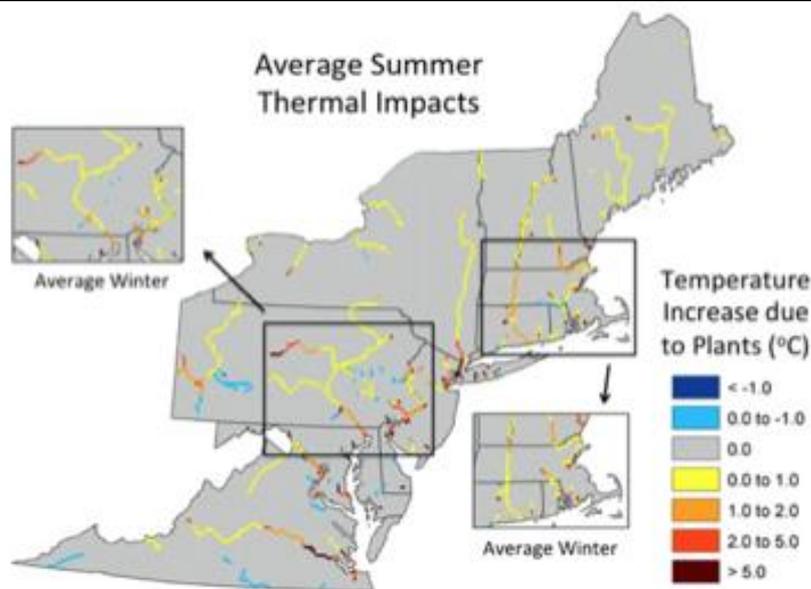
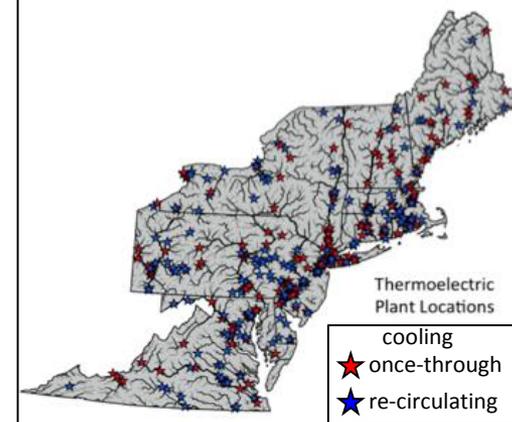
Environ. Res. Lett. 8 (2013) 025010 (10pp)

ENVIRONMENTAL RESEARCH LETTERS

doi:10.1088/1748-9326/8/2/025010

## Horizontal cooling towers: riverine ecosystem services and the fate of thermoelectric heat in the contemporary Northeast US

Robert J Stewart<sup>1</sup>, Wilfred M Wollheim<sup>1,2</sup>, Ariel Miara<sup>3</sup>, Charles J Vörösmarty<sup>3,4</sup>, Balazs Fekete<sup>3,4</sup>, Richard B Lammers<sup>1</sup> and Bernice Rosenzweig<sup>3</sup>



Increase in average summer water temperatures (2000–2010) due to thermal pollution from power plants.

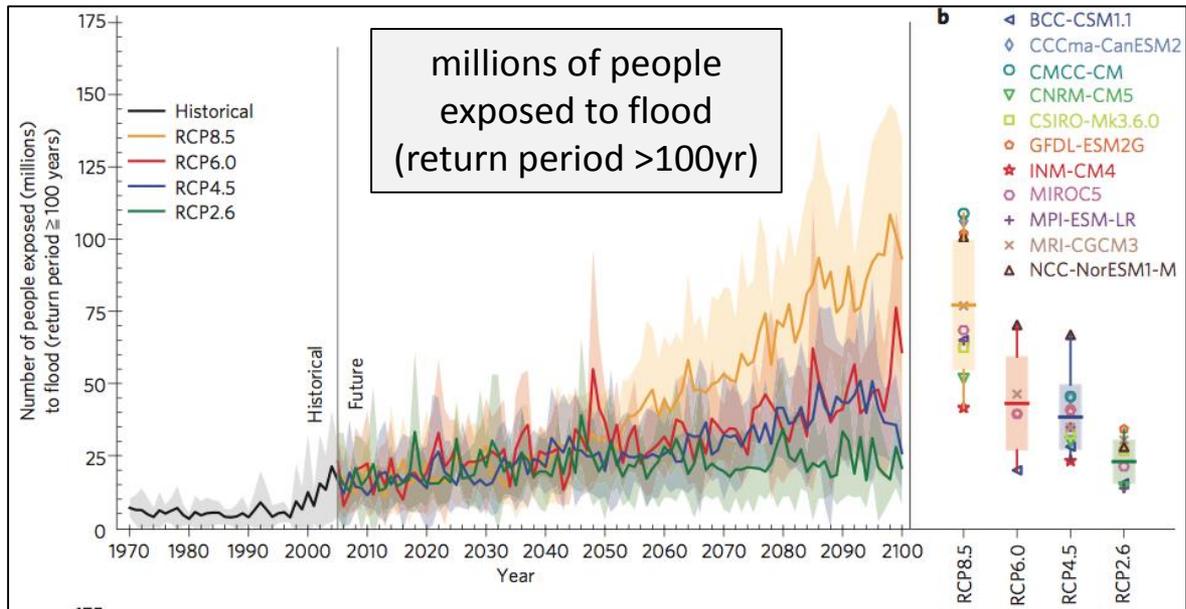
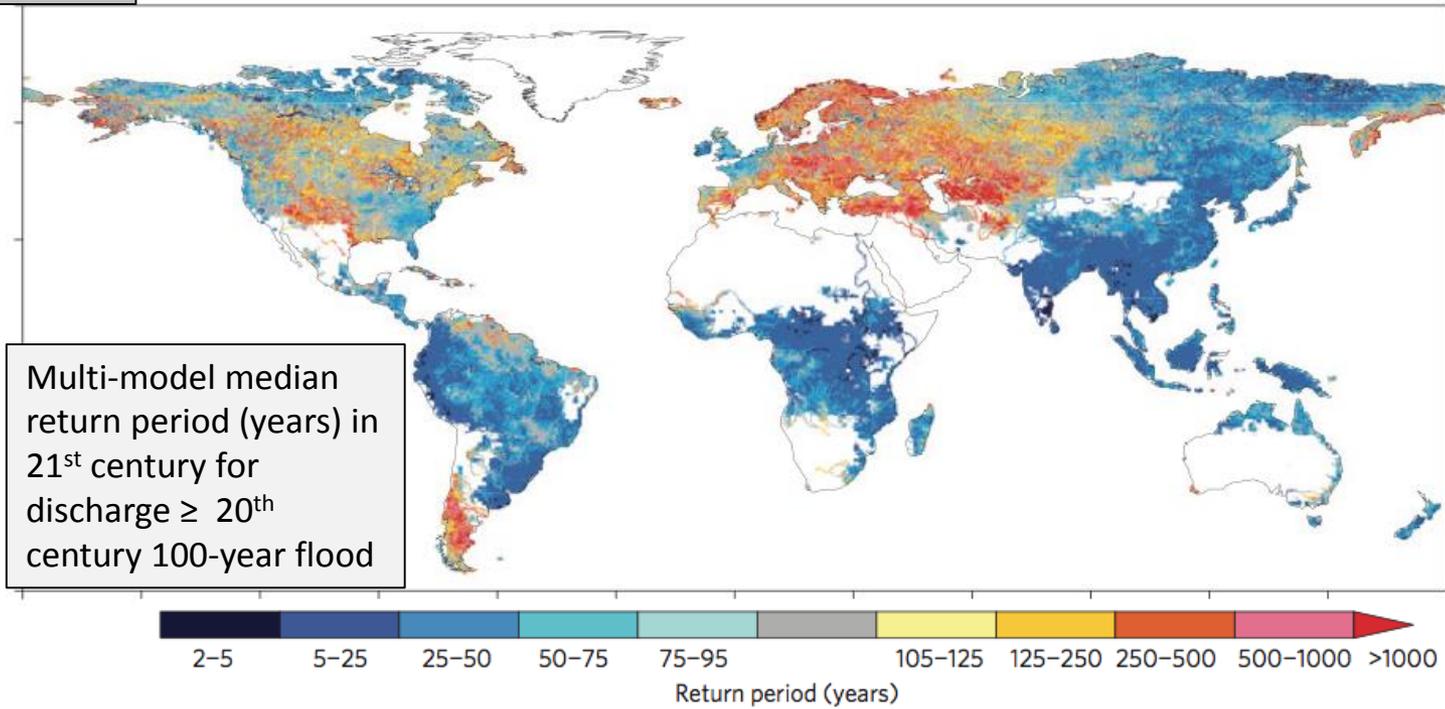
Callout boxes show results for average winter conditions in selected regions.

Temperature increases due to plants are more widespread in the summer because waste heat inputs are dissipated more quickly in the winter.

Allocation of total heat (in petajoules) generated in freshwater thermoelectric power plants during electricity production at selected basins.

# 3. Outcomes

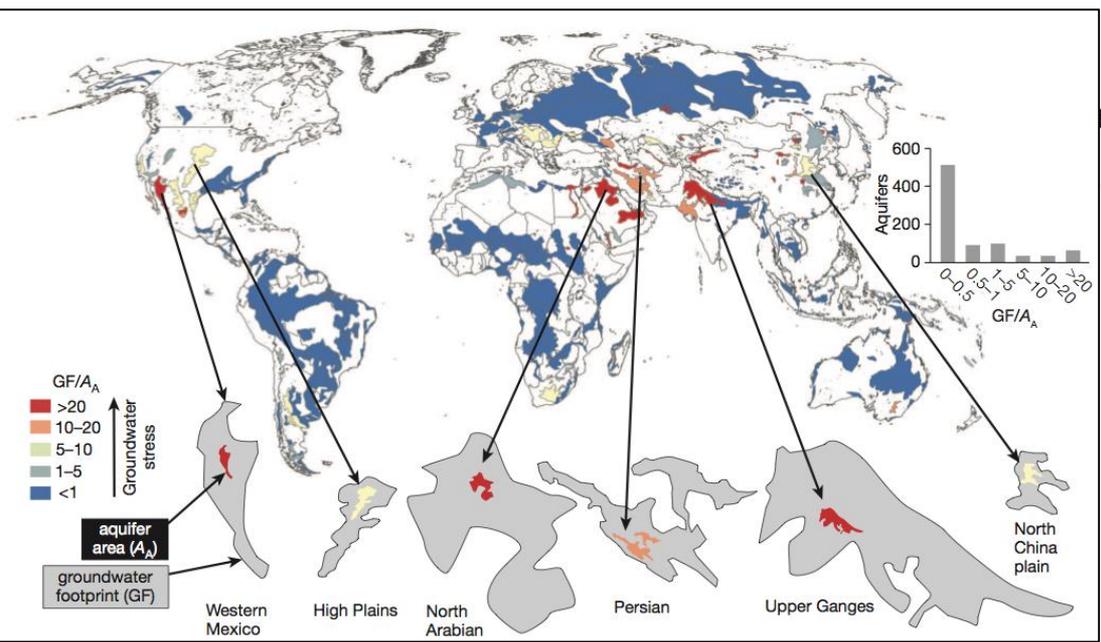
Hirabayashi *et al* (2013) Global flood risk under climate change, *Nature Climate Change*



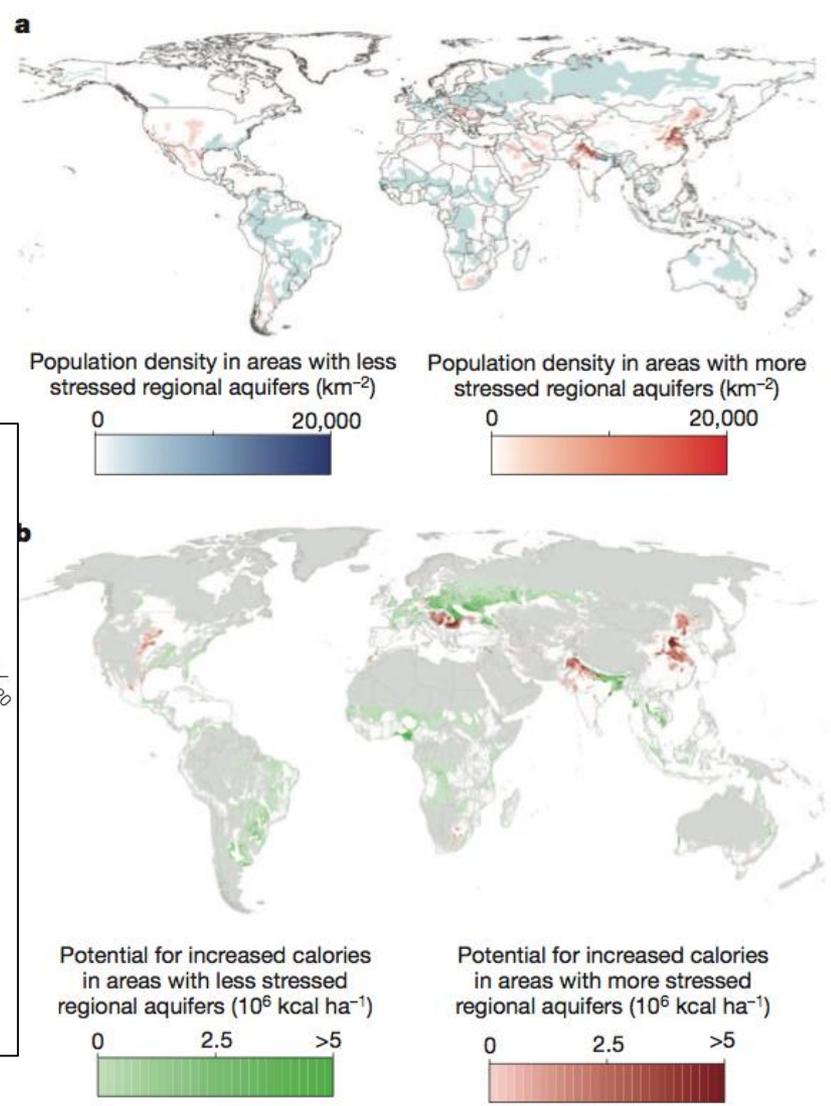
# 3. Outcomes

## Water balance of global aquifers revealed by groundwater footprint

Tom Gleeson<sup>1</sup>, Yoshihide Wada<sup>2</sup>, Marc F. P. Bierkens<sup>2,3</sup> & Ludovicus P. H. van Beek<sup>2</sup>



Groundwater footprints of aquifers that are important to agriculture are significantly larger than their geographic areas. Aquifers are major groundwater basins with recharge of  $>2$  mm yr. At the bottom of the figure, the areas of the six aquifers (Western Mexico, High Plains, North Arabian, Persian, Upper Ganges and North China plain) are shown at the same scale as the global map; the surrounding grey areas indicate the groundwater footprint proportionally at the same scale. The ratio  $GF/AA$  indicates widespread stress of groundwater resources and/or groundwater-dependent ecosystems. Inset, histogram showing that  $GF$  is less than  $AA$  for most aquifers.

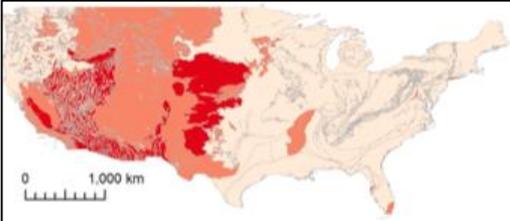
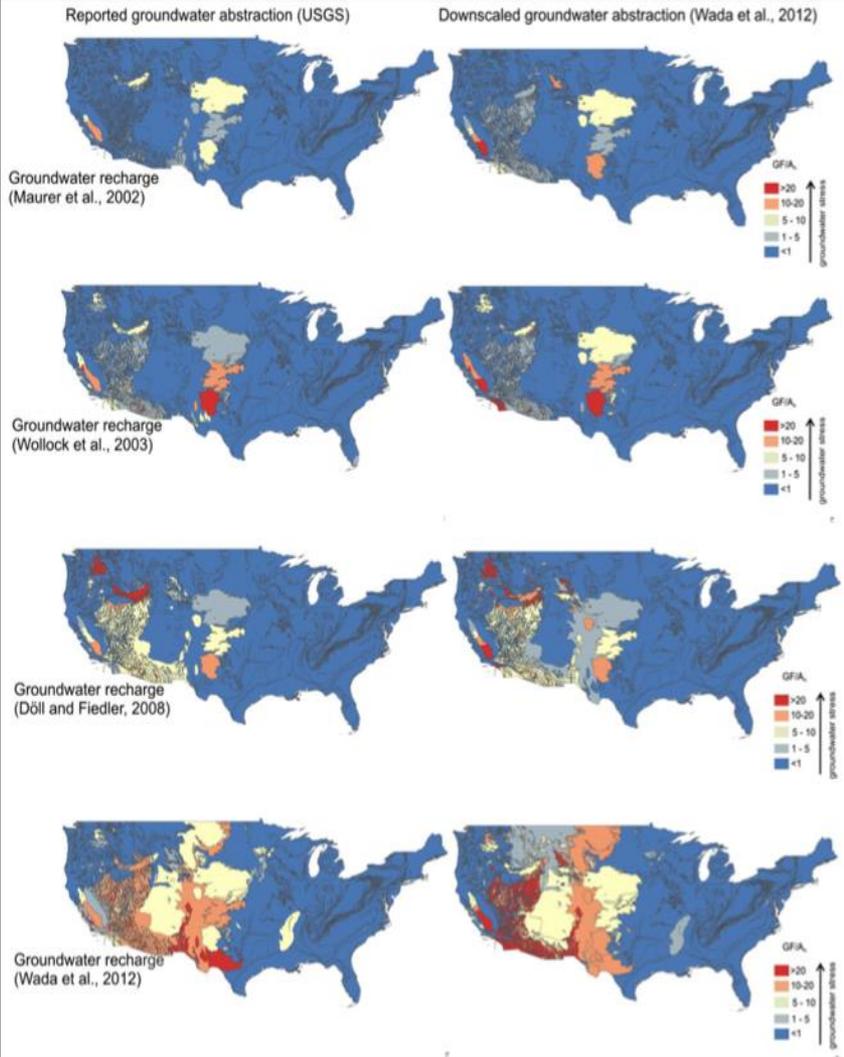


**Figure 2 | Groundwater stress may be affecting ~1.7 billion people and could limit the potential to increase agricultural production.** The ratio  $GF/AA$  is used to differentiate areas with less groundwater stress ( $GF/AA < 1$ ) and more groundwater stress ( $GF/AA > 1$ ). **a**, Population densities, derived from the gridded population of the world for year 2000 (ref. 29). Areas that do not have underlying regional aquifers, or that have very low population density are shown in white. **b**, Potential for increased calories (see main text). Some areas with potential new calories<sup>15</sup> coincide with stressed aquifers and some areas coincide with aquifers that are less stressed. Areas with potential new calories that are not underlain by a regional aquifer are shown in white.

# 3. Outcomes

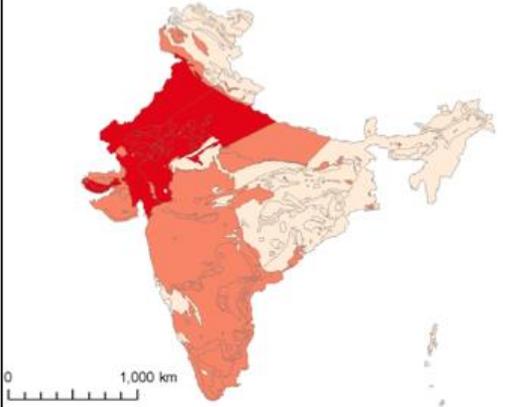
Gleeson & Wada, *ERL* 2013

## Assessing regional groundwater stress for nations using multiple data sources with the groundwater footprint



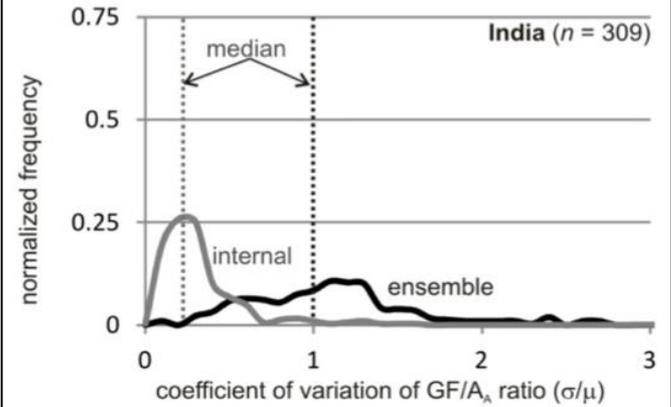
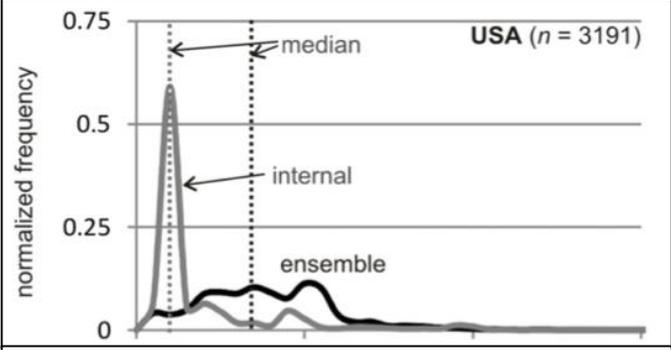
$$GF \text{ (groundwater footprint)} = \frac{\text{gw withdrawal}}{\text{gw net recharge}} \cdot \text{Area}$$

$A_A$  = aquifer known area

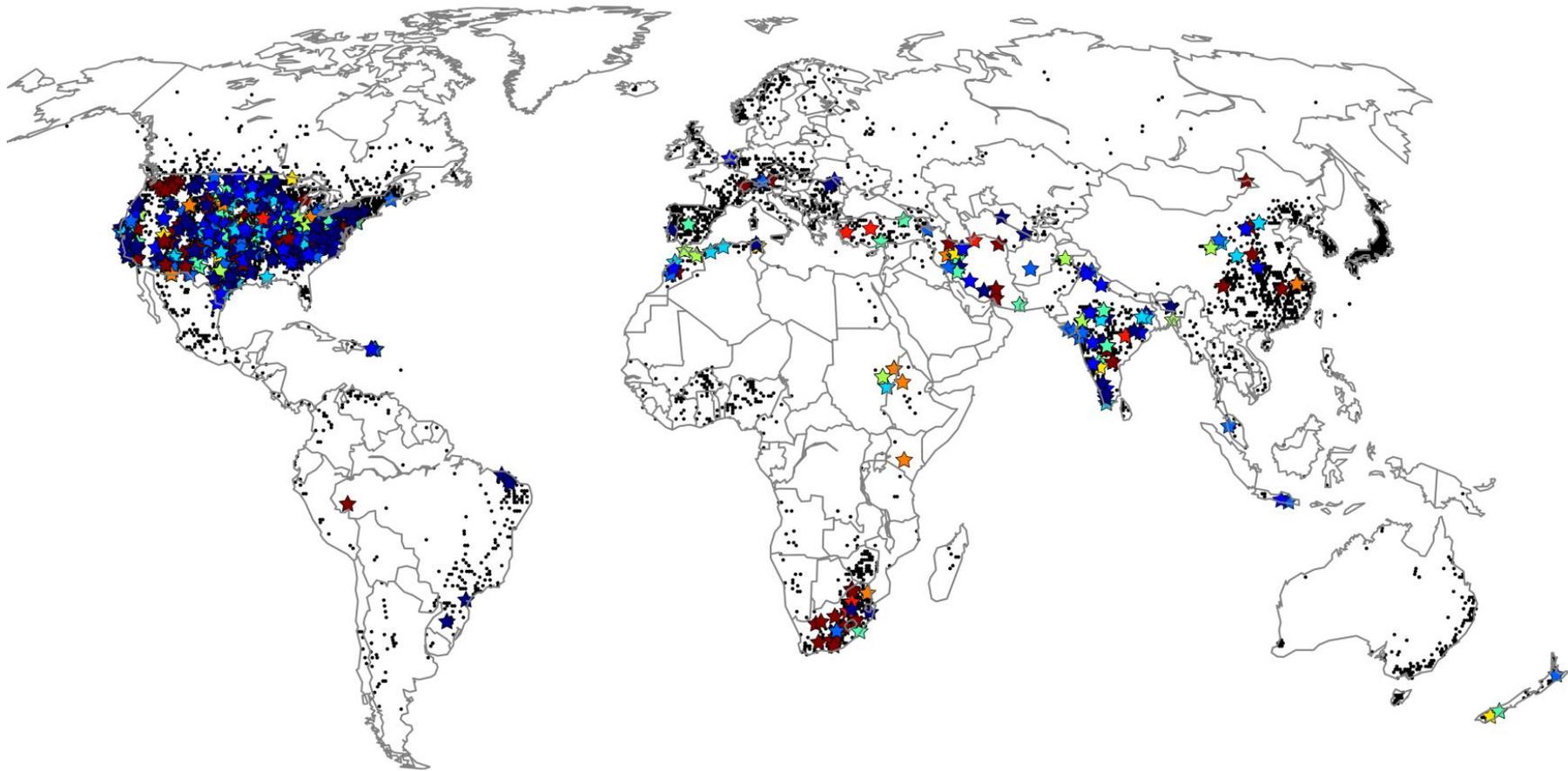


**Aquifer stressed ( $GF/A_A > 1$ ) for:**

- ALL combinations of input data
- SOME combinations of input data
- NO combinations of input data



ensemble  
uncertainty  
2-5x  
internal  
uncertainty



• Reservoirs in GRanD database

★ Reported reservoir capacity loss rates due to sedimentation

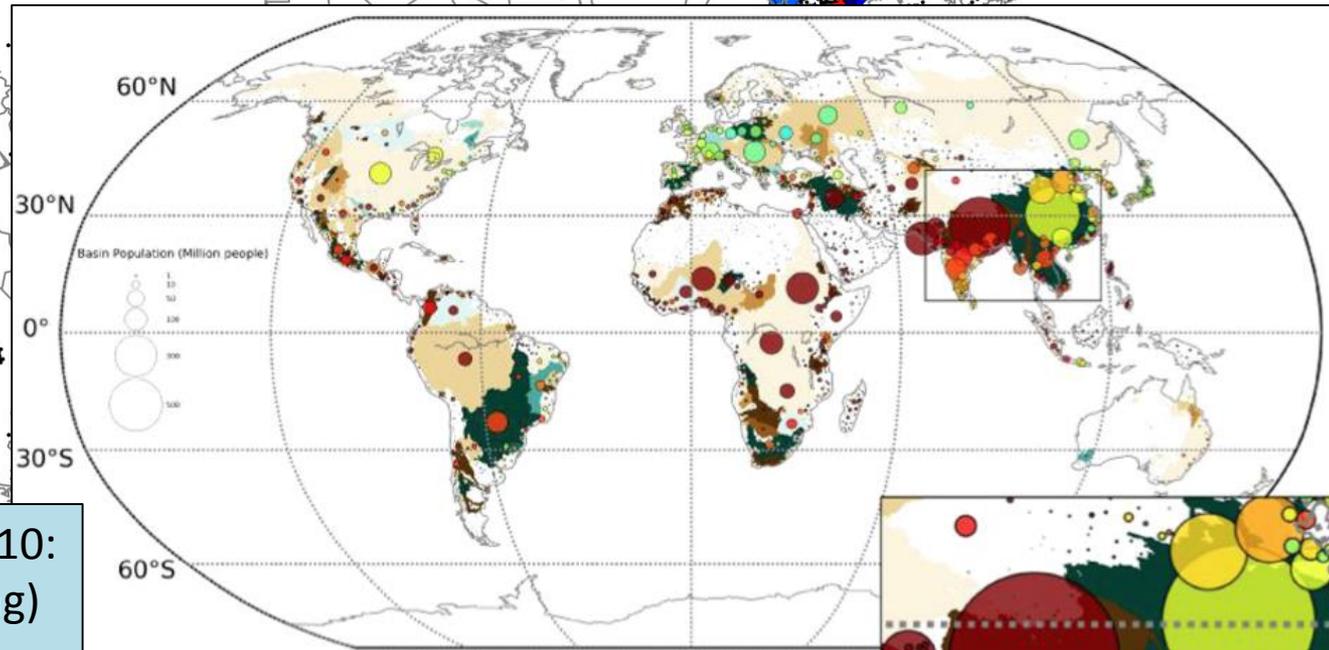
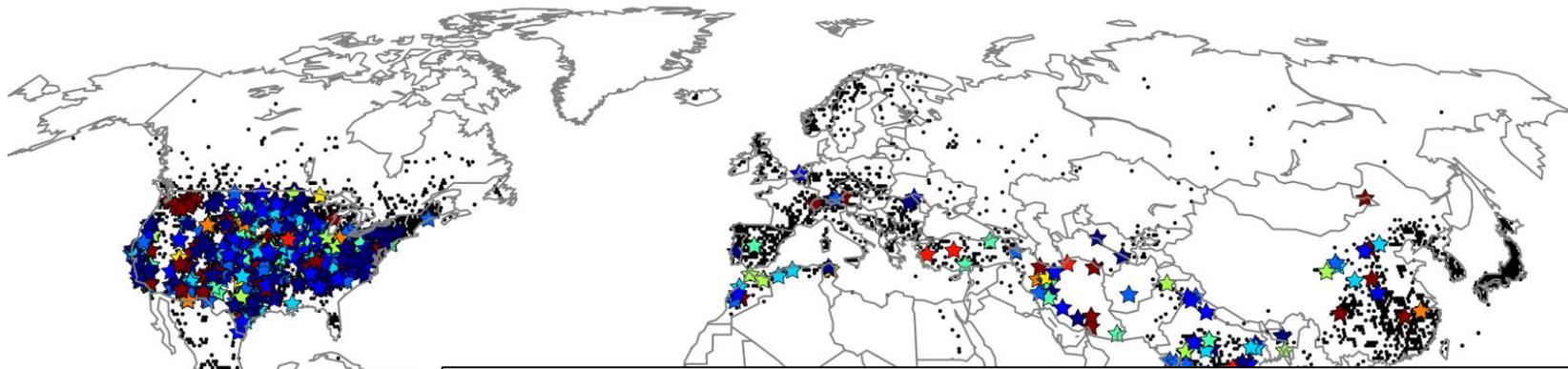


Loss Rate [% per year]

(from Dominik Wisser, Bonn U)

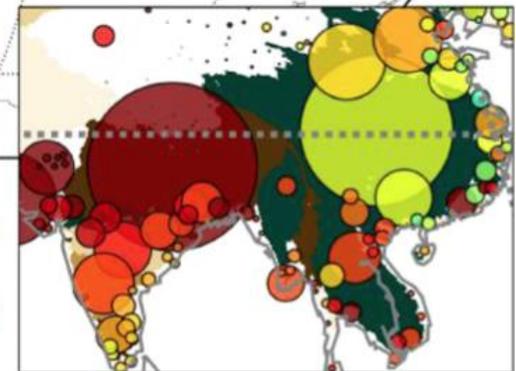
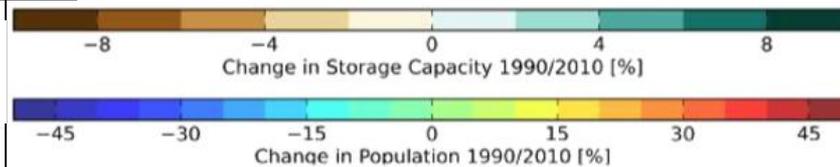
### 3. Outcomes

### Dwindling Storage in Reservoirs



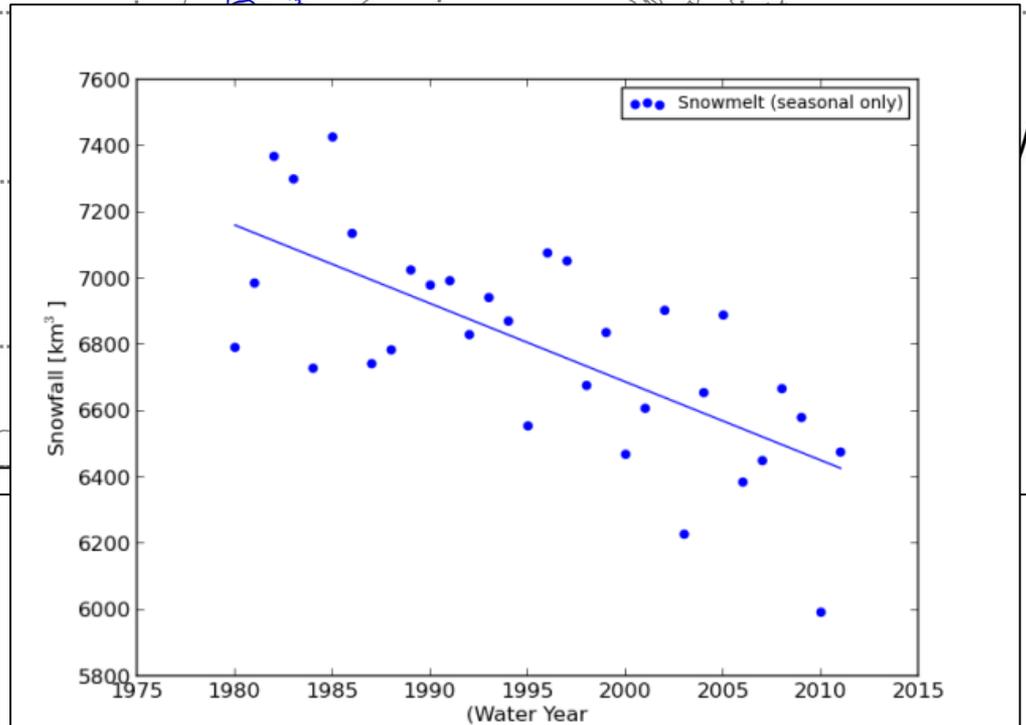
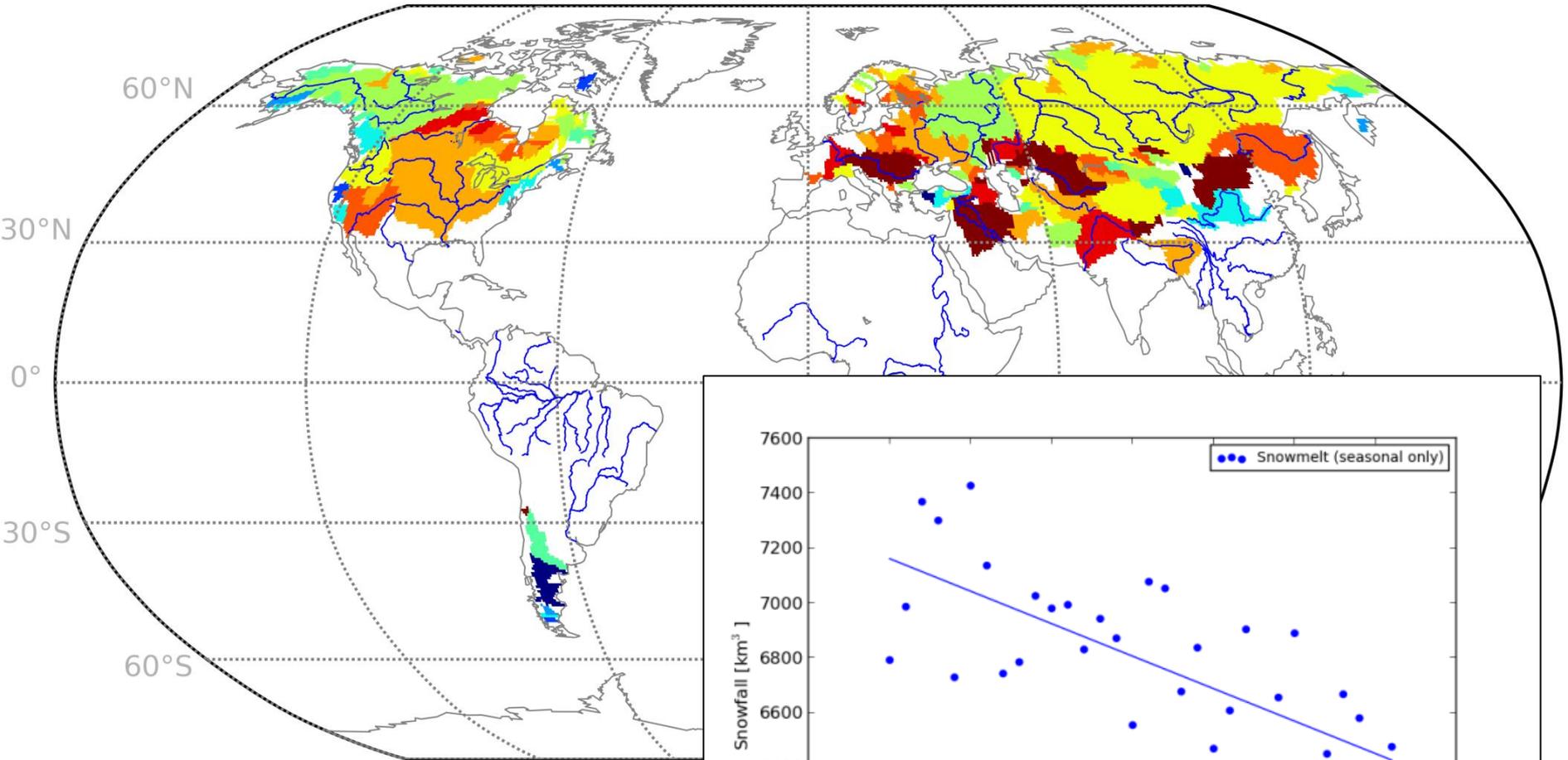
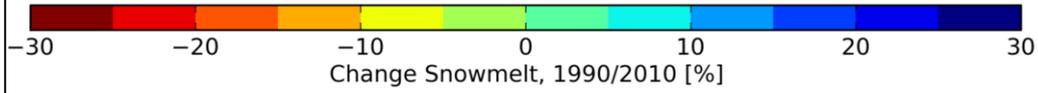
river basin change 1990-2010:  
• reservoir capacity (shading)  
• population (filled circles)

Wisser et al. 2013 *WRR*



# 3. Outcomes

# Dwindling Storage in Snow

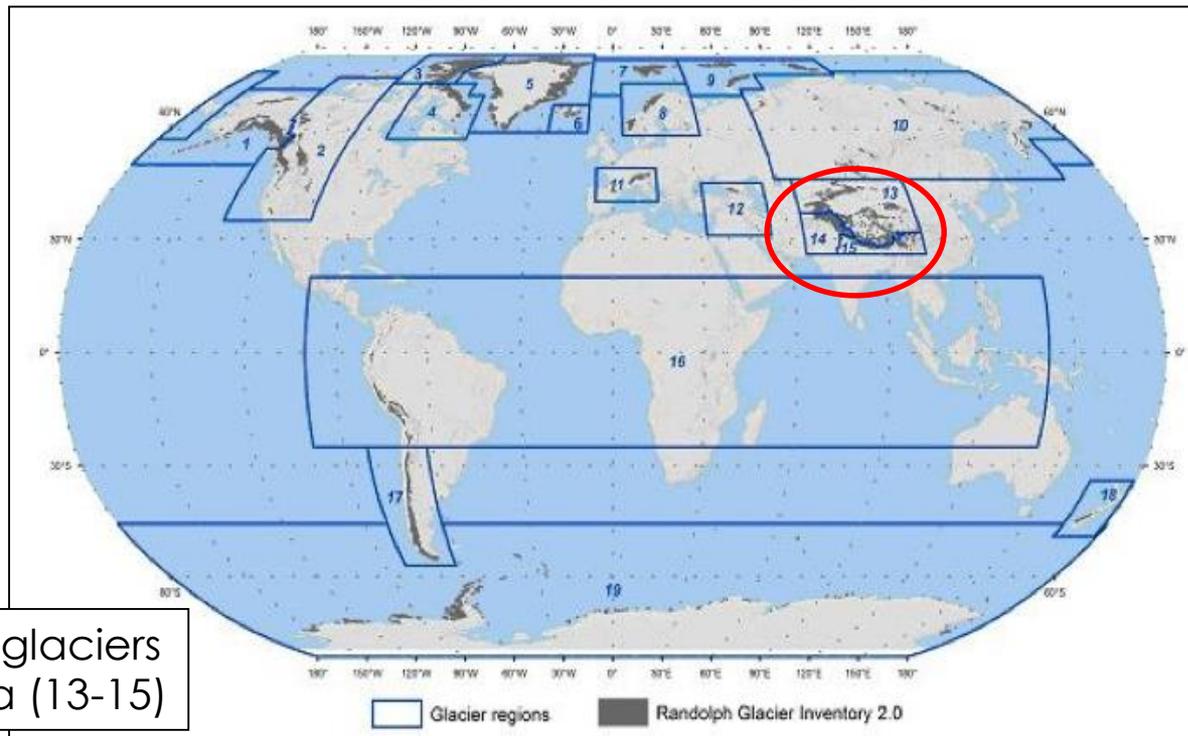


(from Dominik Wisser, Bonn U)

# 3. Outcomes

# Coupling WBM & Glacier Mass Balance Modeling

Radic et al. (*Climate Dynamics*, 2013)

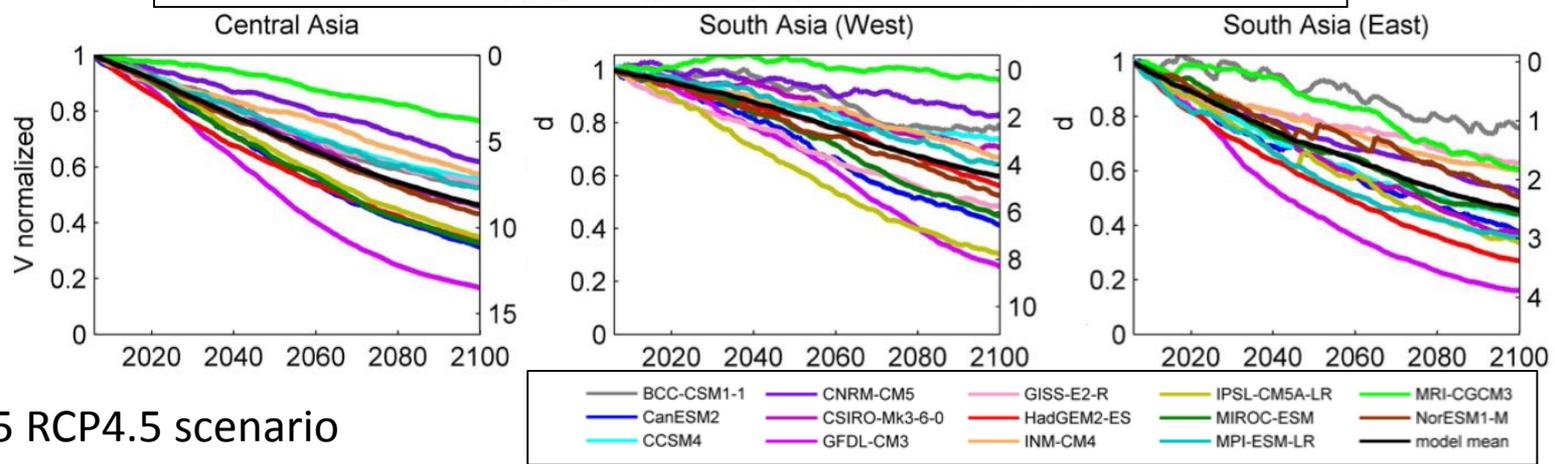


About 80,000 glaciers in Central Asia (13-15)

glacier annual volume

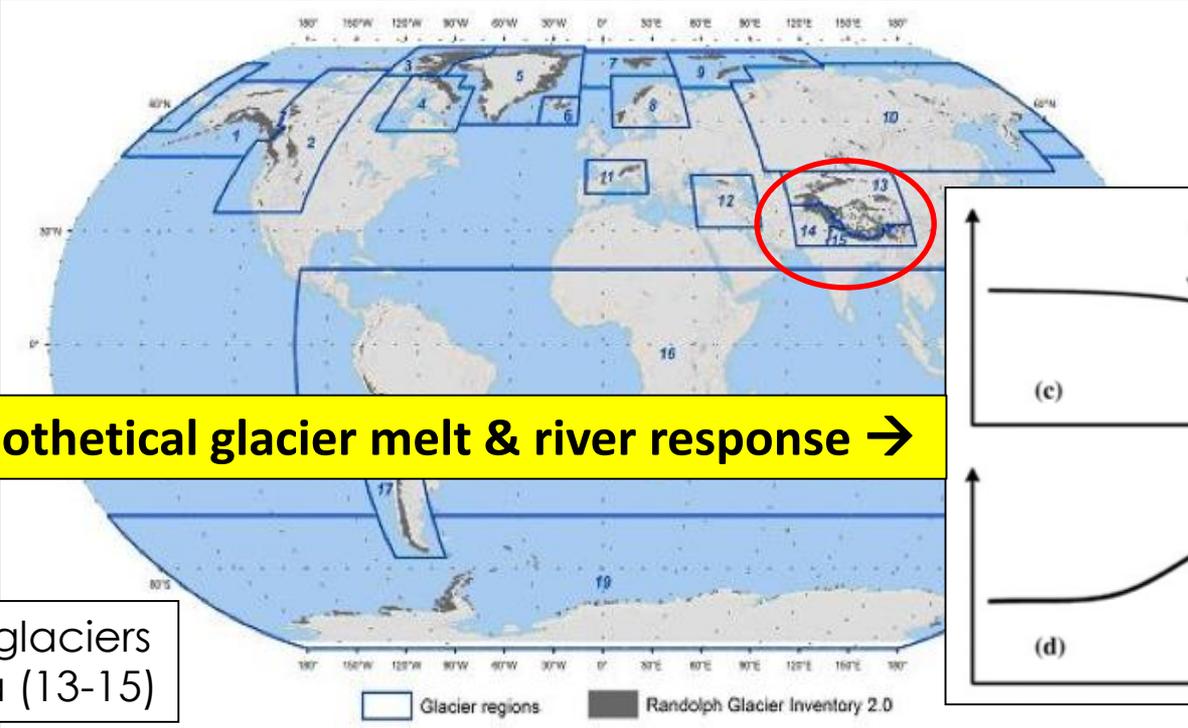
glacier melt sea-level equiv. (mm)

IPCC AR5 RCP4.5 scenario



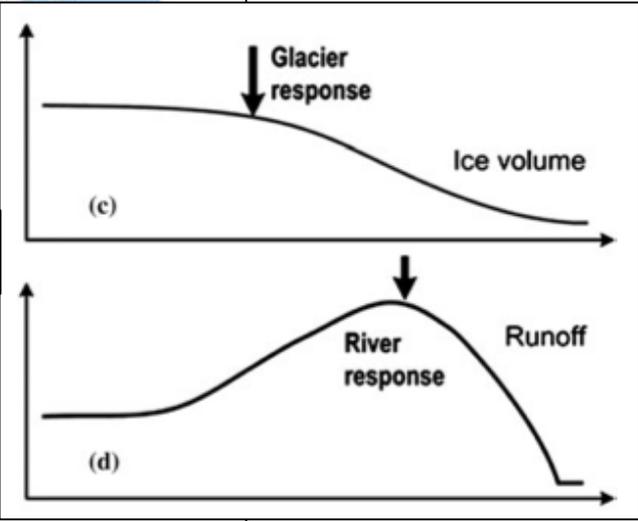
- BCC-CSM1-1
- CanESM2
- CCSM4
- CNRM-CM5
- CSIRO-Mk3-6-0
- GFDL-CM3
- GISS-E2-R
- HadGEM2-ES
- INM-CM4
- IPSL-CM5A-LR
- MIROC-ESM
- MPI-ESM-LR
- MRI-CGCM3
- NorESM1-M
- model mean

# 3. Outcomes Coupling WBM & Glacier Mass Balance Modeling



Radic et al. (*Climate Dynamics*, 2013)

**Hypothetical glacier melt & river response →**

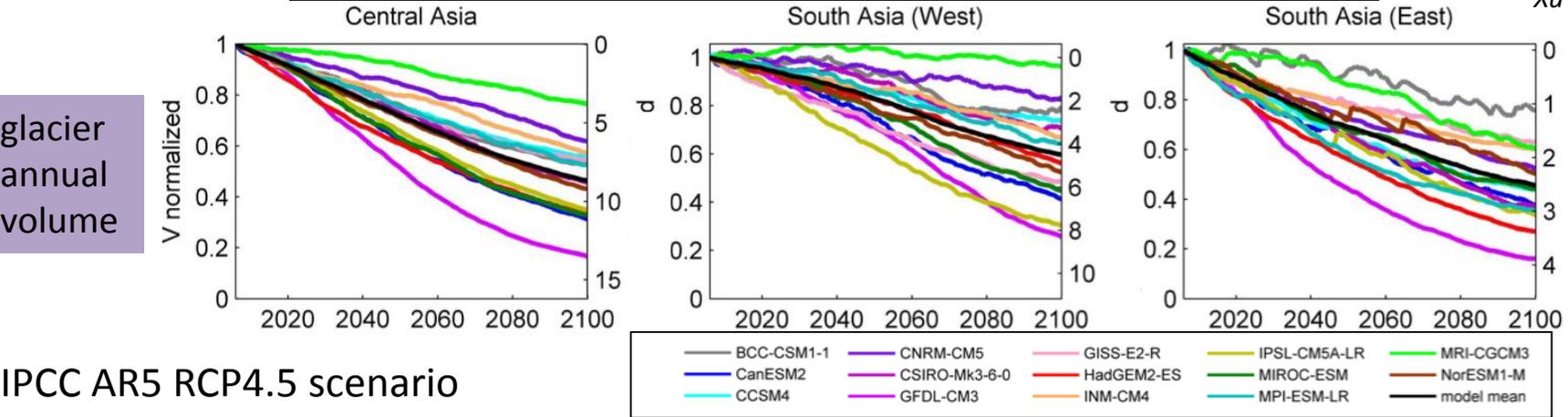


About 80,000 glaciers in Central Asia (13-15)

Xu et al. (2009)

glacier annual volume

glacier melt sea-level equiv. (mm)



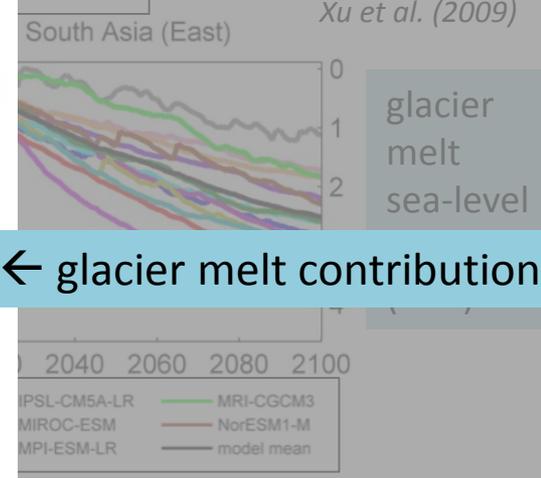
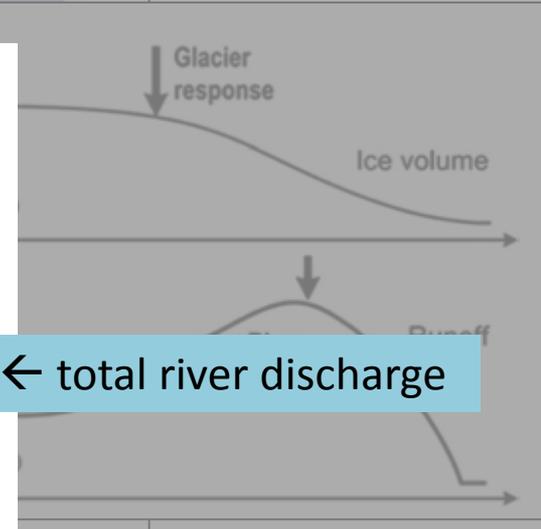
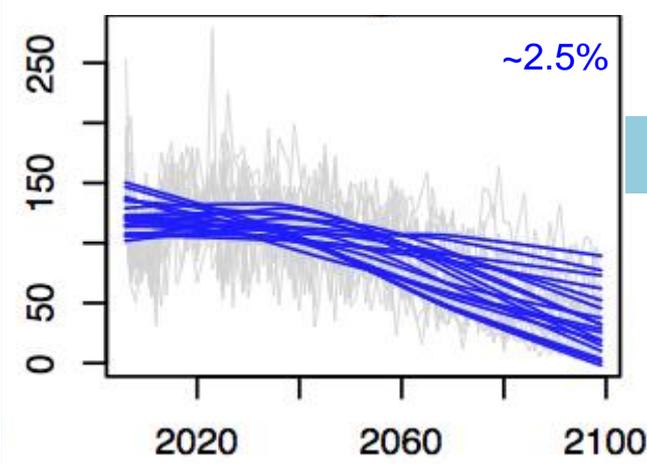
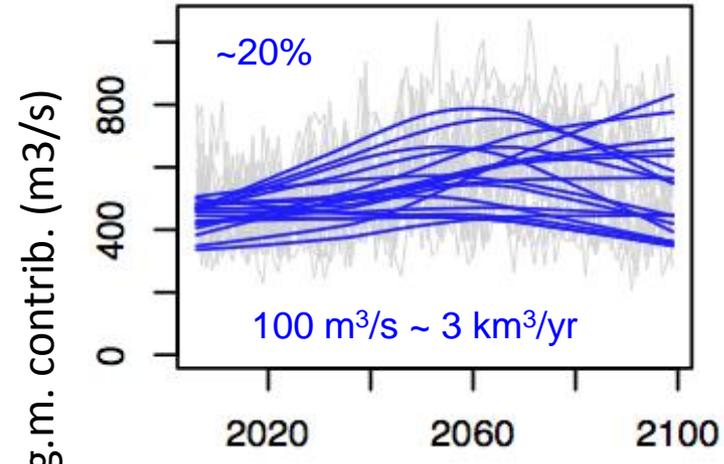
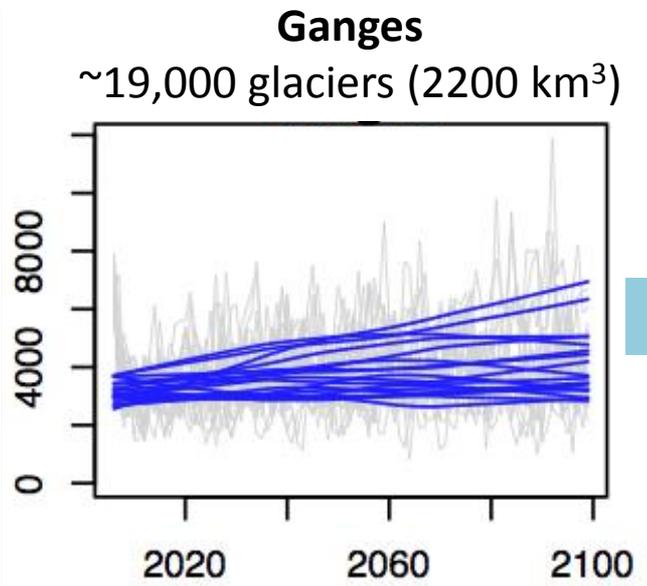
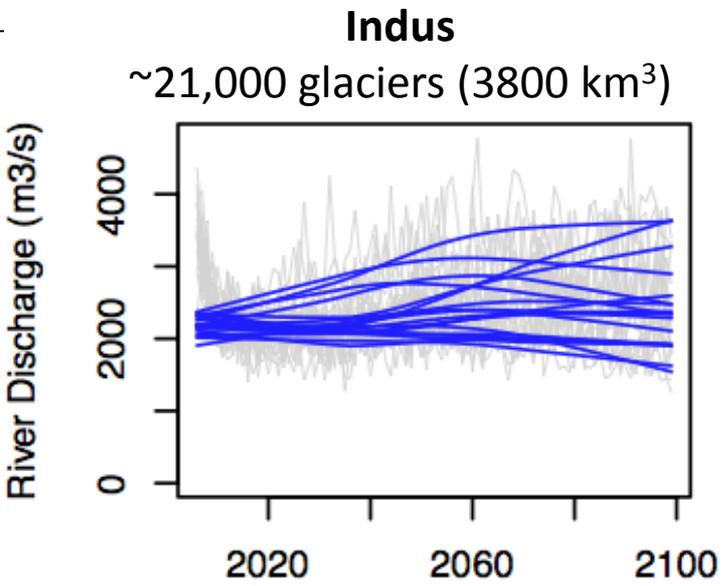
IPCC AR5 RCP4.5 scenario

# 3. Outcomes Coupling WBM & Glacier Mass Balance Modeling

— annual discharge for 9 GCMs and 2 scenarios (RCP 4.5 & 8.5)  
— smoothed annual discharge



Radic et al. (*Climate Dynamics*, 2013)



# 3. Outcomes Coupling WBM & Glacier Mass Balance Modeling

— Indus River annual discharge for 9 GCMs and 2 scenarios (RCP 4.5 & 8.5)  
— smoothed annual discharge (RCP 4.5 & 8.5)



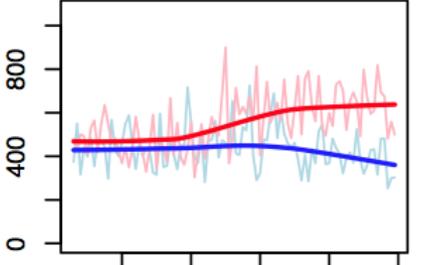
Radic et al. (*Climate Dynamics*, 2013)

glacier melt contribution

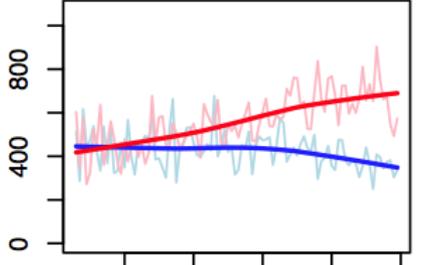
glacier melt river discharge at mouth (m<sup>3</sup>/s)

**Indus**  
 ~21,000 glaciers (3800 km<sup>3</sup>)  
 ~20% of discharge

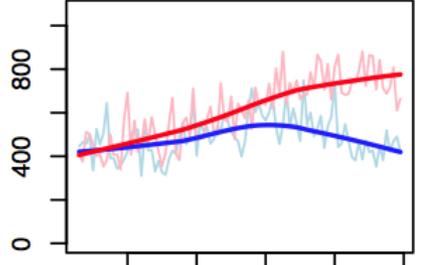
Indus - BCC-CSM1-1



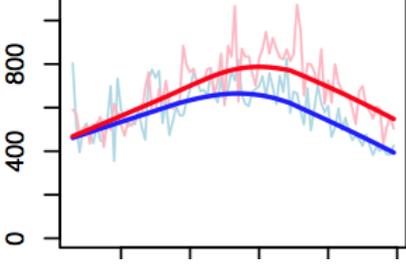
Indus - CCSM4



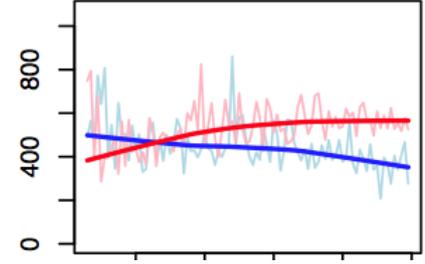
Indus - CSIRO-Mk3-6-0



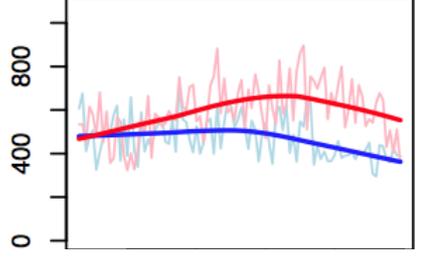
Indus - GFDL-CM3



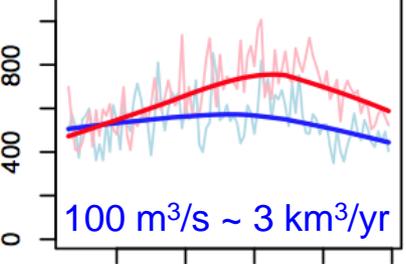
Indus - GISS-E2-R



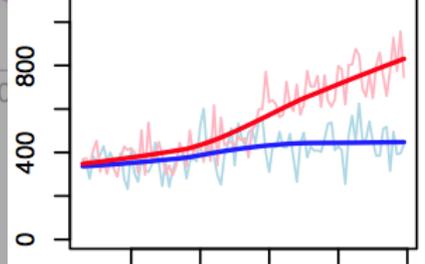
Indus - IPSL-CM5A-LR



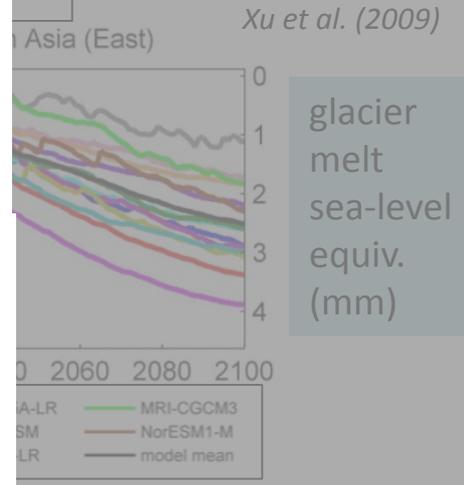
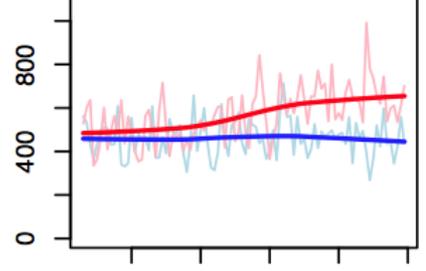
Indus - MIROC-ESM



Indus - MRI-CGCM3



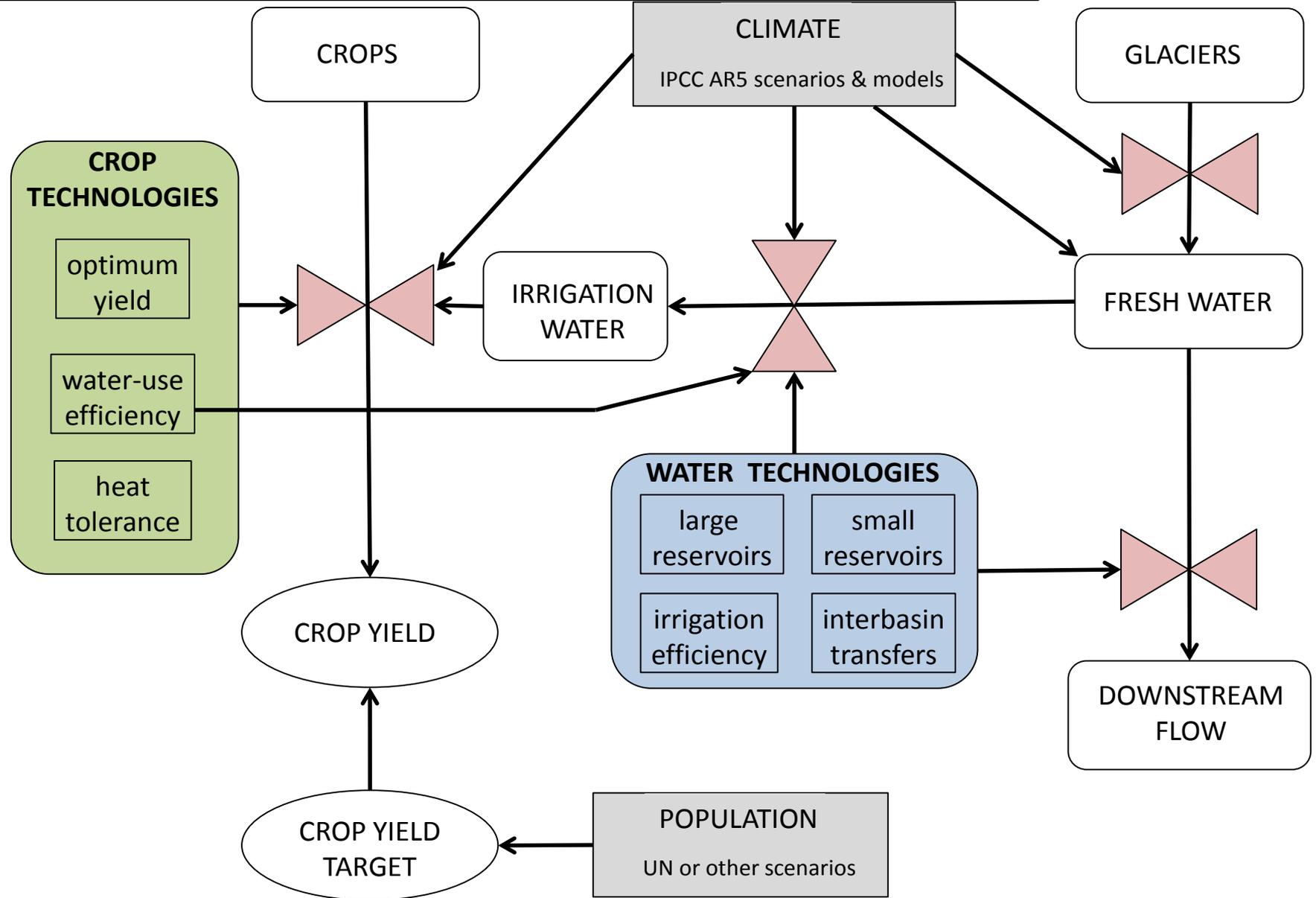
Indus - NorESM1-M



glacier melt sea-level equiv. (mm)

# 4. Relevance to IAMs

## How can 'technologies' improve water supply & crop yield?



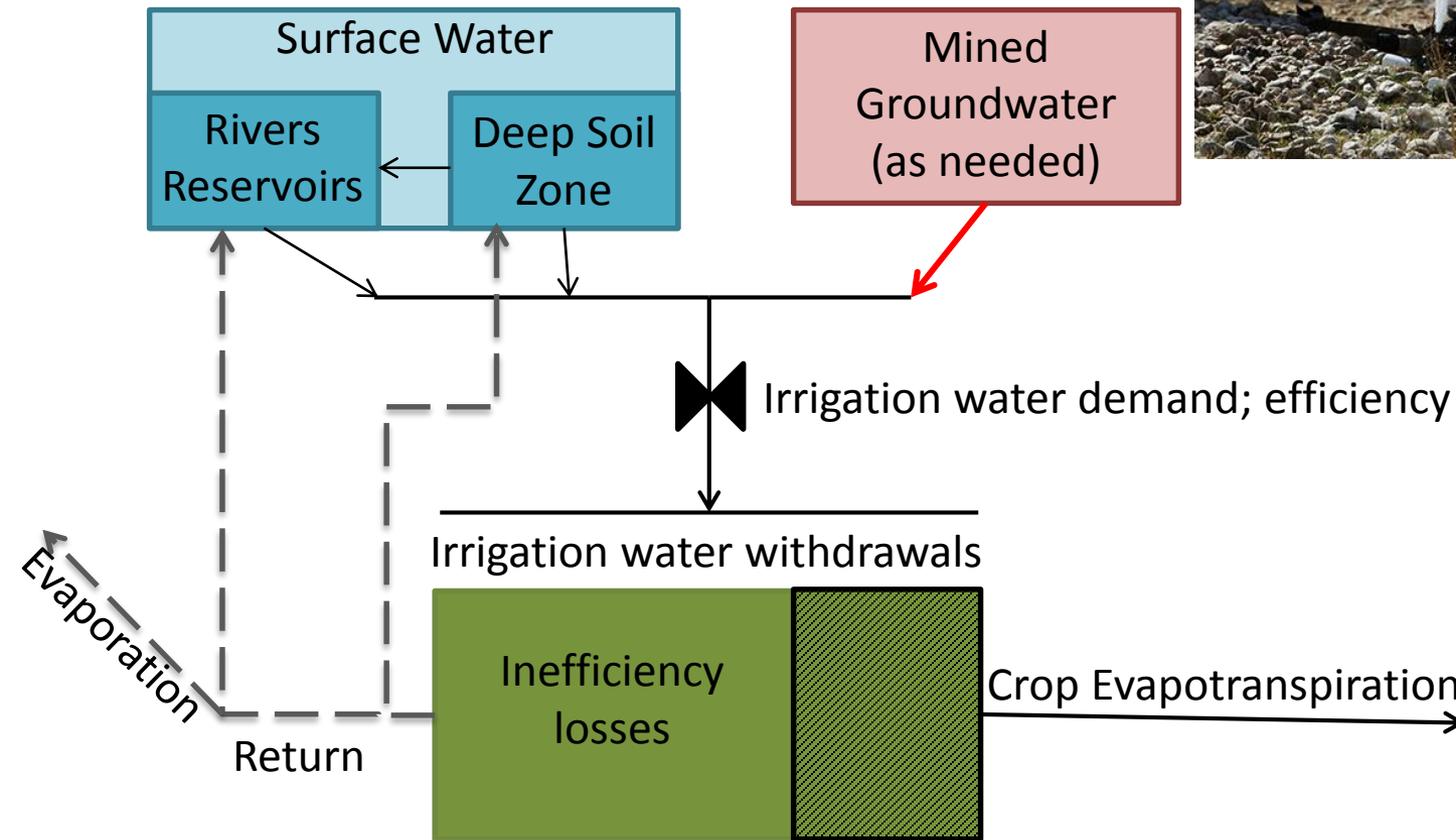




### 3. Outcomes

#### Improving irrigation efficiency

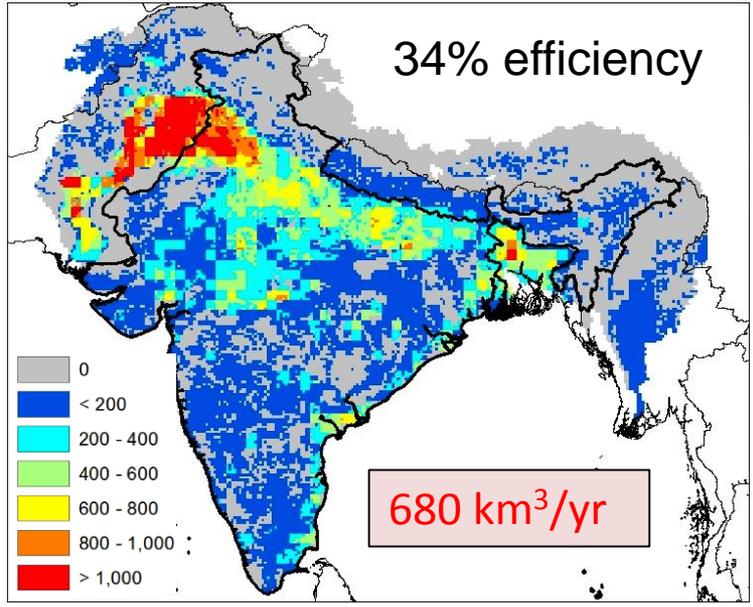
India's irrigation efficiency (FAO) = 0.34  
Irrigation water withdrawal = demand  $\div$  0.34



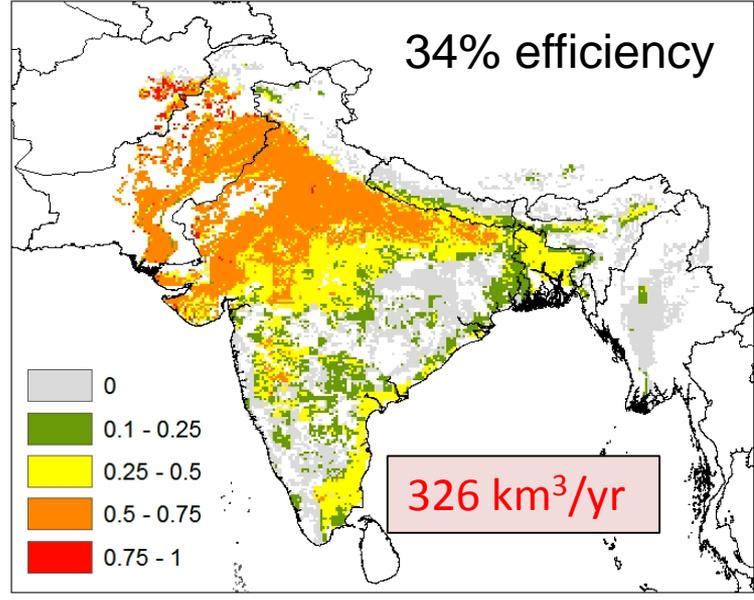
### 3. Outcomes

Irrigation, mined groundwater fraction of demand (c.2000)

irrigation water demand (mm/y)



Mined groundwater (MGW) fraction of demand

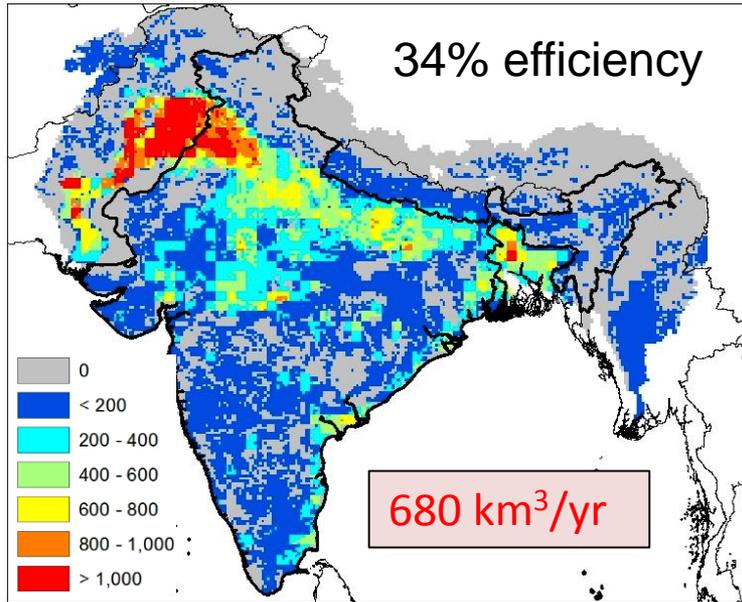


MGW = 48% of demand

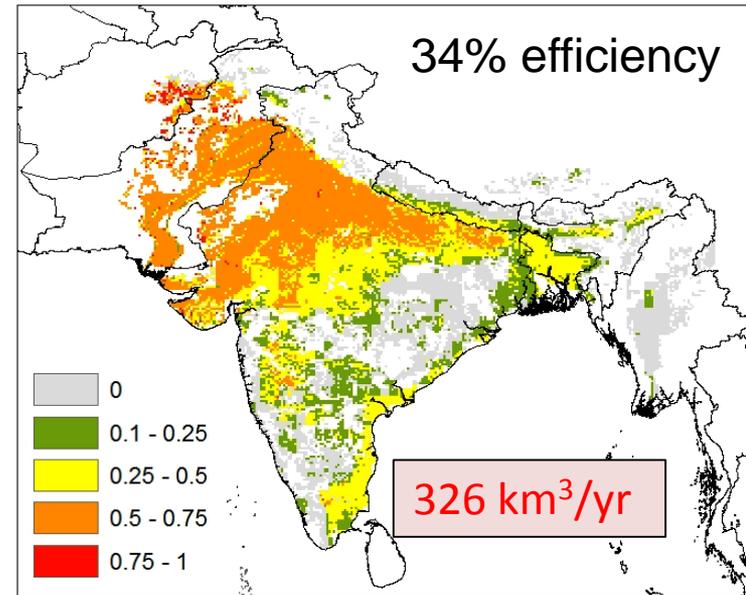
### 3. Outcomes

Irrigation, mined groundwater fraction of demand (c.2000)

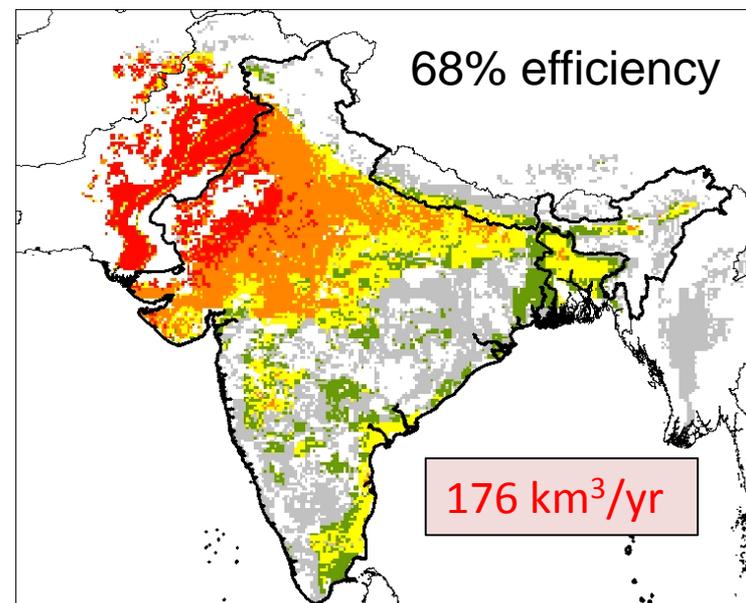
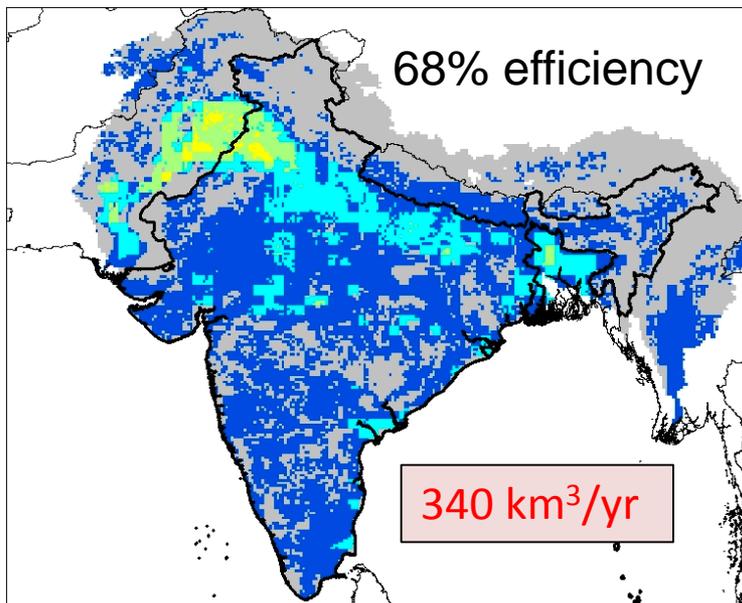
irrigation water demand (mm/y)



Mined groundwater (MGW) fraction of demand



MGW = 48%  
of demand

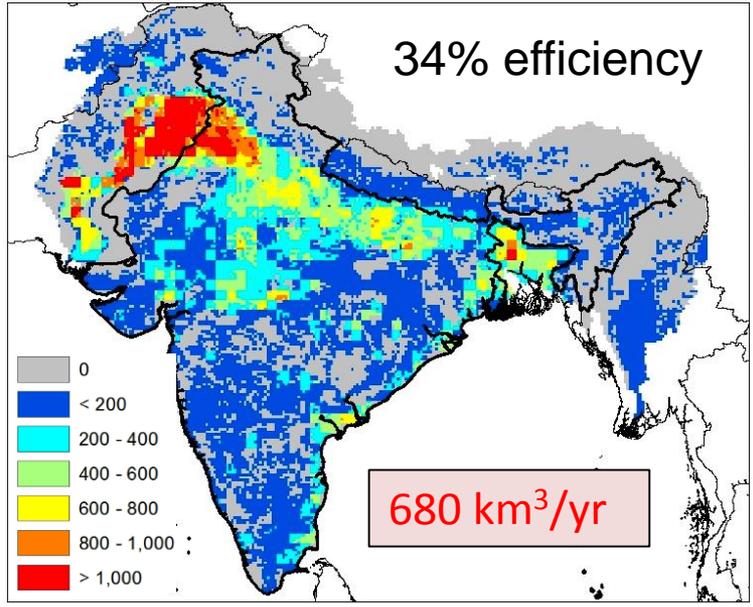


MGW = 52%  
of demand

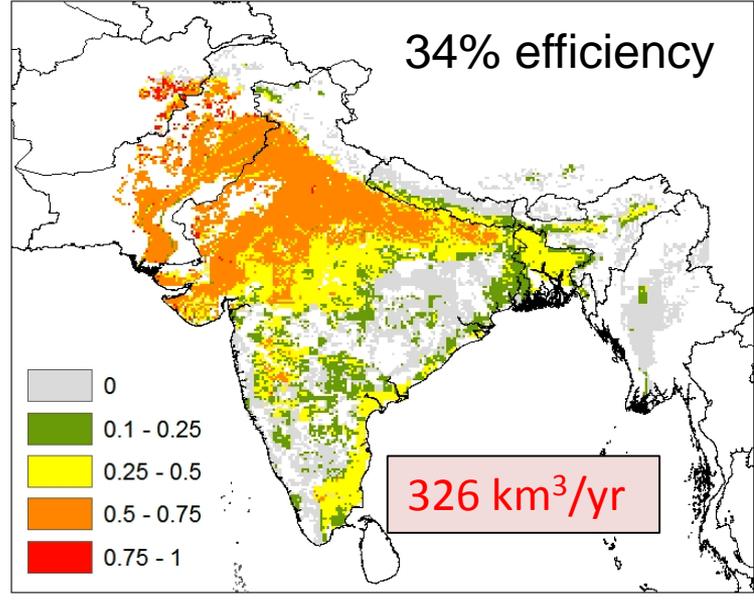
# 3. Outcomes

Irrigation, mined groundwater fraction of demand (c.2000)

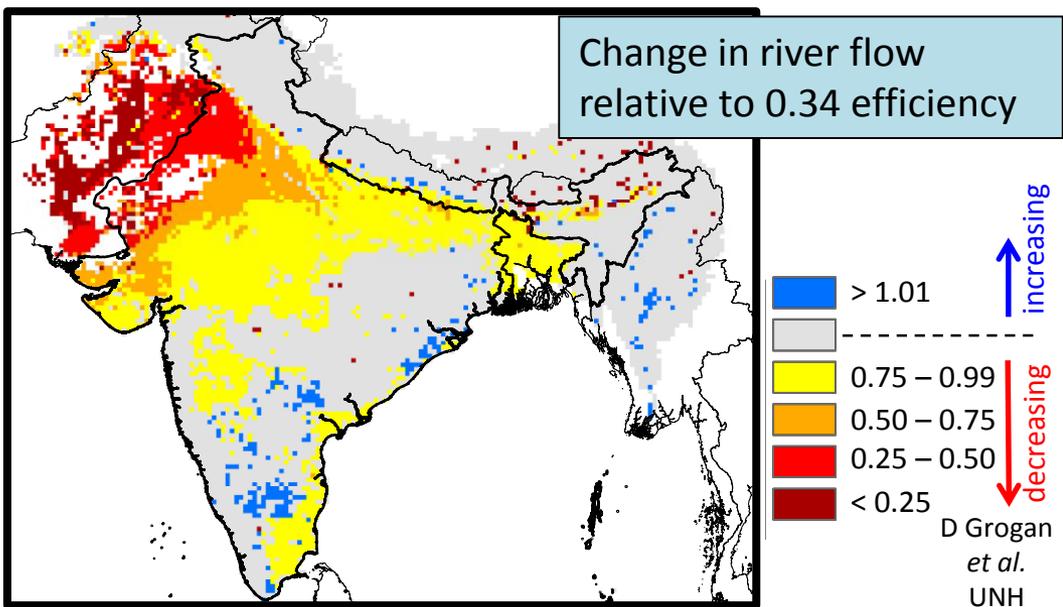
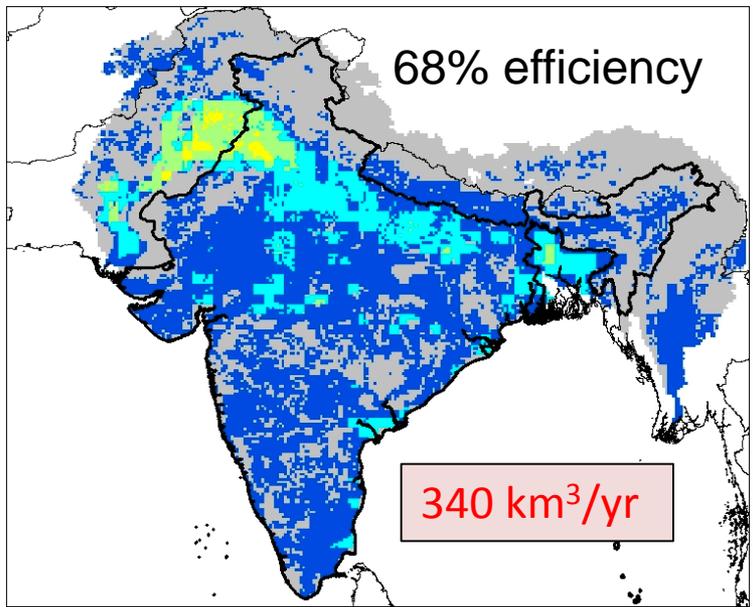
irrigation water demand (mm/y)



Mined groundwater (MGW) fraction of demand



MGW = 48% of demand



*Chair: Karen Fisher-Vanden*

Tuesday:

1:00 PM Energy: Empirical estimates of impacts: Ian Sue Wing

1:30 PM Water: Process modeling of water: Steve Frolking

2:00 PM Water: Pat Reed

2:30 PM DISCUSSION: ENERGY & WATER IMPACTS

3:00 PM BREAK

3:30 PM Adaptation for city infrastructure: Paul Kirshen

4:00 PM Sea Level: Sea level rise: Bob Kopp

4:30 PM Extreme Events: Carolyn Kousky

5:00 PM DISCUSSION: Cities, Sea Level, and Extreme Events

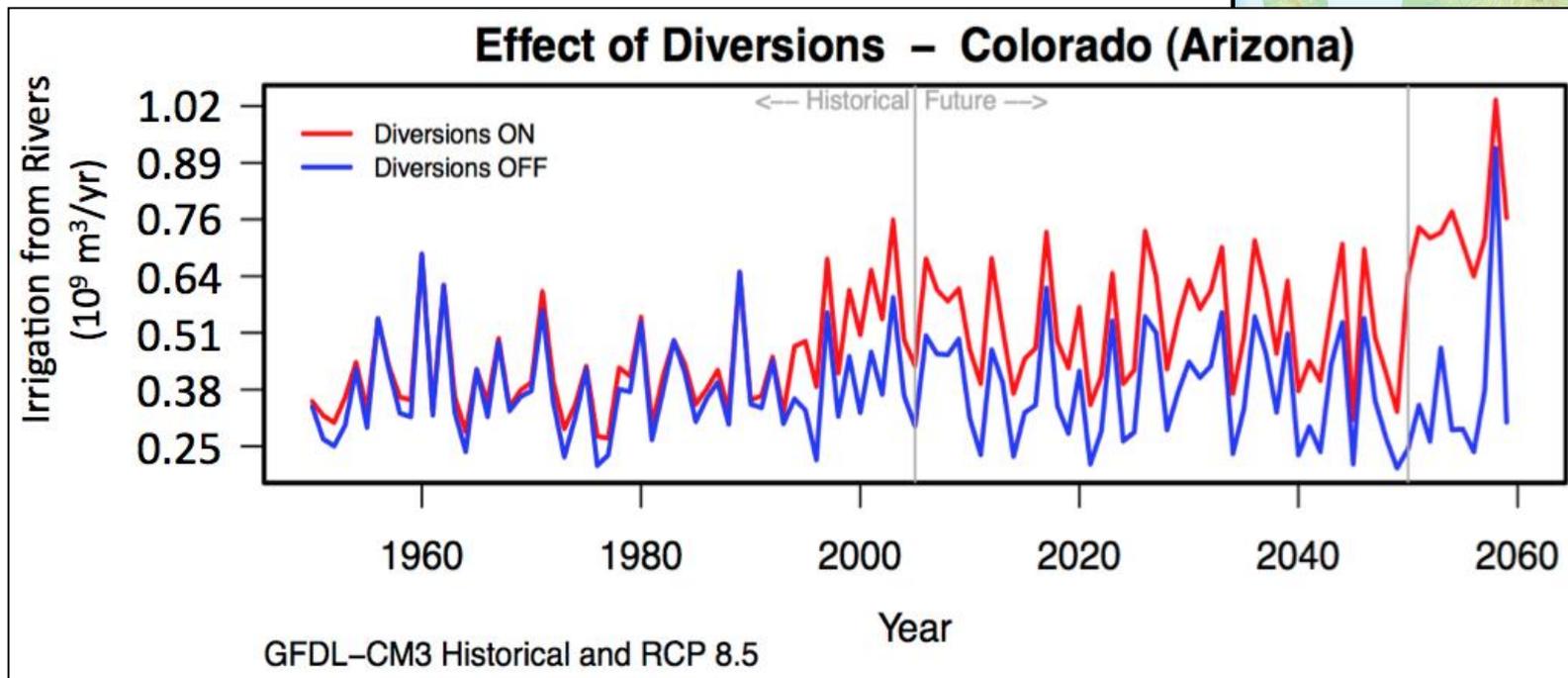
As you can see, you are scheduled to speak in the session I am chairing titled, “The State of the Art in Understanding Potential Climate Impacts and Adaptation,” on Tuesday afternoon (July 22<sup>nd</sup>) and Wednesday morning (July 23<sup>rd</sup>). As the title suggests, the purpose of this session is to provide an overview of the state-of-the-art in empirical and process modeling work on climate impacts and adaption in six sectors (energy, water, city infrastructure, sea level rise, extreme events, and agriculture). ***In addition to providing a short summary of the state-of-the-art in your assigned sector, it would be great if you could provide some thoughts on how the findings from these studies could inform integrated assessment models, if possible. We are hoping that speakers will provide a good survey of the work being done in the field and won’t focus their talks solely on their own work.*** We realize that this is a lot to cover in the time allotted, but we are hoping that speakers will keep their ***presentations to 20 minutes, with 10 minutes for Q&A.*** We will then be opening the floor to further discussion after the set of presentations.

# 3. Outcomes Interbasin Water Transfers

Includes: Reservoirs and Irrigation. Irrigation water applied with 100% efficiency (no loss back to system).

With and Without Inter-basin Transfers (Diversions).

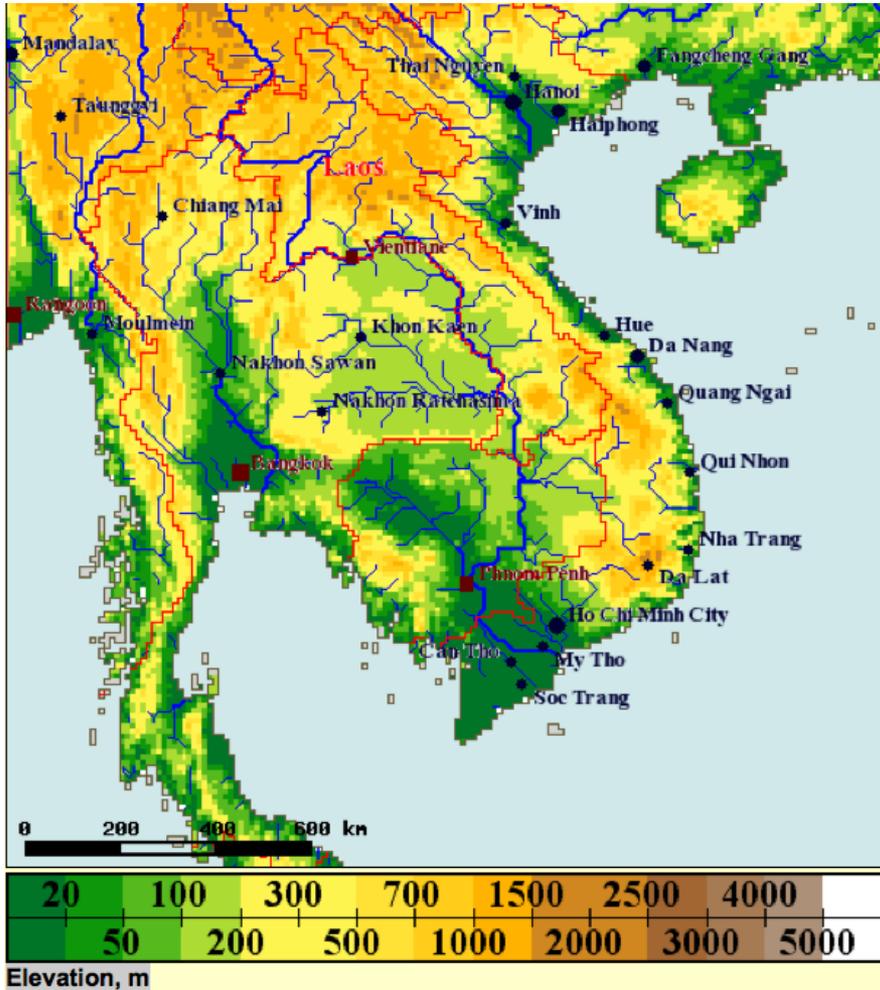
When Diversions turned on (red line) more water is abstracted from rivers for irrigation.



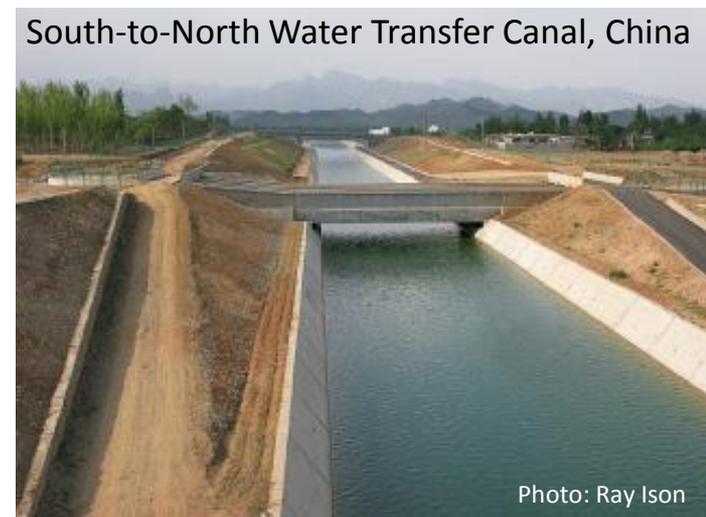
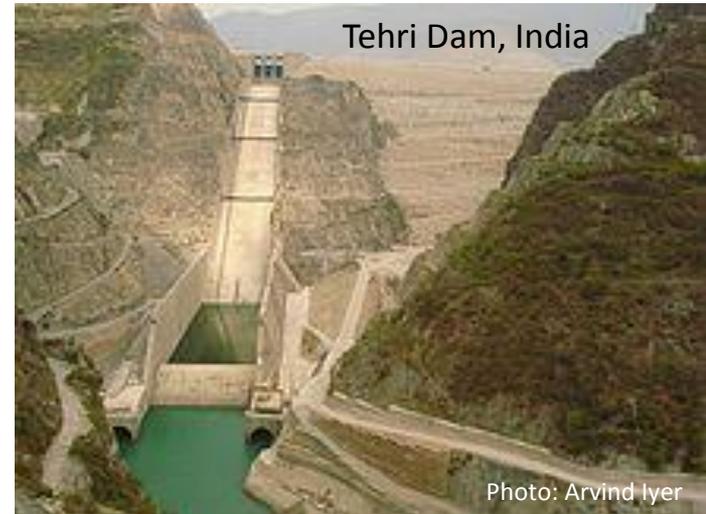


# 1. Framework & methods

## Geophysical Water flows downhill!



## Socio-Economic Unless it doesn't!



Water flows up-money?