

# Mapping Groundwater Recharge Rates Under Multiple Future Climate Scenarios in Southwest Michigan

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## Introduction

### Primary Objective:

Model the water table of Kalamazoo County, Michigan under various future scenarios of climate change, urbanization, and expanded agricultural production.

### Sub Objective (primary for this presentation):

**Use SWAT to simulate and map (at field scales) groundwater recharge under future scenarios of climate change.**



Expectations:

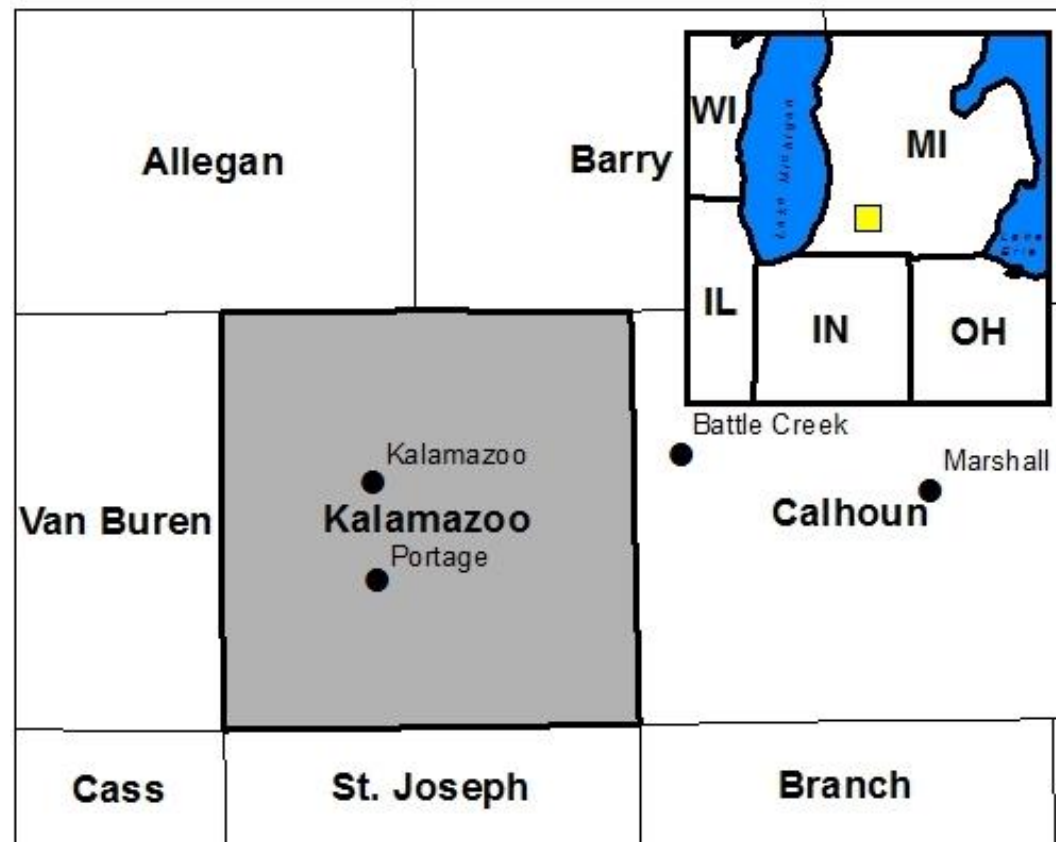
Evapotranspiration will increase due to higher temperatures.

Subsequent decrease in groundwater recharge.



## Primary Study Site

- Kalamazoo County, Michigan
- Existing MODFLOW model by USGS (Luukkonen et al. 2004)
- 40% agriculture, 21% forest, 20% urban
- well draining soils
- moderate topographic relief
- precipitation 36 in./yr.
- population 254,000, growing
- average annual water use
  - ag: 26 MGD
  - industry: 5 MGD
  - City of Kalamazoo: 19 MGD
  - City of Portage: 6 MGD

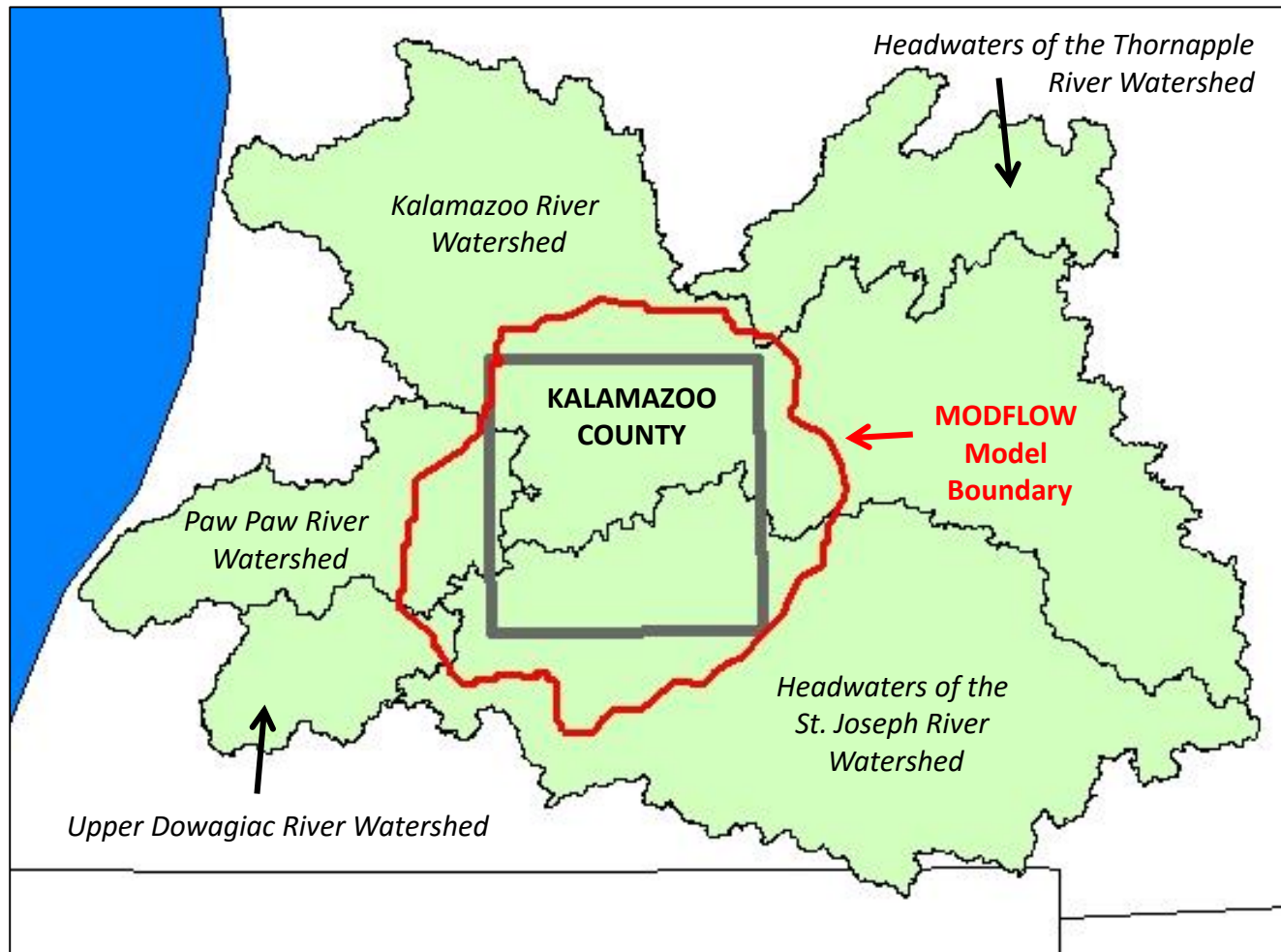






## SWAT Study Site

Intersecting watersheds of MODFLOW model boundary.





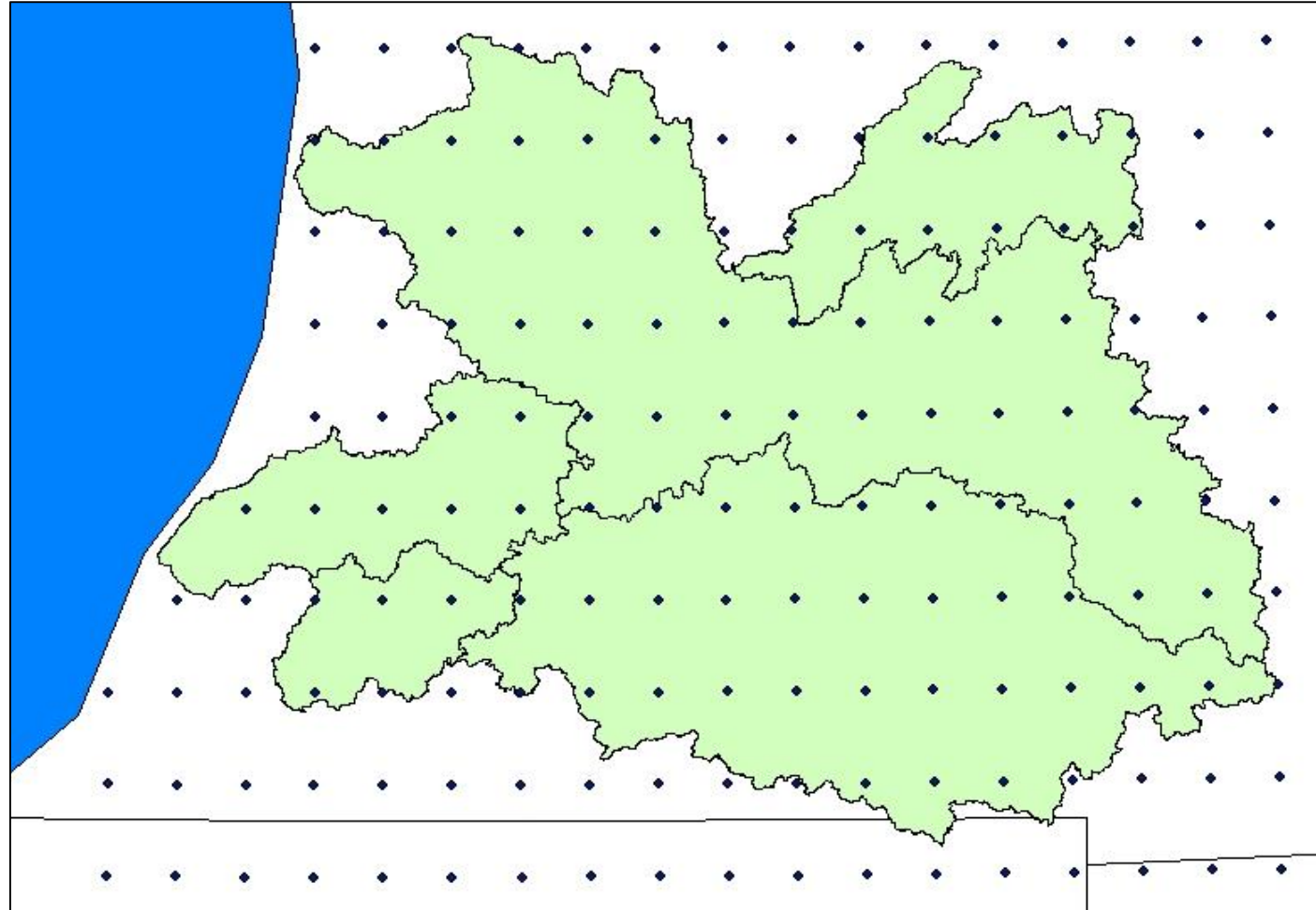
## SWAT Inputs

Data	Source
Land cover	Cropland Data Layer (2009-2013)
Soils	SSURGO
Topography	USGS 10-meter DEM
Irrigation	Michigan DEQ, well logs
Consumptive water use	Michigan DEQ
Point sources	Michigan DEQ, US EPA
Dams	USACE National Inventory of Dams
Weather	Maurer et al., 2002.



## SWAT Inputs

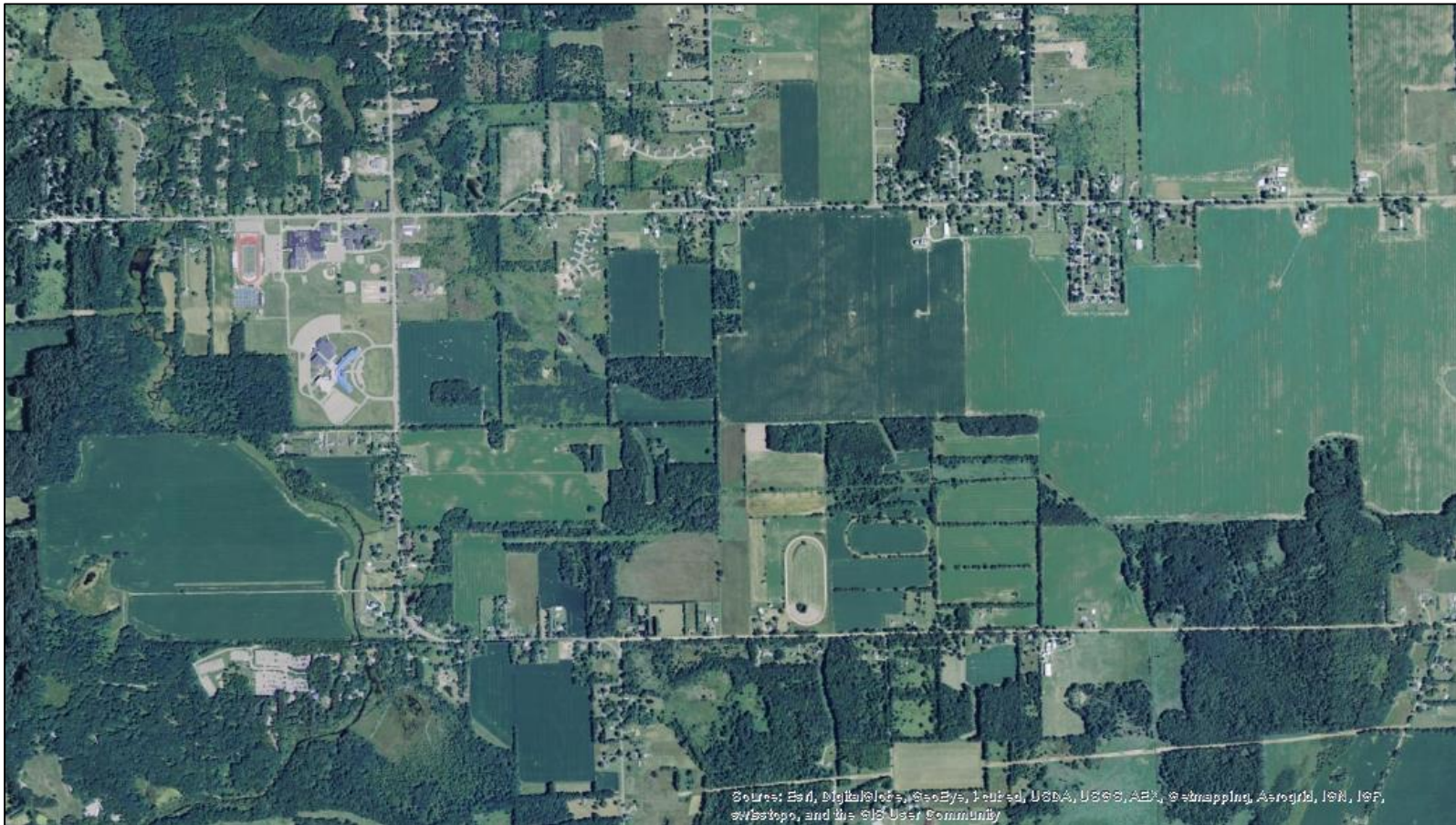
- Observed weather data interpolated to grid points
- 1/8 deg. resolution.
- Daily precip, min. temp., max temp.
- 1940 - 2010





## HRU Mapping

- HRU thresholds: Land cover – 3%, Soil – 3%, Slope – 3%.
- Back-mapped to raster format.
- Resulted in 256 sub-basins, 76,281 HRUs.

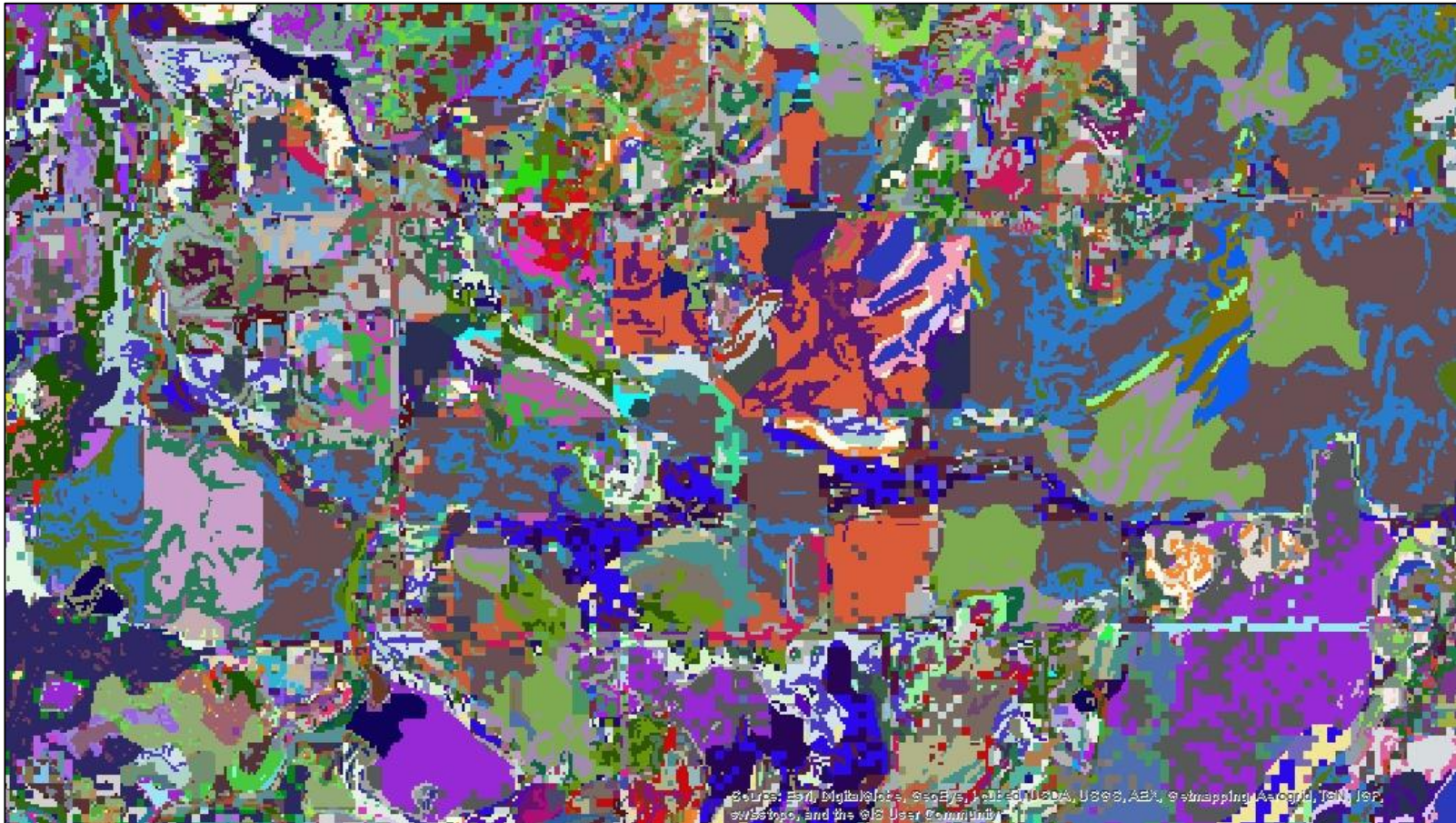






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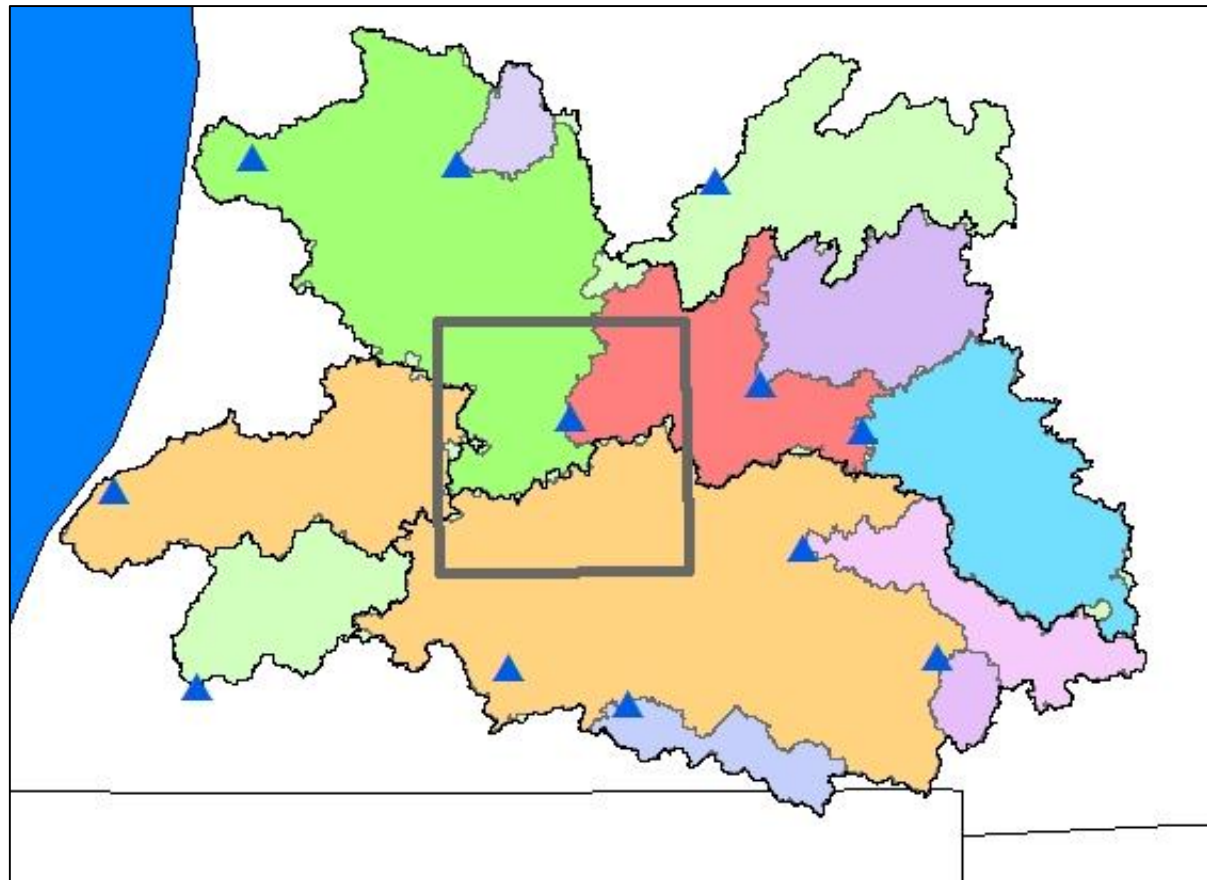


## SWAT Calibration

To best simulate ground water recharge, SWAT was calibrated to baseflow conditions.

### Legend

- # USGS Gages
- Kalamazoo County
- SWAT Model Watershed

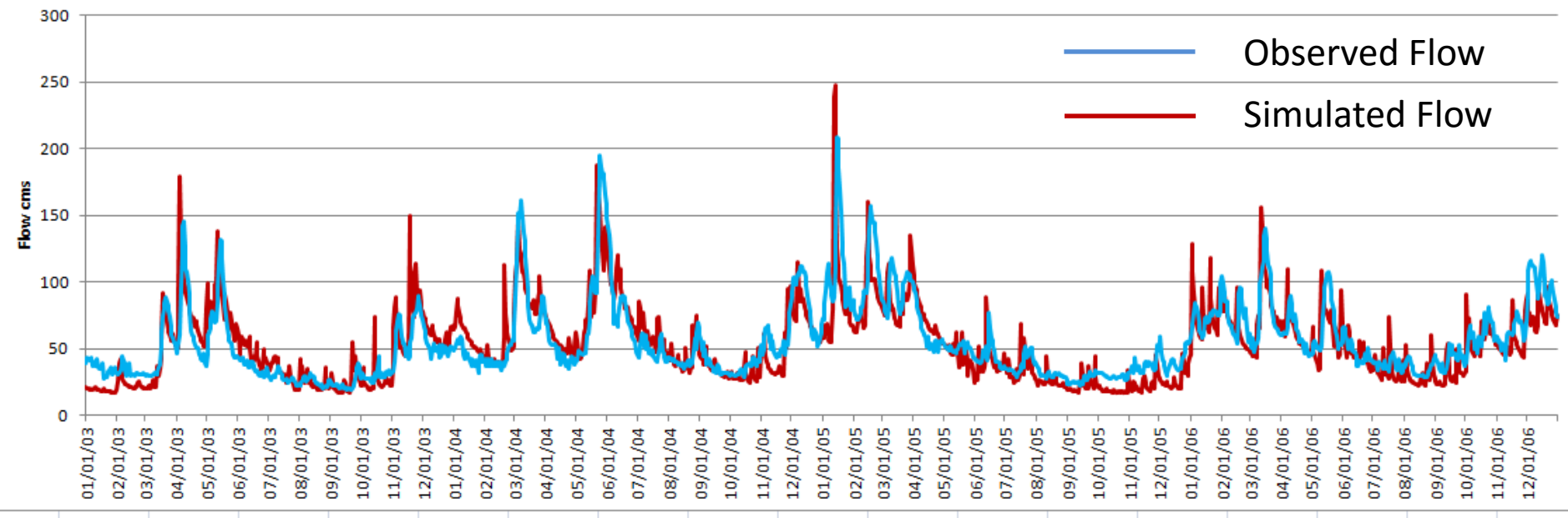




## SWAT Calibration

USGS baseflow separation program identified days where 75% of flow was from ground water.

Kalamazoo River – USGS Gage 04108660



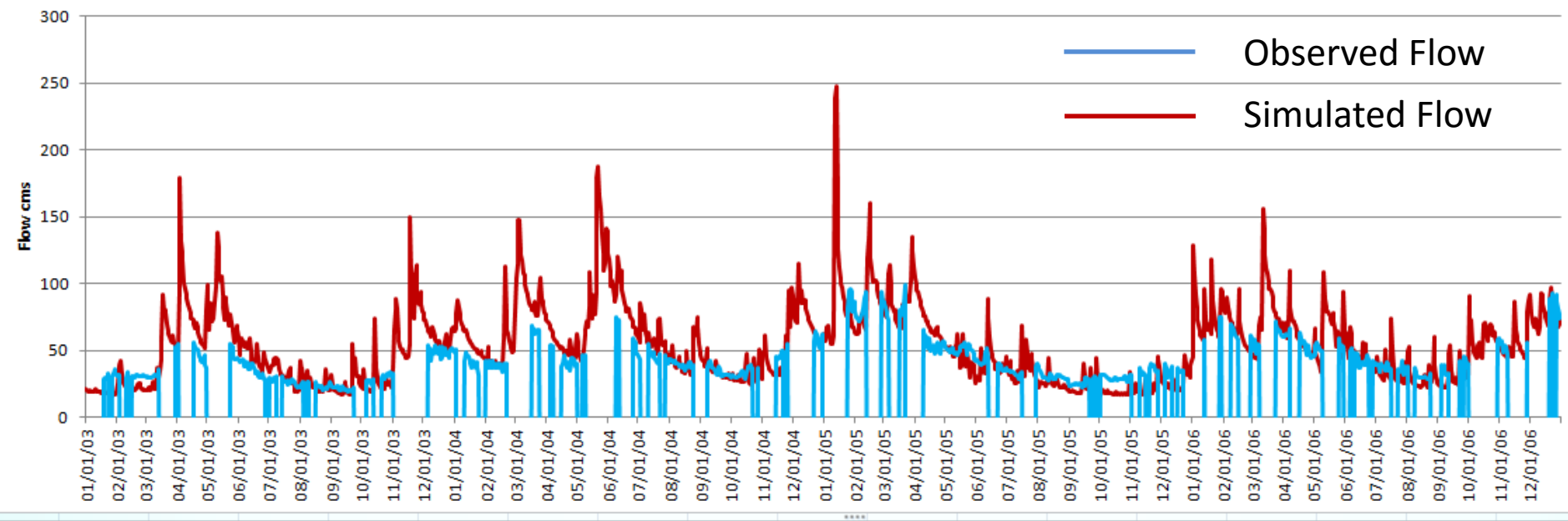




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## Climate Change Simulation

11 different models, each under various CMIP-3 scenarios, downscaled to Maurer grid points by Hayhoe, et al. (2013).

Daily values for precipitation and temperature through 2100.

### Climate Models

1. CCSM
2. CGCM3-T47
3. CGCM3-T63
4. CNRM
5. ECHAM5
6. ECHO
7. GFDL-2-0
8. GFDL-2-1
9. HADCM3
10. HADGEM
11. PCM

### Climate Scenarios

1. A1FI – rapid population growth, levels off mid-century, heavy fossil fuel use
2. A1B – rapid population growth, levels off mid-century, balanced fossil fuel use
3. A2 – continuous population growth, regional economic growth
4. B1 – population growth levels off, efficient energy technologies adopted



## Climate Change Simulation

Run SWAT in 10-year increments, for each decade:

- adjust .wgn files
- adjust CO2 concentrations (ppm) from IPCC\*
  - A1Fi: 420 (2020) – 970 (2100)
  - A1B: 403 (2020) – 717 (2100)
  - A2: 417 (2020) – 856 (2100)
  - B1: 412 (2020) – 549 (2100)
- run the model
- grab the outputs

\* <http://www.ipcc-data.org/ancilliary/tar-isam.txt>



## SWAT Calibration

- Calibrated SWAT models from 2000-2005
- Validated from 2006-2010
- Moriasi et al. (2007) provided guidance on flow metrics

	Nash-Sutcliffe Efficiency	Percent Bias
Very Good	0.75 - 1.0	< 10%
Good	0.65-0.75	10 – 15%
Satisfactory	0.5 – 0.65	15 – 25%
Unsatisfactory	< 0.5	> 25%



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**Results**

Conclusions



## SWAT Calibration

- Model performance for monthly baseflow

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SWAT Model / Gage	Calibration NSE	Calibration % Bias (negative value = more simulated baseflow)	Validation NSE	Validation %Bias (negative value = more simulated baseflow)
04108660 (Kalamazoo)	.69	-1%	0.55	10%
04108600 (Kalamazoo)	0.02	-20%	0.89	-36%
04106000 (Kalamazoo)	0.66	-4%	0.69	-8
04105000 (Kalamazoo)	0.64	1%	0.48	<1%
04103500 (Kalamazoo)	0.86	-4%	0.58	8
04097500 (St. Joe)	0.66	-14%	0.55	3%
04097540 (St. Joe)	0.83	-16%	0.18	-13%
04096515 (St. Joe)	0.99	-50%	0.99	-65%
04096405 (St. Joe)	0.97	-6%	0.94	7%
Paw Paw	0.53	7%	0.50	-9%
Thornapple	0.61	1%	0.80	8%
Upper Dowagiac	0.49	3%	0.50	-6%



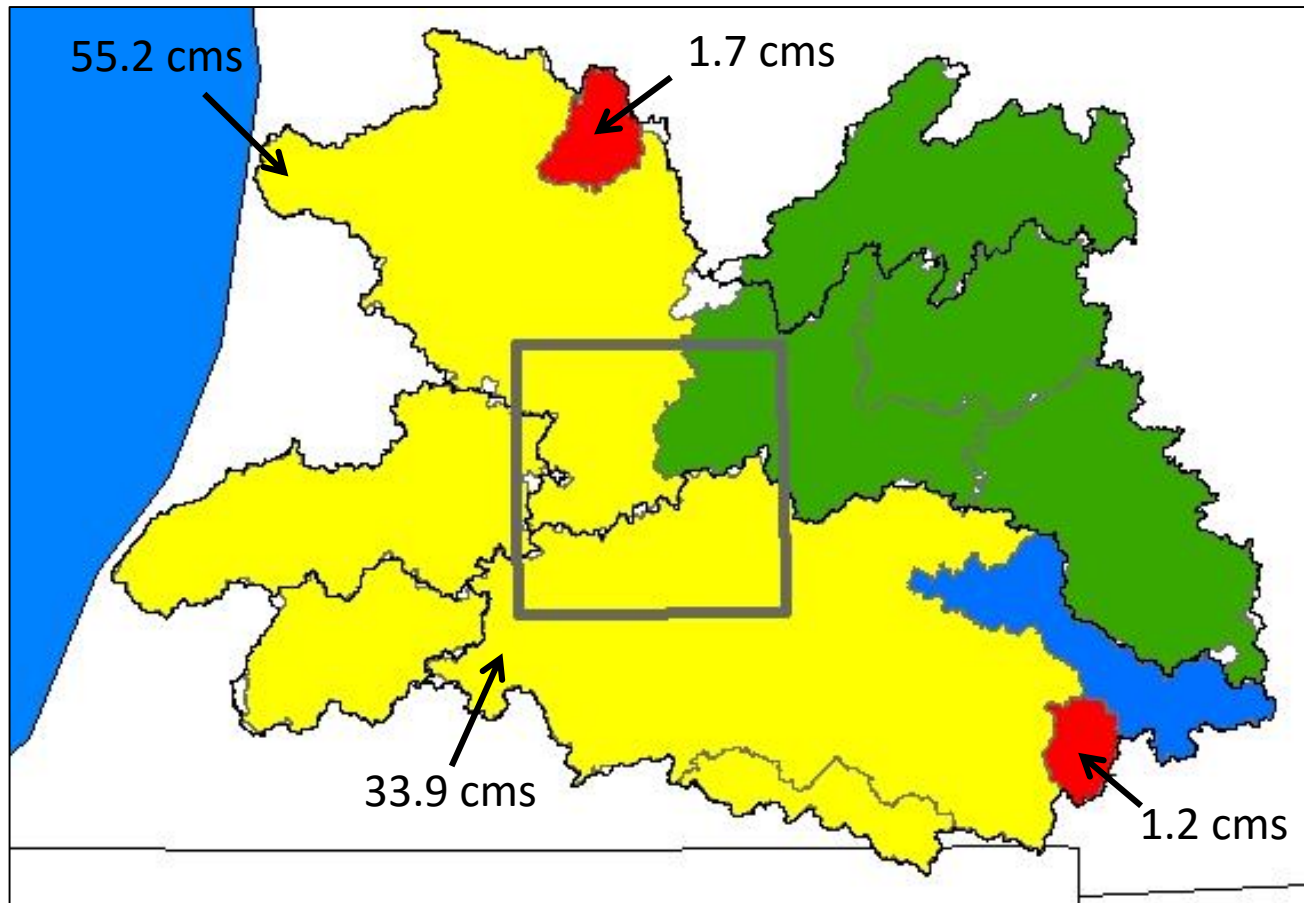


## SWAT Calibration

- Model performance for monthly baseflow

**Map of Nash Sutcliffe Efficiency Values**

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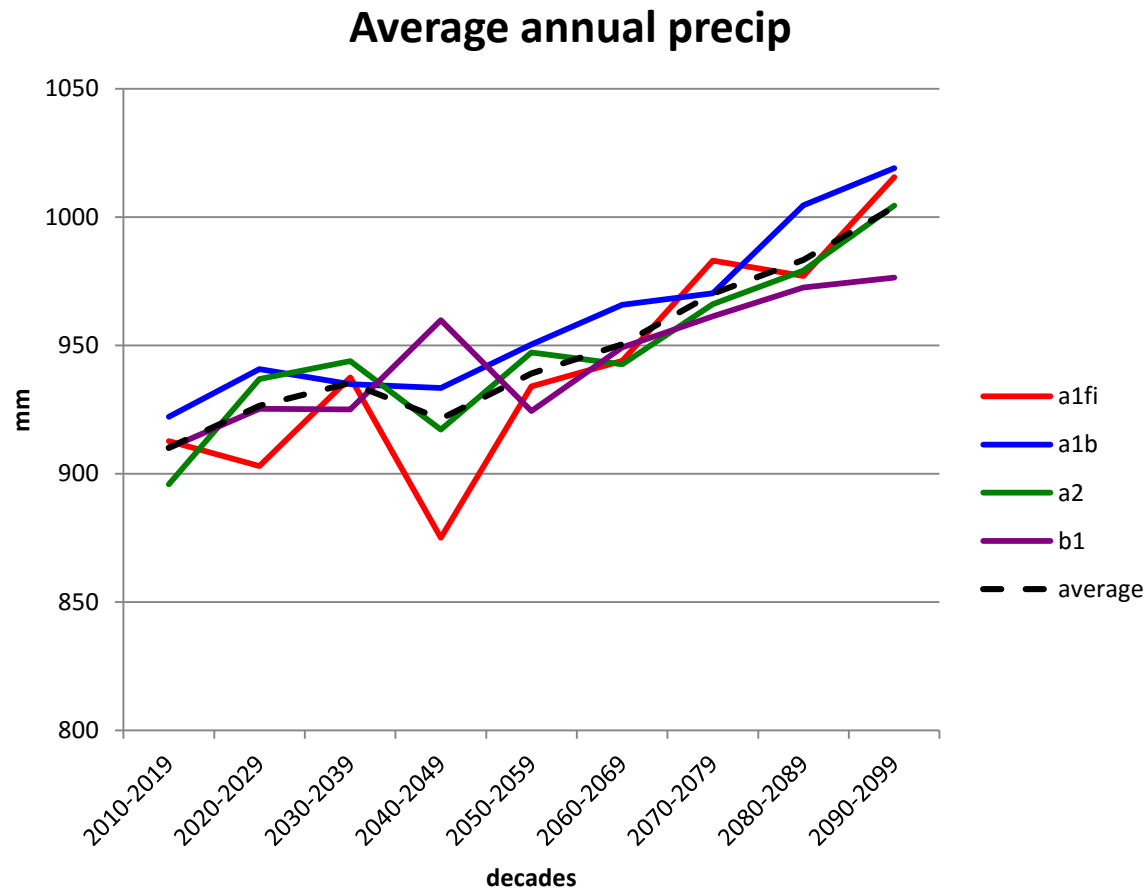
## SWAT Calibration

- Did not just rely on flow.
- Compared SWAT outputs to:
  - Reported crop yields in NASS
  - USGS estimates of ET
  - USGS estimates of baseflow fraction
  - Reported irrigation rates to M-DEQ and M-DARD
  - Estimates of ground-water recharge from M-DEQ/USGS/RSGIS/IWR



## SWAT Future Simulations

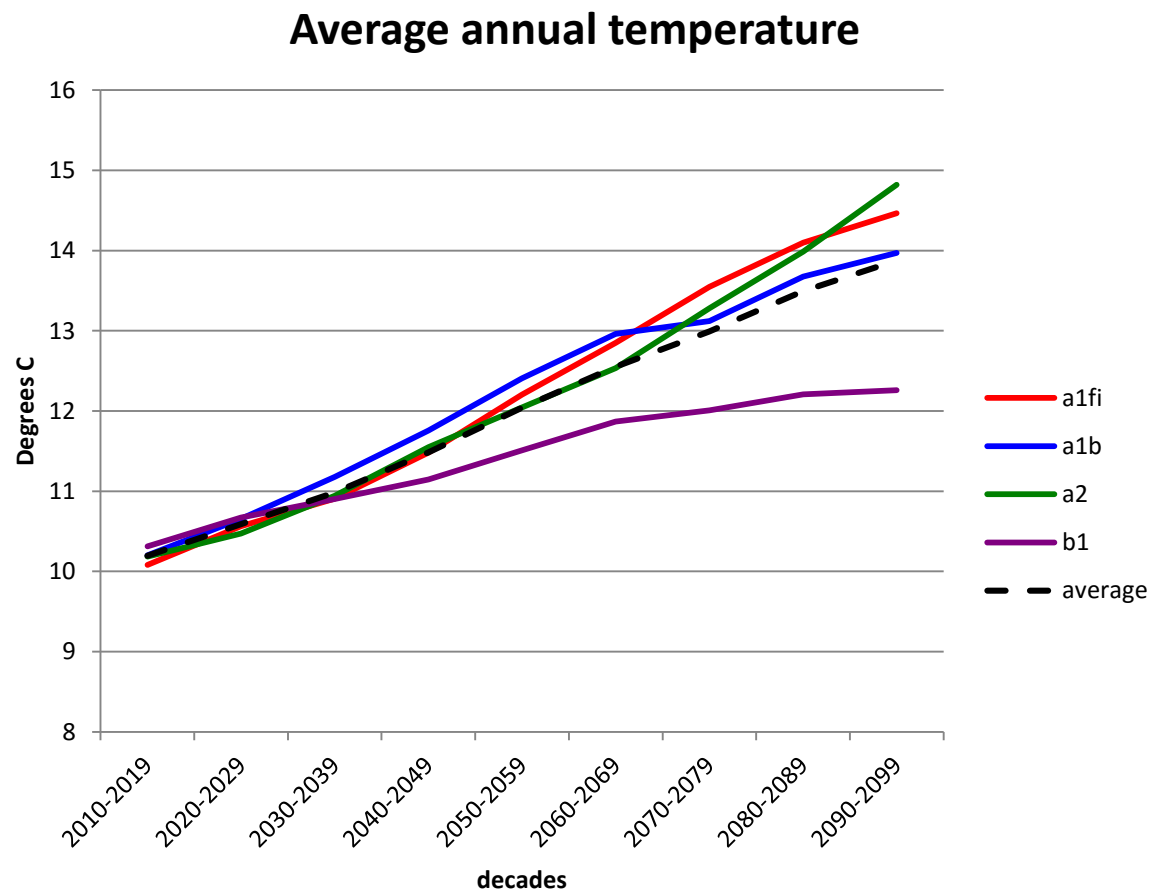
### - SWAT Outputs for 04106000 (Kalamazoo)





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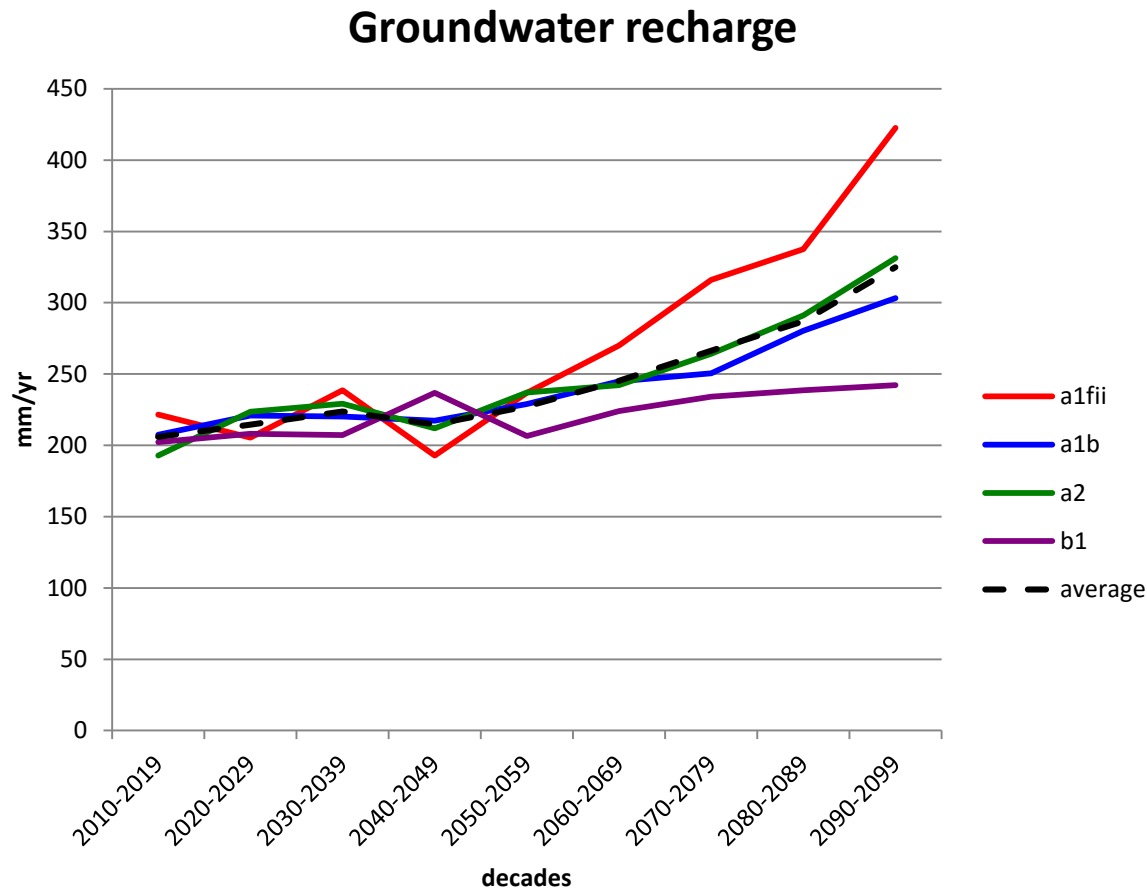






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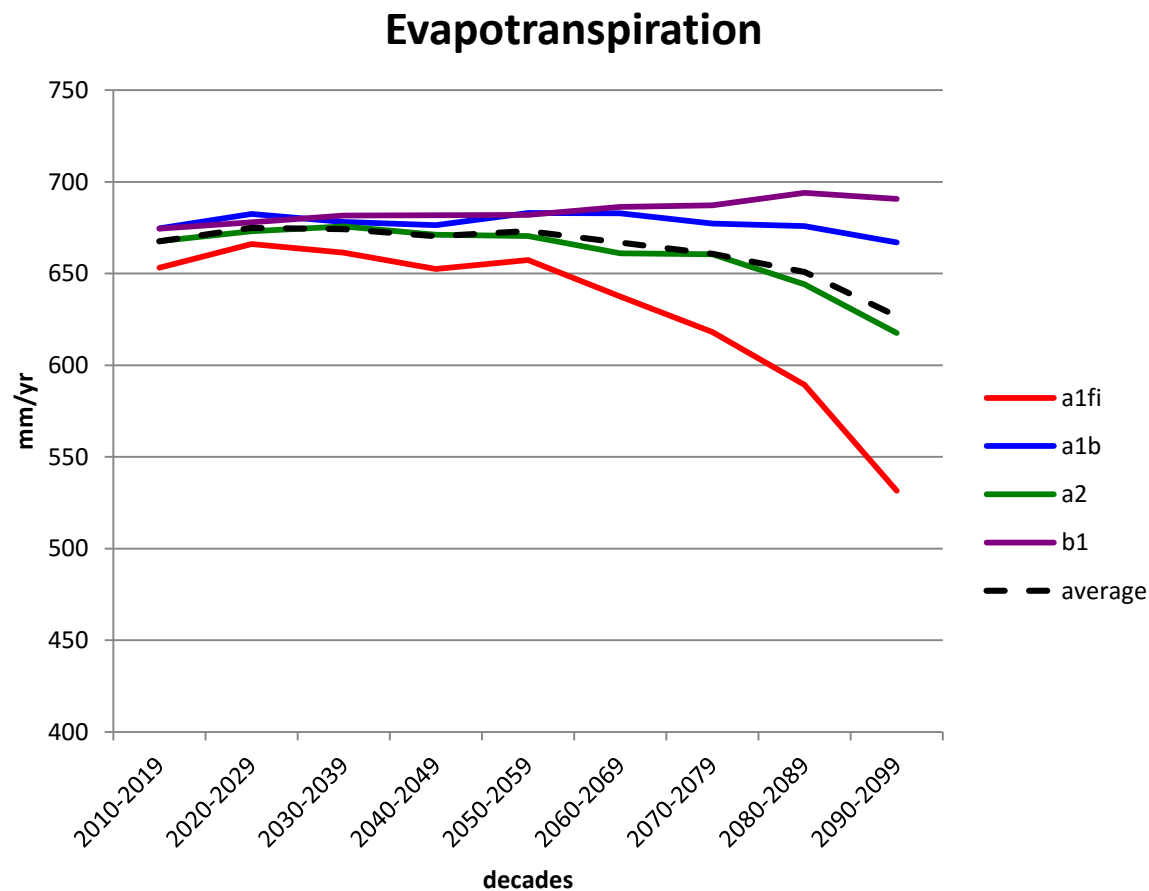
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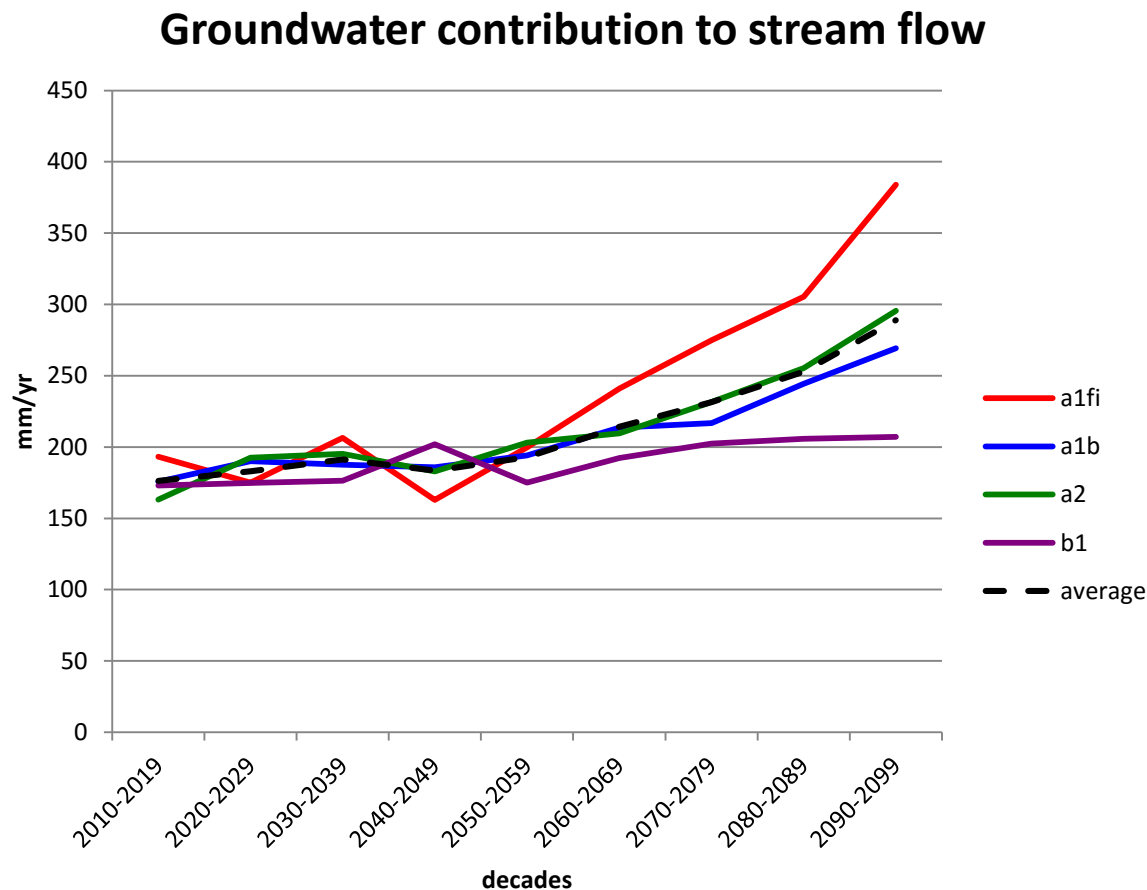
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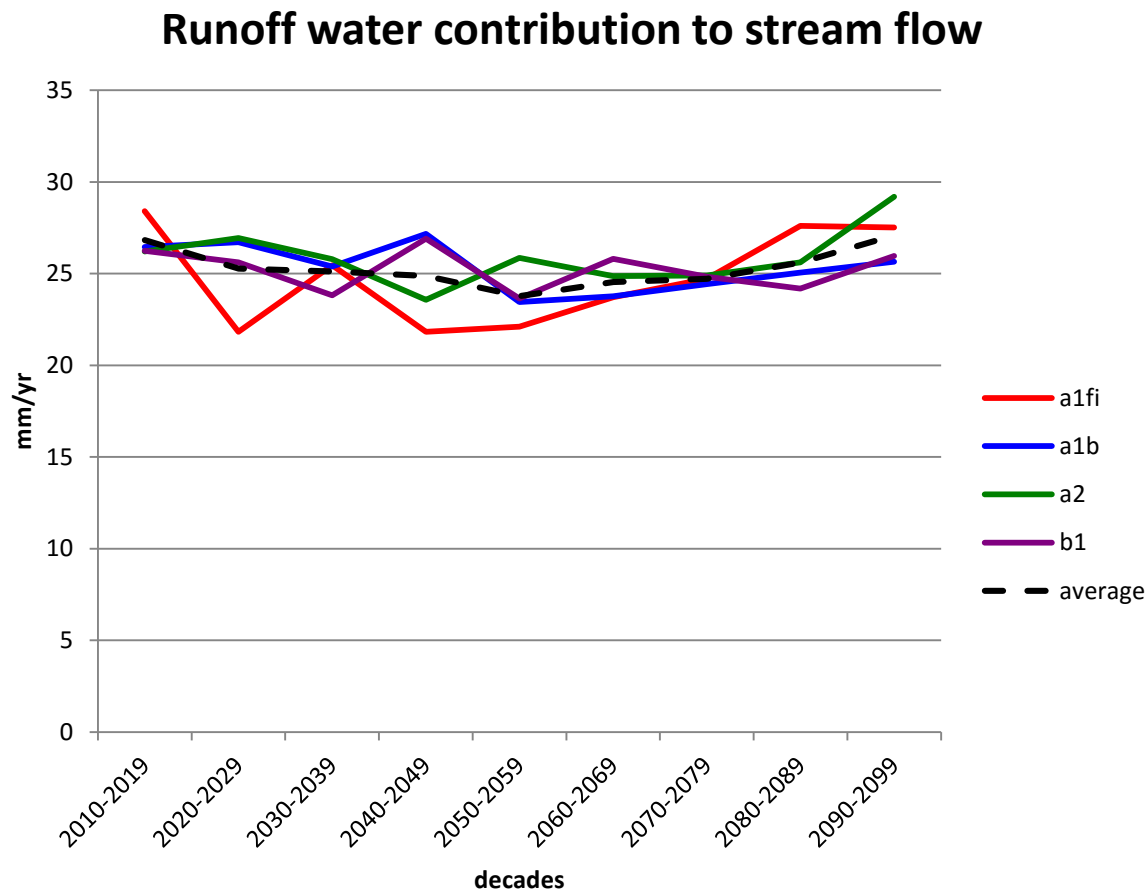
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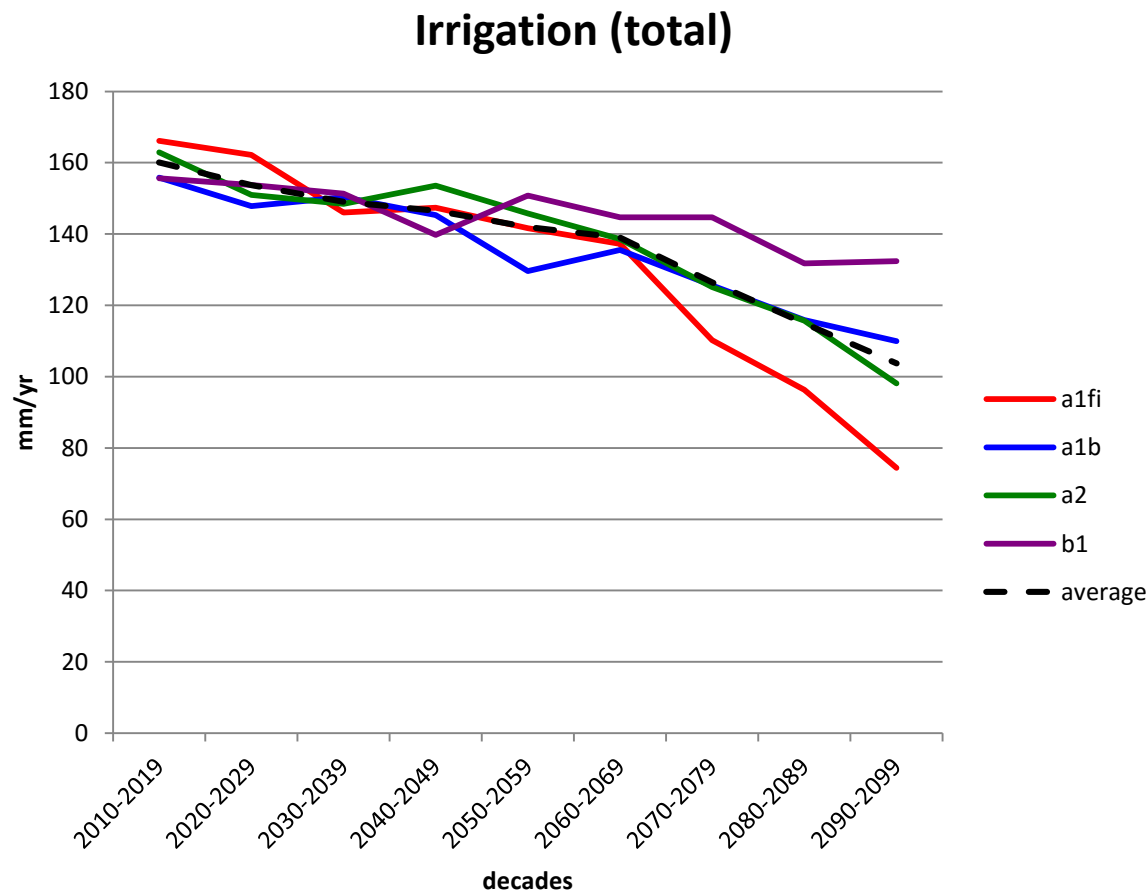






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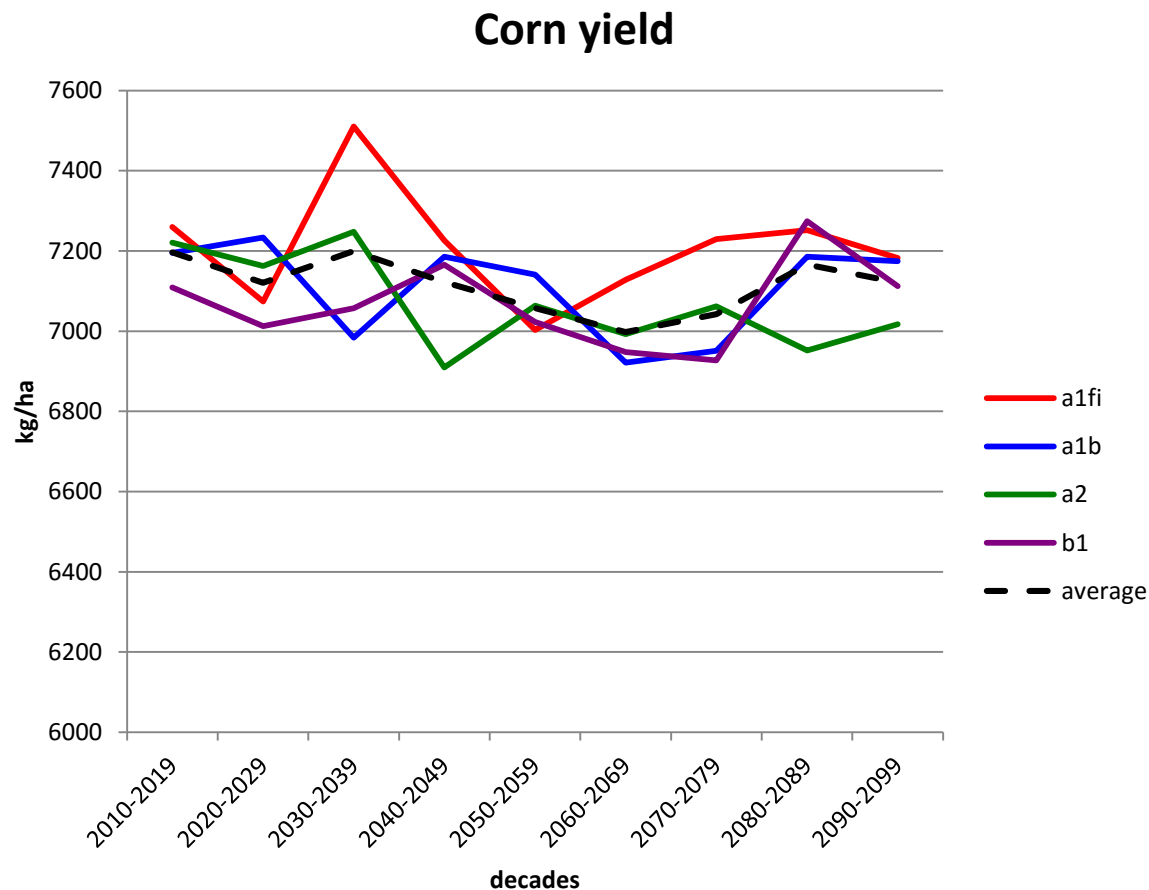
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## SWAT Future Simulations

### - SWAT Outputs for 04106000 (Kalamazoo)





## SWAT Future Simulations

- Changes in recharge (120mm, 60%) due to two primary sources:
  - Increased precip over the century (100mm, 10%)
  - Decreased ET over the century (50 mm, 8%)
- Lower ET caused by higher CO<sub>2</sub>, plants transpire less.
  - from the SWAT documentation:

“As carbon dioxide levels increase, plant productivity increases and plant water requirements go down.”

“Morrison (1987) found that at CO<sub>2</sub> concentrations between 330 and 660 ppmv, a doubling of CO<sub>2</sub> concentration resulted in a 40% reduction in leaf conductance.”
- CO<sub>2</sub> is at 970 ppm by 2100 for A1Fi, 549 ppm for B1.



## SWAT Future Simulations

- From the SWAT Theoretical Documentation (p. 130):

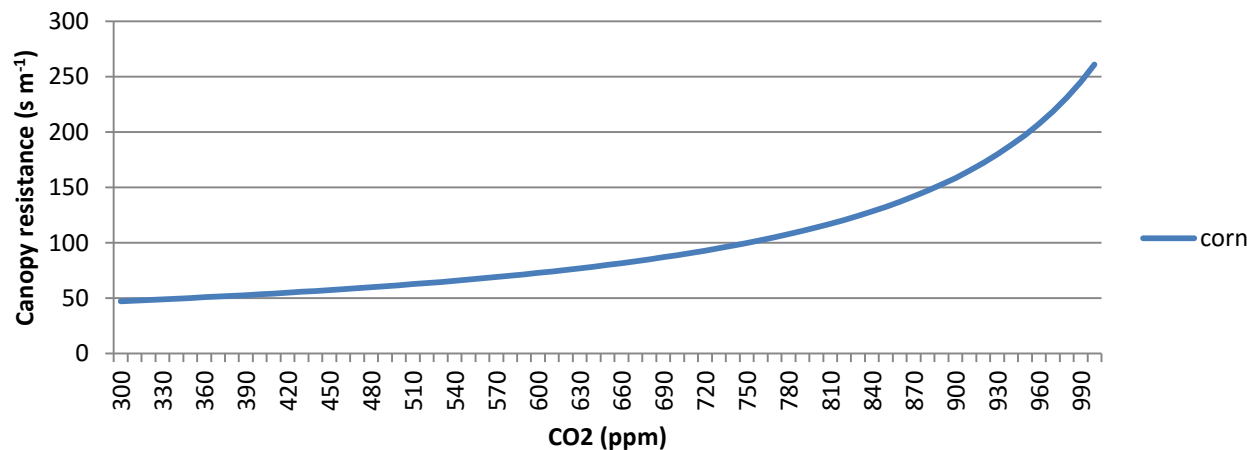
$$r_c = r_\ell \cdot \left[ (0.5 \cdot LAI) \cdot \left( 1.4 - 0.4 \cdot \frac{CO_2}{330} \right) \right]^{-1}$$

$r_c$  = plant canopy resistance ( $s\ m^{-1}$ )

$r_\ell$  = minimum resistance of a single leaf ( $s\ m^{-1}$ )

$LAI$  = leaf area index

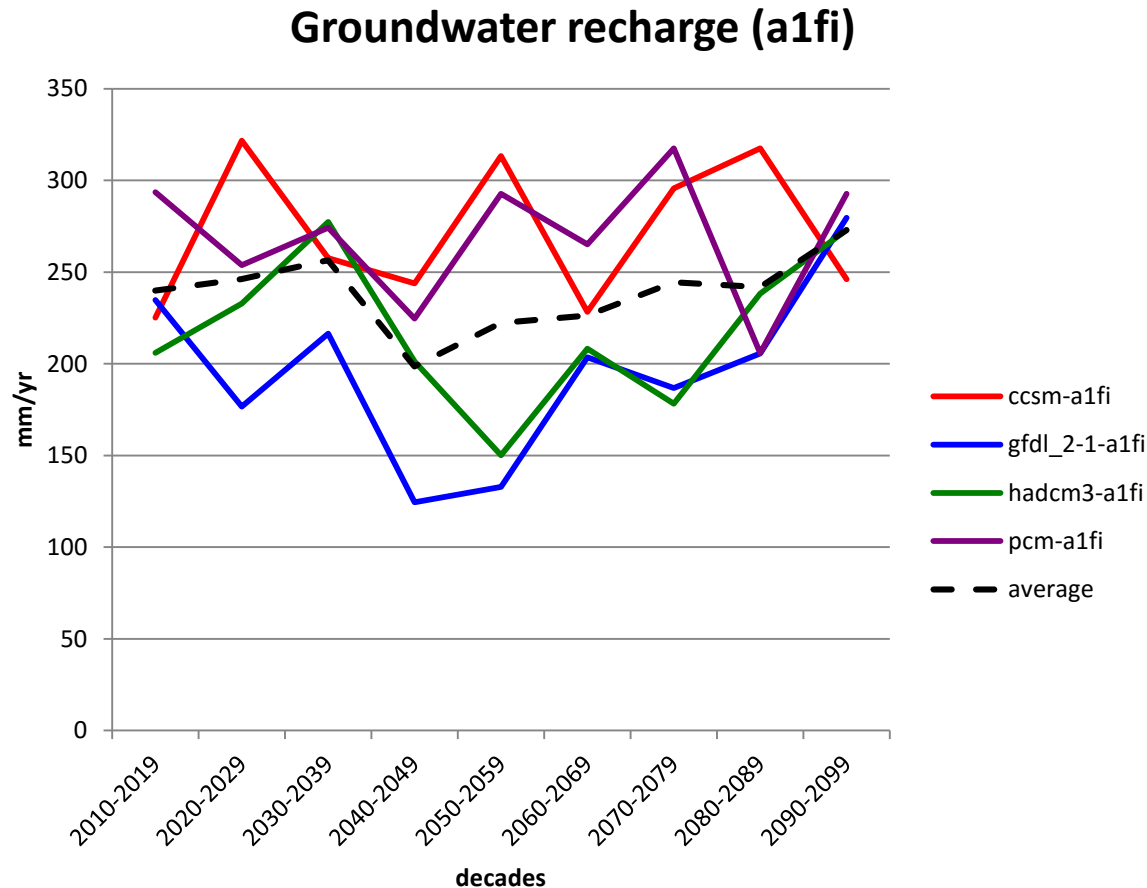
### Canopy Resistance





## SWAT Future Simulations

- Holding CO<sub>2</sub> constant in 04097540 kept recharge flat while ET rose slightly.

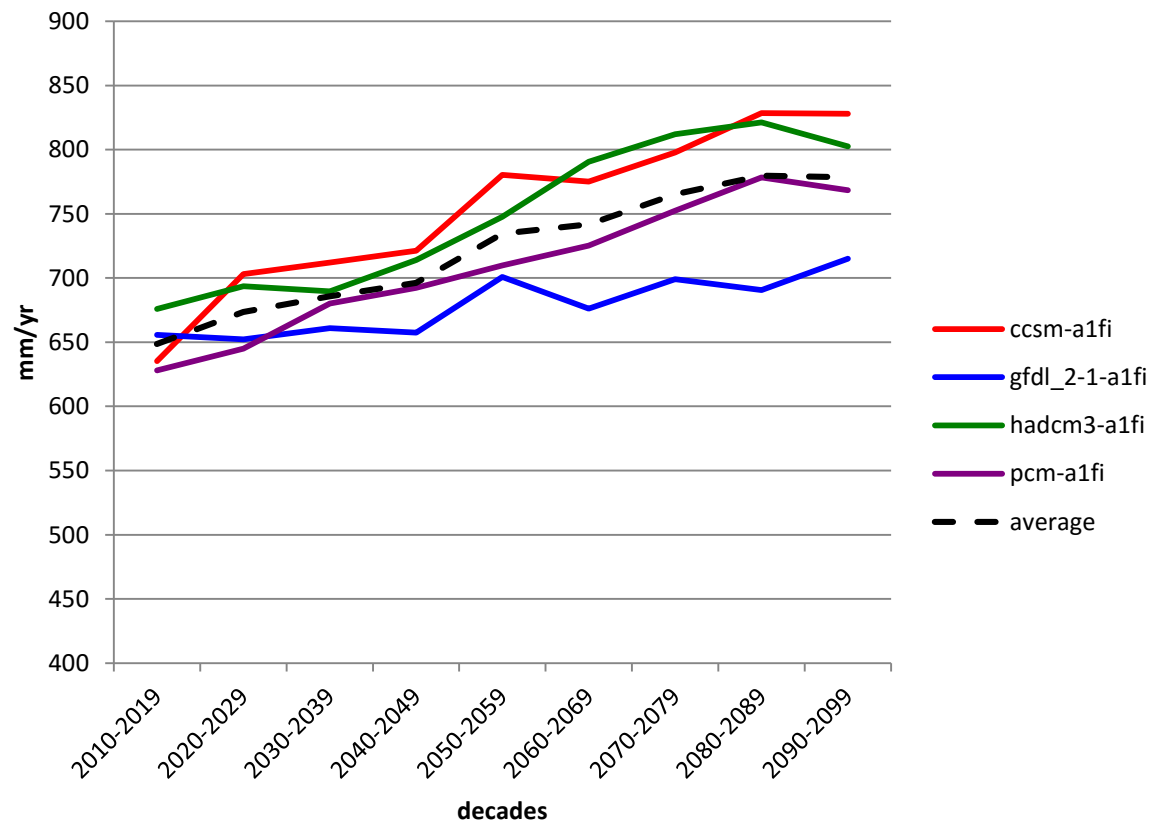




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**Evapotranspiration (a1fi)**







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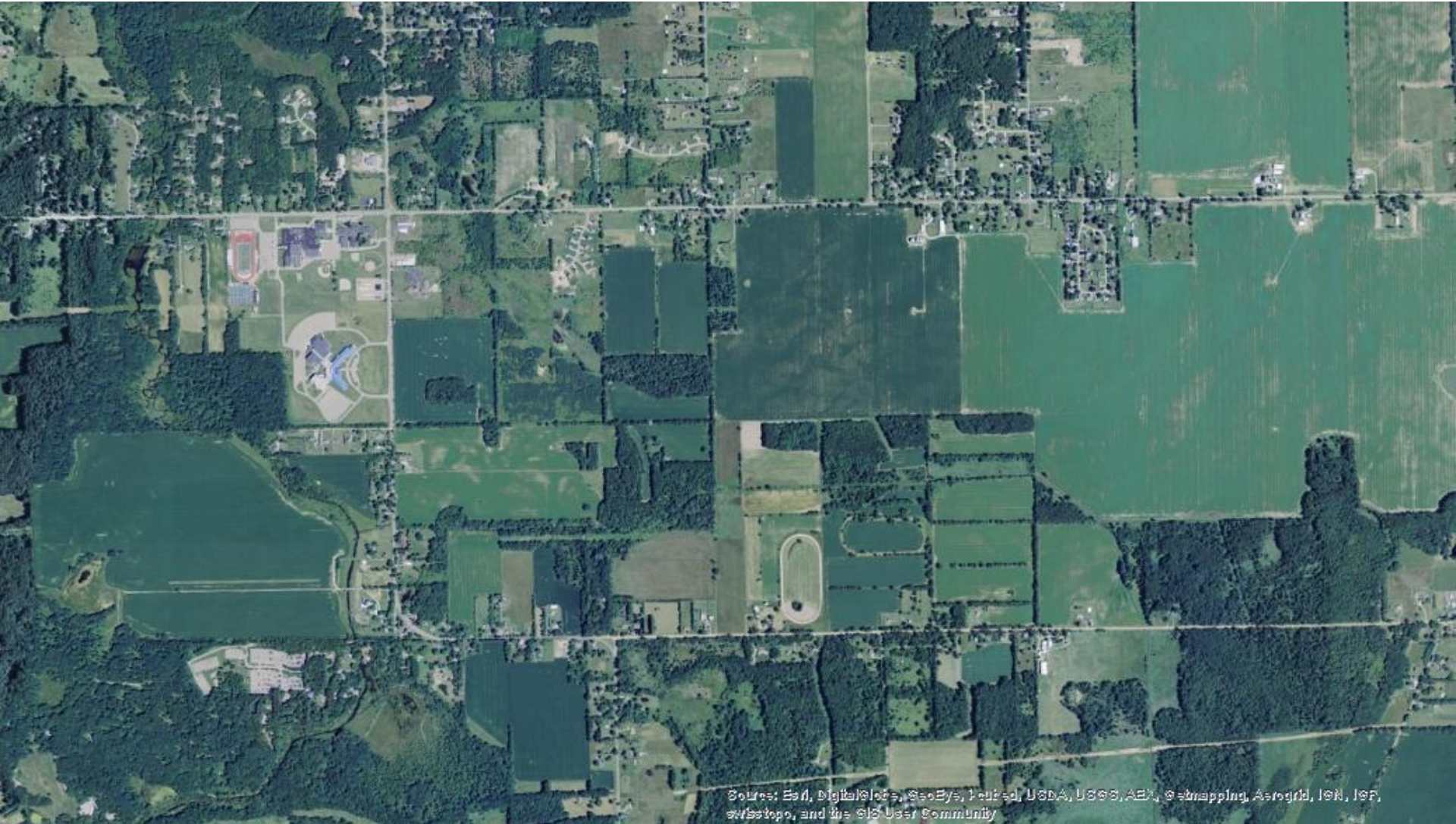
Methods

**Results**

Conclusions



SWAT Future Simulations - Spatial differences in HRU outputs.



Source: Esri, DigitalGlobe, GeoEye, United States, USDA, USGS, AeroGRID, IGN, IGP, swisstopo, and the GIS User Community





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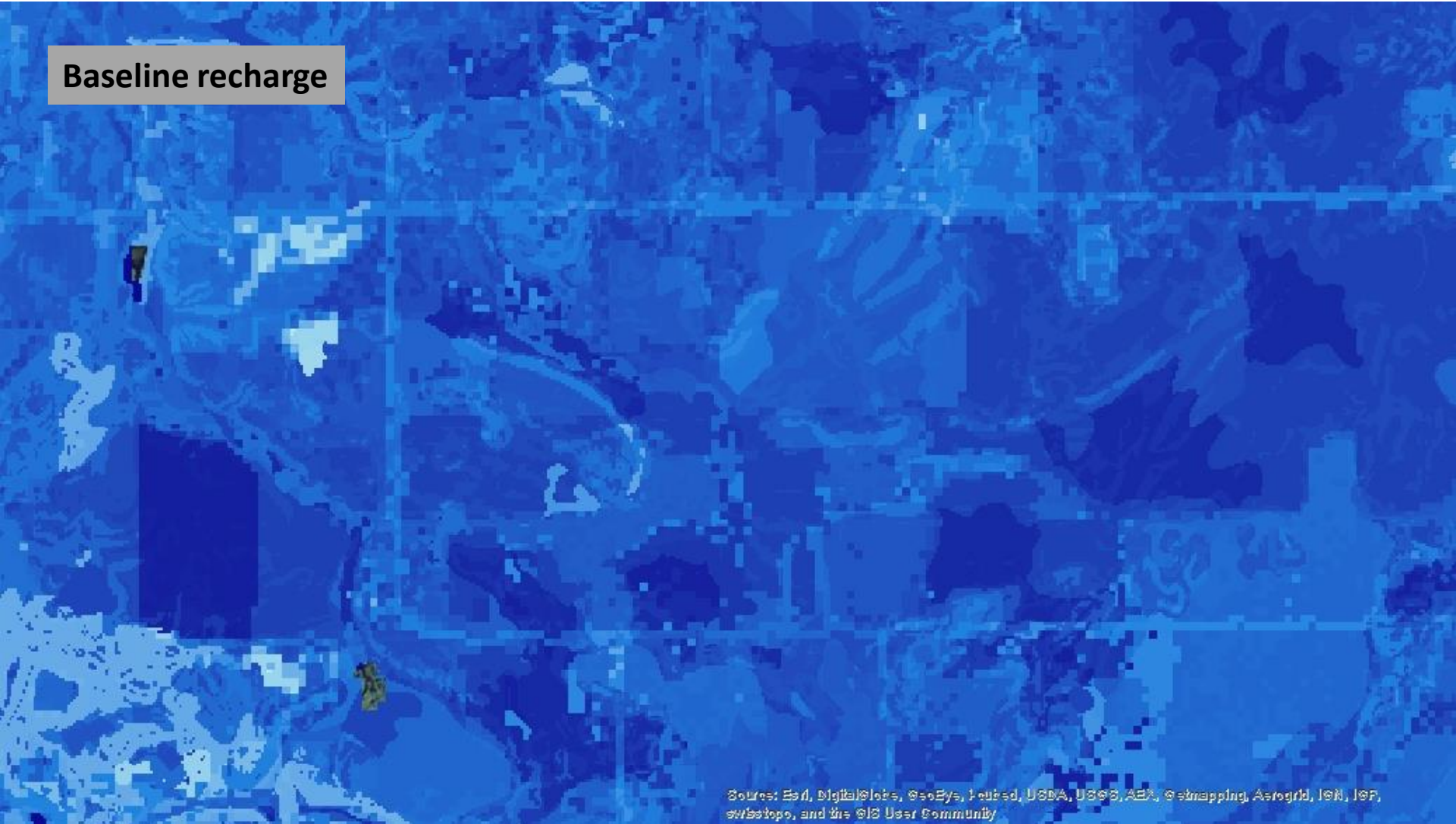
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## SWAT Future Simulations - Spatial differences in HRU outputs.

Baseline recharge



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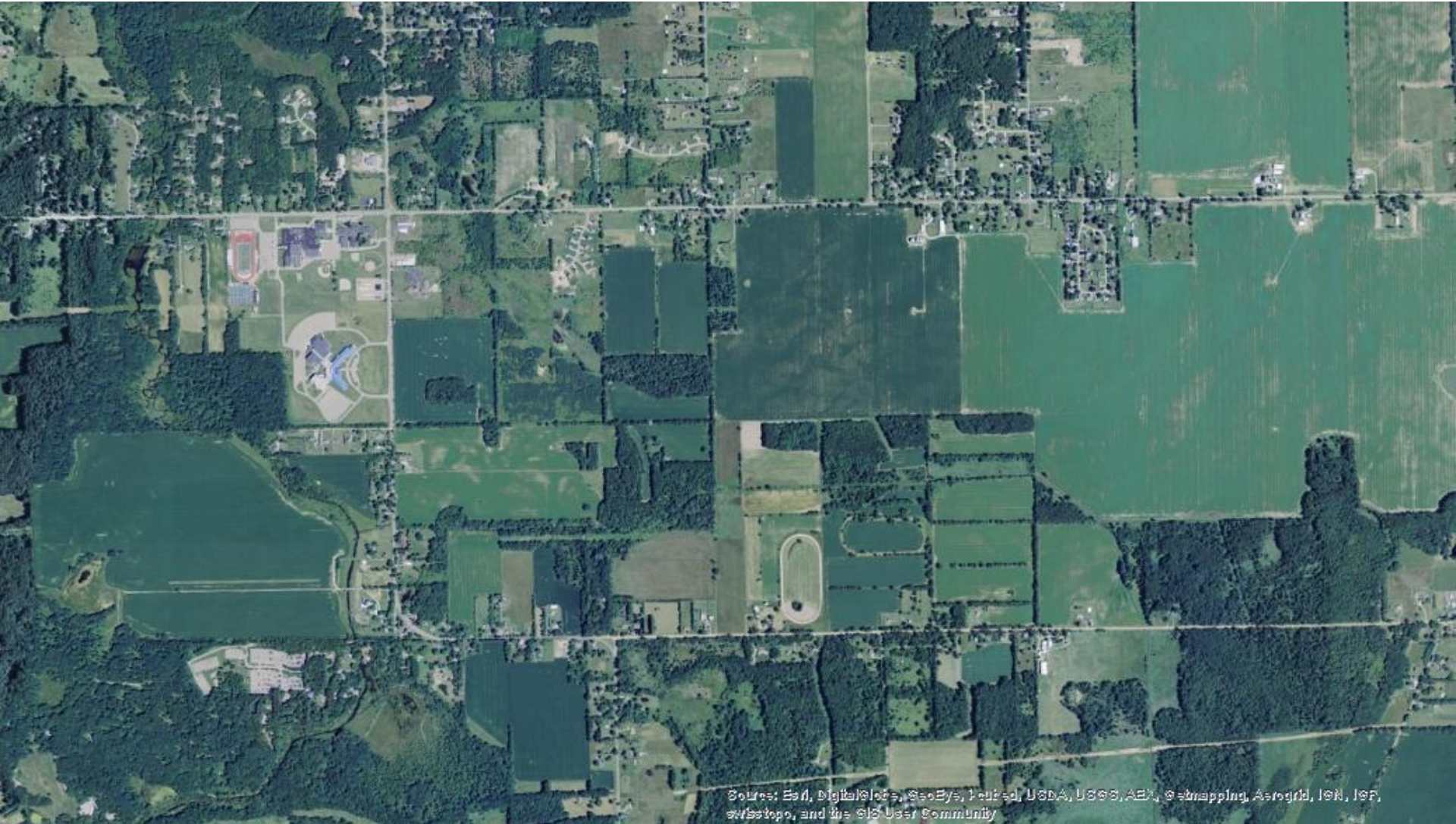
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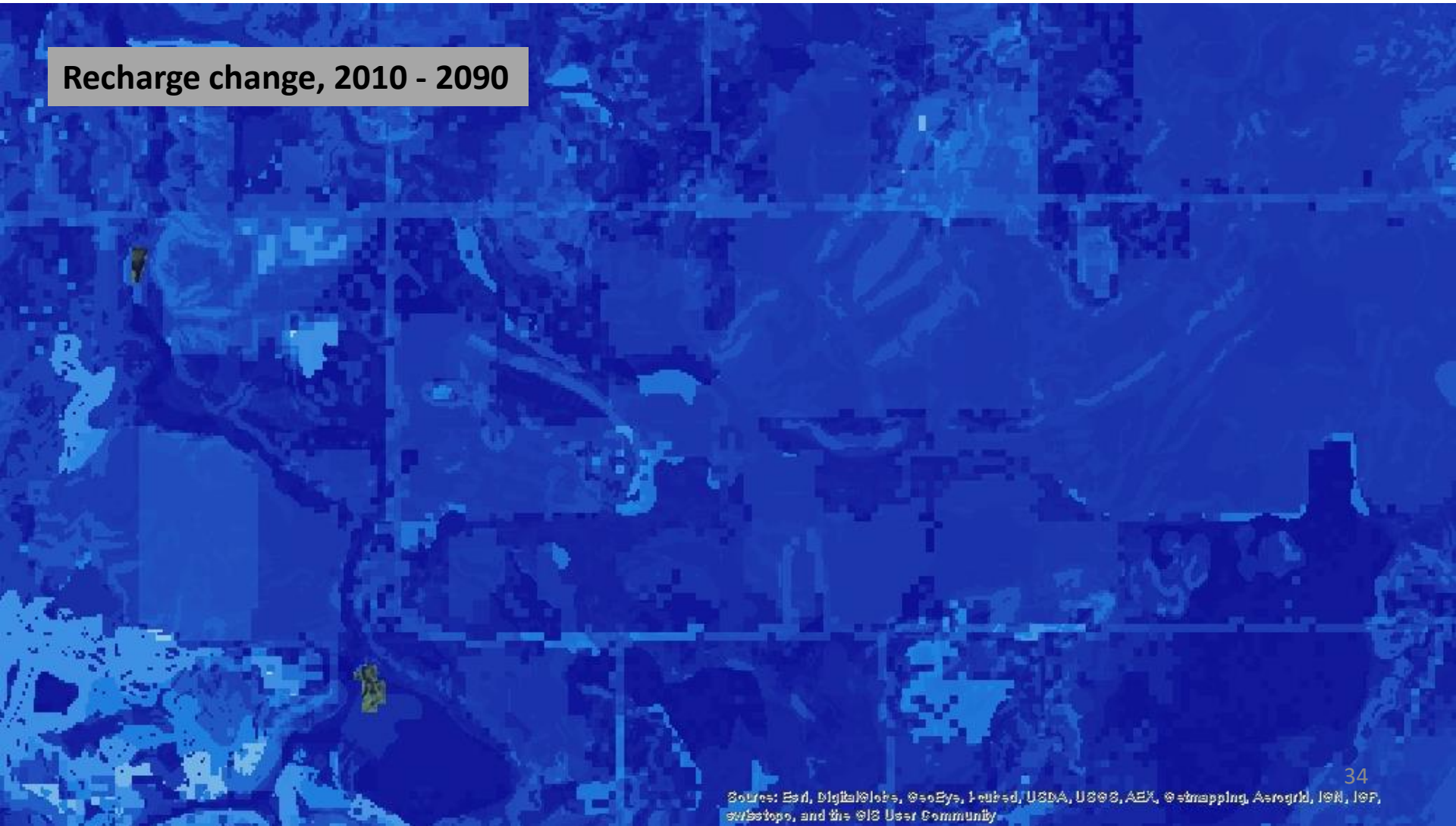
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## SWAT Future Simulations - Spatial differences in HRU outputs.

Recharge change, 2010 - 2090

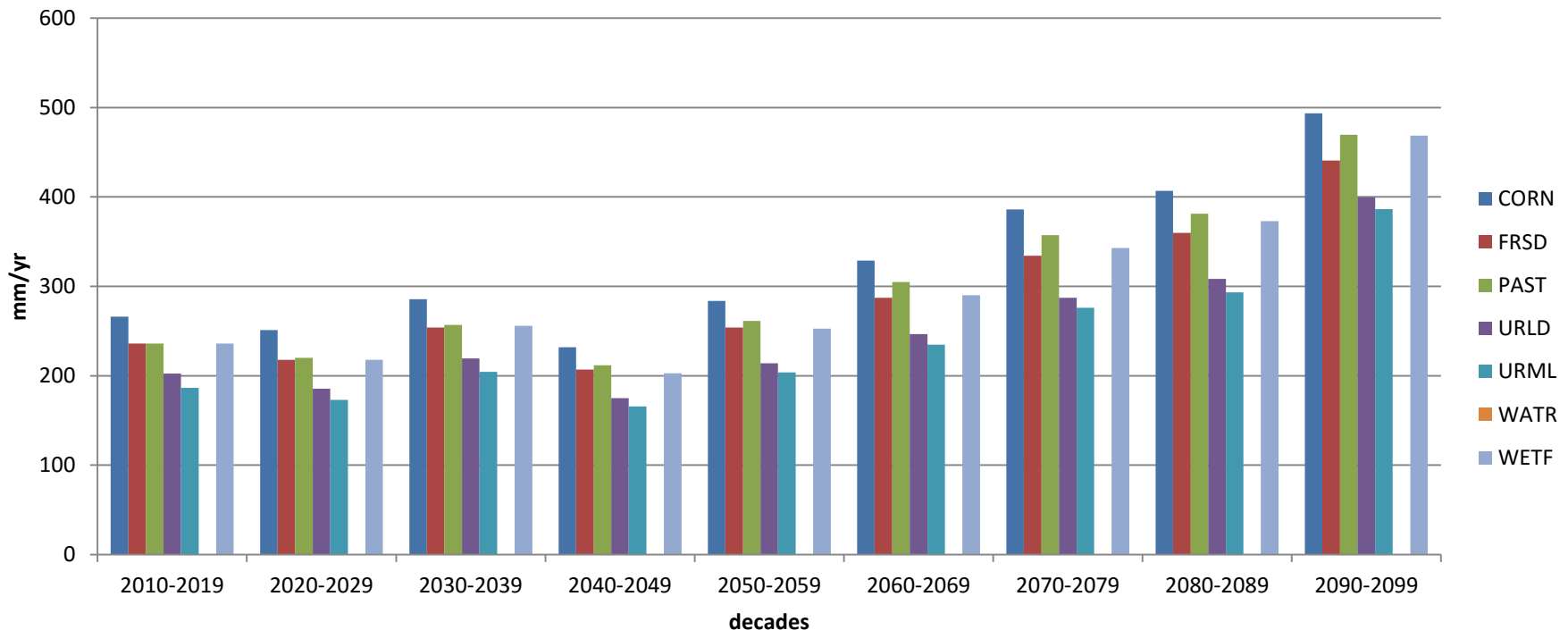




## SWAT Future Simulations

- Corn areas in 04106000 recharged most, urban least.
- Pasture started even with forest, surpassed it around 2050.

**Average annual recharge by land cover (a1fi)**





## Limitations

- Land cover did not change in future simulations.
- Solar radiation and relative humidity did not change.
- Growing season parameters did not change (e.g. no double-cropping).
- Did not calibrate for nutrients, may affect crop-growth.





## Conclusions

- Groundwater recharge generally decreased in future climate scenarios, except for the b1 scenario.
- ET generally increased, except for the b1 scenario, due to increased CO<sub>2</sub> levels.
- Crop yields were flat.
- Spatially, largest increases in recharge through 2100 are in forested and pasture areas.



## Next Steps

- Feed the recharge maps into MODFLOW to produce steady-state head for each decade within each climate scenario.
- Run another batch of simulations for increased urbanization (more imperviousness around urban centers, more consumptive water use), with current climate conditions.
- Run another batch of simulations for expanded agriculture (marginal lands converted to corn-soy rotations, more lands implementing irrigation), with current climate conditions.
- Run a final batch of simulations combining the increased urbanization, agricultural expansion, and changing climate.



## References

Hayhoe, K. 2013. Development and dissemination of a high-resolution national climate change dataset. *Final Report for United States Geological Survey, USGS G10AC00248* (Accessed online 10-08-2014 at: <https://nccwsc.usgs.gov/displayproject/5050cc22e4b0be20bb30eacc/4f833ee9e4b0e84f608680df>).

<http://cida.usgs.gov/thredds/catalog.html?dataset=dcg>

Luukkonen, Carol L., Stephen P. Blumer, T.L. Weaver, and Julie Jean. 2004. "Simulation of the Ground-Water-Flow System in the Kalamazoo County Area, Michigan." 2004-5054. USGS Scientific Investigations Report. Reston, Virginia: U.S. Geological Survey.

<http://pubs.usgs.gov/sir/2004/5054/> .

Maurer, E. P., A. W. Wood, J. C. Adam, D. P. Lettenmaier, and B. Nijssen. 2002. "A Long-Term Hydrologically Based Dataset of Land Surface Fluxes and States for the Conterminous United States\*." *Journal of Climate* 15 (22): 3237–51. doi:10.1175/1520-0442(2002)015<3237:ALTHBD>2.0.CO;2.

[http://cida.usgs.gov/thredds/catalog.html?dataset=cida.usgs.gov/new\\_gmo](http://cida.usgs.gov/thredds/catalog.html?dataset=cida.usgs.gov/new_gmo)