

# **Influence of spatial and temporal resolutions in hydrologic models**

**Ingjerd Haddeland (University of Oslo)**

**Dennis P. Lettenmaier (University of Washington)**

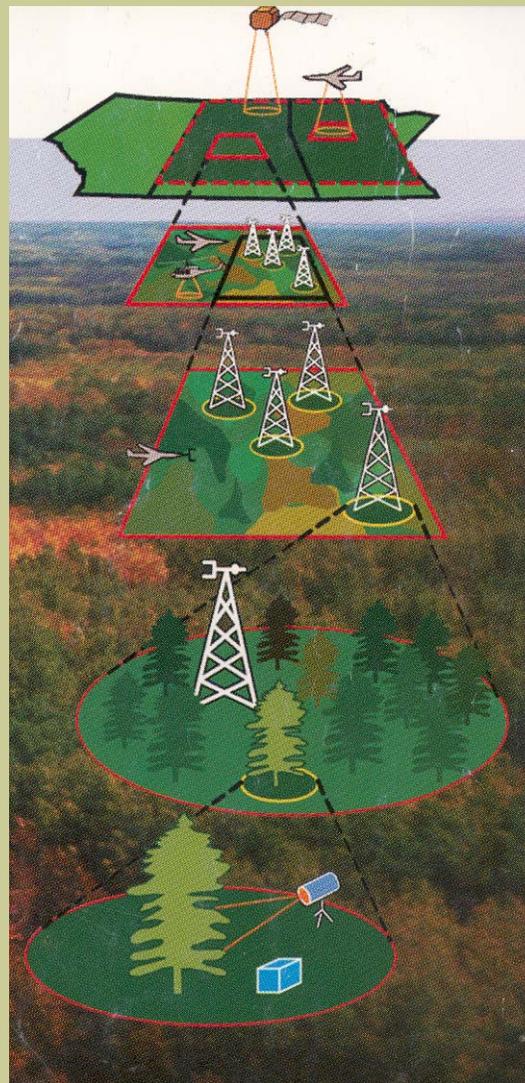
**Thomas Skaugen (University of Oslo)**

# Outline

- Background, motivation
- Variable Infiltration Capacity (VIC) model
- Spatial aggregation:
  - Rhone, Columbia and Arkansas-Red River basins
  - Conclusions
- Temporal aggregation:
  - Ohio and Arkansas-Red River basins
  - Conclusions

# Motivation and objective

- Hydrological data are just pieces.....
  - Pieces of the water balance
  - Pieces in space
  - Pieces in time



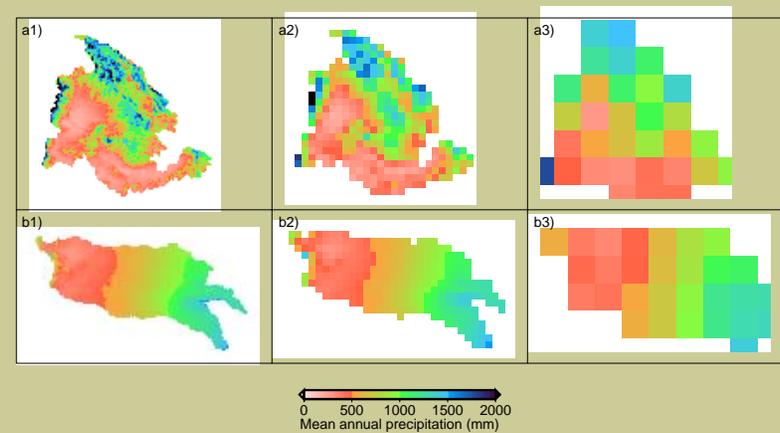
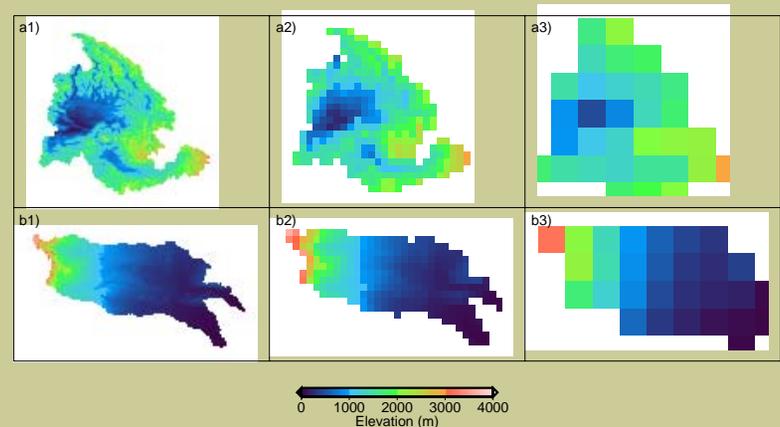
# Motivation and objective

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# Motivation and objective

- Representation of spatial variations in soil properties, topography and precipitation
- Spatial resolution of available input data and hydrologic models changes frequently
- Choice of spatial/temporal scale: Is often based on computational considerations, or issues related to the resolution of the observations.



# Science questions

- How are model simulations impacted by changing the spatial resolution?
- How different does models evaluated at two temporal scales perform?
- Is it possible to reconcile simulations performed at different scales?

# Previous studies: Examples

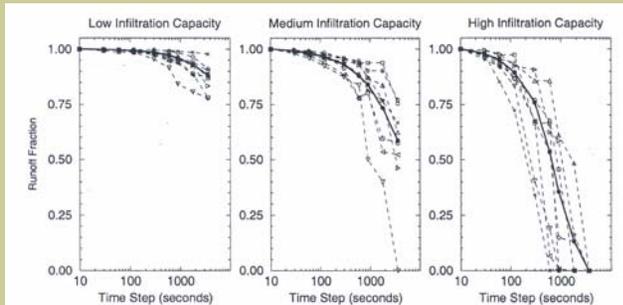


Figure 2. Total storm runoff simulated using true parameters as a fraction of true runoff, Phi-index model. Individual storm events are shown by open symbols and dotted lines; a longer calibration record is shown by solid symbols and line. For longer sampling intervals, increasing undersimulation of runoff occurs. Among the individual storms, those that are more variable have a more extreme response to the smoothing than storms that are generally more uniform.

Holmann-Dodds et al., *Journal of Geophysical Research*, 1999

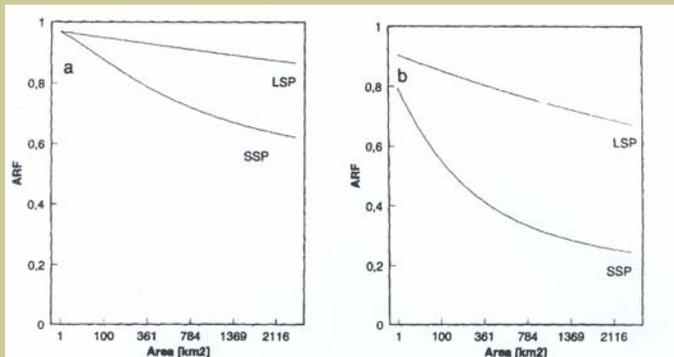
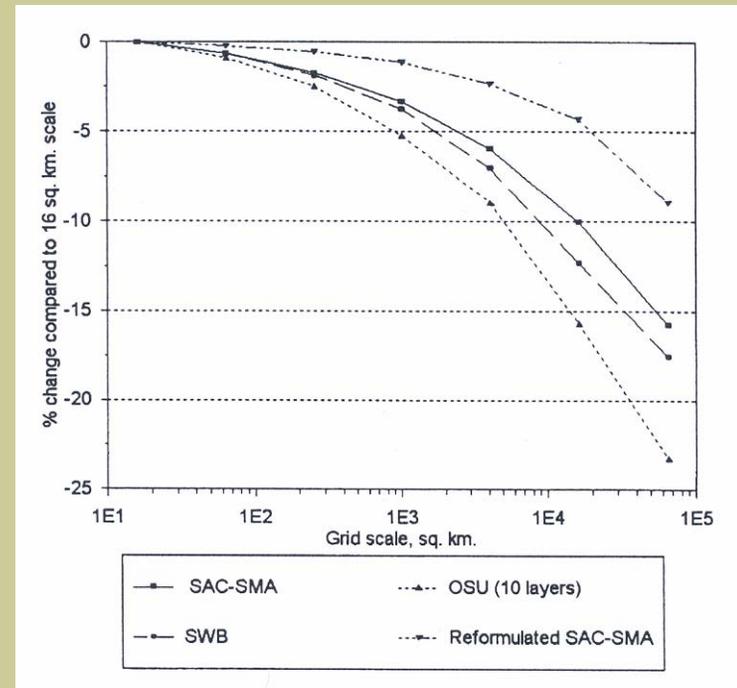


Fig. 7. ARF curves for probabilities of exceedance 0.1 (a) and 0.01 (b).

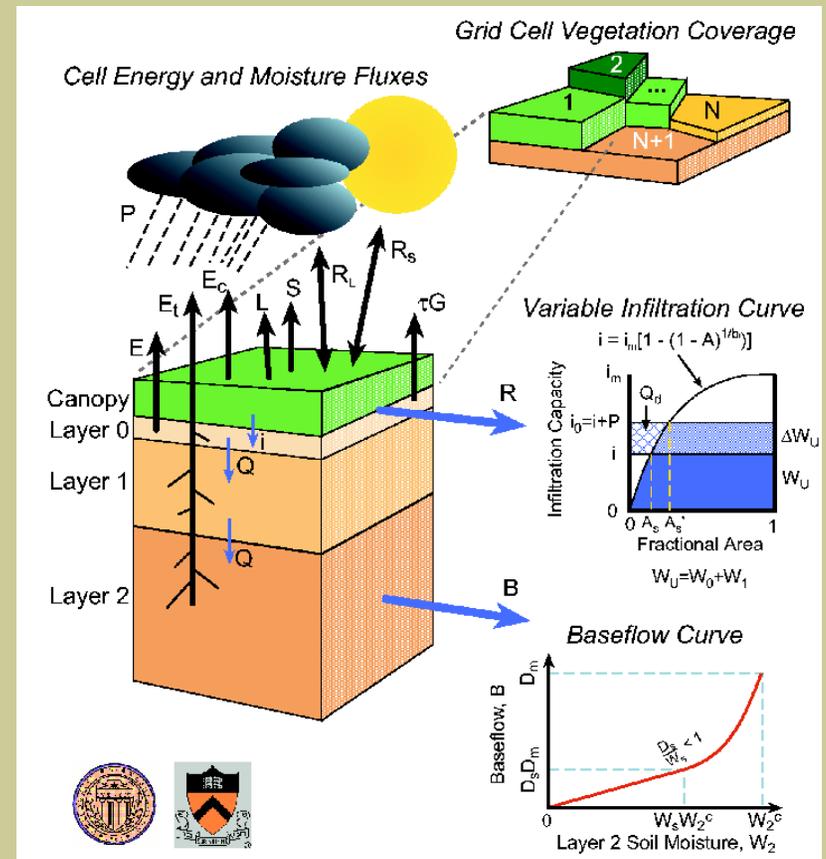
Skaugen, *Journal of Hydrology*, 1997



Koren et al., *Water Resources Research*, 1999

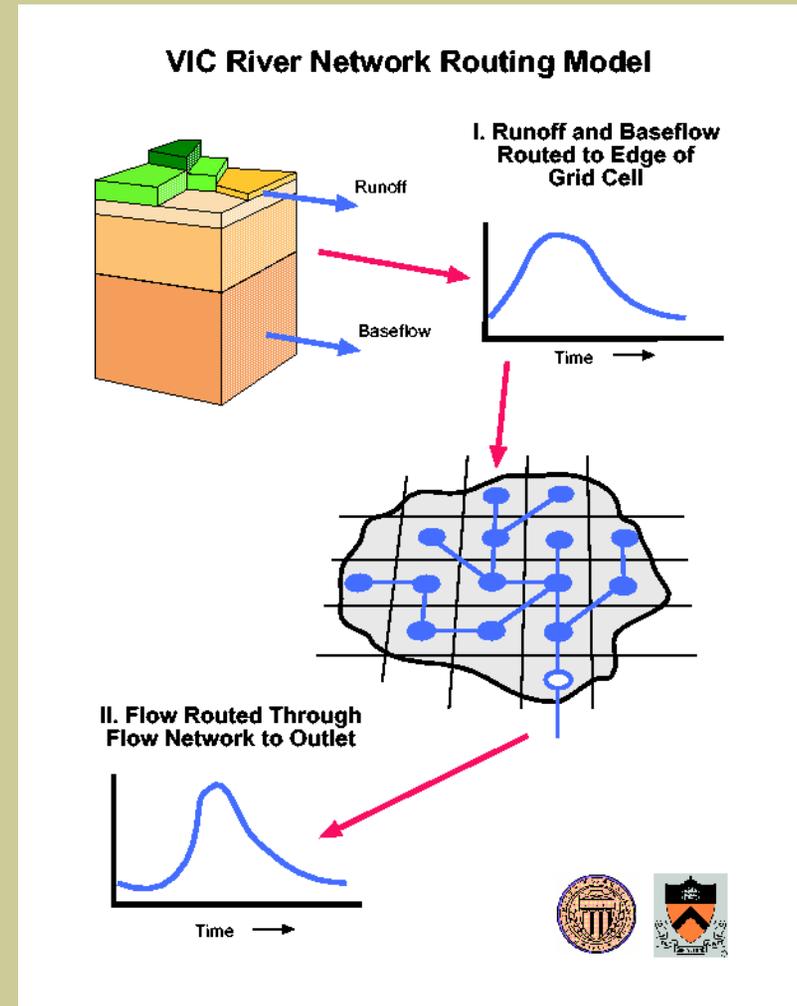
# VIC: Variable Infiltration Capacity Model

- N soil layers (3)
- N vegetation types (10)
- N elevation bands (10)
- Energy balance
  - winter/summer
- Variable infiltration
- Nonlinear baseflow
- Distributed precipitation
- Typical scale of application: 1/8 - 2 degrees latitude by longitude, 1 hr to 24 hr temporal resolution

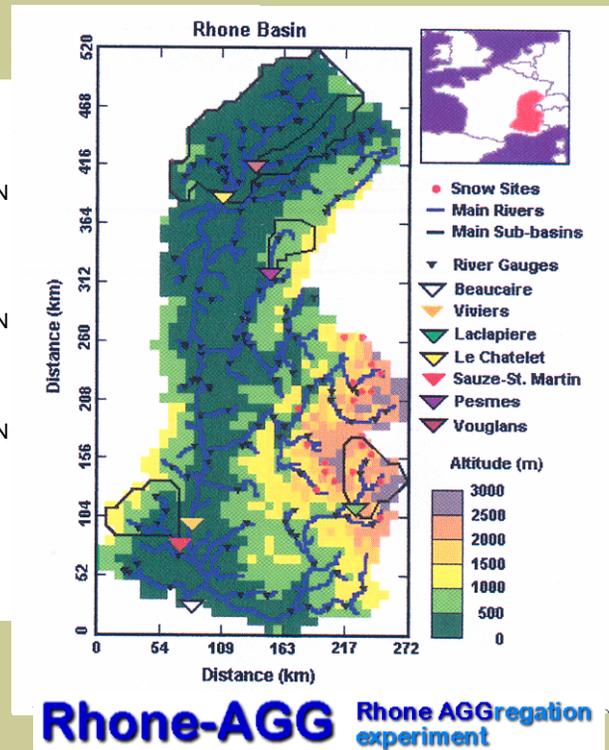
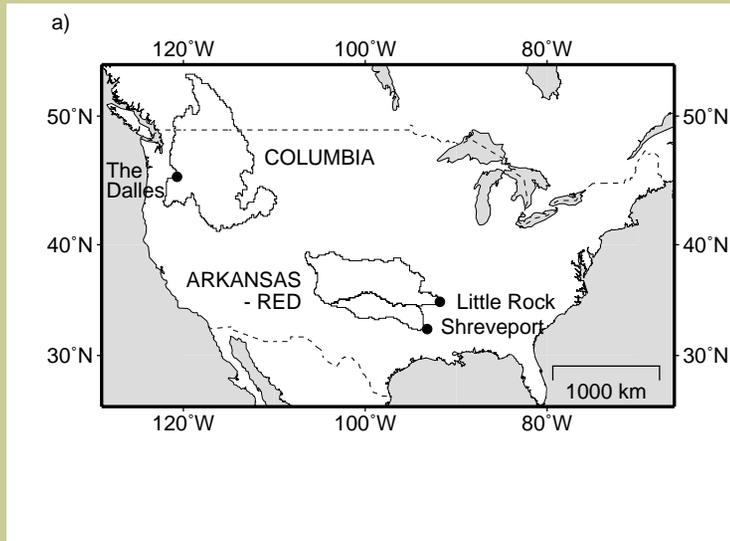


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# Spatial aggregation: Study areas



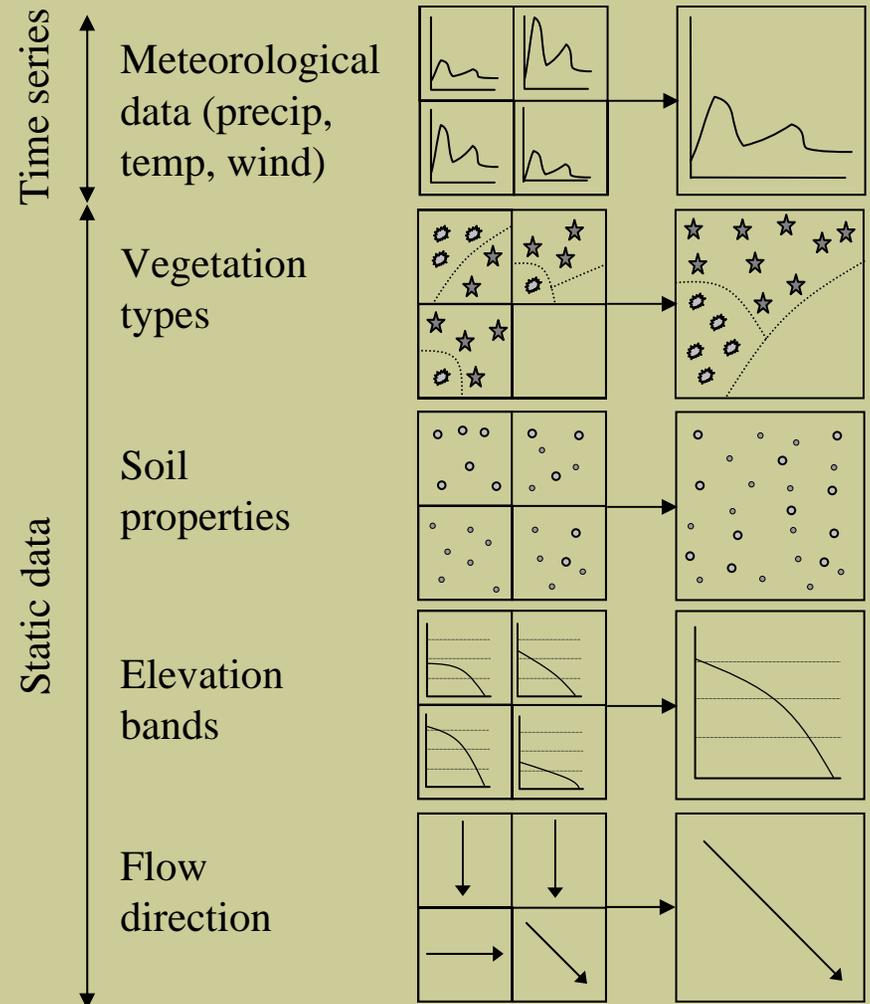
# Aggregation method

## Rhone:

- 8\*8 km
- One-half and one degree

## Columbia and Arkansas-Red:

- One-eighth degree (~12.5 km\*12.5 km)
- One-quarter, one-half, one and two degrees



# Results: RhoneAGG

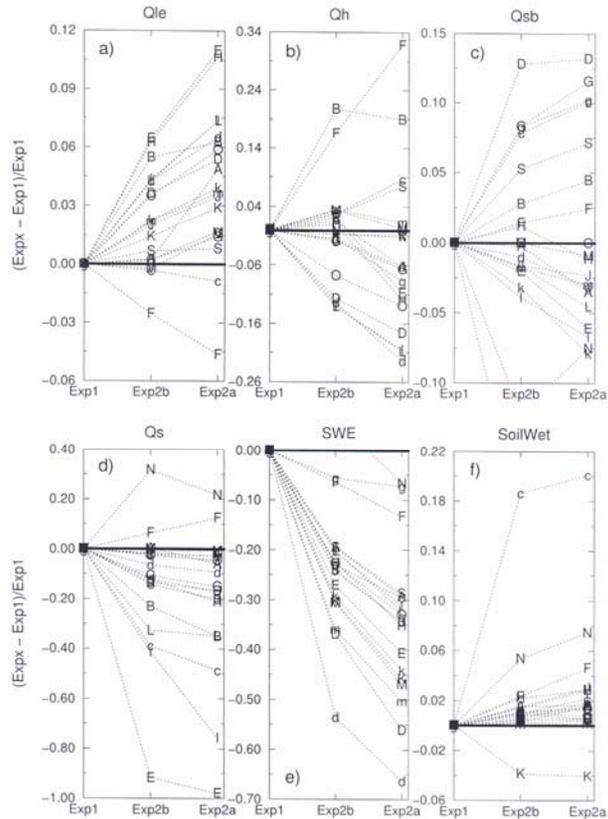


FIG. 12. The impact (as a relative difference) of scaling on selected LSS surface fluxes and hydrological components. The upscaled values are compared to the control, high-resolution results. Exp2b and Exp2a correspond with upscaling to  $1/2^\circ$  and  $1^\circ$  grids, respectively. Exp2c corresponds to using dominant surface parameters on a  $1^\circ$  grid.

# Results: RhoneAGG

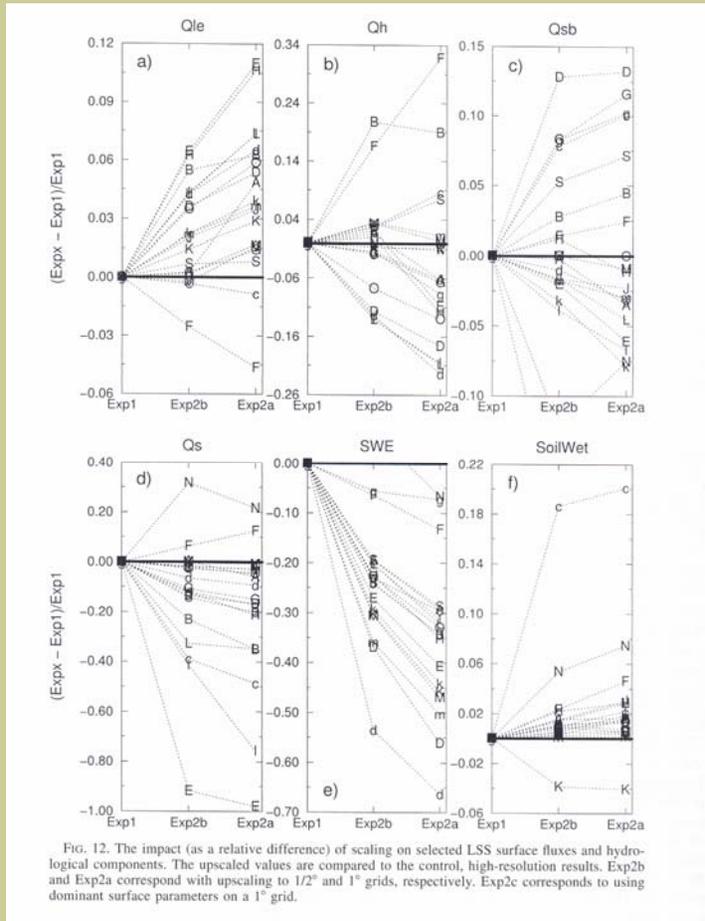


FIG. 12. The impact (as a relative difference) of scaling on selected LSS surface fluxes and hydrological components. The upscaled values are compared to the control, high-resolution results. Exp2b and Exp2a correspond with upscaling to 1/2° and 1° grids, respectively. Exp2c corresponds to using dominant surface parameters on a 1° grid.

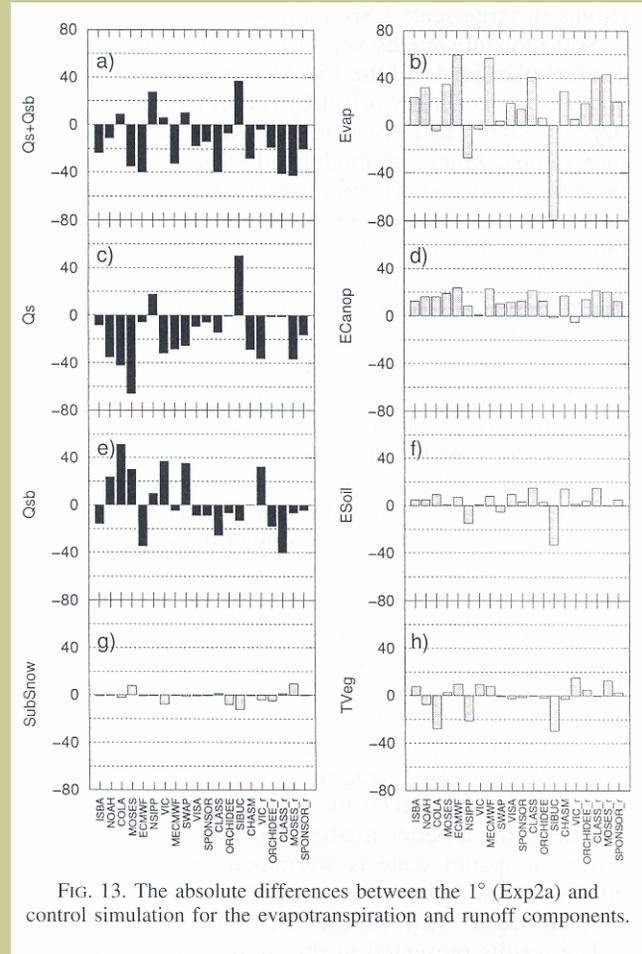
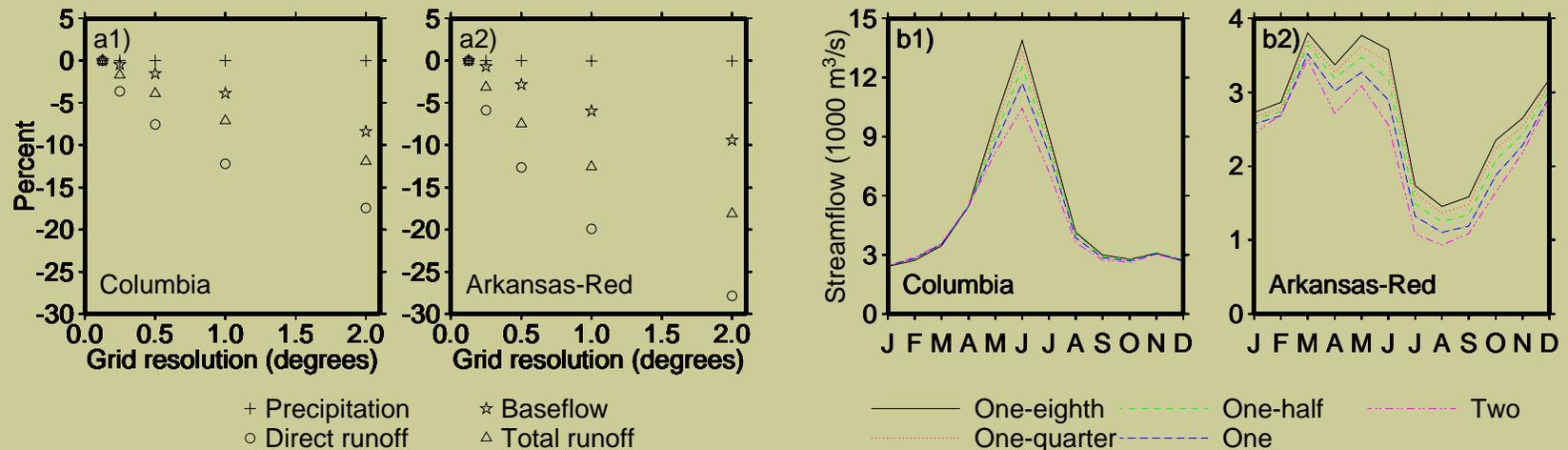


FIG. 13. The absolute differences between the 1° (Exp2a) and control simulation for the evapotranspiration and runoff components.

# Results: Columbia and Arkansas-Red

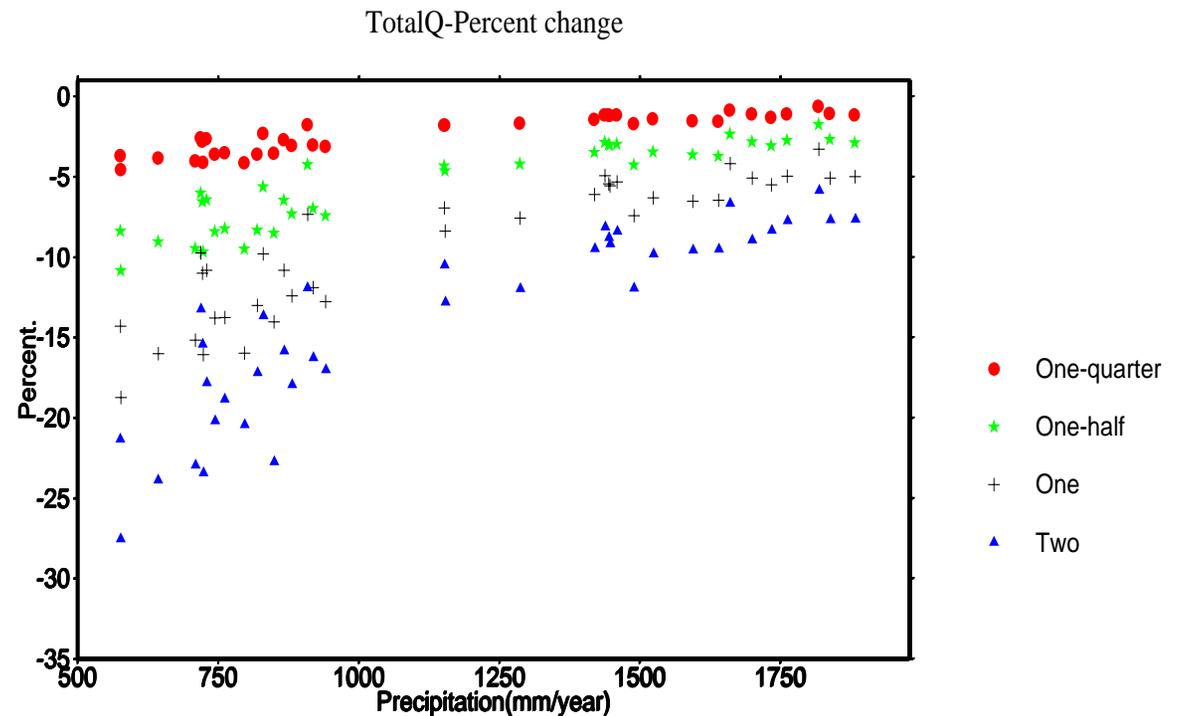
Spatially and temporally uniform precipitation, daily time steps



a) Percent changes in moisture fluxes, compared to the results at one-eighth degree spatial resolution, and b) Mean monthly streamflow at all spatial resolutions, for the 1) Columbia and 2) Arkansas-Red River basins, using spatially constant grid cell precipitation

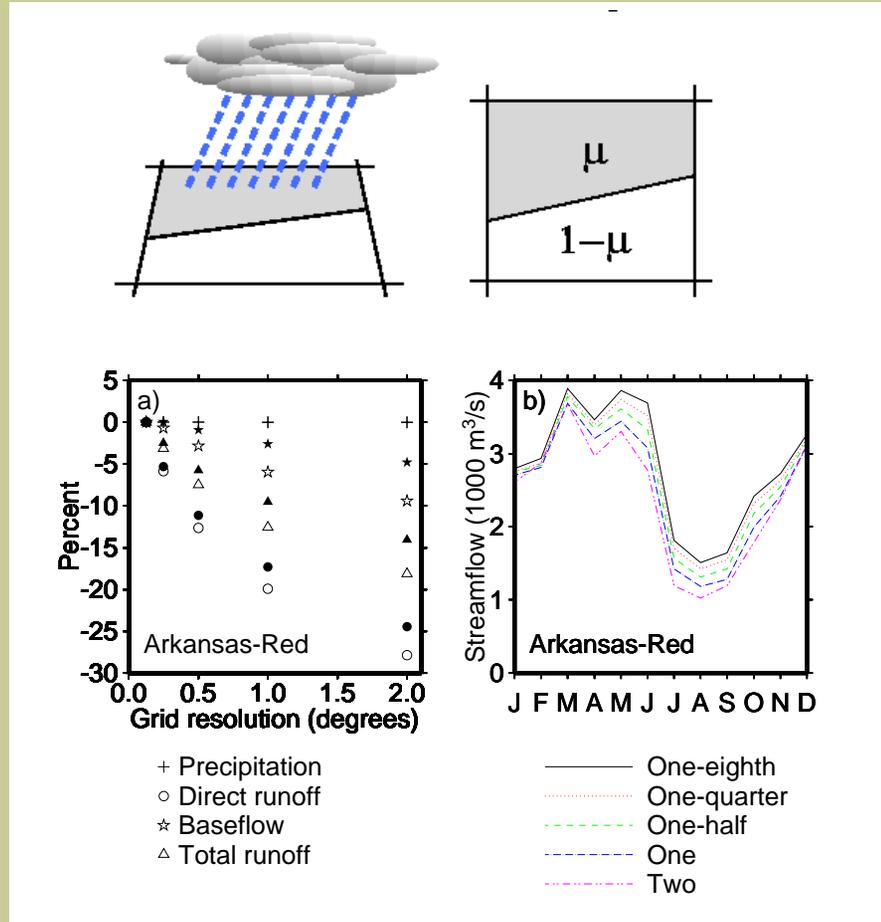
# Results: Arkansas-Red

Scale  
sensitivity of  
total runoff for  
Arkansas-Red  
River basin as  
a function of  
water year  
precipitation



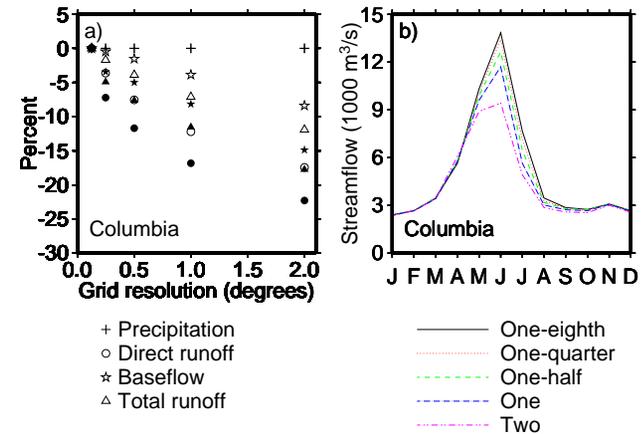
# Results: Arkansas-Red

Effect of parameterization for spatial variability of precipitation (black) vs spatially uniform precipitation (open)



# Results: Columbia

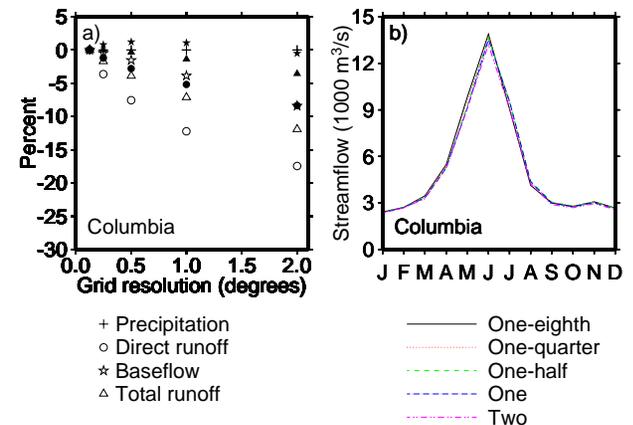
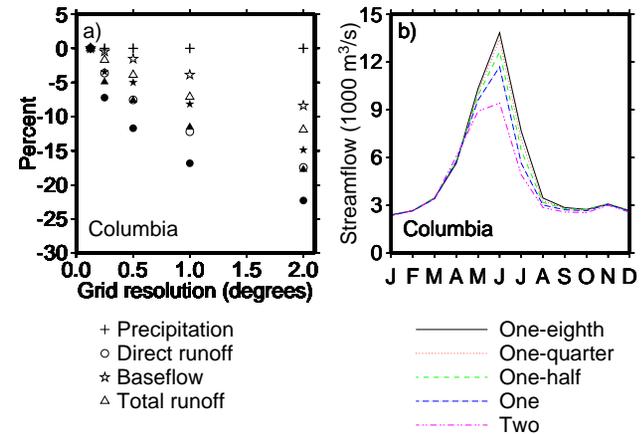
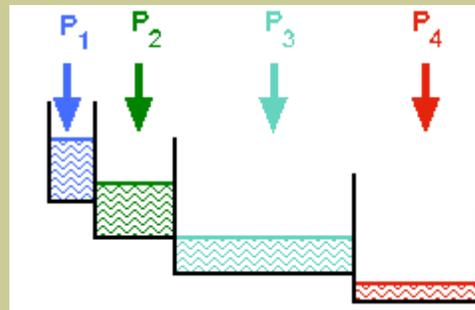
Effect of elevation bands (open symbols) vs no elevation bands (black symbols)



# Results: Columbia

Effect of elevation bands (open symbols) vs no elevation bands (black symbols)

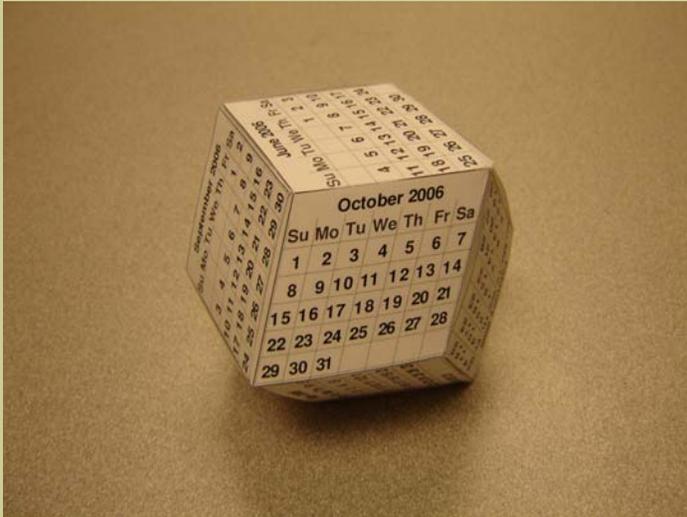
Effect of parameterization of precipitation as a function of elevation



# Conclusions: Spatial aggregation

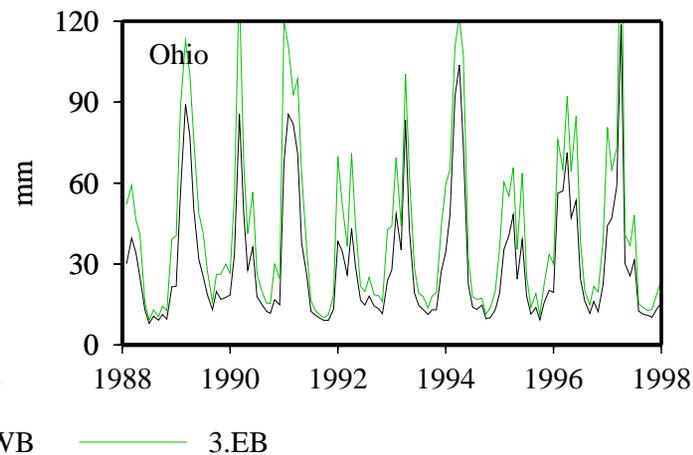
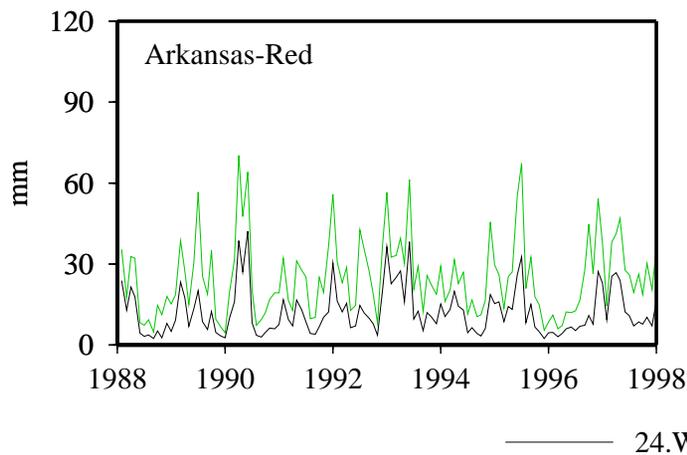
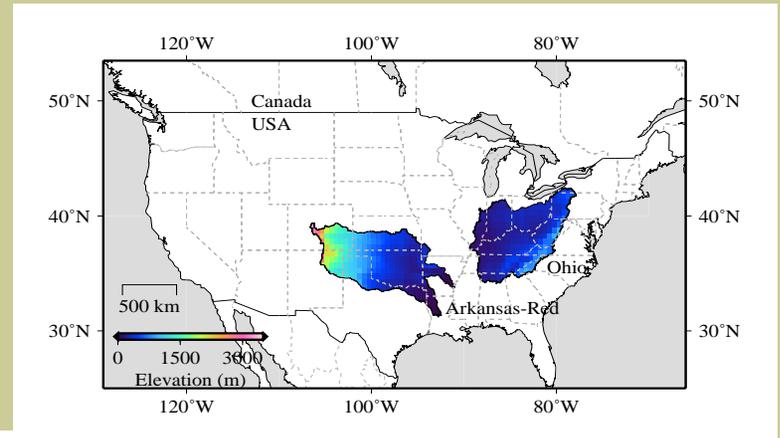
- In general: Form of hydrographs preserved, runoff decreases as spatial scale increases
- Snowmelt dominated areas: Interaction precipitation/temperature
  - Elevation bands
- Drier areas: Interaction precipitation/vegetation
  - Subgrid precipitation and soil moisture, canopy evaporation
- Wet areas: Decrease in direct runoff is compensated by an increase in baseflow

# Temporal scale



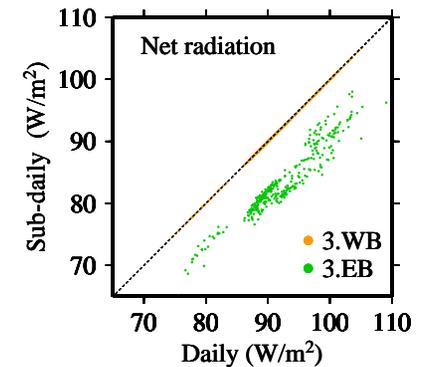
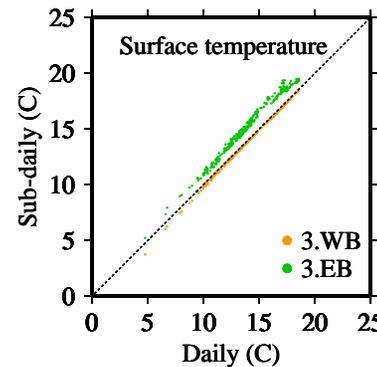
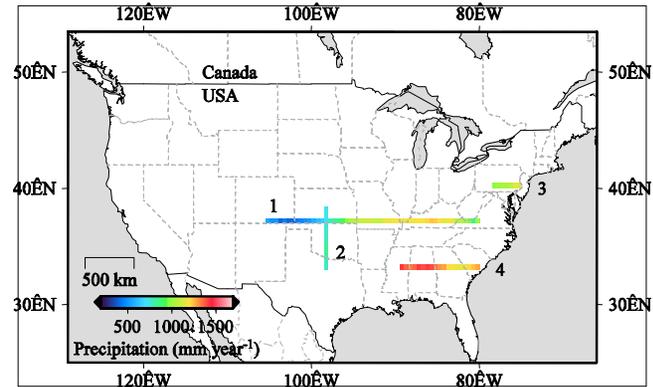
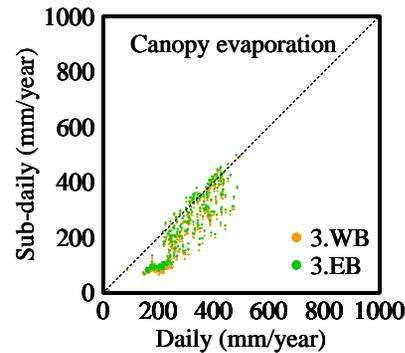
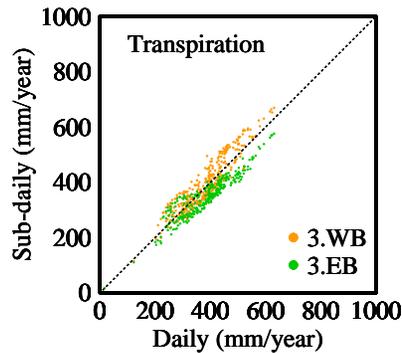
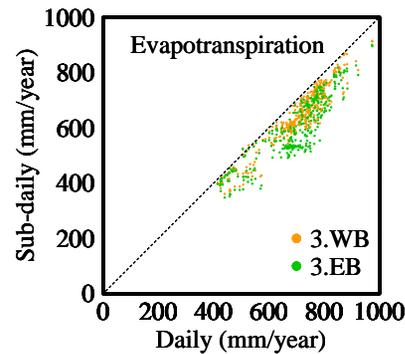
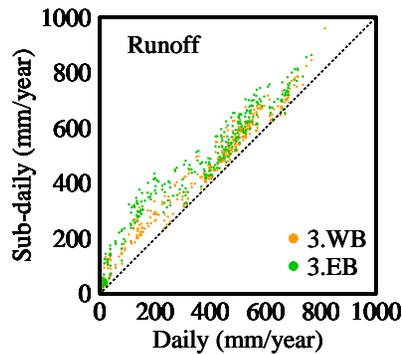
# Temporal scale: Background

The backdrop: Models evaluated at one temporal scale (time step) may perform much differently at another



*Mean annual runoff in the Arkansas-Red and Ohio River basins. Daily water balance mode (24.WB) and 3 hourly energy balance mode (3.EB)*

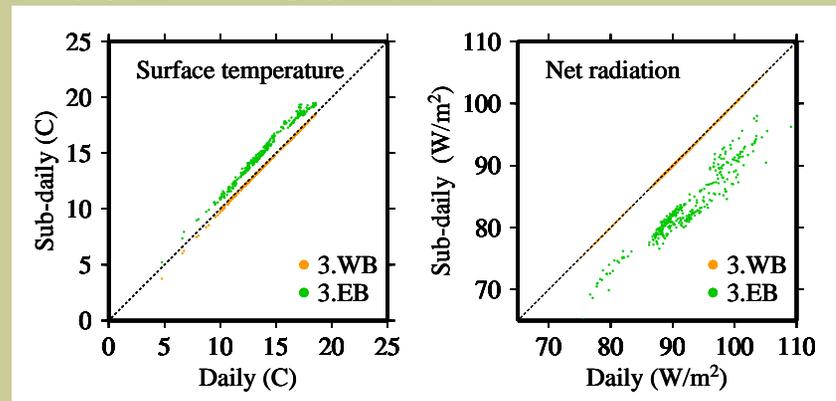
# Temporal scale effects



Spatially and temporally uniform precipitation. Daily water balance (24.WB) runs compared to 3 hourly water balance (3.WB) and 3 hourly energy balance (3.EB) runs.

# Model differences: 24.WB – 3.EB

- Energy balance, water balance
  - Surface temperature
  - Net radiation
- Parameterization of canopy evaporation
  - Daily time steps: Evaporation *can* include current time step's precipitation
  - Sub-daily time steps: Evaporation *cannot* include current time step's precipitation
- So – how can we easily reconcile model simulations?



# Rescaling parameters for time step differences

- Search for parameters (interception capacity factor and minimum stomatal resistance):

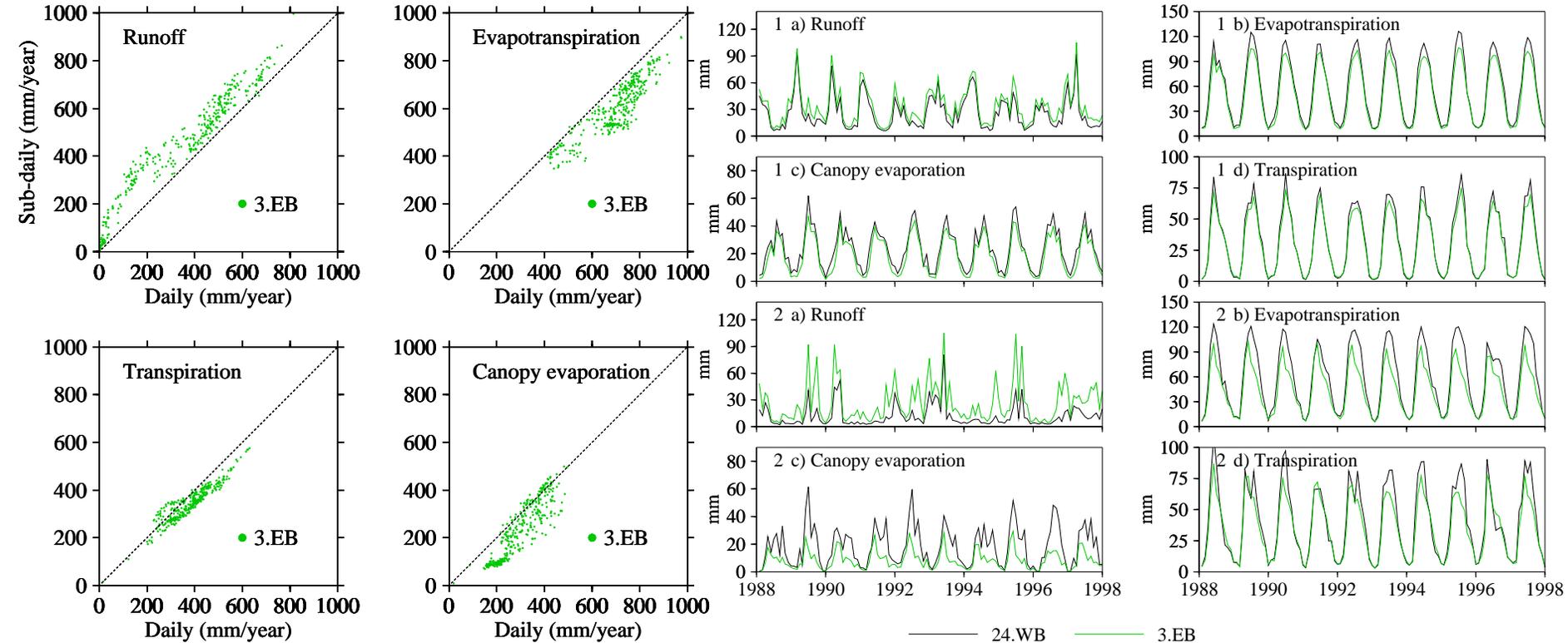
$$(R_{new})_{n,i} = (R_{orig})_{n,i} * k_{1,n} \quad (C_{new})_{n,i} = (C_{orig})_{n,i} * k_{2,n}$$

$$\min \sum_{months} \left\{ (EC_{sub-daily} - EC_{24.WB})^2 + (TV_{sub-daily} - TV_{24.WB})^2 \right\}$$

- SCEM-UA algorithm (Vrugt et al., *Water Resources Research*, 2003)
- Search done across transect at one degree interval, evaluation at 1/8 degree (parameters interpolated for intermediate grid cells)
- Reproduce daily water balance results from 3 hr energy balance runs

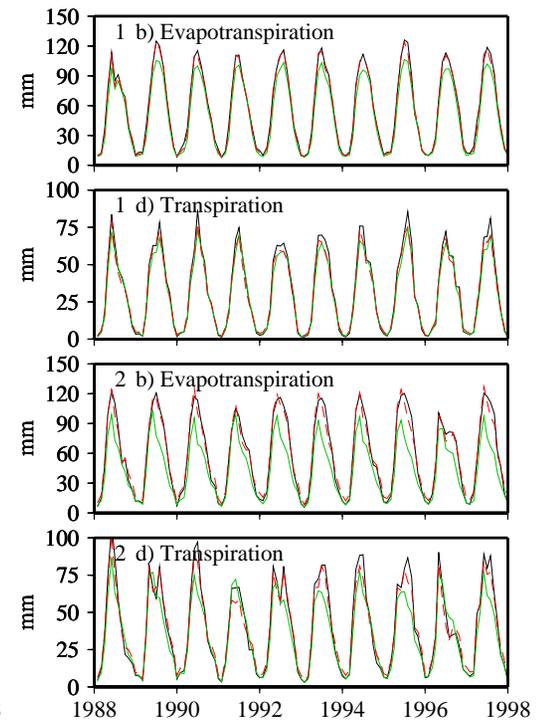
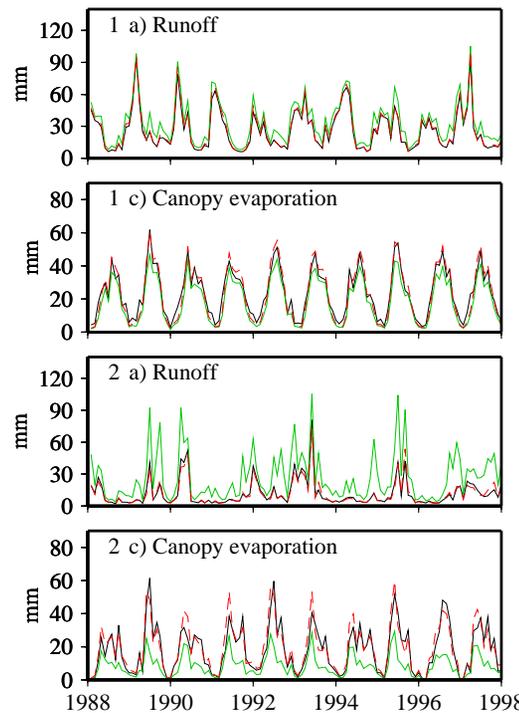
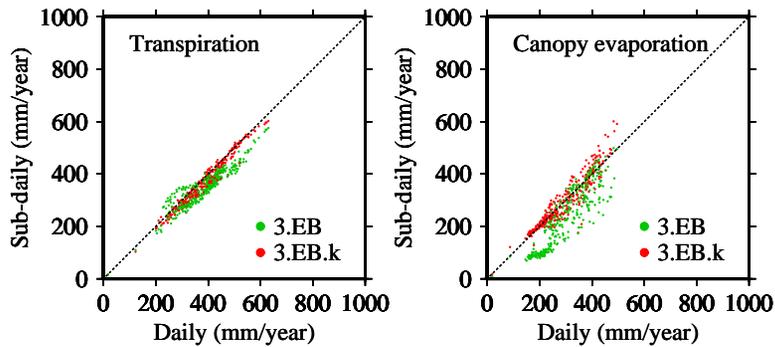
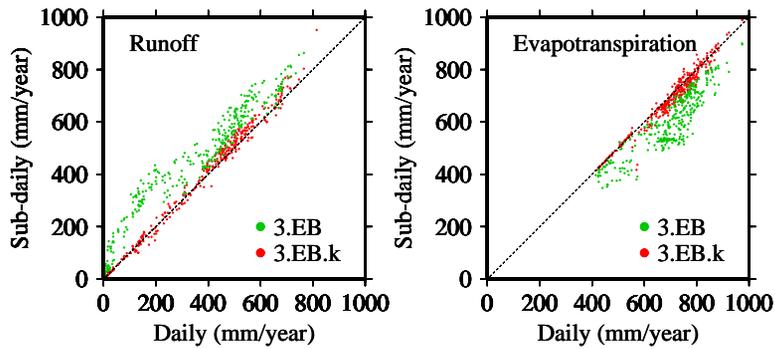
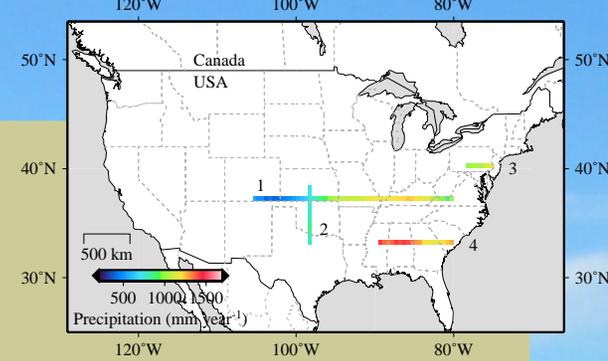
# Results: Transects

3 hourly energy balance compared to 24 hourly water balance runs



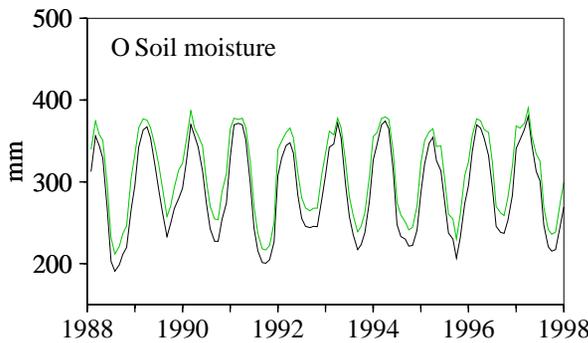
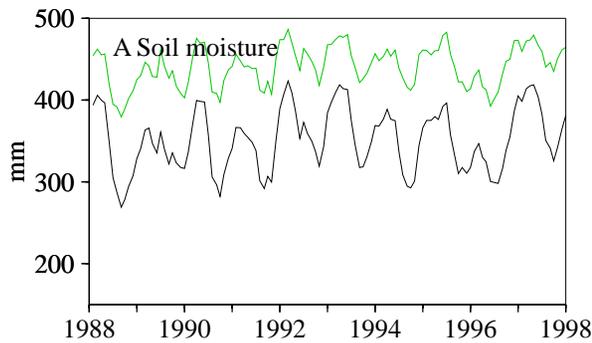
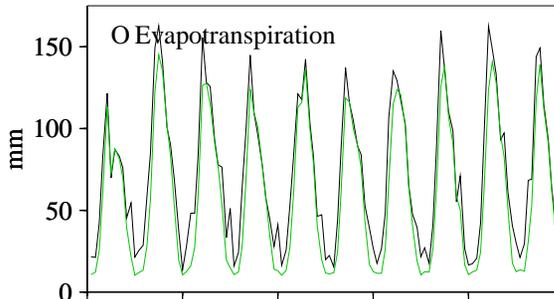
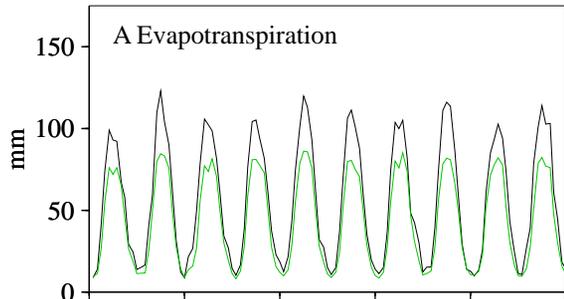
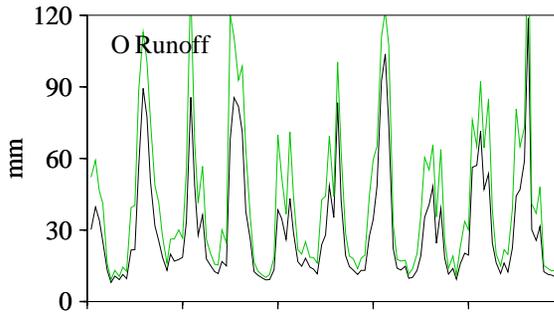
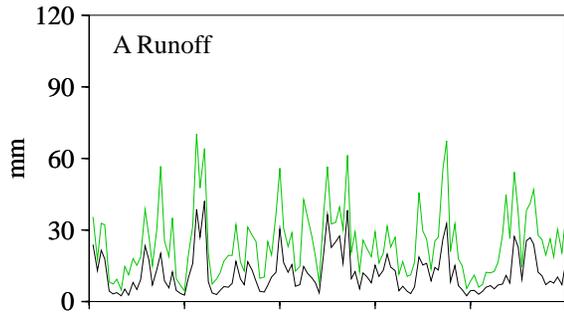
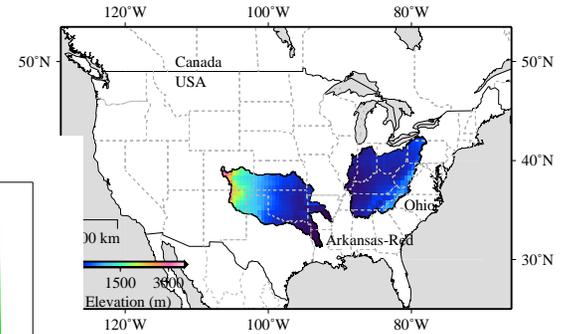
# Results: Transects

3 hourly energy balance runs matched to 24 hourly water balance runs



— 24.WB    — 3.EB    - - - 3.EB.k

# Results: River basins

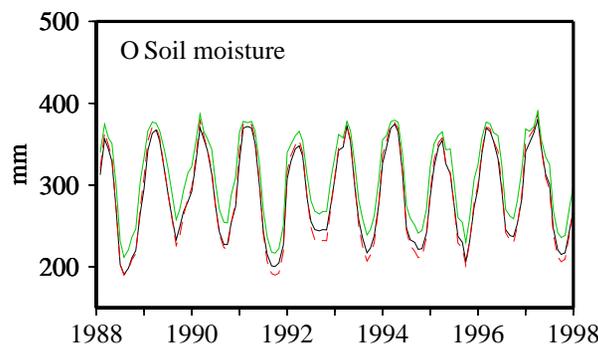
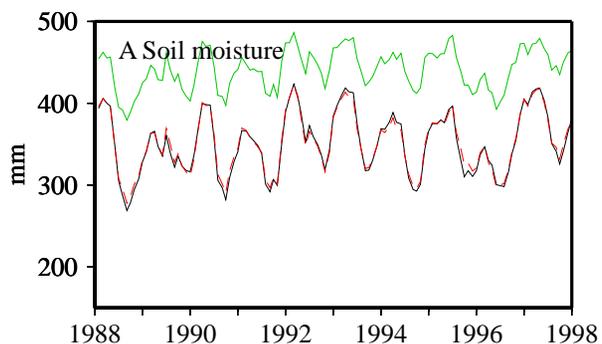
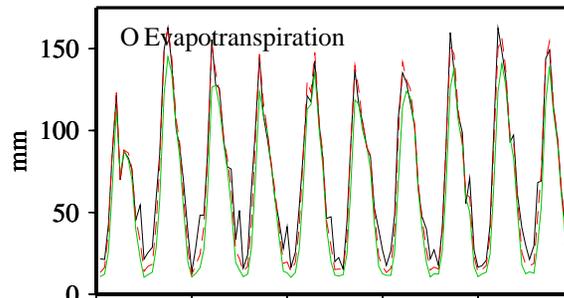
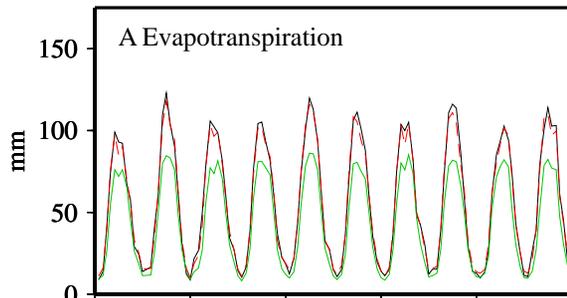
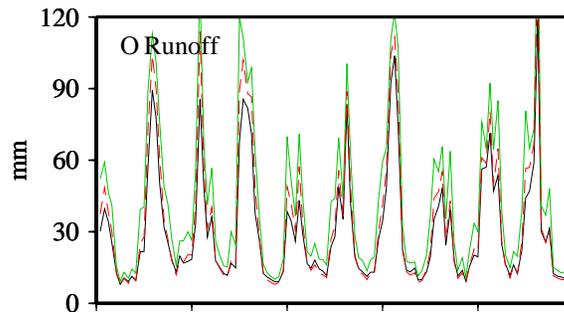
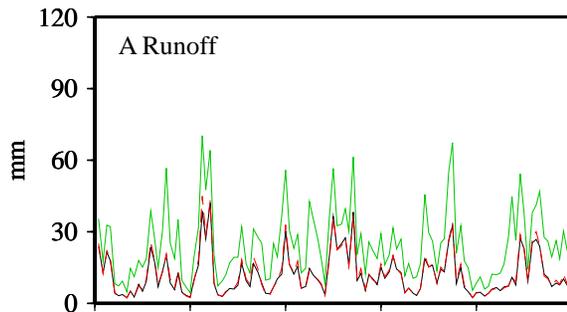
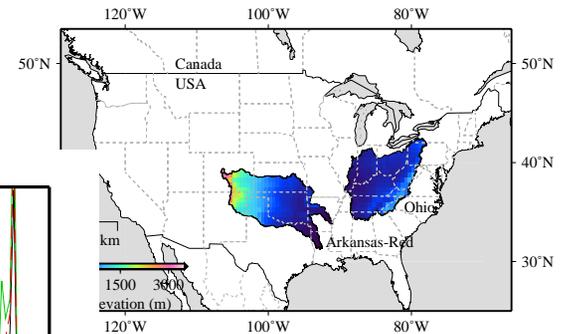


— 24.WB — 3.EB

A: Arkansas-Red  
O: Ohio

3 hourly energy  
balance runs and 24  
hourly water balance  
runs

# Results: River basins



— 24.WB    — 3.EB    - - - 3.EB.k

A: Arkansas-Red  
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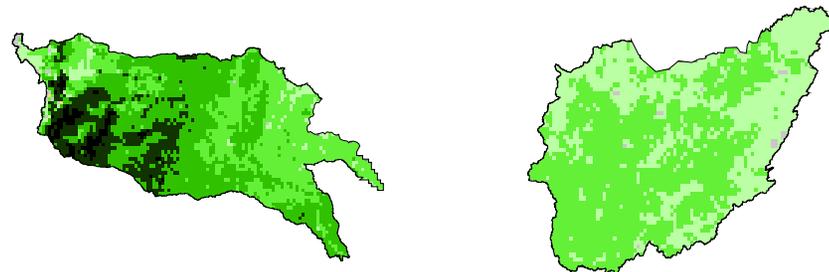
3 hourly energy  
balance runs  
matched to 24 hourly  
water balance runs

# Results: Spatial images

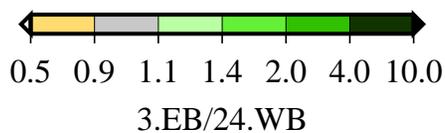
3 hourly energy  
balance runs  
compared to 24  
hourly water  
balance runs

## a) Runoff

Original results

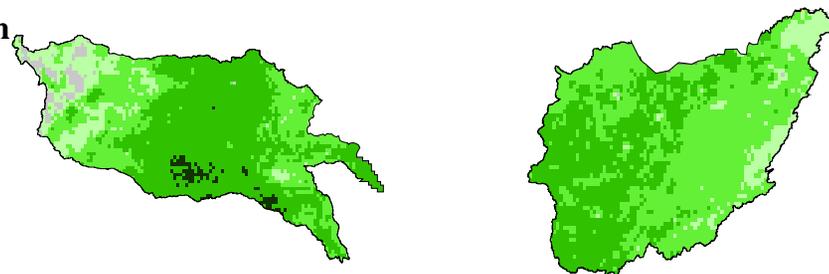


Corrected results

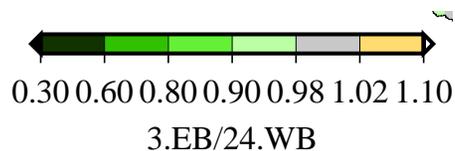


## b) Evapotranspiration

Original results



Corrected results

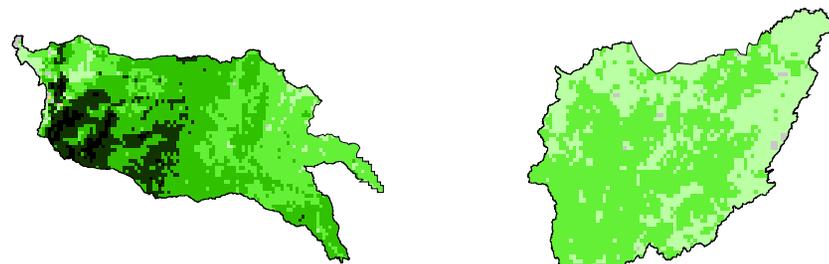


# Results: Spatial images

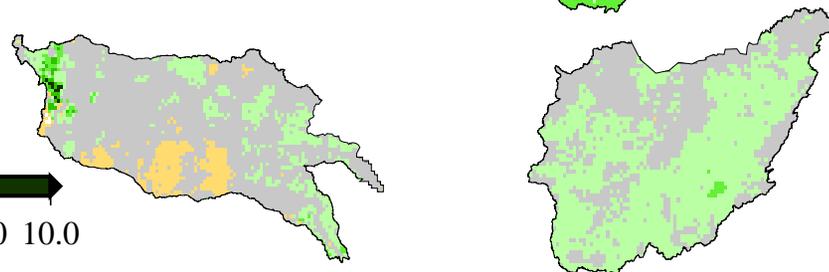
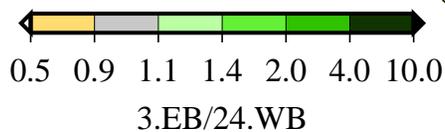
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## a) Runoff

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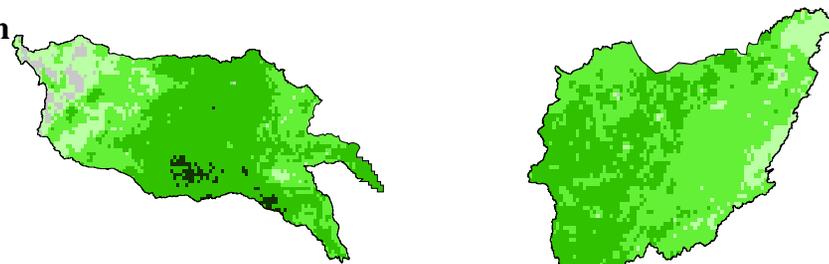


Corrected results

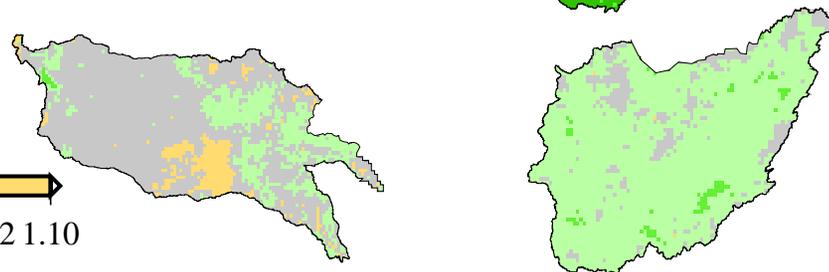
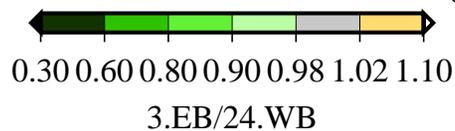


## b) Evapotranspiration

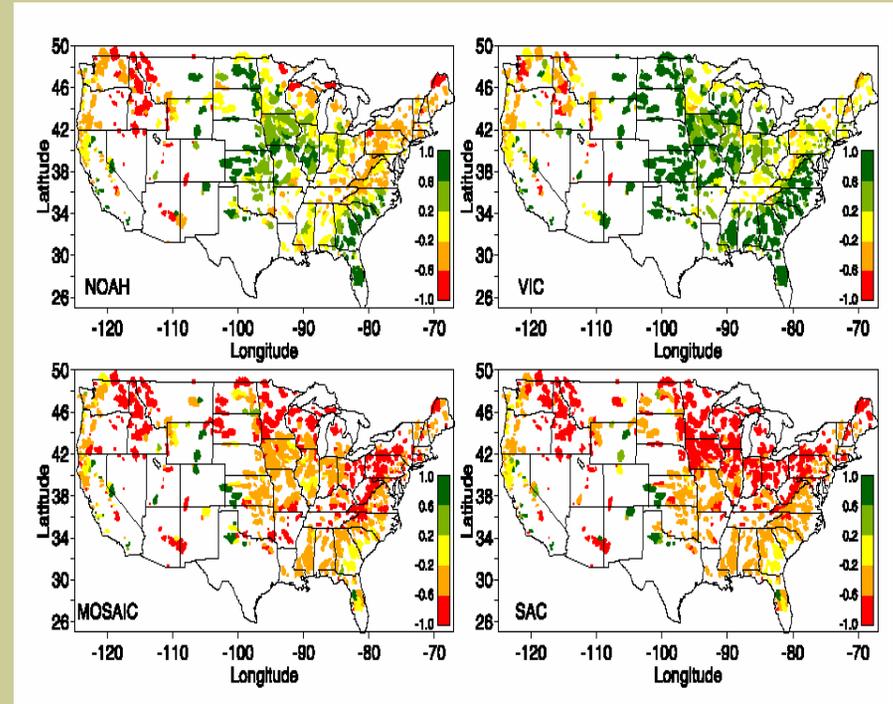
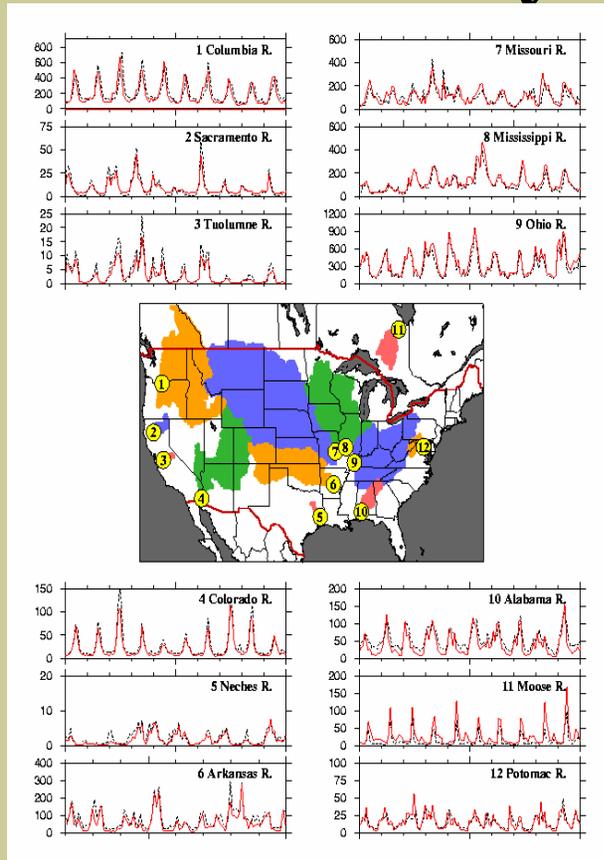
Original results



Corrected results



# NLDAS (North American Data Assimilation System)



Maurer et al., 2002: A long-term hydrologically-based data set of land surface fluxes and states for the conterminous United States, *J. Climate*, **15**, 3237-3251.

Relative runoff bias WY 1998-99, evaluated at USGS gauges with minimal management effects.

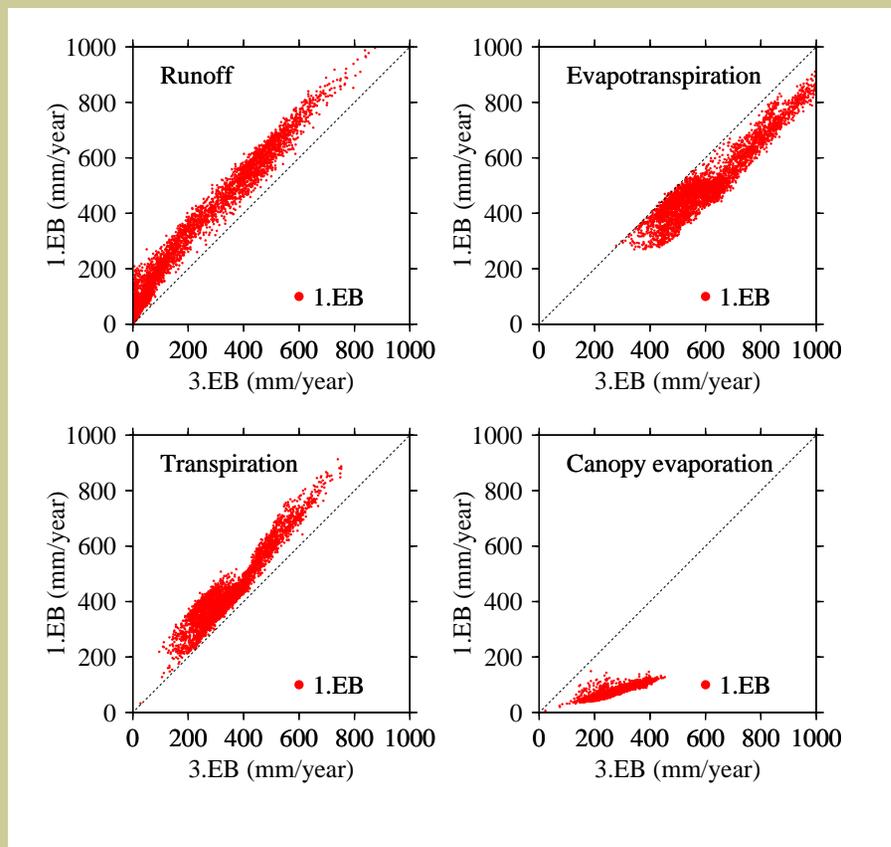
Lohmann et al., 2004: Streamflow and water balance intercomparisons of four land surface models in the North American Land Data Assimilation System project, *J. Geophys. Res.*, **109**, D07S91, doi:10.1029/2003JD003517

# NLDAS: Arkansas-Red

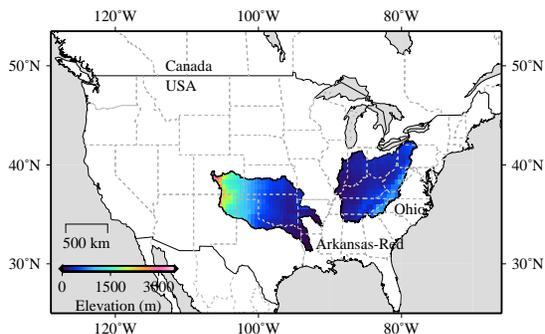
Arkansas-Red results Lohmann et al. (1.EB), vs Maurer et al. (3.EB)

3.EB: 3 hr energy balance results (no spatial or temporal disaggregation of precipitation)

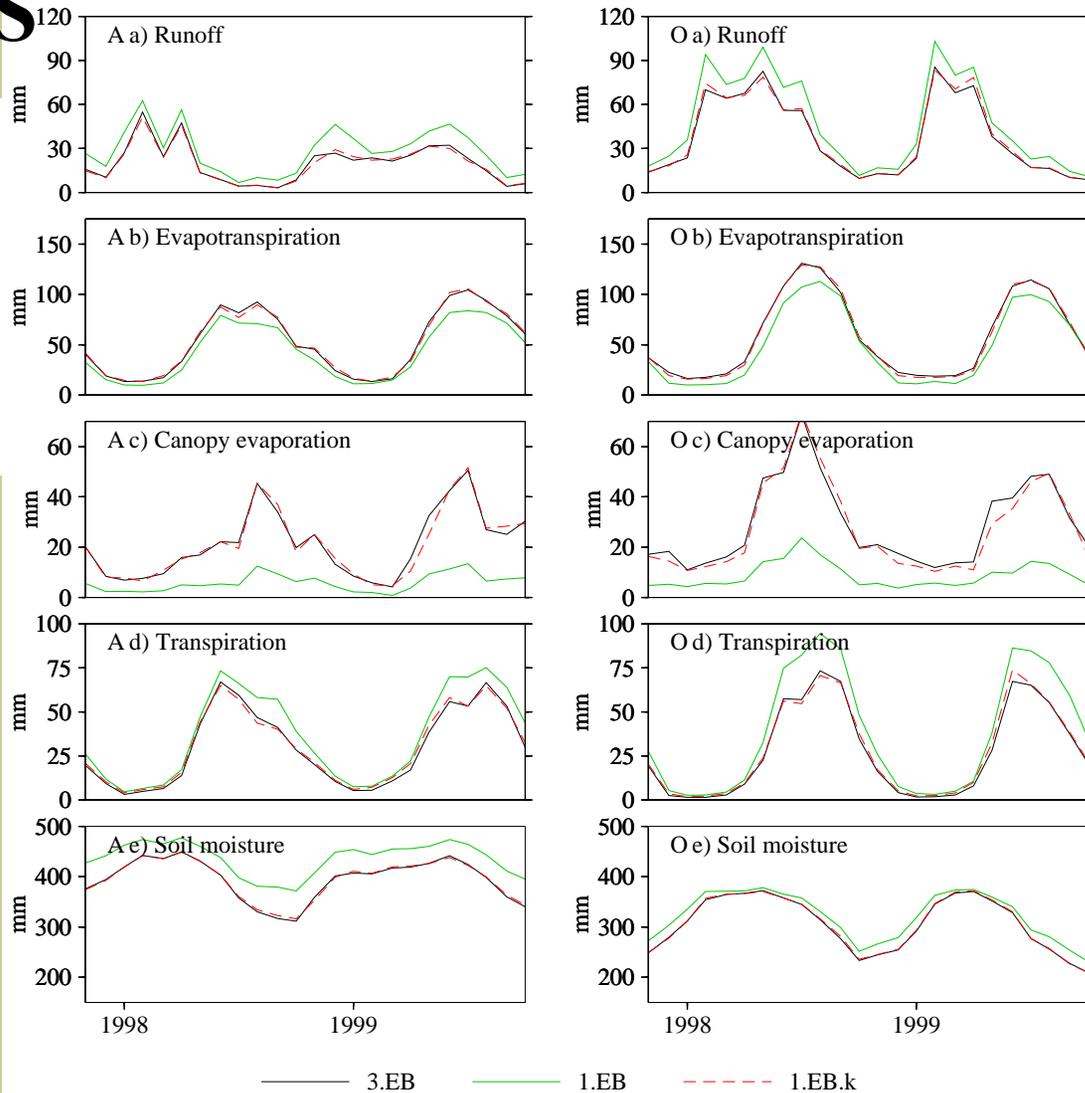
1.EB: 1 hr energy balance runs (spatially and temporally disaggregated precipitation)



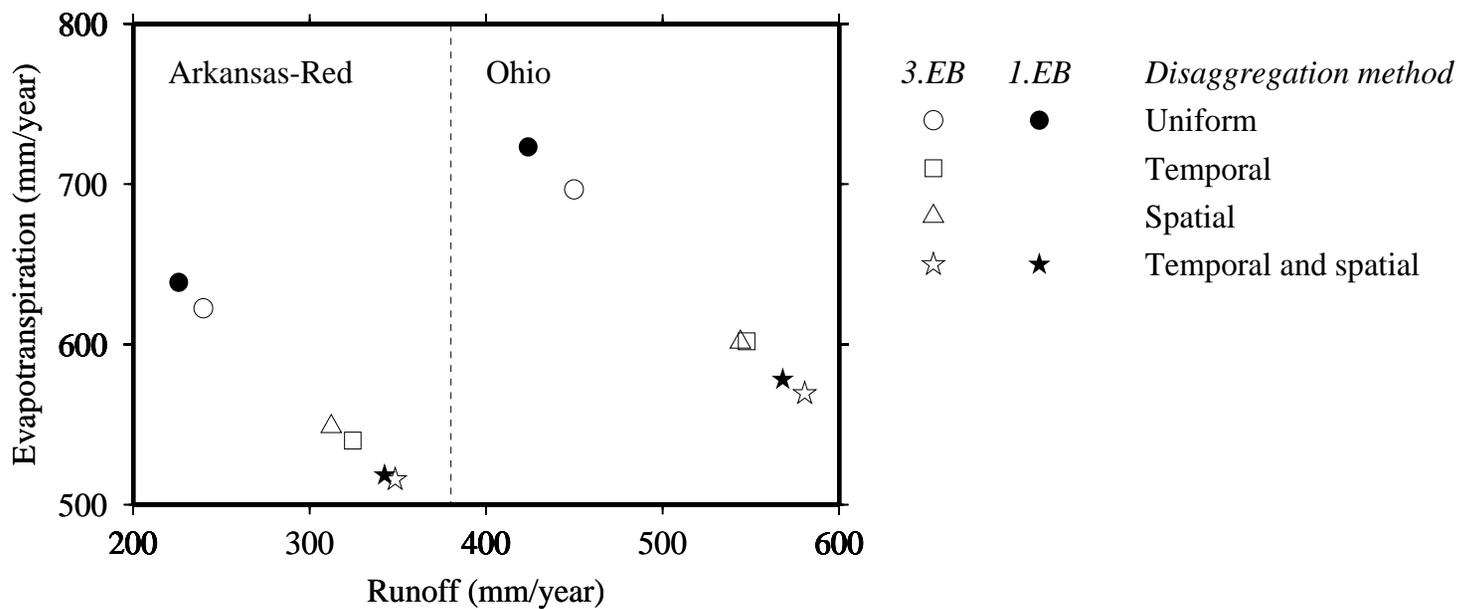
# Results: NLDAS



1 hourly energy balance runs, spatially and temporally disaggregated precipitation, matched to 3 hourly energy balance runs, temporally and spatially uniform precipitation



# Results: NLDAS



# Conclusions – temporal aggregation

- Moisture fluxes simulated by the VIC model are sensitive to the time step used, to the assumptions made regarding closure of the surface energy budget, and to the method of temporal and spatial disaggregation of precipitation.
- Simulated canopy evaporation differences are the main reason for the discrepancies between simulated model results.
- Sensitivity analyses performed at sub-daily time steps (3 hours and 1 hour) indicate that temporal disaggregation of precipitation is the most significant factor controlling canopy evaporation at sub-daily time steps.
- Simulation results at different model setups can to a large extent be reconciled by introducing correction factors that adjust the canopy interception capacity and canopy resistance.
- It is possible to calibrate the model in the computationally efficient daily water balance mode and thereafter introduce correction factors to the sub-daily energy balance simulations without having to recalibrate the model.

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