

# Modeling unsteady lumped transport with time-varying transit time distributions



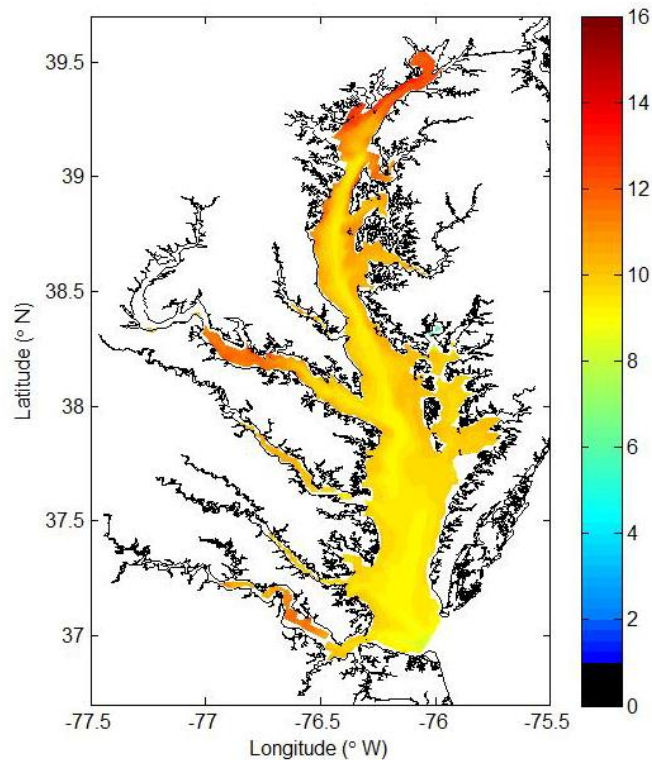
Ciaran Harman

Johns Hopkins University  
Department of Geography and Environmental Engineering

# Two views of transport

## Eulerian

Concentration at fixed points



DO above the bed

Courtesy of Jeremy Testa, UMCES

## Lagrangian

Parcels moving through space

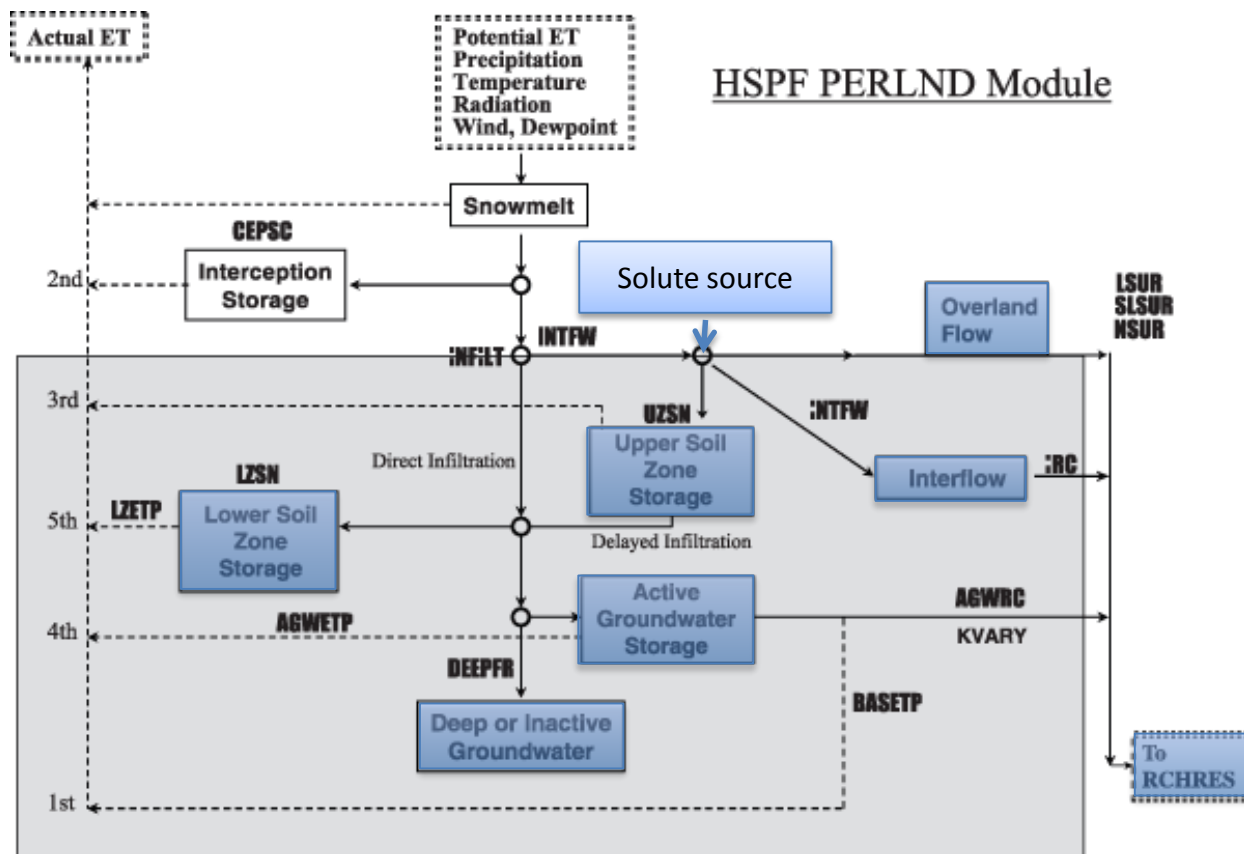


LTRANS Larval transport model (North et al 2006)  
from [www.usglobec.org](http://www.usglobec.org)

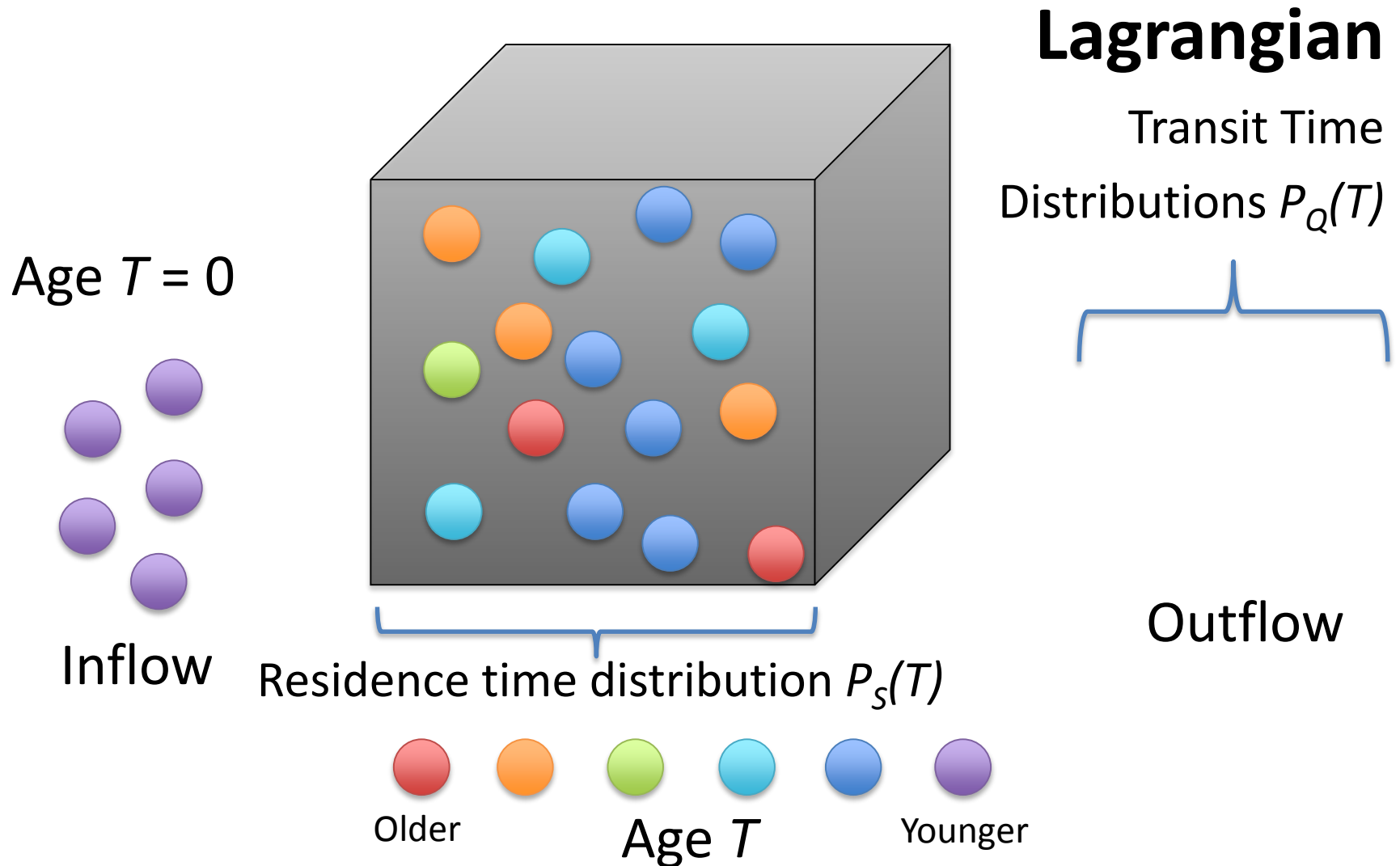
# Spatially aggregated versions

## Eulerian

Mixing box models (built on lumped flow model)

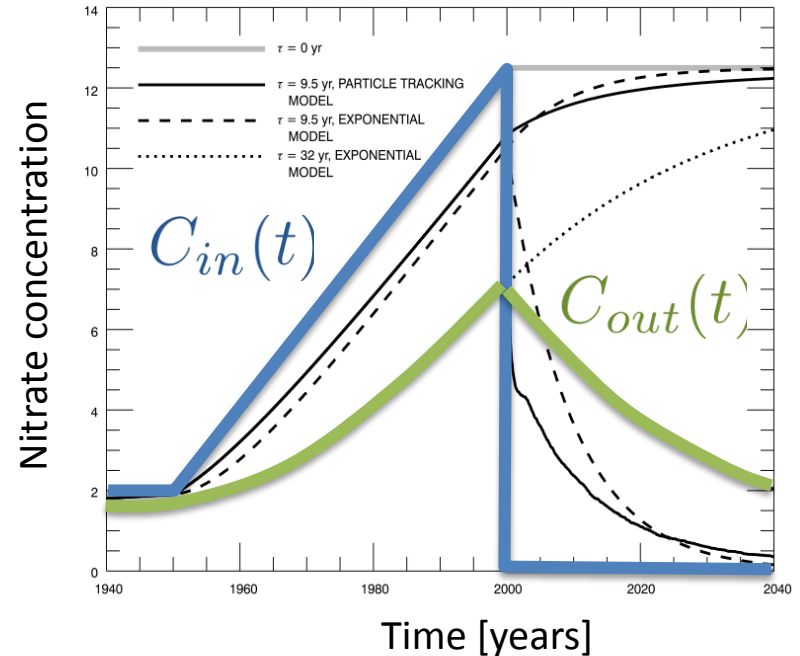
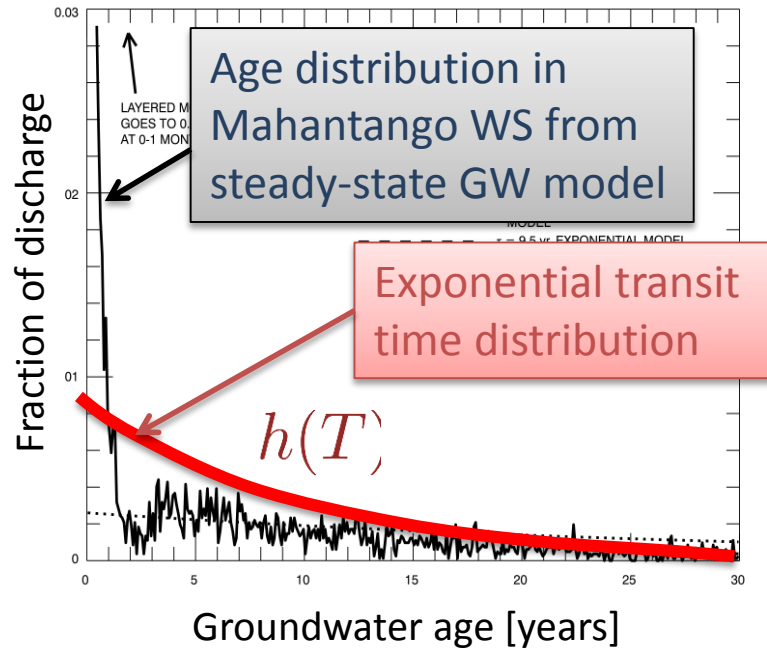


# Spatially aggregated versions



# If Q is steady-state

Lindsey et al (2003)



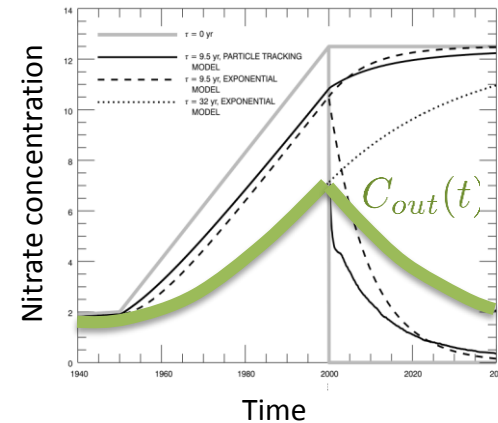
“Convolution”

$$C_{out}(t) = \int_{-\infty}^t C_{in}(\tau) h(t - \tau) d\tau$$

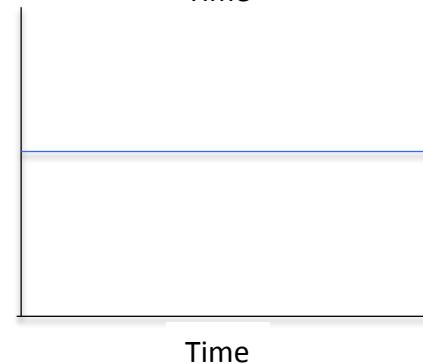
# Advantages of TTD approach

- Few parameters
- Captures 'emergent' effect of heterogeneity
- Can reproduce anomalous phenomena

- ‘Steady-state’ requirement restricts modeling applications
- Non-steady flow *will not conserve mass*



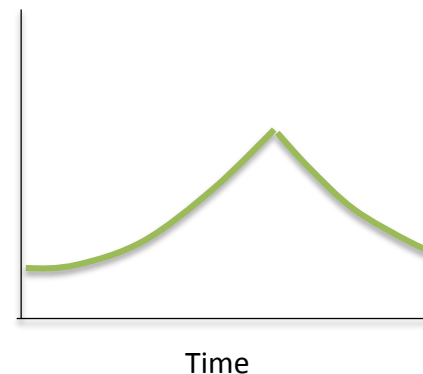
$Q(t)$



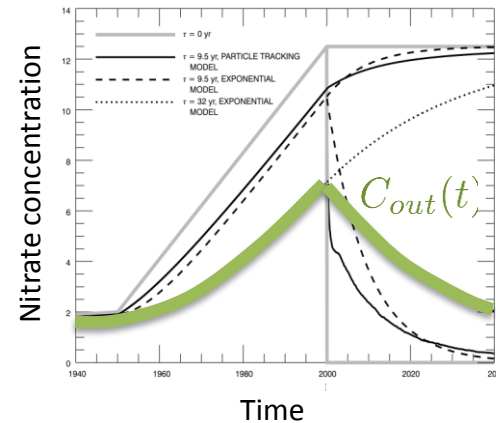
Steady discharge

$$M_{out}(t) = Q(t) \times C_{out}(t)$$

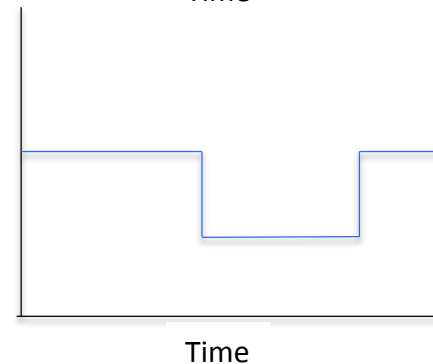
$M_{out}(t)$



- ‘Steady-state’ requirement restricts modeling applications
- Non-steady flow *will not conserve mass*



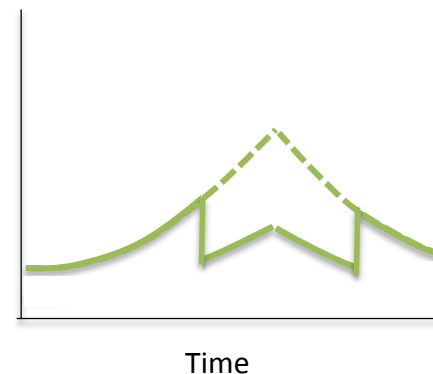
$Q(t)$



Un-steady discharge

$$M_{out}(t) = Q(t) \times C_{out}(t)$$

$M_{out}(t)$



Missing mass!



# Sources of variability in TTD

## *Climate change*

1. Temporal variability of input (Precip & irrigation)
2. Water balance partitioning variability ( $ET$  vs  $Q$ )
3. Hydrologic pathway variability  
(e.g. overland flow under wet conditions)

4. Long term pathway change  
(e.g. urbanization)

## *Land-use change*

# Residence Time Distributions of Variable Flow Processes

ANTTI J. NIEMI

Helsinki University of Technology, Control Engineering Laboratory, Otaniemi, Finland

(Received 19 May 1977)

Tracer response  
presented in terms  
of flow rate.

Several flow  
of the method

Use of the control  
to the control  
control of vari

INTRODUCTION

RADIOACTIVE and chemical

WATER RESOURCES RESEARCH, VOL. 46, W03514, doi:10.1029/2009WR008371, 2010



## Transport in the hydrologic response: Travel time distributions, soil moisture dynamics, and the old water paradox

Gianluca Botter,<sup>1</sup> Enrico Bertuzzo,<sup>2</sup> and Andrea Rinaldo<sup>1,2</sup>

Received 8 July 2009; revised 23 October 2009; accepted 29 October 2009; published 12 March 2010.

[1] We propose a mathematical framework for the general definition and computation of travel time distributions defined by the closure of a catchment control volume, where the input flux is an arbitrary rainfall pattern and the output fluxes are green and blue water flows (namely, evapotranspiration and the hydrologic response embedding runoff production through soil water dynamics). The relevance of the problem is both practical, owing to implications in hydrologic watershed modeling, and conceptual for the linkages and the explanations the theory provides, chiefly concerning the role of geomorphology, climate, soils, and vegetation through soil water dynamics and the treatment of the so-called old water paradox. The work focuses in particular on the origins of the conditional and time-variant nature of travel time distributions and on the differences between unit hydrographs and travel time distributions. Both carrier flow and solute matter transport in the control volume are accounted for coherently. The key effect of mixing processes occurring within runoff production is also investigated, in particular by a model that assumes that mobilization of soil water involves randomly sampled particles from the available storage. Travel time distributions are analytically expressed in terms of the major water fluxes driving soil moisture dynamics, irrespective of the specific model used to

There is now a rigorous and convenient theoretical framework for time-variable TTD

## SAS - StorAge Selection functions

- aSAS - Botter *et al*, (2011)
- fSAS - Van der Velde *et al*, (2012)
- rSAS - Harman (in review)

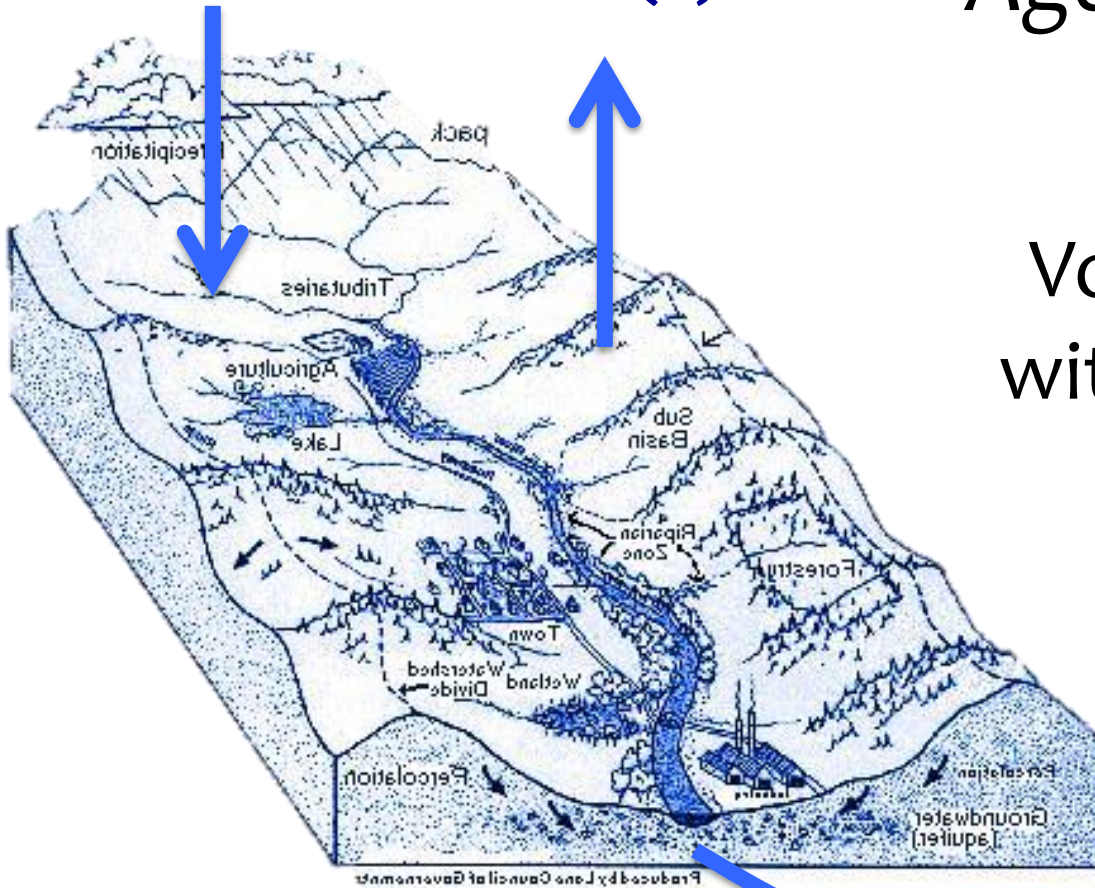
$J(t_i)$

$ET(t)$

Age-ranked storage

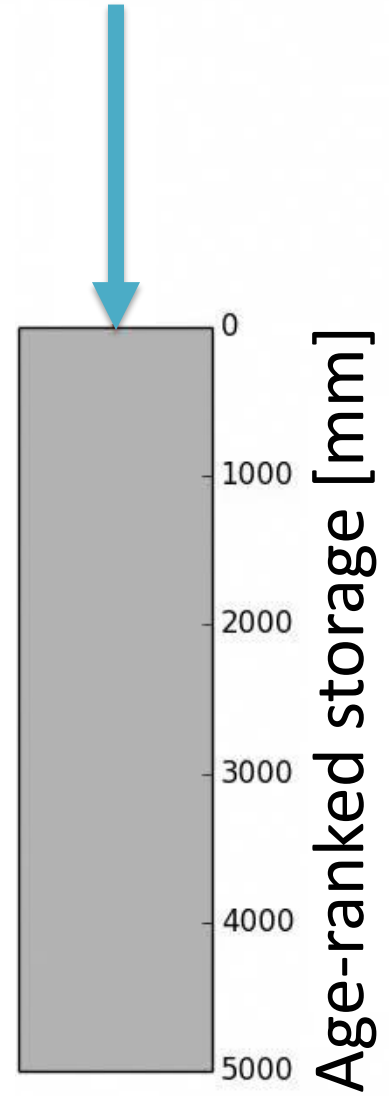
$S_T(T, t)$

Volume in storage  
with age less than  $T$   
at time  $t$



$Q(t)$

Precipitation



# rank StorAge Selection (rSAS)

Conservation law for  $S_T$

$$\frac{\partial S_T}{\partial t} = J(t) - Q(t) \bar{P}_Q(T|t) - ET(t) \bar{P}_{ET}(T|t) - \frac{\partial S_T}{\partial T}$$

Hydrologic timeseries  
Closure relations

Discharge TTD

ET TTD

$$\bar{p}_Q(T, t) = \frac{\partial S_T}{\partial T} \omega_Q(S_T, t)$$

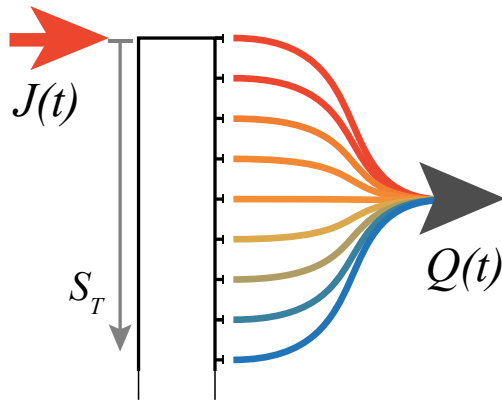
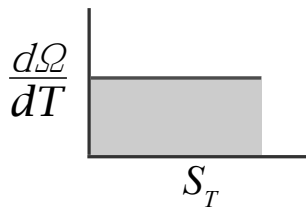
$$\bar{p}_{ET}(T, t) = \frac{\partial S_T}{\partial T} \omega_{ET}(S_T, t)$$

Discharge rSAS function

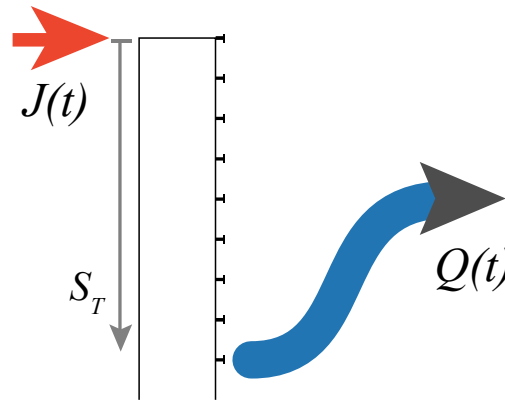
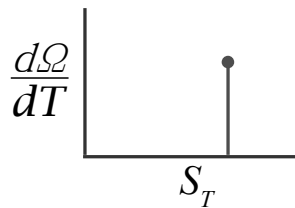
ET rSAS function

# Shape of the rSAS function determines transport

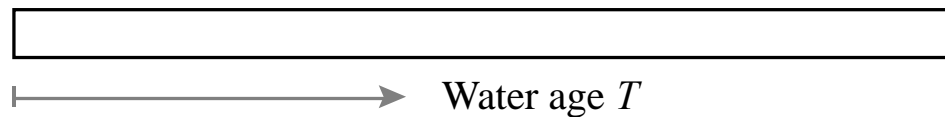
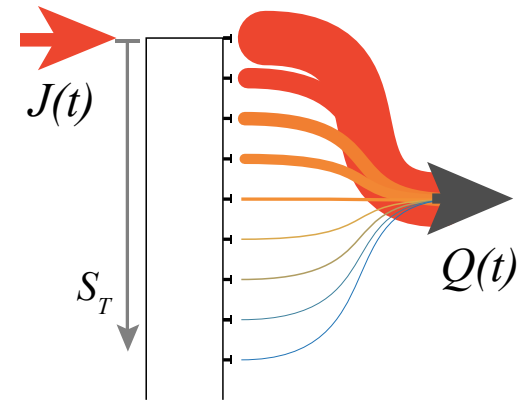
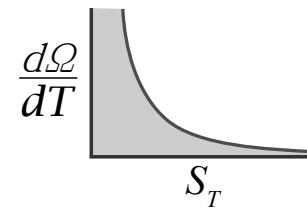
A - Uniform



B - Dirac delta



C - Gamma





# Application to Lower Hafren stream

*Long-term precip + stream chloride*

~27 years weekly

~3 years daily samples



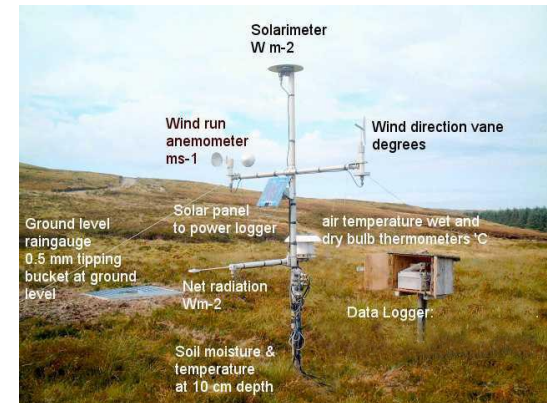
## Lower Hafren stream

~3.67 km<sup>2</sup>

48% forest (mainly lower part)

68% peatland (mostly uplands)

Faulted mudstones and slate



Thanks to Jim Kirchner for  
gap-filled hydroclimatic data





Extraordinary public dataset of stream and precip chemistry:  
Long-term (20+ years of weekly samples)  
and high frequency (3 years of daily, 2 years of 7-hourly)

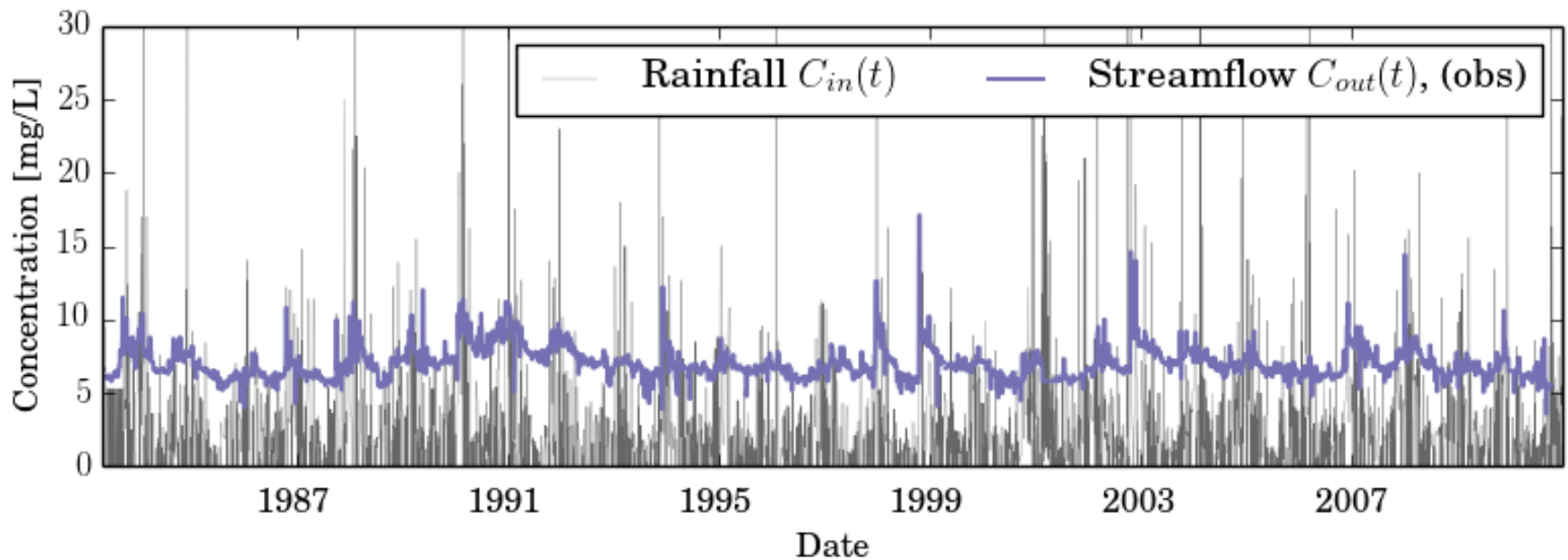
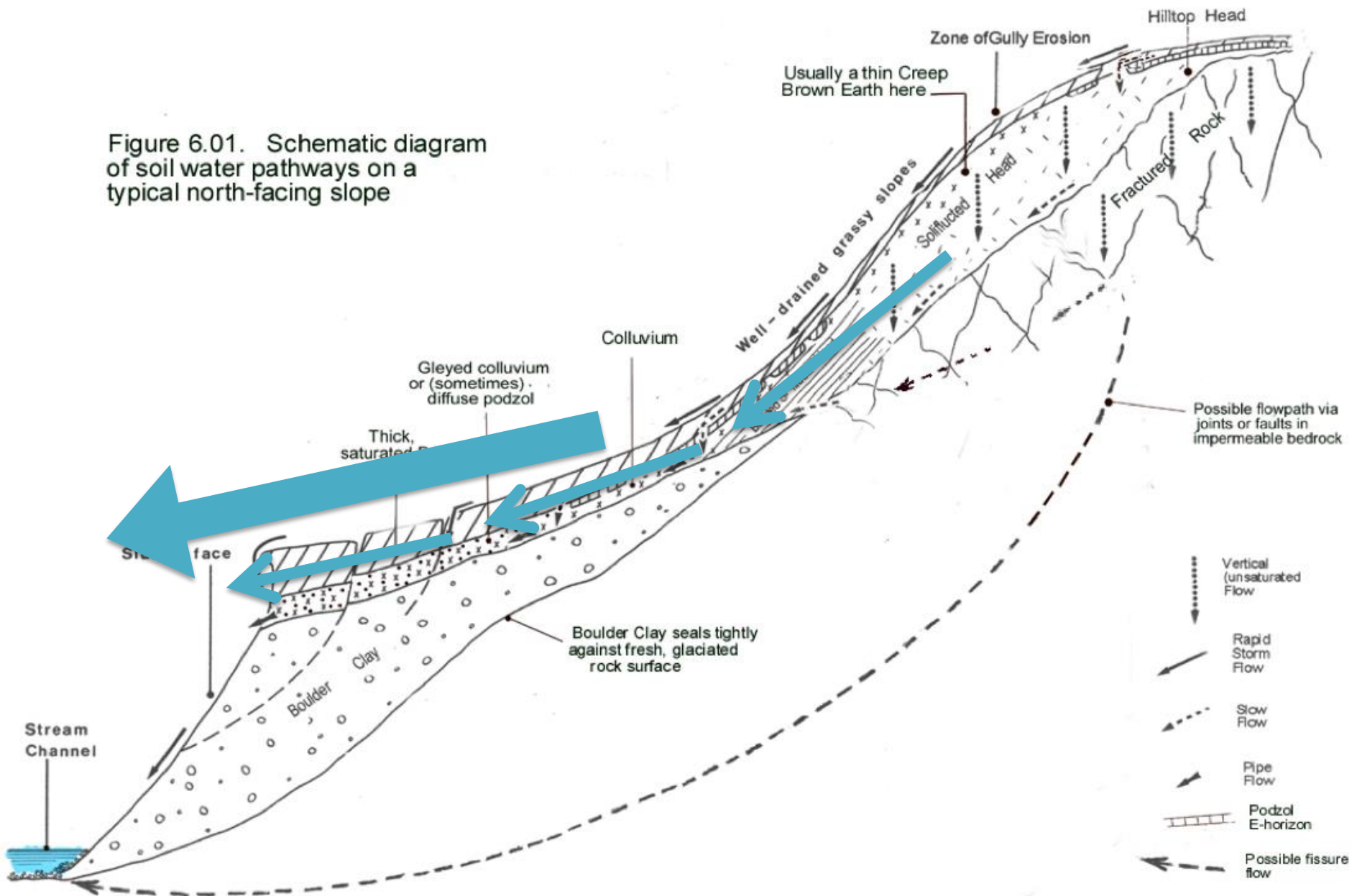


Figure 6.01. Schematic diagram of soil water pathways on a typical north-facing slope



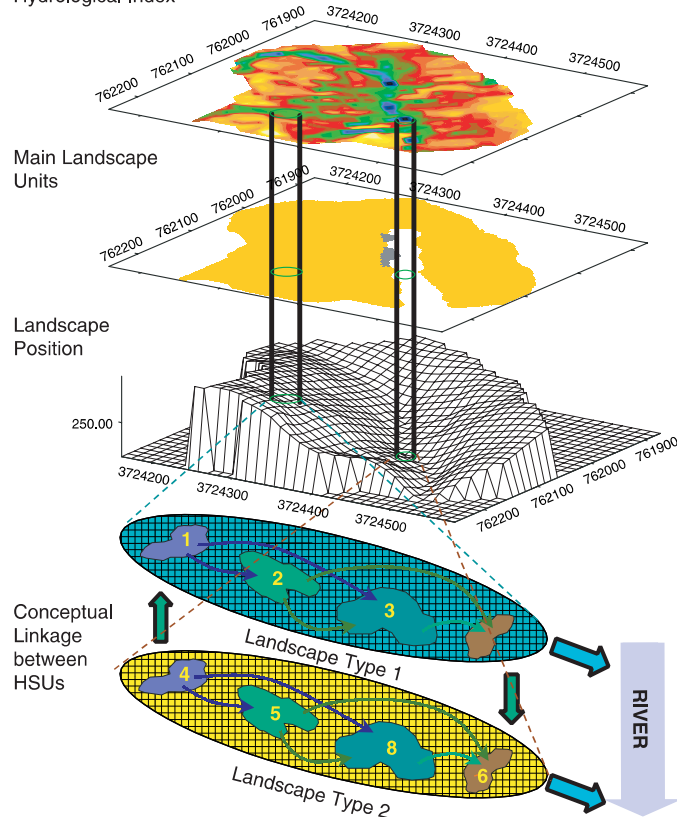
Bell (2005)

# Previous modeling by Page et al (2007)

Dynamic TOPMODEL

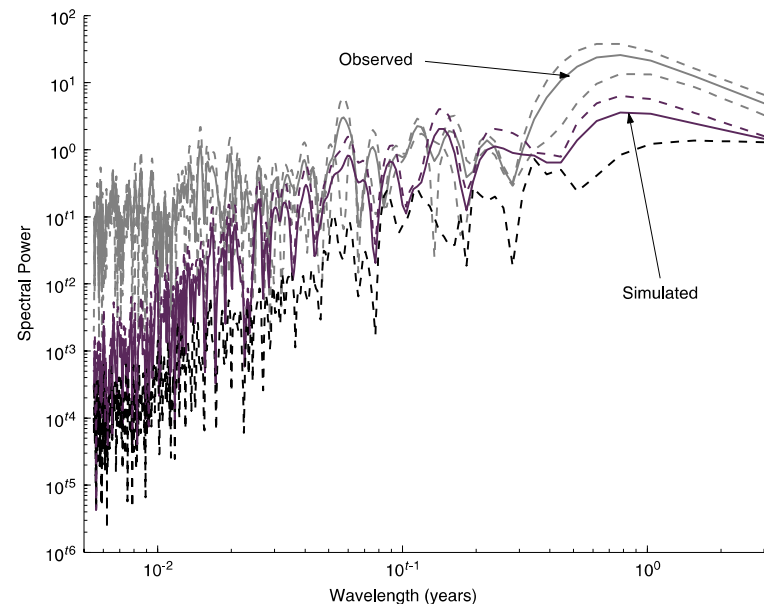
18+ calibrated parameters

Hydrological Index



“Behavioral” NSE > **0.15**

703 of 60,000 *parameter sets*

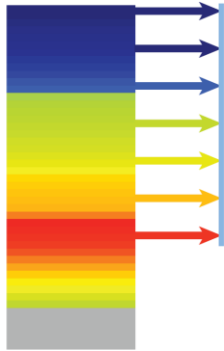


Could not capture  
spectral structure

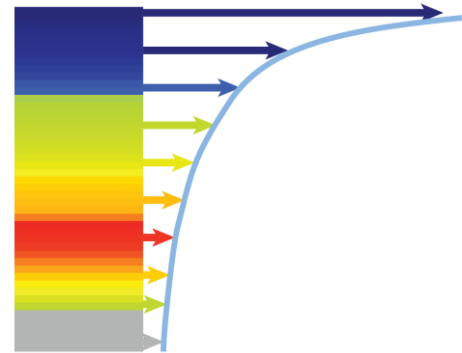
# Application of the Omega function

- Watershed modeled as a single control volume
- No hydrologic model
- Assumed functional forms for  $\Omega_Q$  &  $\Omega_{ET}$  PDFs
- Parameters fit by minimizing RMSE of predicted stream  $[Cl^-]$

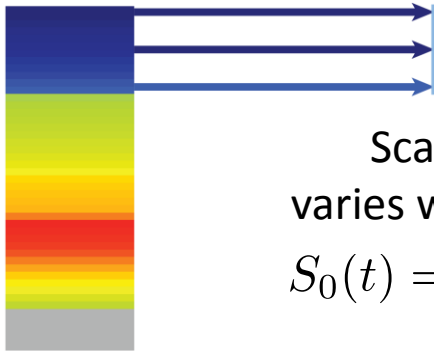
# rSAS function parameterization



Fixed uniform

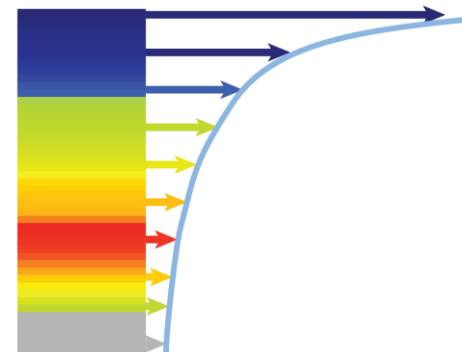


Fixed gamma

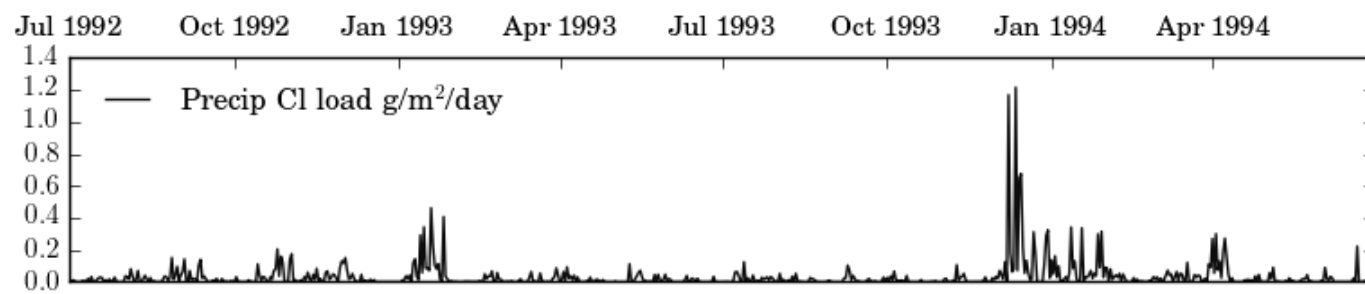


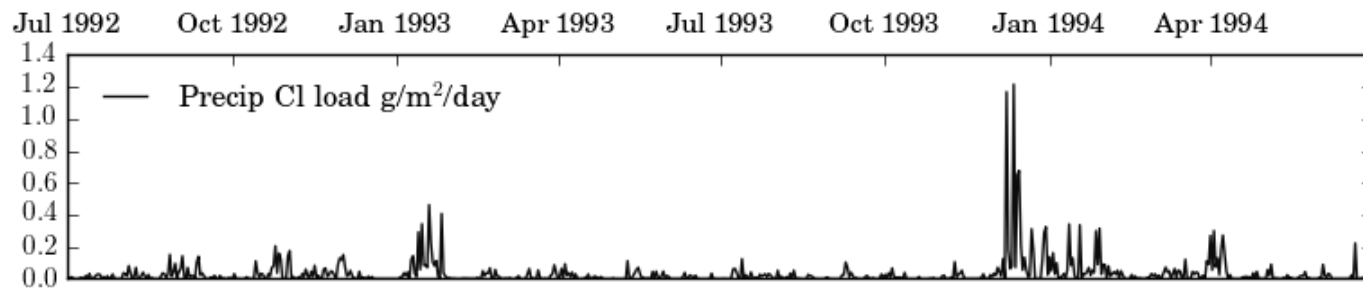
Storage-dependent uniform

Scale parameter  $S_0$   
varies with relative storage  
$$S_0(t) = \lambda (\Delta S(t) - \Delta S_c)$$

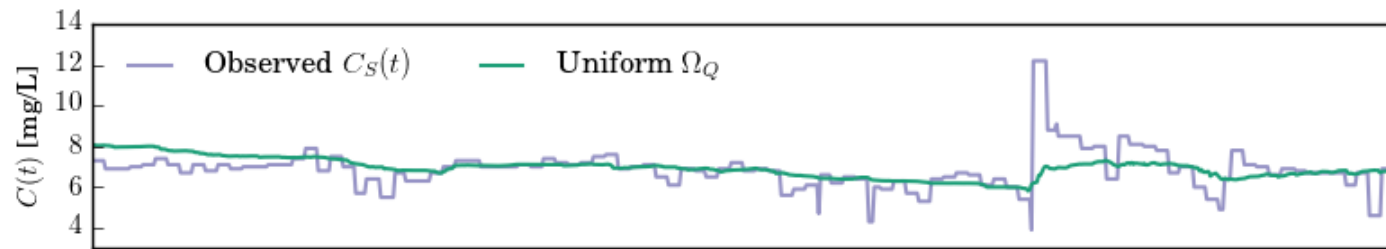


Storage-dependent gamma



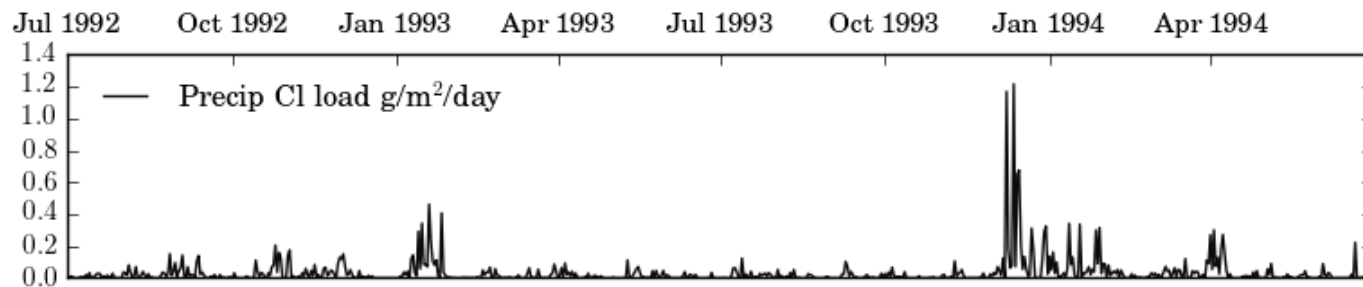


Discharge rSAS  
functional form

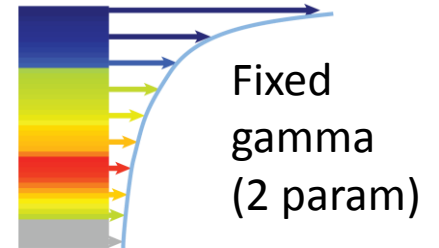
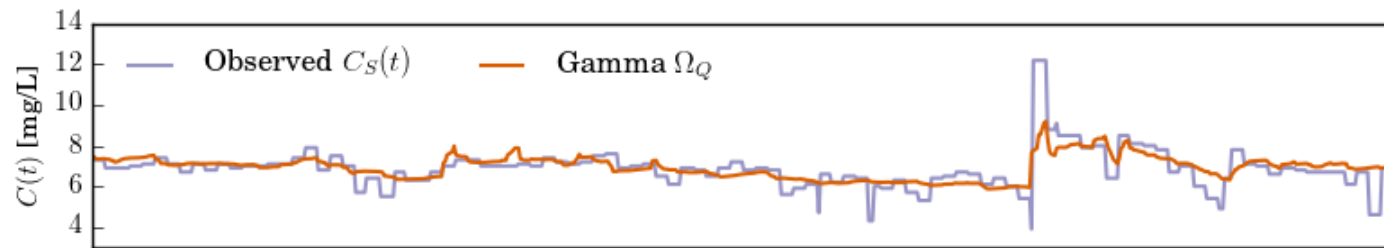
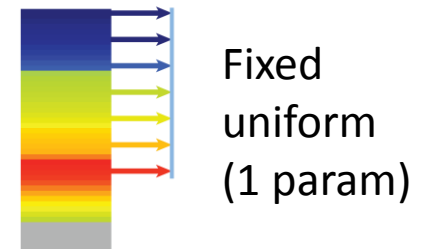
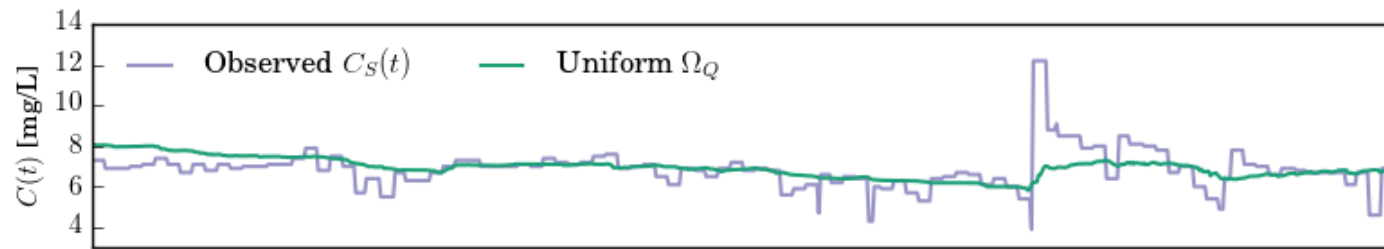


Fixed  
uniform  
(1 param)

Nash-Sutcliffe Efficiency = **0.35** calibration **0.13** validation

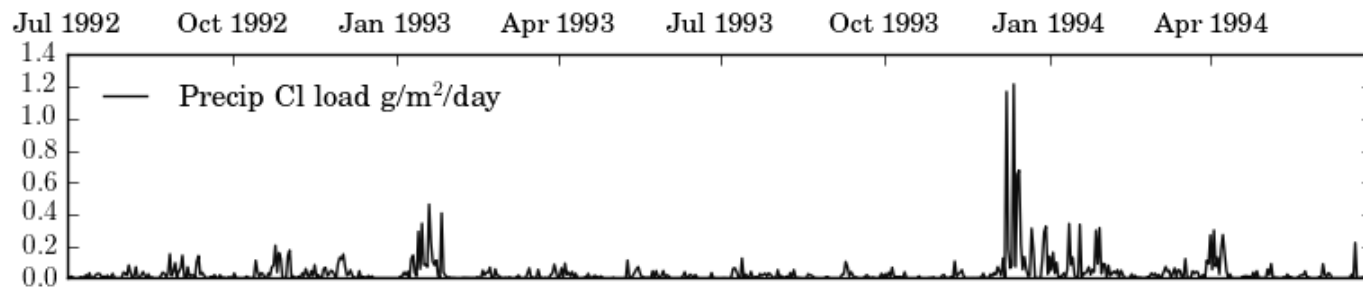


Discharge rSAS  
functional form

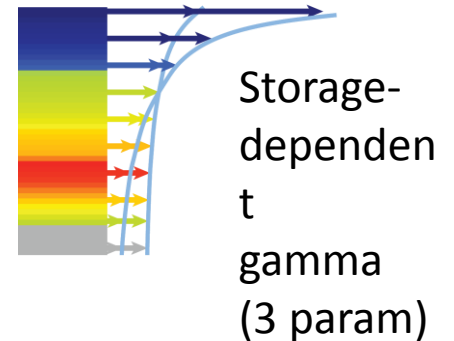
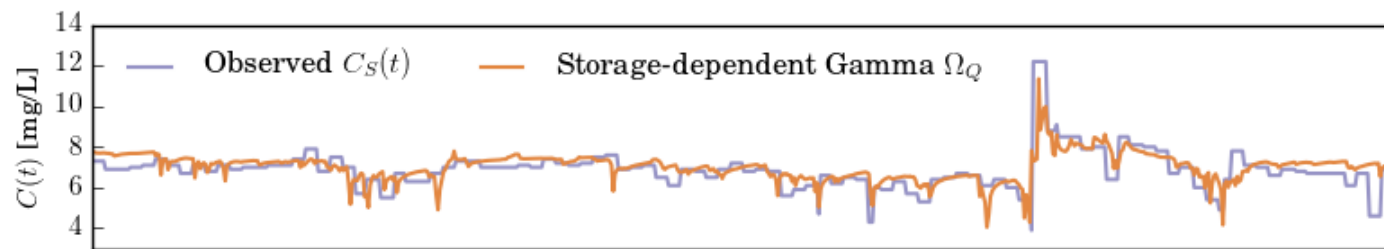
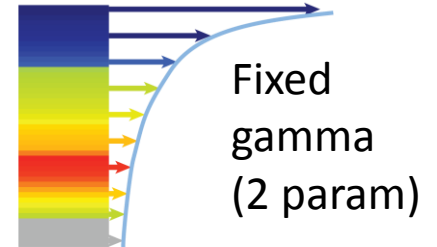
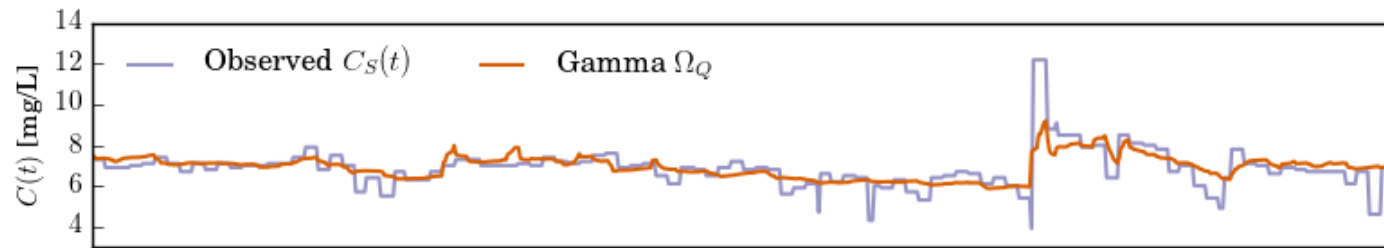
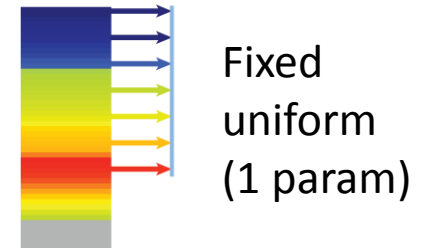
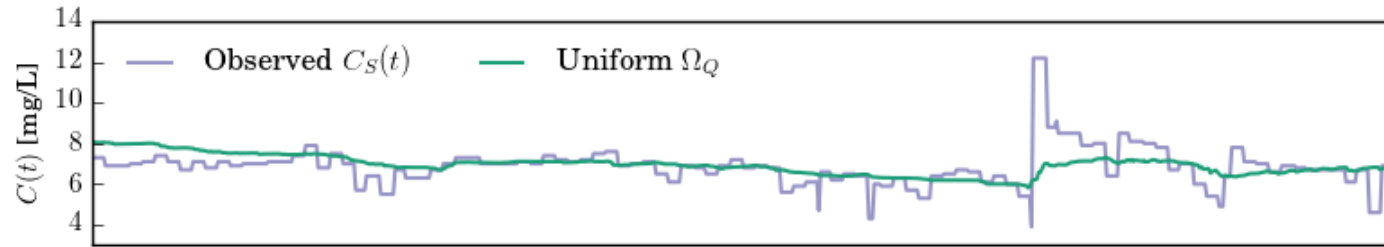


Nash-Sutcliffe Efficiency =      **0.54** calibration      **0.48** validation





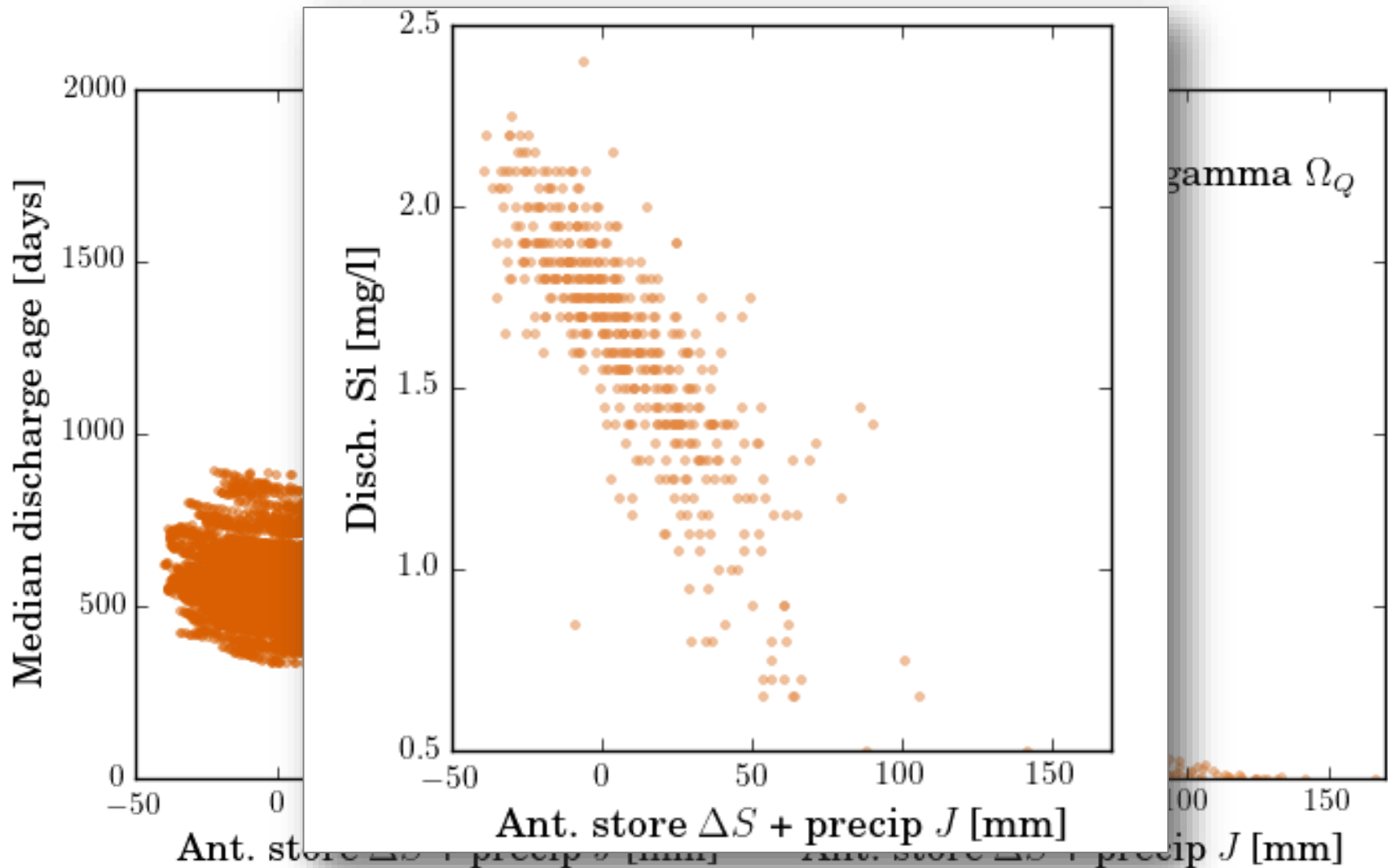
Discharge rSAS  
functional form



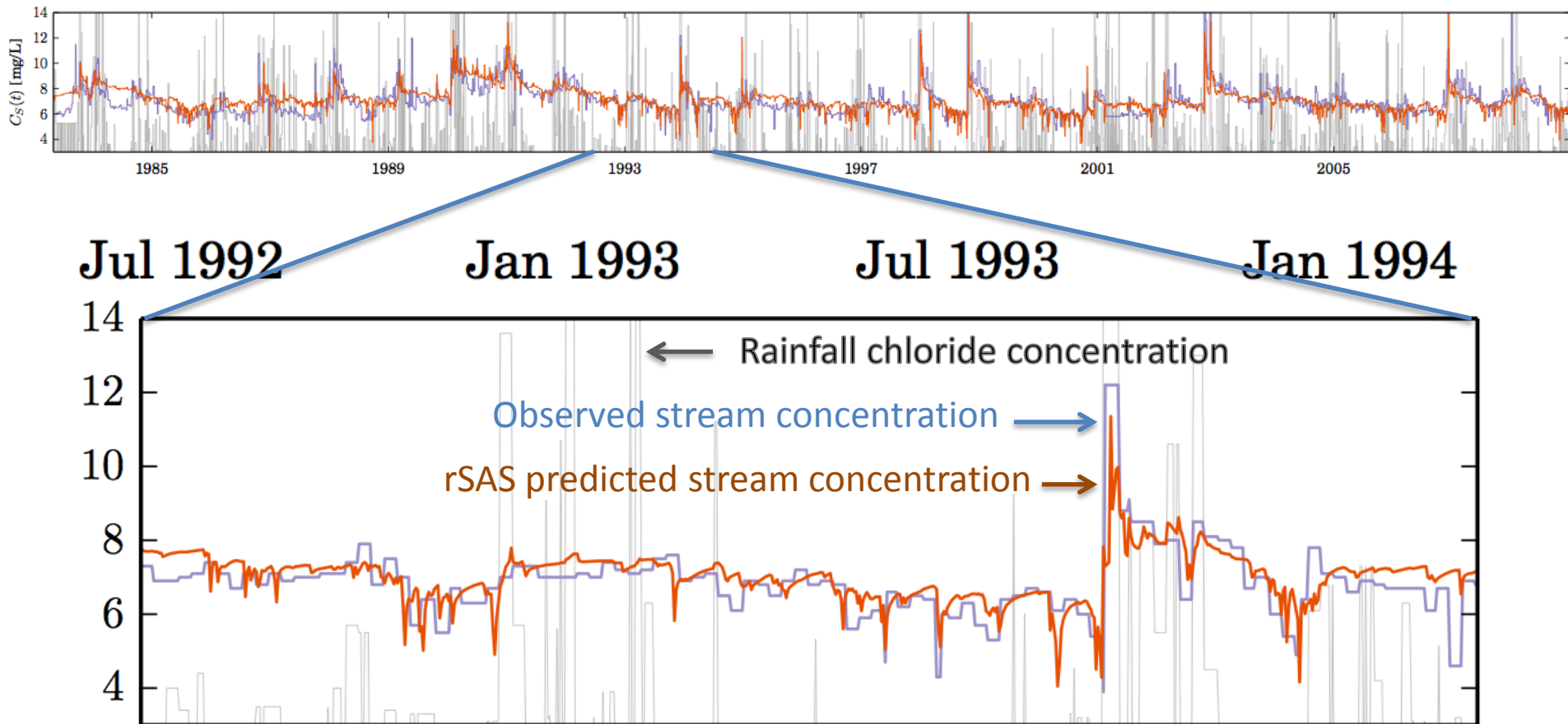
Nash-Sutcliffe Efficiency =      **0.66** calibration      **0.53** validation

Remember: 1 control volume, no hydrologic model

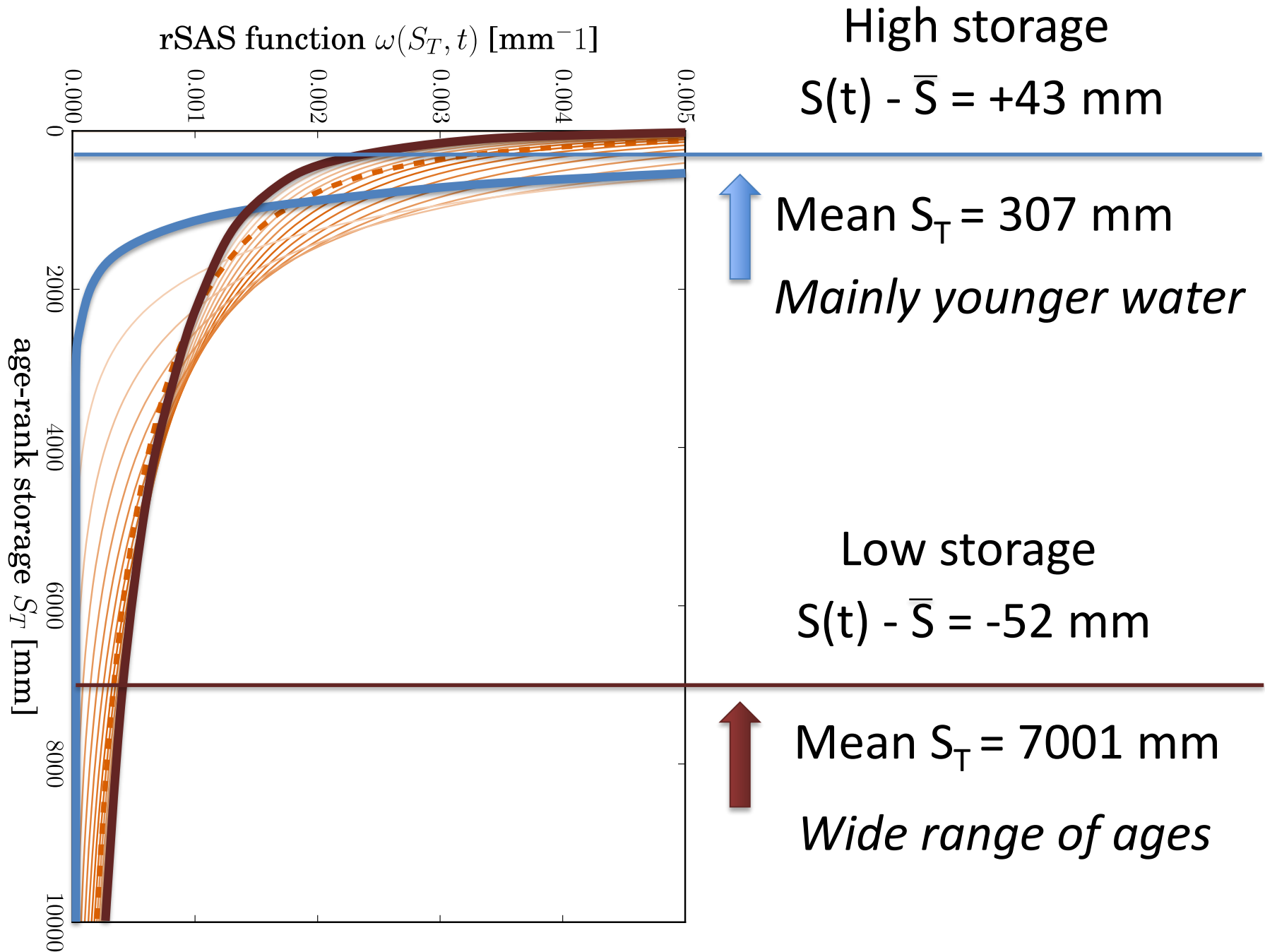
# The difference between fixed and storage-dependent: age variability



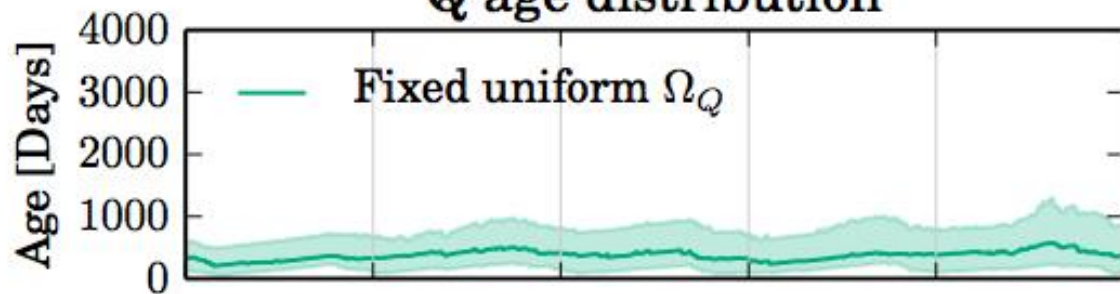
# 1 control volume, no hydrologic model



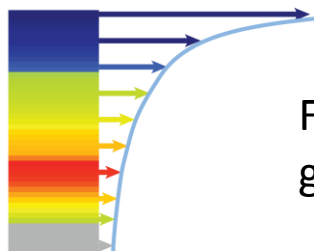
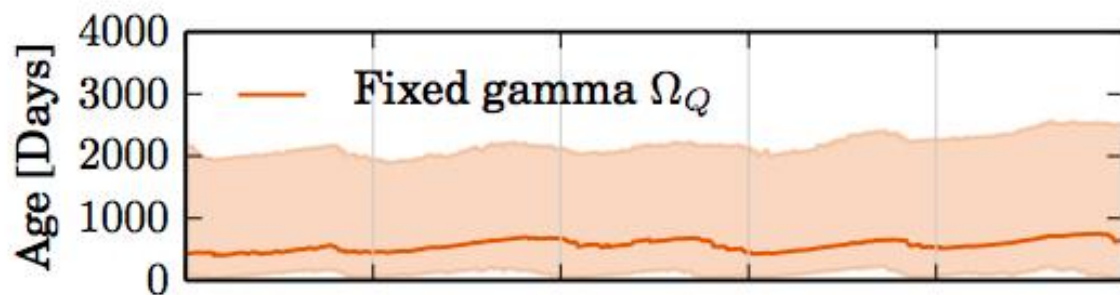
Calibration period (10 years) RMSE = 0.74 mg/L  
Validation period (10 years) RMSE = 0.77 mg/L



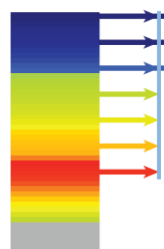
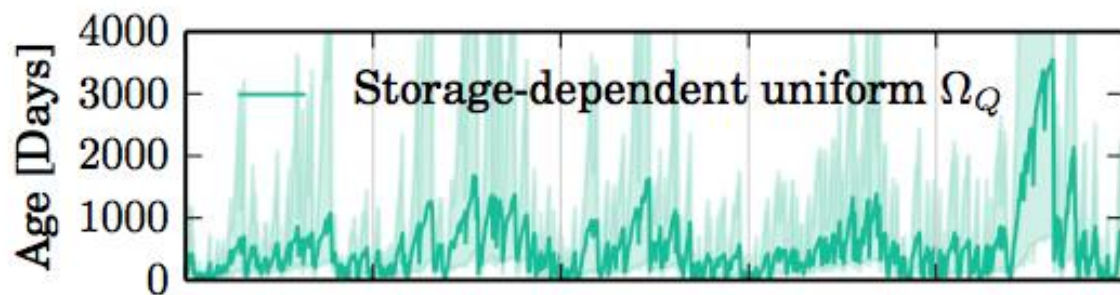
## Q age distribution



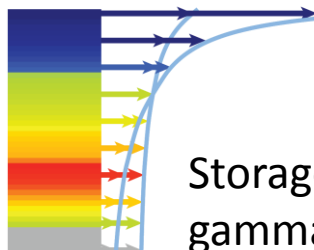
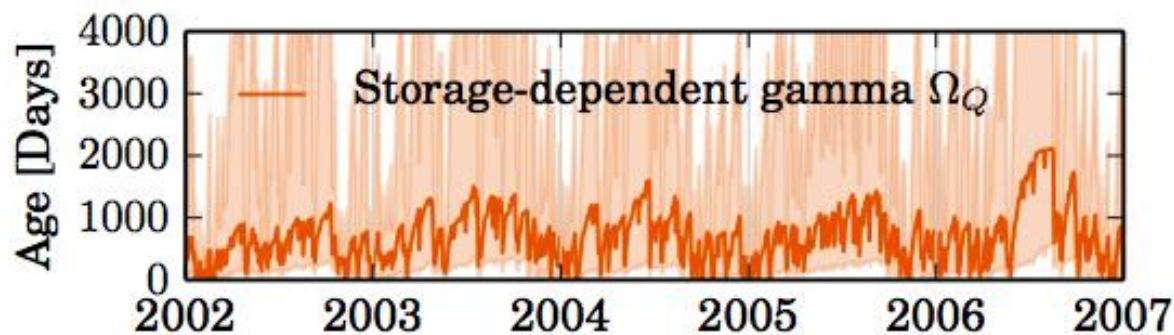
Fixed  
uniform



Fixed  
gamma

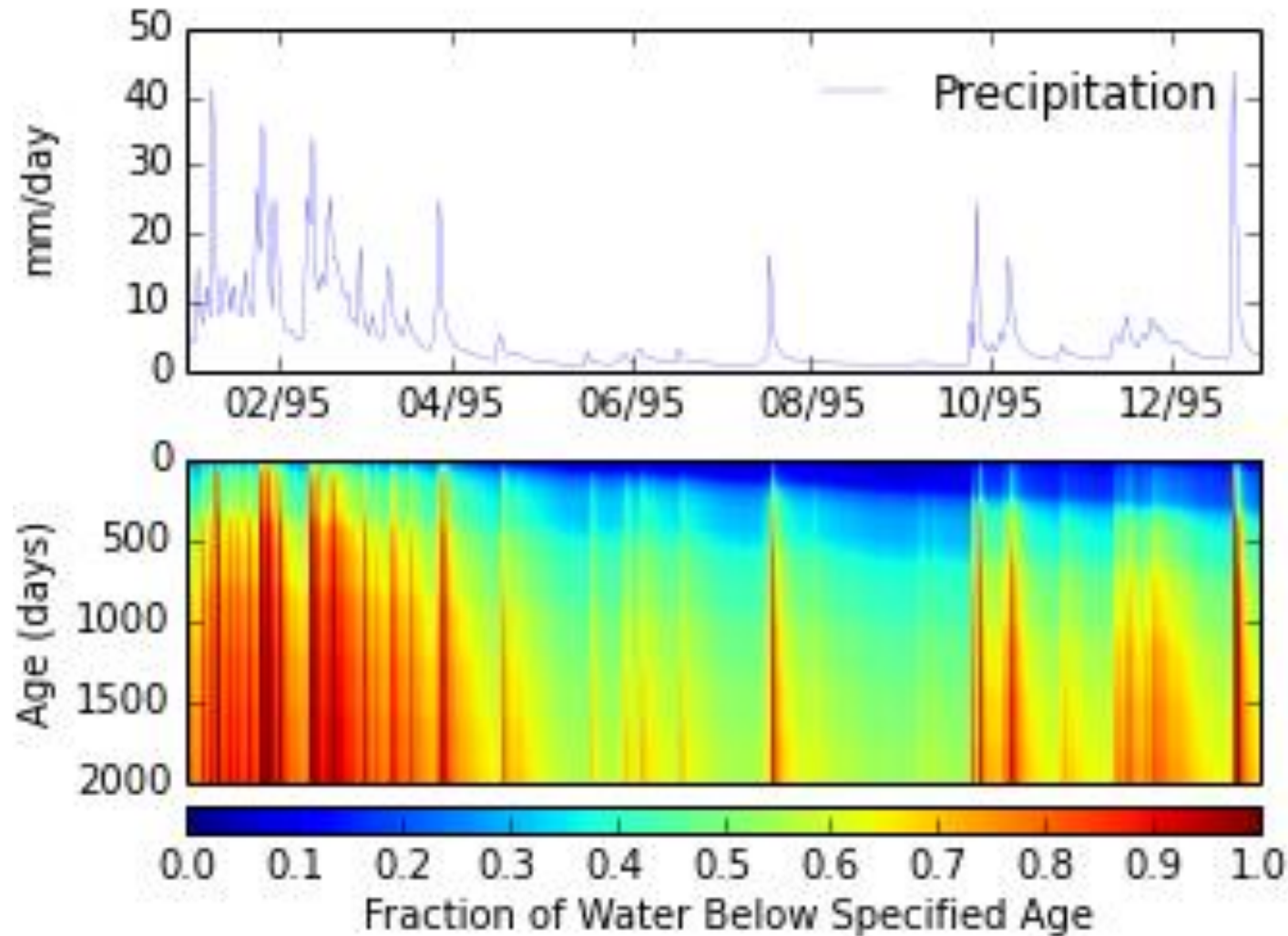


Storage-dependent  
uniform

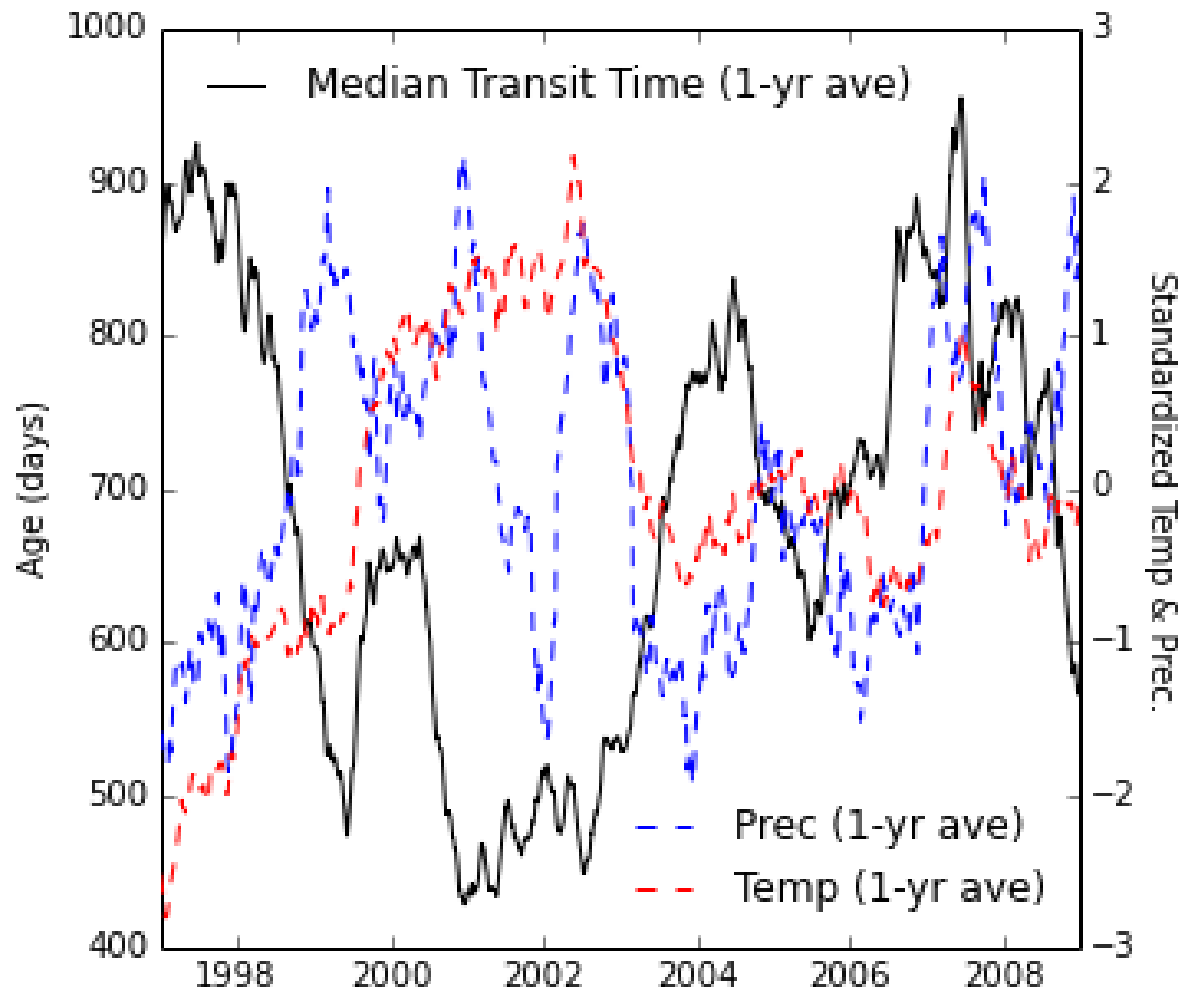


Storage-dependent  
gamma

# Event-scale climate sensitivity



# Inter-annual climate sensitivity



## Water, Sustainability and Climate (Cat III)

### *Impacts of climate change on the phenology of linked agriculture-water systems*

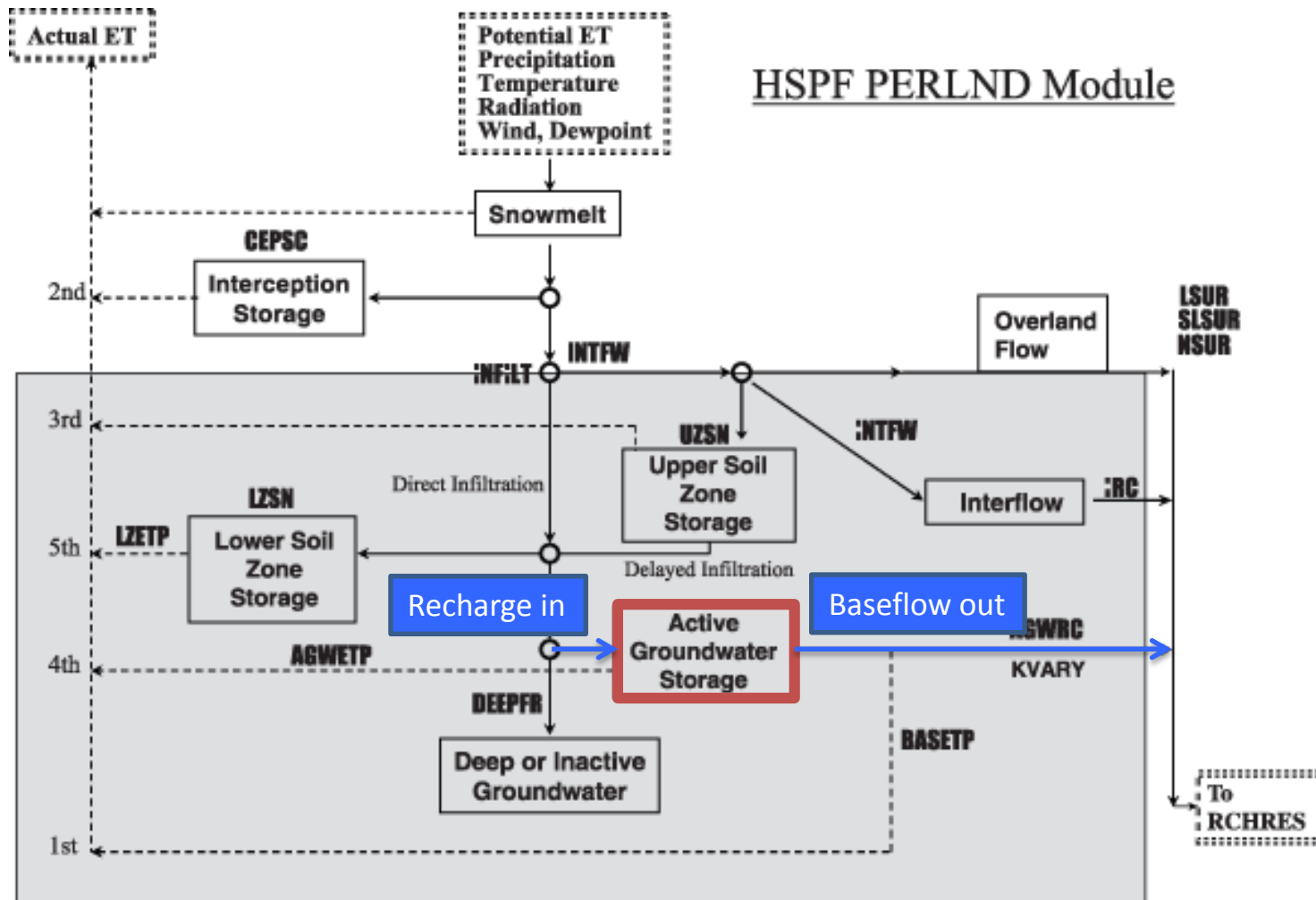
Johns Hopkins, UMCES, U Maine, Cornell, Virginia Tech

- Partnerships with EPA, USGS, USDA, Penn State
- Kickoff meeting this month at the CBPO, Annapolis





# Possible rSAS implementation in CBP Watershed Model



# “First-cut” parameterization linked to USGS groundwater modeling?

Recharge rate  $R$

Modflow/Modpath

Land-water segment TTD for  
ages  $T > 1$  year

Equivalent rSAS for  
 $S_T > 1$  year of recharge

1-parameter calibration  
for shorter  $S_T$

Regionalization at  
physiographic province level



# Thanks!



- Co-PIs - Peter Troch (EAR), Bill Ball (WSC)
- Luke Pangle, Dano Wilusz, Qian Zhang, Shane Putnam, Ashley Ball, Minseok Kim, Holly Guest, Yifan Zhou
- National Science Foundation
  - EAR-1344664, EAR-1417175, CBET-1360415
- CUAHSI Pathfinder Fellowship



Harman, C. J. (2014), Time-variable transit time distributions and transport: theory and application to storage-dependent transport of chloride in a watershed, *Water Resour. Res.*, *in press*. DOI: 10.1002/2014WR015707