

# INTEGRATED SWAT+ SOFT-CALIBRATION PROCEDURE FOR WATER BALANCE AND CROP YIELDS

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# BACKGROUND



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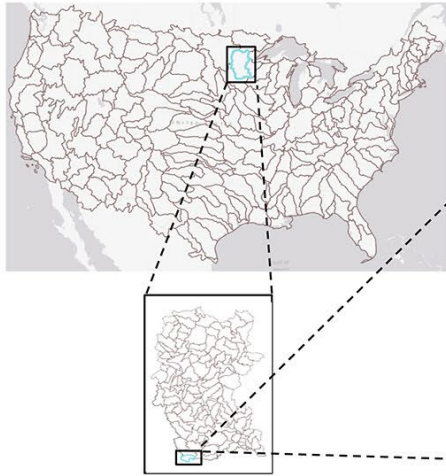
# THE CHALLENGE

National Agroecosystems Model

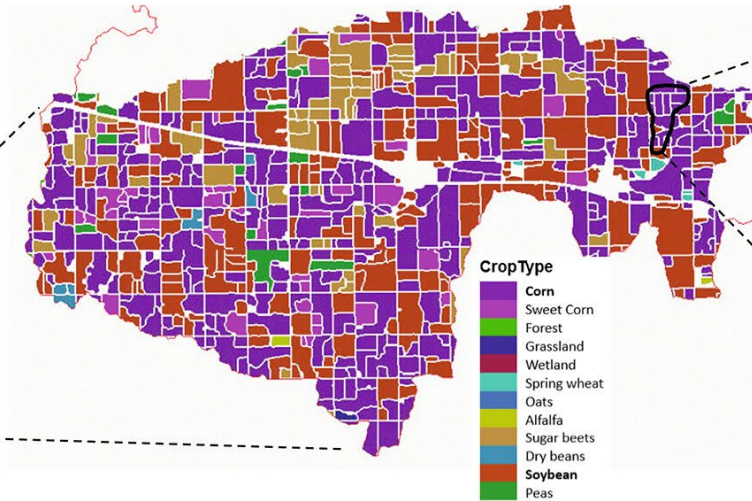


# DEVELOPMENT OF A FIELD SCALE SWAT+ MODELING FRAMEWORK FOR THE CONTIGUOUS U.S.

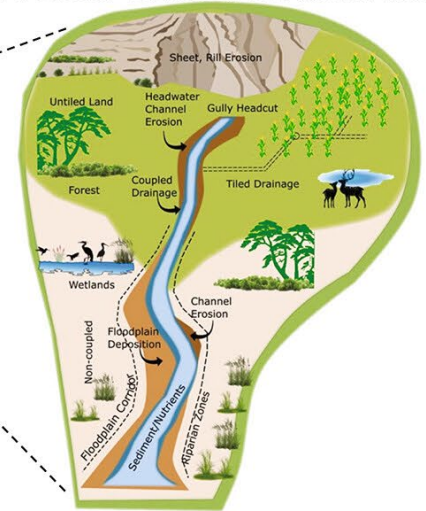
## National Extent



## Field Based Computational Units



## Process Based Simulation



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# HOW TO CALIBRATE SUCH FRAMEWORKS?

Soft-calibration

**DEFINE PROCESSES**  
Describe the governing processes



**CAN BE REPRODUCIBLE**  
Applicable in almost every situation



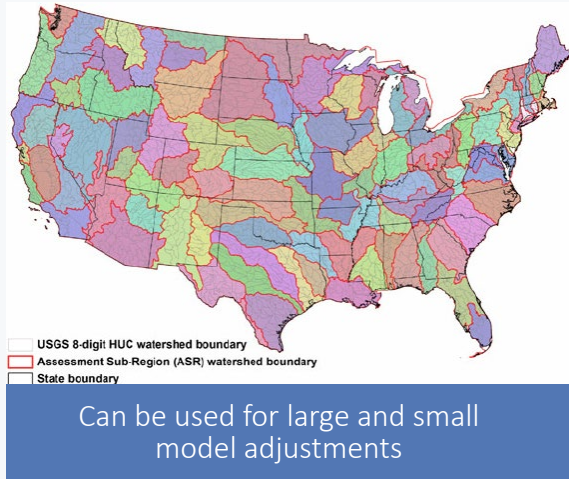
**KEEP IT SIMPLE**  
Only a few parameters, one at a time approach



**CAN BE ANALYZED**  
Analysis of the result is fast and straightforward



# WHAT IS SOFT CALIBRATION IN SWAT+?



## GROUND RULES

An algorithm that is hard-coded into SWAT+. Can be activated via input files.

Can be useful if the model is verified: all processes are working as they should be; all plants are growing as they should be; all stresses are accounted for.

Works on processes.

Uses soft data as inputs:



Average annual values



Average basin values



Average aggregated values

# CURRENTLY AVAILABLE SOFT-CAL OPTIONS IN SWAT+

More are in future development

## WATER BALANCE SOFT-CAL (WB)

✓ Inputs are:



**Water Yield Ratio (WYR) =**

*total water yield (surface + lateral + tile + perc) / precipitation*

**Baseflow Ratio (BFR) =**

*total baseflow (lateral + tile + perc) / total water yield*

✓ The processes which are calibrated:  
surface runoff, lateral flow, percolation, ET.

## CROP YIELD SOFT-CAL (YLD)

✓ Inputs are:

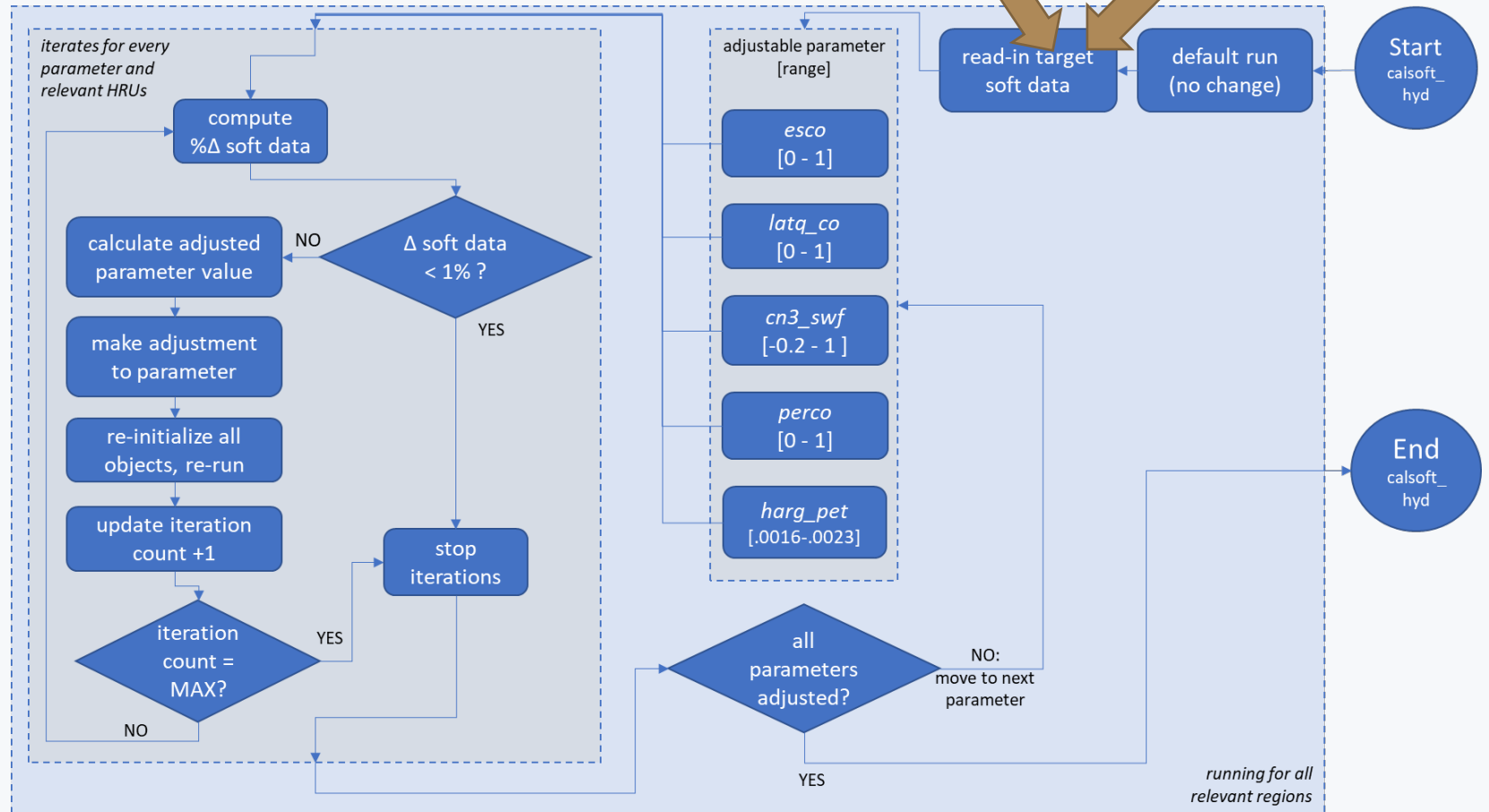
Average annual yield for each crop (t/ha)

✓ The processes which are calibrated:

- aeration stress (no tile)
- LAI development,
- reduction of harvest due to unfavorable conditions,
- plant water uptake.



# WATER YIELD SOFT-CAL PROCEDURE





# WATER BALANCE ADJUSTMENT

Computation steps

## ONE VARIABLE AT A TIME:

- 1) esco
- 2) petco
- 3) cn3\_swf
- 4) latq\_co
- 5) perco
- 6) cn3\_swf

... calibrated again to ensure surface runoff is accurate

Initial change in each variable is a function of the difference (mm) in the soft ratio multiplied by precipitation minus the modeled process output.

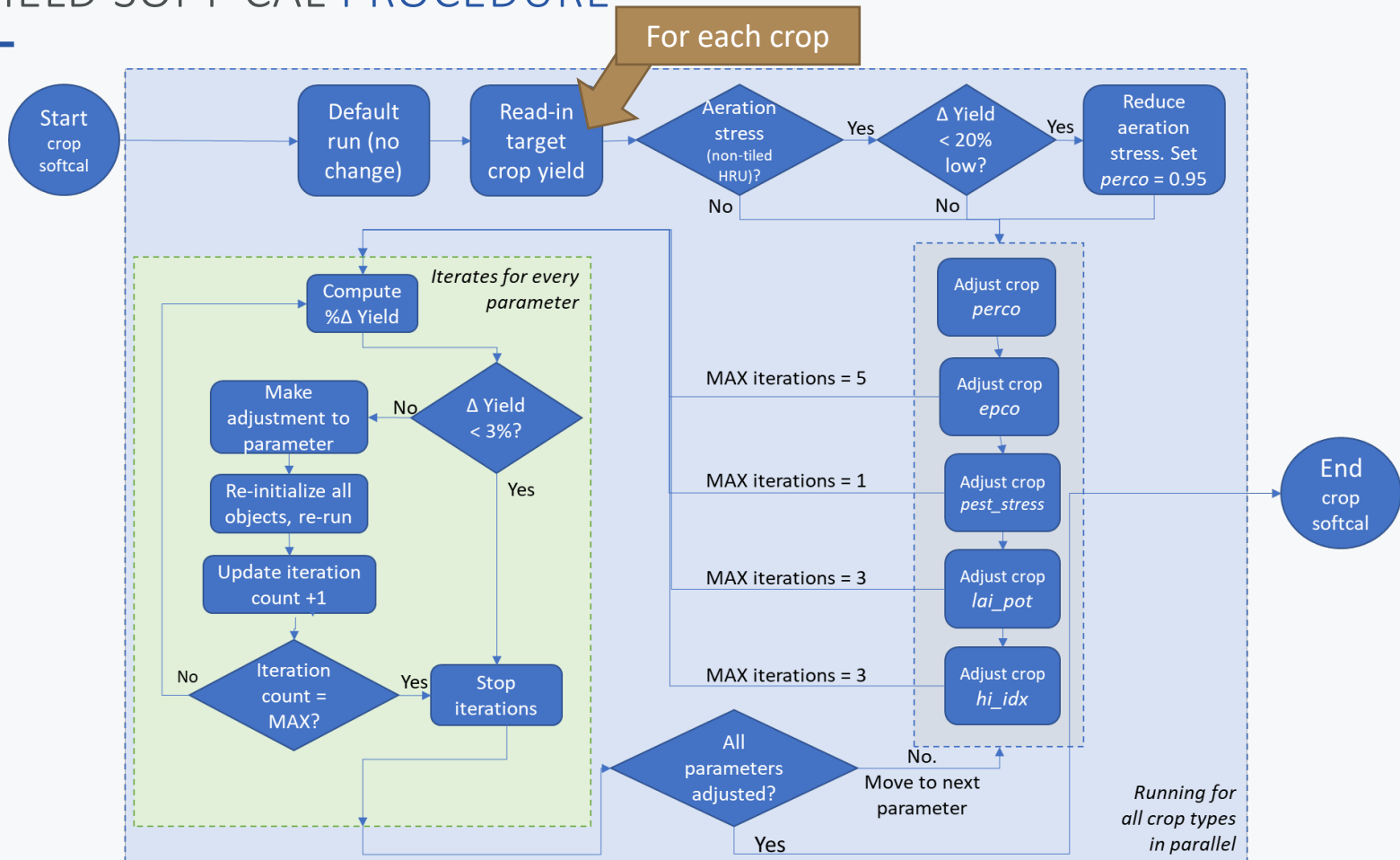
## EXAMPLE:

- The user input 0.2 surface runoff ratio;
- Simulated precipitation = 800 mm;
- Surface runoff = 120 mm.
- Initial difference =  $0.2 * 800 - 120 = 40$  mm.  $[(SURQ_{soft} - SURQ_{sim})]$

... the next value of cn3\_swf used in the calibration would be set to  $(cn3\_swf - 0.4) [- (SURQ_{soft} - SURQ_{sim}) / 100]$

Variable	Initial change (guess)
esco	$(ET_{soft} - ET_{sim}) / 500.$
petco	$(ET_{soft} - ET_{sim}) / ET_{soft}$
cn3_swf	$-(SURQ_{soft} - SURQ_{sim}) / 100.$
latq_co	$(LATQ_{soft} - LATQ_{sim}) / 400.$
perco	$(PERC_{soft} - PERC_{sim}) / 1000.$

# CROP YIELD SOFT-CAL PROCEDURE



# CROP YIELD ADJUSTMENT

Computation steps

## ONE VARIABLE AT A TIME:

- 1) perco\* → if needed
- 2) epco
- 3) pest\_stress
- 4) lai\_pot
- 5) hi\_pot

The initial change applied to each parameter is a function of the percent difference between the simulated and observed yields.

Variable	Initial change	Number of linear interpolations
epco	if ( $\text{diff}_{\text{pct}} \geq 10\%$ ) $\text{chg\_init} = -0.01 * \text{diff}_{\text{pct}} + 0.06$ if ( $\text{diff}_{\text{pct}} < 10\%$ ) $\text{chg\_init} = 1.0$	4
pest_stress	$\text{diff}_{\text{pct}}$	0
lai_pot	$0.5 * \text{diff}_{\text{pct}}$	2
hi_pot	$0.005 * \text{diff}_{\text{pct}}$	2

After the initial change, the algorithm uses linear interpolation in subsequent iterations



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## CALIBRATION SEQUENCE

Which one to do first?

We suggest

- 1 – Water Balance
- 2 – Crop Yield

One will need:

- water\_balance.sft
- wb\_parms.sft
- codes.sft
- plant\_parms.sft
- plant\_gro.sft

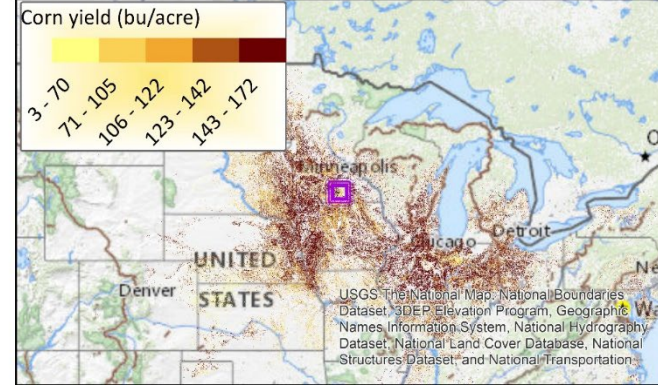
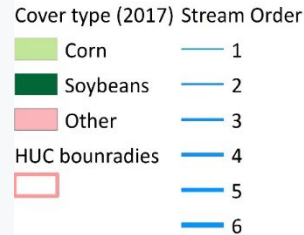
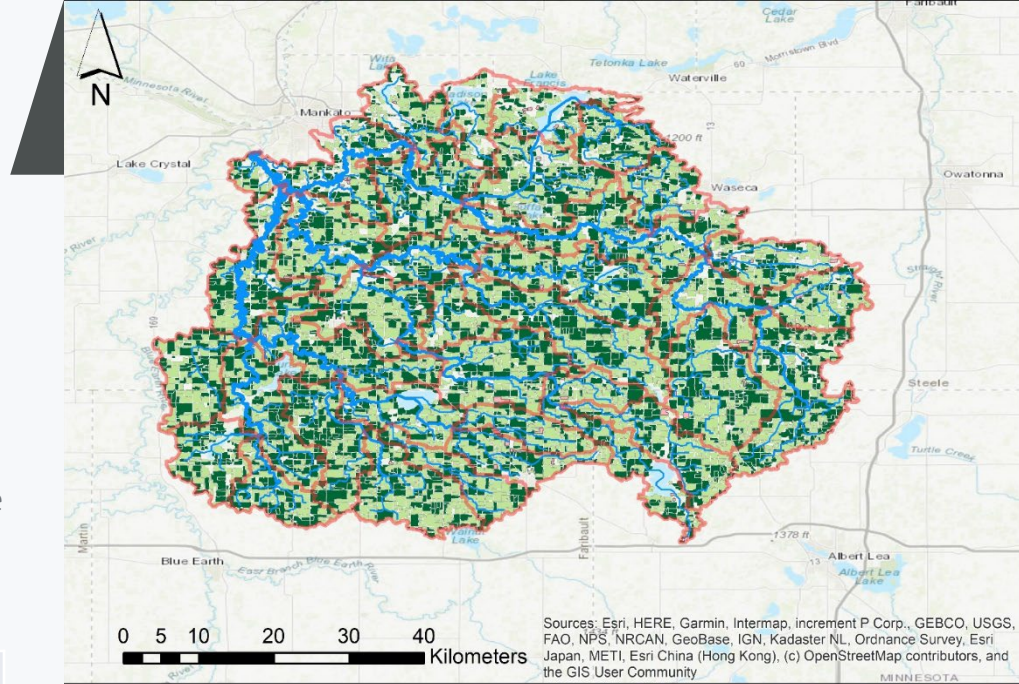


# EXAMPLE WATERSHED

Le Sueur watershed

- Major watershed of the Minnesota River Basin.
- 2850 km<sup>2</sup>
- Average annual mean flow ~ 21 m<sup>3</sup>/s
- 87% - Agriculture → Corn-Soybean rotation
- Soils are poorly drained – most agriculture (~92%) is tile-drained.

	Water Yield Ratio (WYR)	Baseflow Ratio (BFR)
Target	0.329	0.557



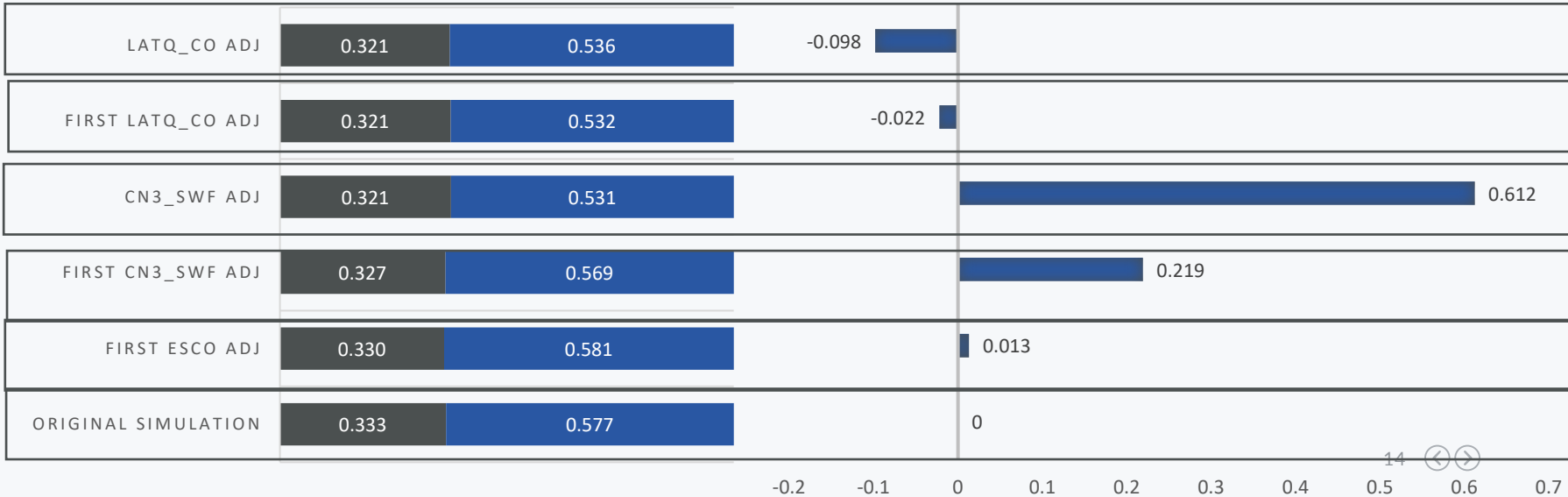
# SOFT-CAL PARAMETER ADJUSTMENTS

Steps

## SOFT-CAL ITERATIONS

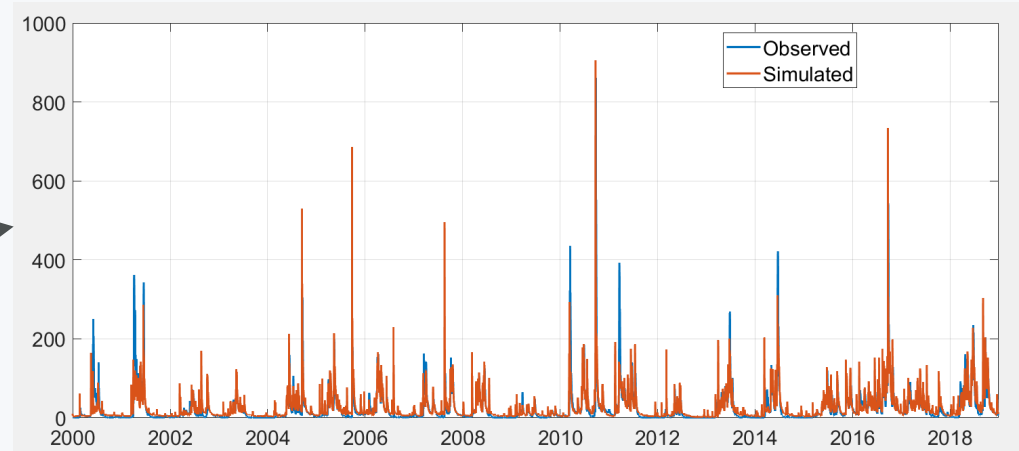
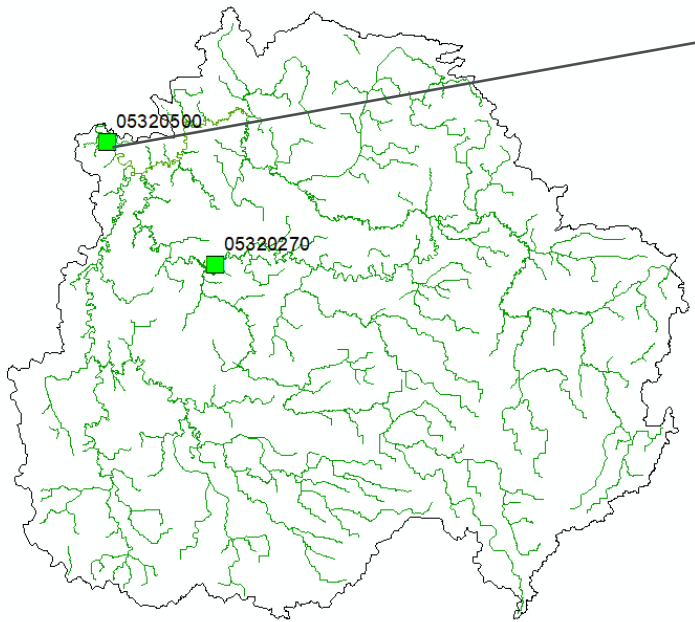
## ADJUSTMENT

■ WYR ■ BFR



# WHAT ABOUT HARD-CAL?

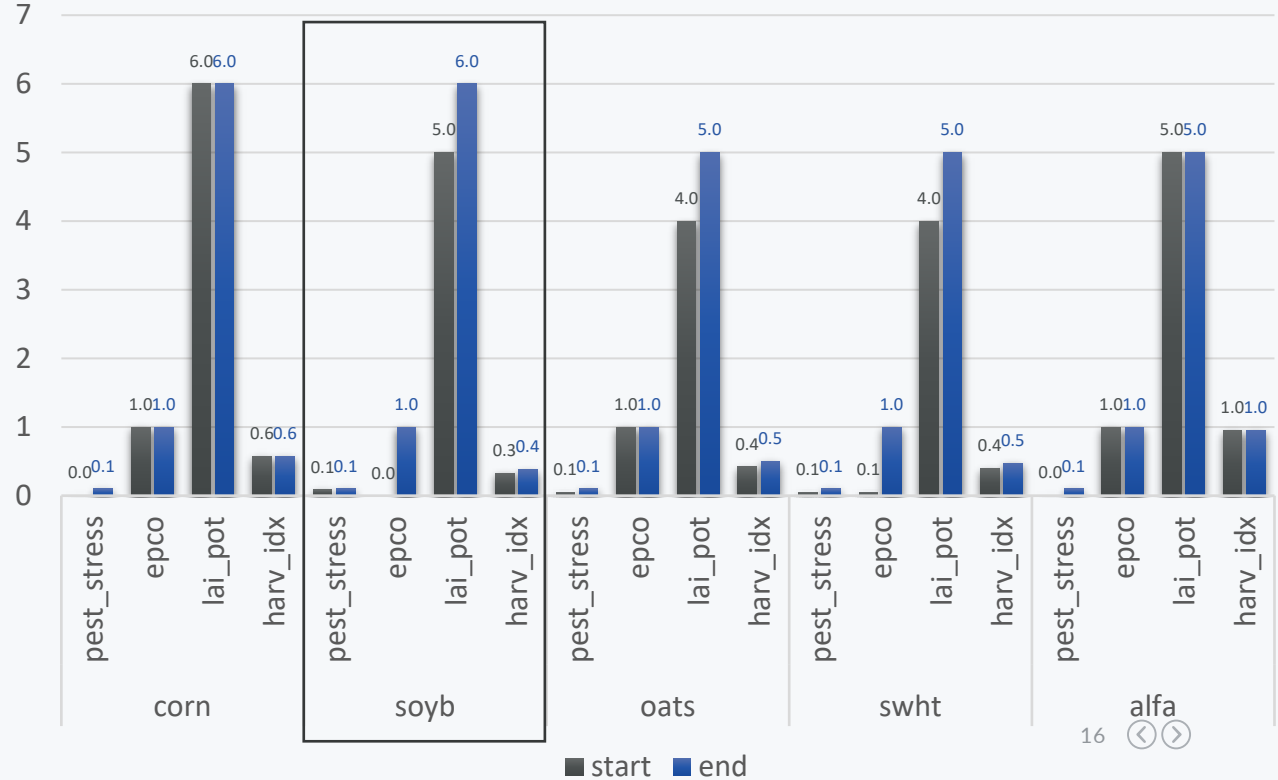
Improved streamflow



➤ Daily NSE for flow > 0.5

# EXAMPLE CROP YIELD CALIBRATION

Crop	Initial yield (t/ha)	Calibrated yield (t/ha)	Target value (t/ha)
CORN	11.6	9.8	9.8
SOYB	2.3	2.3	2.3
OATS	3.2	2.0	2.1
SWHT	3.7	2.8	2.7
ALFA	4.9	3.3	4

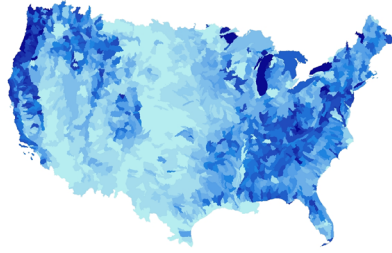




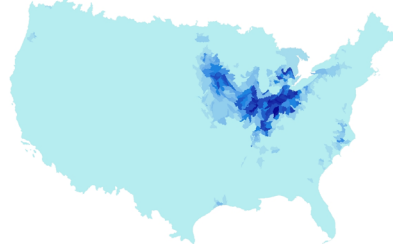
# RUNNING SOFT-CAL AT LARGE SCALE

National Agroecosystems Model

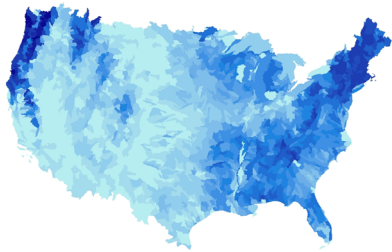
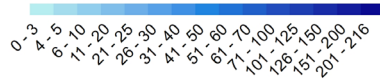
Average annual values



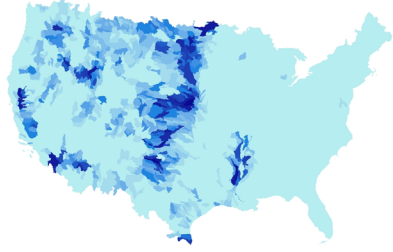
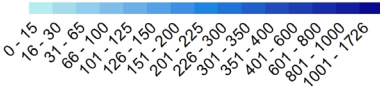
Lateral flow (mm)



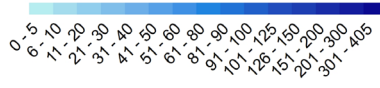
Tile flow (mm)



Percolation (mm)



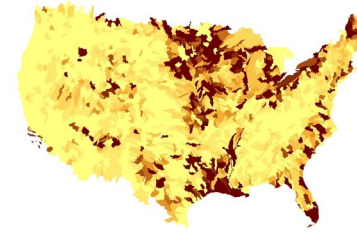
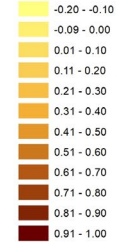
Irrigation (mm)



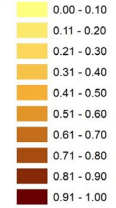
Assigned values



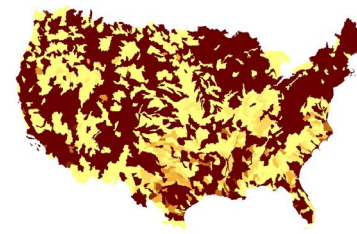
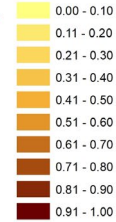
cn3\_swf



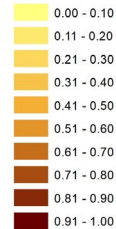
latq\_co



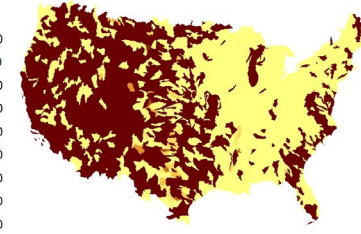
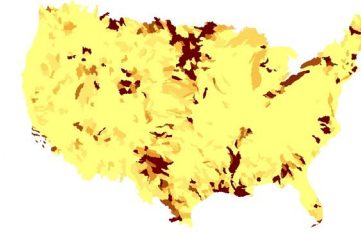
perco



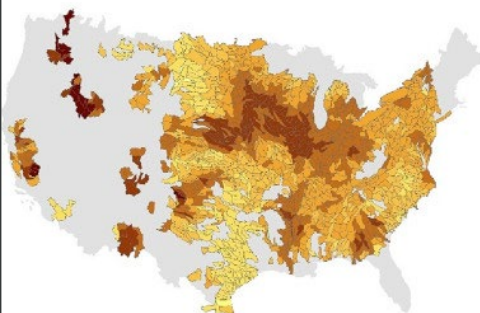
esco



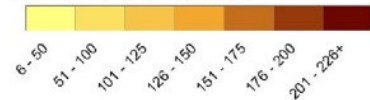
Initial values



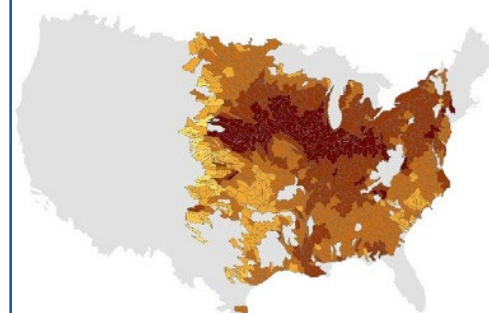
# Corn



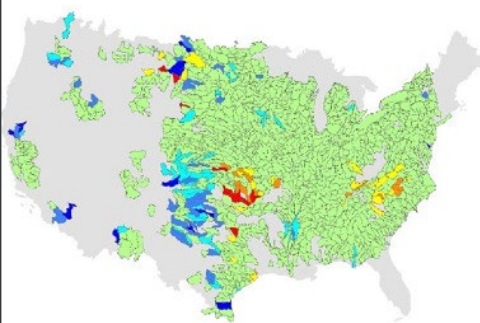
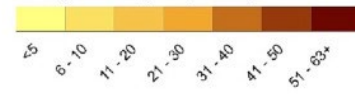
Average annual yield (bu/acre)



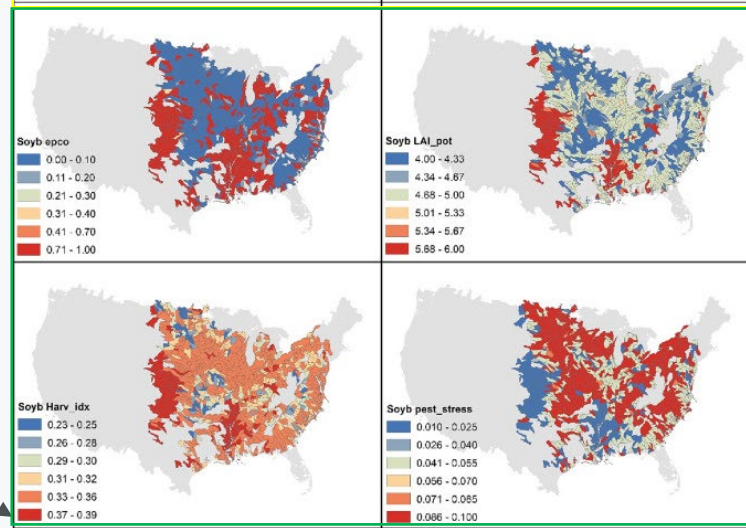
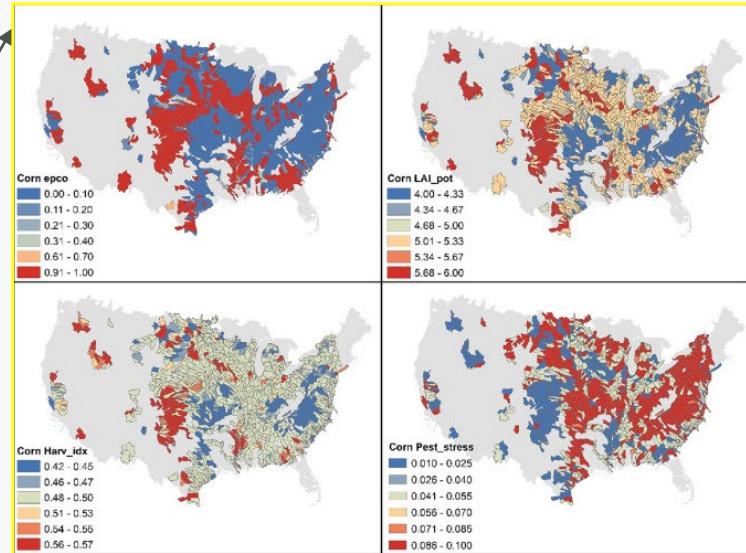
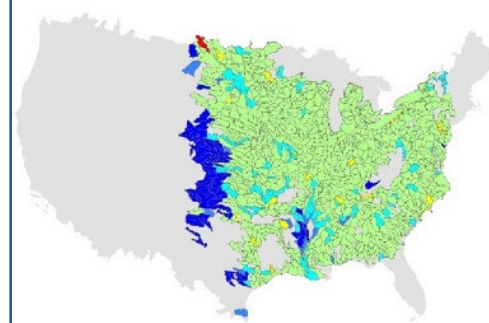
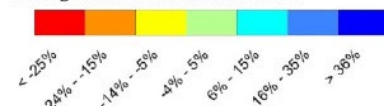
# Soybeans



Average annual yield (bu/acre)



Average Annual Yield Relative Error



# PUBLISHED RESULTS

Full text available at

<https://doi.org/10.1016/j.agry.2023.103695>



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## Field scale SWAT+ modeling of corn and soybean yields for the contiguous United States: National Agroecosystem Model Development

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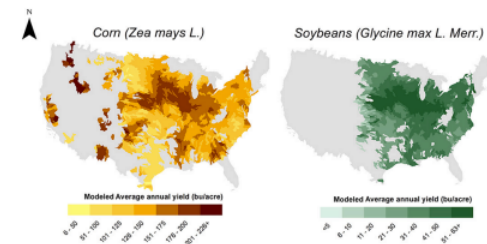
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### HIGHLIGHTS

- SWAT+: a high-resolution national-scale model for crop growth and yield estimation
- National scale model with over 2.5 M individual corn and soybeans fields simulated.
- Crop yield calibration procedure incorporated into the new SWAT+ model.

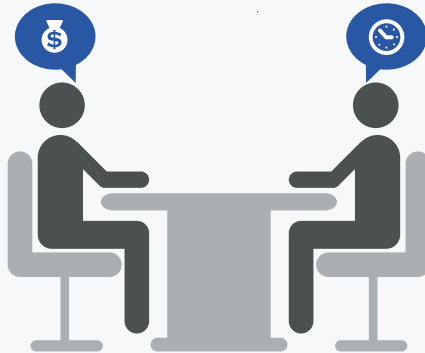
### GRAPHICAL ABSTRACT



# TO SUM-UP

Soft-cal

## THANK YOU!



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01

### IN-BUILD

Does not require additional software

02

### FAST

Runs in just a handful simulations

03

### MINIMAL INPUT

Only several sof-cal values required as input

04

### REPEATABLE

Can be reproducible with ease