

**Enhancing and Extending  
Field Research  
with Modeling of Agricultural Systems  
--International Collaborations**

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# Need for Quantitative System Approaches in Agriculture

- ❖ Agriculture in the 21<sup>st</sup> century is much more complex due to: environmental concerns, limited water, climate change: droughts & uncertainty, global competition; bio-energy
- ❖ Integrated and quantitative system approaches are needed as planning & decision tools for optimal management, & to help research develop them. System models provide these approaches.



# Integrating Field Research with System Models Helps Both

- ❖ **Enhances understanding** of the experimental results & complex interactions; cause & effect relations
- ❖ Enables their synthesis, quantification & **extends results** to longer time periods
- ❖ Helps **transfer results**, their optimal application to other soils/ climates, and **aids management**
- ❖ **Identifies knowledge gaps** to focus further research; reduces duplication
- ❖ Good field data help **improve the models**



# THE GUIDING PRINCIPLE & VISION

**CUTTING EDGE  
FIELD  
RESEARCH**

**SIMPLER DECISION  
SUPPORT SYSTEMS**

**for Farmers &  
Ranchers, Ag  
Consultants, and  
Action Agencies**

**PROCESS MODELS  
OF AGRICULTURAL  
SYSTEMS**

**Extend Research &  
Applications**



# The CGIAR Science Council (2005) Research Priorities:

- **“Modeling and the ability to combine data from different sources, ...promises to revolutionize understanding of processes affecting management of natural resources.”**
- **“Thanks to strategic accumulation of data, tools, and modeling resources in the coming decade, one can expect the development of a more predictive approach to agriculture”.**
- **Policy to focus limited resources on a few comprehensive field studies and then use models to extend them to other locations and countries.**



# Agricultural Systems Research Unit



Fort Collins, Colorado  
U.S.A.



# OUR UNIT'S RESEARCH MISSION

Develop whole-system approaches to help optimize resource management & evaluate/develop sustainable agricultural systems:

- Synthesis of disciplinary knowledge to the whole system level and collaborative research to fill knowledge gaps.
- Computer models of agriculture systems to help research, site-specific management, and create simpler decision aids.
- Decision support technology packages for farmers, ranchers, ag consultants and action agencies for planning and management.
- Techniques for more efficient development & maintenance of models & decision tools



# More Recent Major Team Products

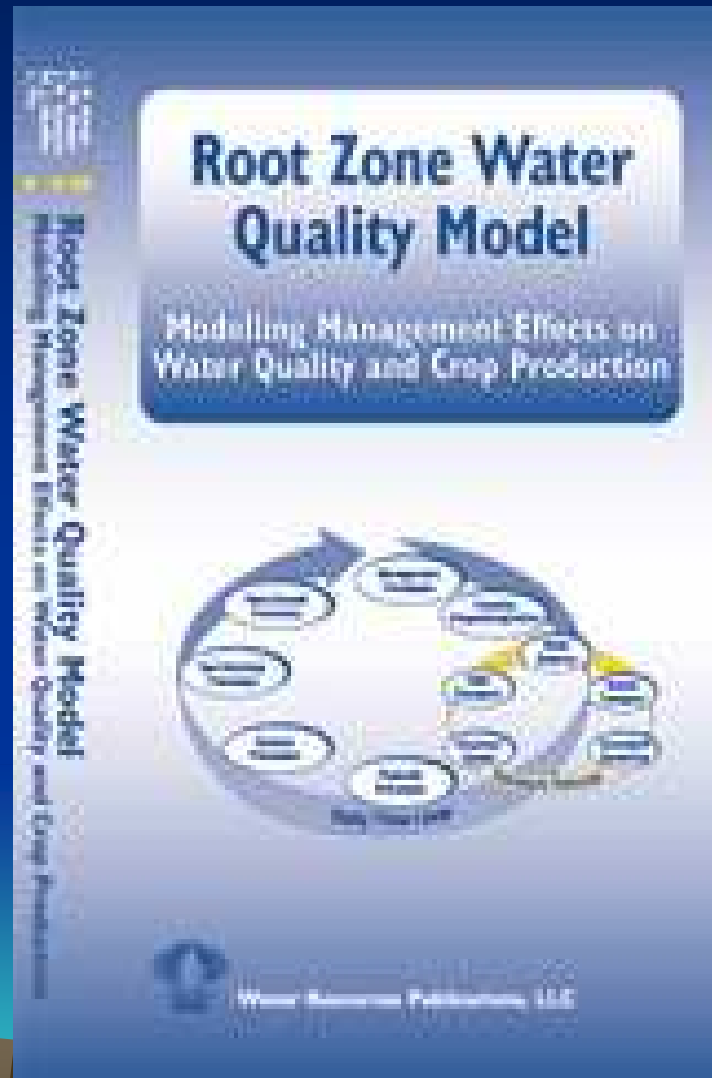
- **The Root Zone Water Quality Model (RZWQM) to simulate management effects on water, water quality and crop production.**  
**Updated to RZWQM2-DSSAT & RZWQM2-GIS for precision spatial management & conservation effects assessment--CEAP .**
- **GPFARM, a simpler whole farm/ranch decision support system for strategic planning.**
- **Object Modeling System: Create models from library of stand-alone modules**





# Root Zone Water Quality Model

Modeling Management Effects on Water,  
Water Quality and Crop production



# Distinguishing Features of RZWQM

- Agricultural management practices and their integrated effects on water, crop production, and environmental quality ( tillage, irrigation, fertilization, manure application, tile drainage, pesticide application, and crop rotation).
- Macropore/preferential flow.
- Water table fluctuation and tile flow.
- Chemical transport in runoff/percolation water.



# Distinguishing Features of RZWQM

- Detailed carbon/nitrogen dynamics with consideration of microbial populations.
- Multiple year simulation for crop rotations with capability of answering “what-if” scenarios
- Detailed crop-specific models from DSSAT package



# RZWQM-RZWQM2 Applications

- ❖ Extensively used in U.S & other countries to evaluate water quality/quantity impacts of ag management & develop sustainable systems.
- ❖ Adopted by EPA and used by pesticide industry for pesticide registration
- ❖ Used by USGS for NAWQA program
- ❖ China: water & N could be reduced by 50% w/o reducing corn yield
- ❖ Continues to play an important role in our new research projects.



# GPFARM: A Farm Level DSS

A whole-farm decision support system for strategic planning: evaluation of alternate cropping system, range-livestock systems, and integrated farming options for production,

economics, and environmental impacts

End Users: Farmers and Ranchers, Consultants, Action Agencies, Extension, and Scientists



# GPFARM Applications

- ❖ Several invited presentations to Colorado Conservation Tillage Association & farmers
- ❖ MOU with CAWG: GPFARM distributed to 600 members; trained 150 members
- ❖ GPFARM-Range model has been extensively used for synthesizing research data from three range research stations in the Great Plains



# The Object Modeling System (OMS)

An Object Modeling System consists of a library of modules which facilitates the assembly of a modeling package, tailored to the problem, data constraints, and scale of application.

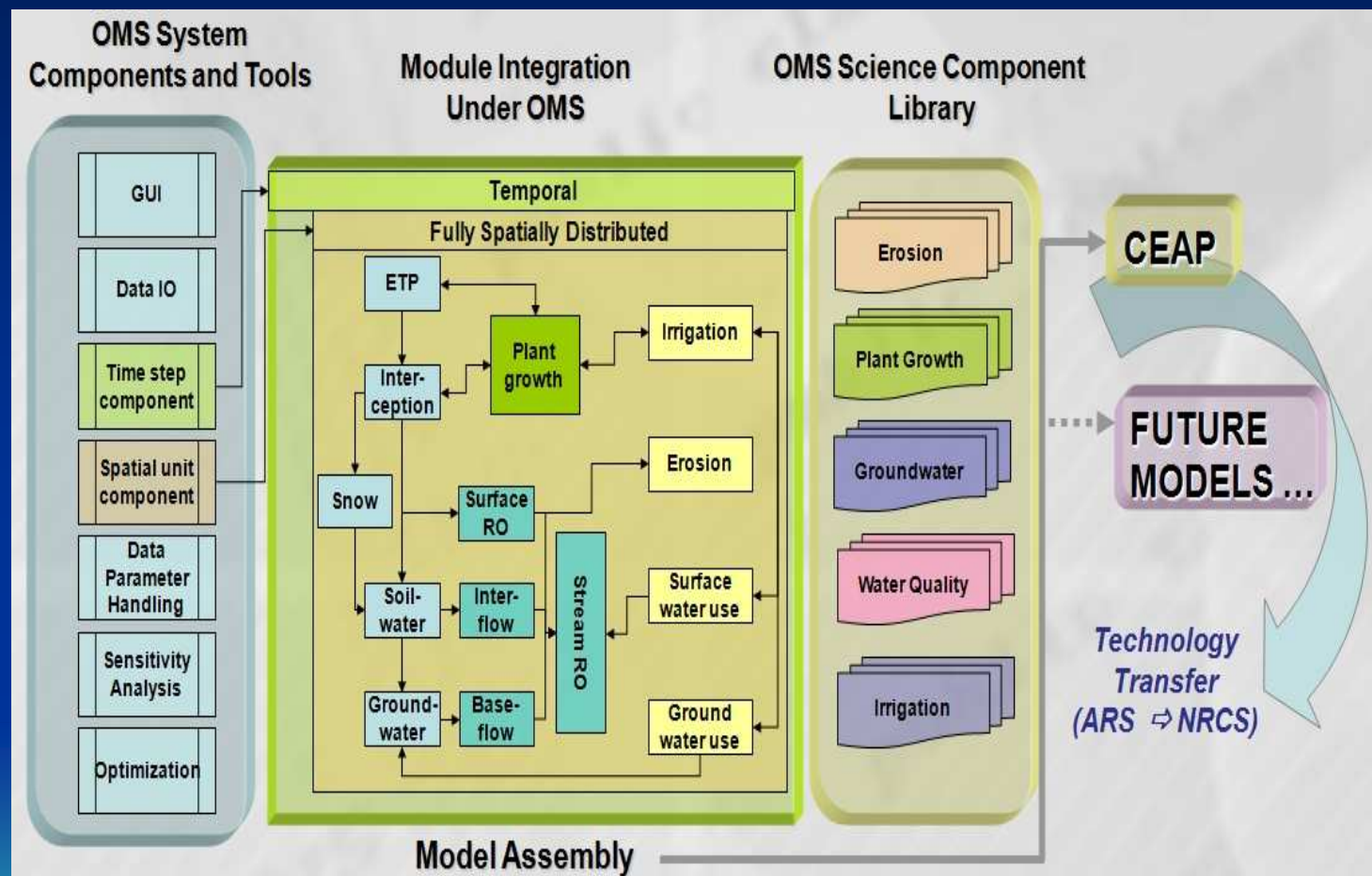
Collaborators: ARS, NRCS, USGS, Friedrich-Schiller University, Jena, Germany

Has been adopted by NRCS as a uniform system to deliver conservation technology and is being used to develop a new field to watershed scale model.



# Model and Field Research a Precursor to Decision Support Tools

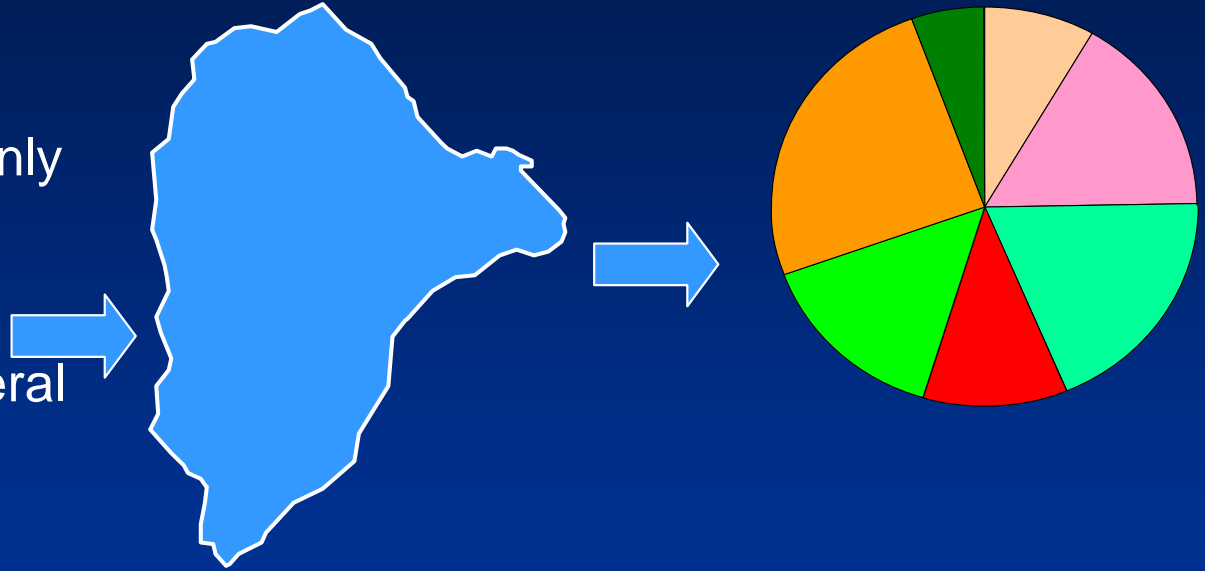
The Object Modeling System (OMS) facilitates the development of component-based models which benefits decision support tool development.



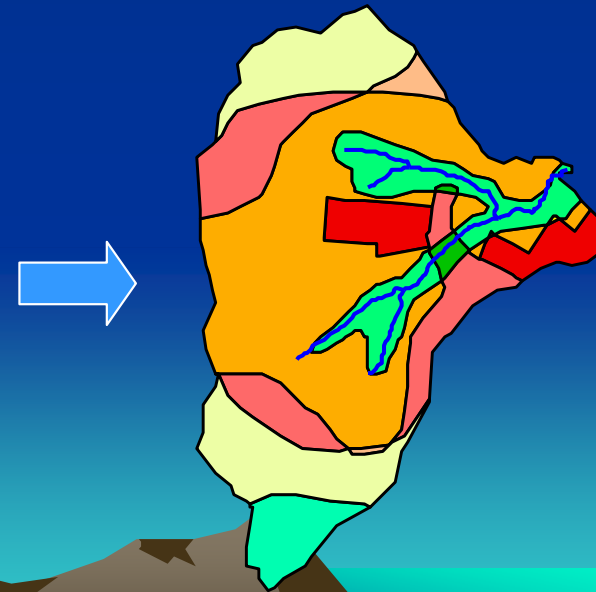


# CEAP Watershed Compared to SWAT

- The semi-distributed SWAT concept considers distributed information within a sub-basin only statistically but not in terms of location.
- Important processes, e.g., lateral water /nutrient transport and specific management in some parts of a sub-basin cannot be simulated.



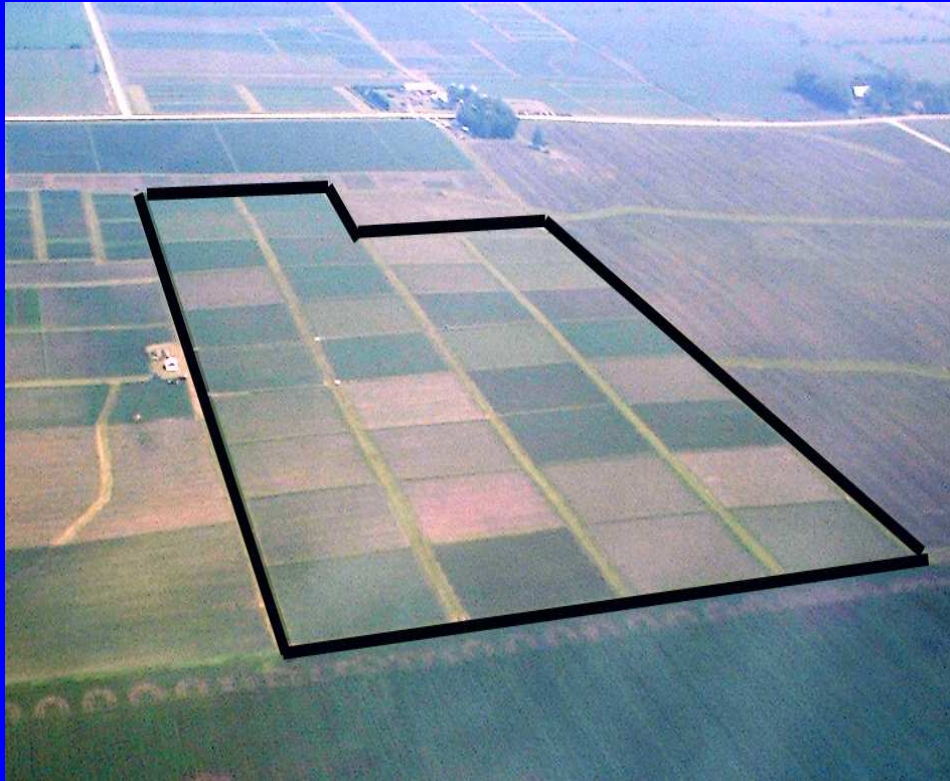
The fully distributed CEAP Watershed Model concept allows the consideration of such processes.



# Recent Examples of Model Application to Enhance and Extend field Research



# 1. Water Quality Studies in Tile-Drained Cropping Systems (Nashua, Iowa)



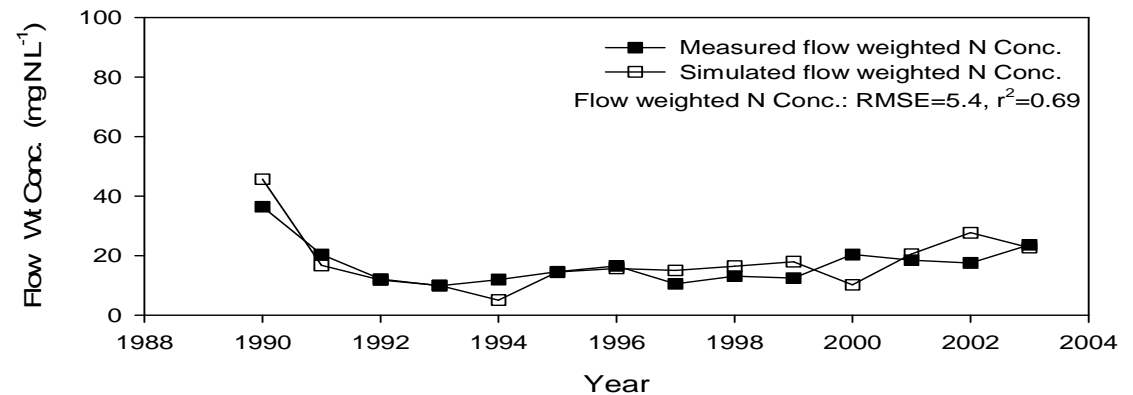
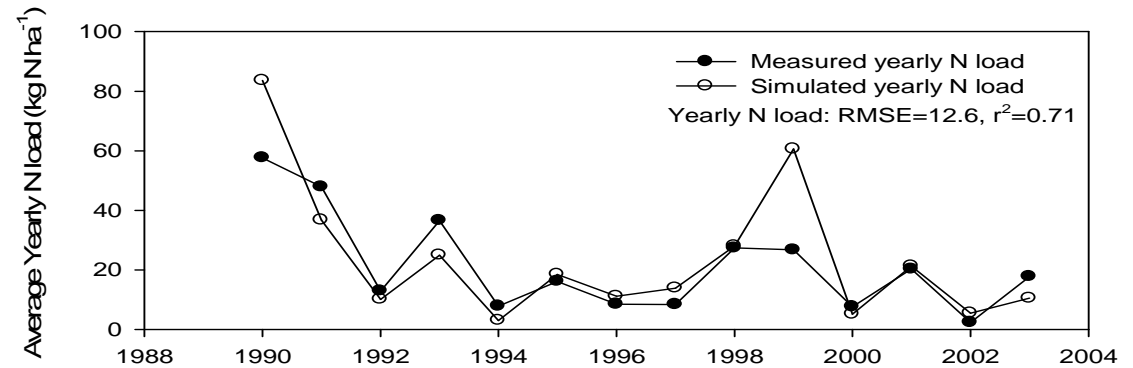
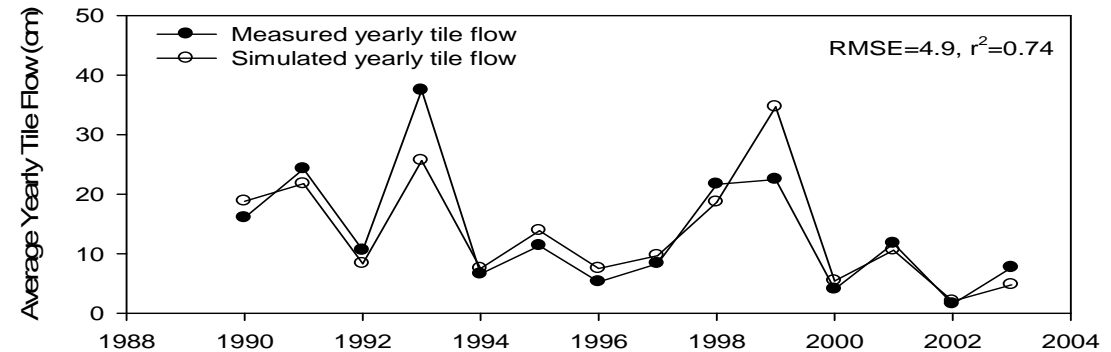
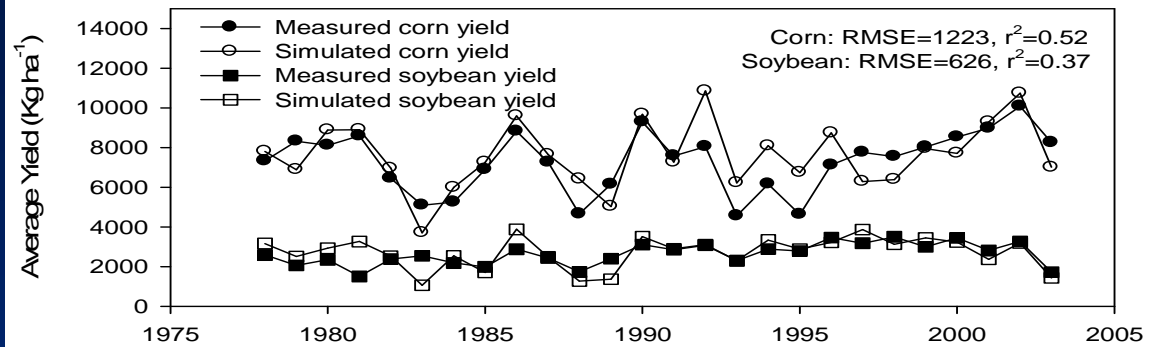
# Experimental Design

- **36 1-acre plots in Nashua, IA under tile drainage (at 120 cm depth); Variety of data over time from 1978 to 2003**
- **Two crop rotations: continuous corn (CC) and corn-soybean (CS) rotations**
- **Four tillage systems: moldboard plow (MP), ridge till (RT), chisel plow (CP), and no-till (NT)**
- **Fertilizers: anhydrous ammonium (AA) from 1977 to 1993; UAN from 1993 to 1998**
- **Swine manure from 1998 to 2003: fall & spring applications**



# Synthesis of Data:

## Average values across treatments



Using Validated Model to Extend Results to  
multiple years and Create  
Simpler Decision Tools



**Simulated yearly water balance and crop production averaged over 24-yr for different crop rotation, tillage, and drainage scenarios. Results for corn-soybean rotation were taken as averages from CS and SC phases of the rotation (Ma et al., 2007b).**

Scenarios	Drain flow (cm)	Lateral** flow (cm)	Runoff (cm)	ET*** (corn, cm)	Corn yield (kg/ha)	Corn biomass (kg/ha)	ET (soybean, cm)	Soybean yield (kg/ha)	Soybean biomass (kg/ha)
CC-NT-FD*	12.2	13.2	6.8	57.0	7878.3	18426.0	---	---	---
CC-MP-FD	10.6	11.4	6.8	60.4	7862.2	18384.4	---	---	---
CC-CP-FD	11.7	12.7	6.8	58.0	7886.9	18445.1	---	---	---
CC-NT-CD	8.7	15.2	7.4	57.8	7920.3	18433.5	---	---	---
CC-MP-CD	7.2	13.4	7.3	61.3	7908.0	18382.9	---	---	---
CC-CP-CD	8.3	14.7	7.4	58.8	7921.7	18433.2	---	---	---
CS-NT-FD	13.8	15.5	6.9	57.6	7879.7	18410.2	47.9	2971.5	8190.5
CS-MP-FD	12.8	14.4	6.9	58.9	7915.0	18443.1	50.9	3052.2	8544.2
CS-CP-FD	13.5	15.2	6.9	57.9	7915.7	18460.0	48.7	3001.3	8270.7
CS-NT-CD	9.8	18.2	7.6	58.4	7927.3	18428.6	48.4	3024.4	8281.8
CS-MP-CD	8.7	17.1	7.5	59.7	7959.0	18472.6	51.6	3098.3	8638.8
CS-CP-CD	9.5	17.9	7.6	58.8	7958.3	18487.6	49.3	3052.2	8356.0

\* CC: continuous corn; CS: corn-soybean rotation; NT: no-till; MP: moldboard plow; CP: chisel plow; FD: free drainage; CD: controlled drainage.

\*\* Lateral groundwater flow below the tiles

\*\*\*Evapo-transpiration



**Simulated yearly nitrogen balance under different crop rotation, tillage, and drainage scenarios. Units are in Kg N/ha unless stated otherwise. N application rate was 202 kg N/ha for CC and 168 kg N/ha on corn for CS and SC. Results for corn-soybean rotation were taken as averages from CS and SC phases of the rotation (Ma et al., 2007b).**

Scenarios	Flow-weighted N concentration (mg/L)	N loss in Tile	N loss to lateral flow	Net Mineralization	Denitrification	N uptake in corn biomass	N uptake in soybean biomass	N fixation	$\Delta$ inorganic N (1979-2002)	$\Delta$ organic N (1979-2002)
CC-NT-FD*	15.0	18.4	19.1	73.3	10.4	224.1	---	---	85.7	1642.6
CC-MP-FD	17.4	18.4	17.5	70.3	8.6	223.7	---	---	81.2	1637.6
CC-CP-FD	16.1	18.9	19.2	73.3	9.7	224.3	---	---	83.2	1639.6
CC-NT-CD	15.3	13.4	21.9	72.2	11.3	224.4	---	---	86.0	1647.6
CC-MP-CD	18.3	13.1	20.6	69.2	9.4	224.3	---	---	81.2	1641.6
CC-CP-CD	16.6	13.7	22.0	72.1	10.5	224.7	---	---	83.2	1644.6
CS-NT-FD	11.8	16.3	18.1	116.5	12.5	225.0	318.8	242.8	49.8	1672.7
CS-MP-FD	13.5	17.3	18.6	118.0	9.5	225.8	333.4	252.0	45.4	1793.6
CS-CP-FD	12.7	17.2	19.0	117.0	10.8	226.0	322.1	246.5	52.3	1679.9
CS-NT-CD	11.7	11.4	21.2	115.8	13.3	225.6	322.4	246.3	49.5	1727.6
CS-MP-CD	13.4	11.7	22.1	117.4	10.1	226.5	336.9	254.9	46.3	1798.6
CS-CP-CD	12.6	11.9	22.2	116.2	11.5	226.8	325.4	249.7	52.0	1684.7

\* CC: continuous corn; CS: corn-soybean rotation; NT: no-till; MP: moldboard plow; CP: chisel plow; FD: free drainage; CD: controlled drainage.

$\Delta$  = change from 1979 to 2002.





# 2. Dryland Copping Systems Studies in the Semi-Arid Central Great Plains (Akron, CO)



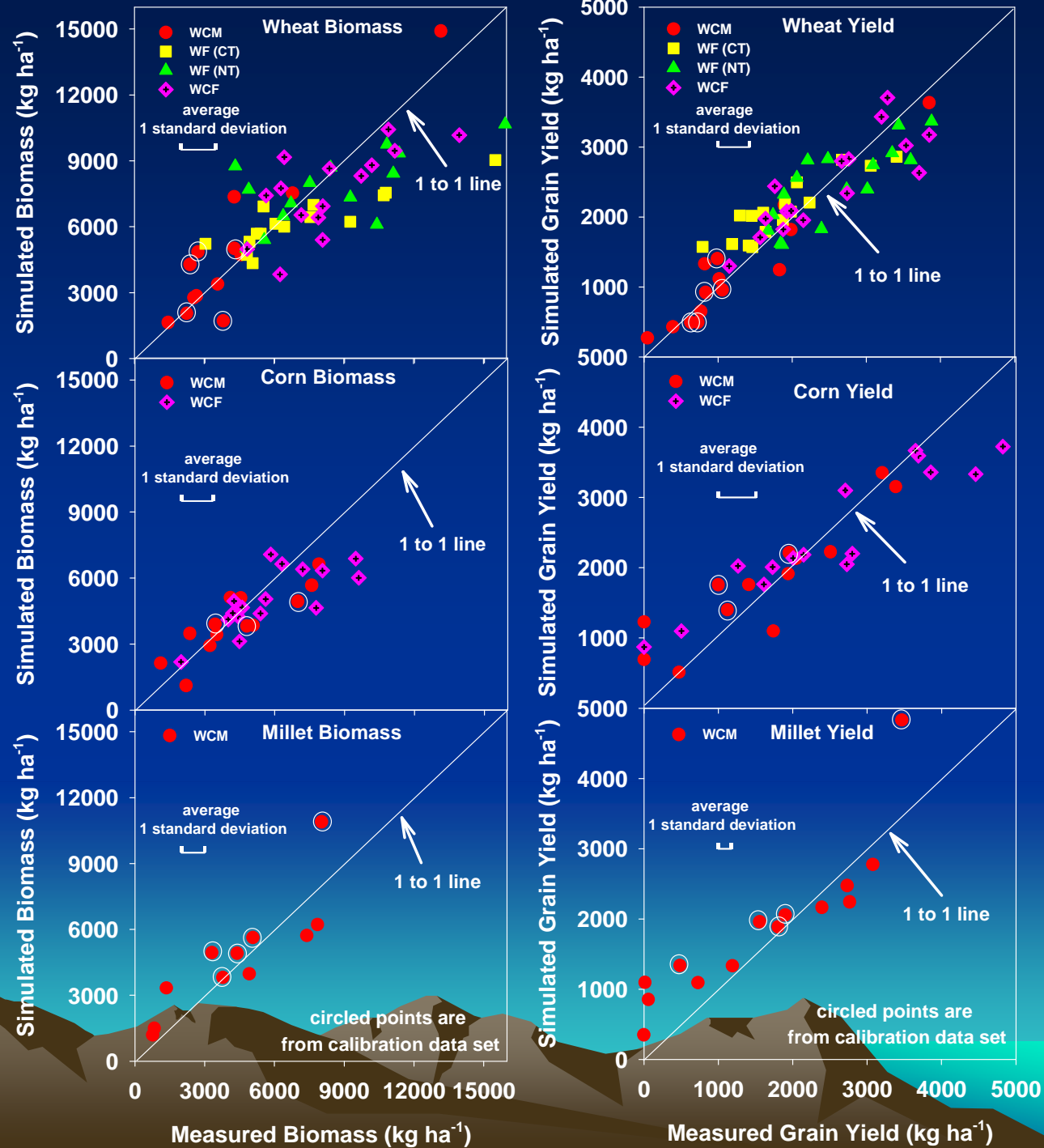
# Alternative Crop Rotation Exp.

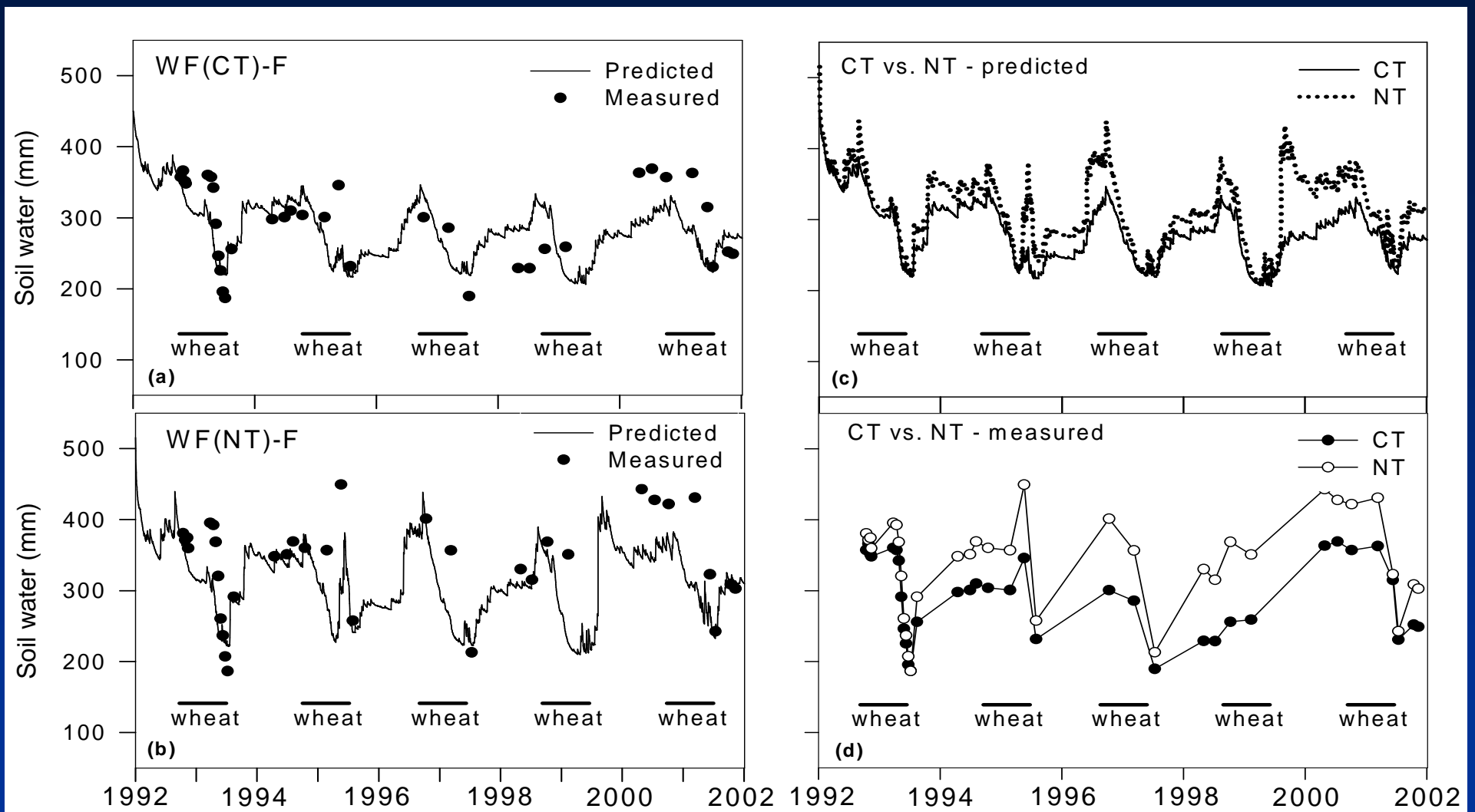
-23 dryland rotations (beginning 1991)

-Wheat, corn, millets, sunflower. peas



# SYNTHESIS – Biomass and Yield in 4 Rotations

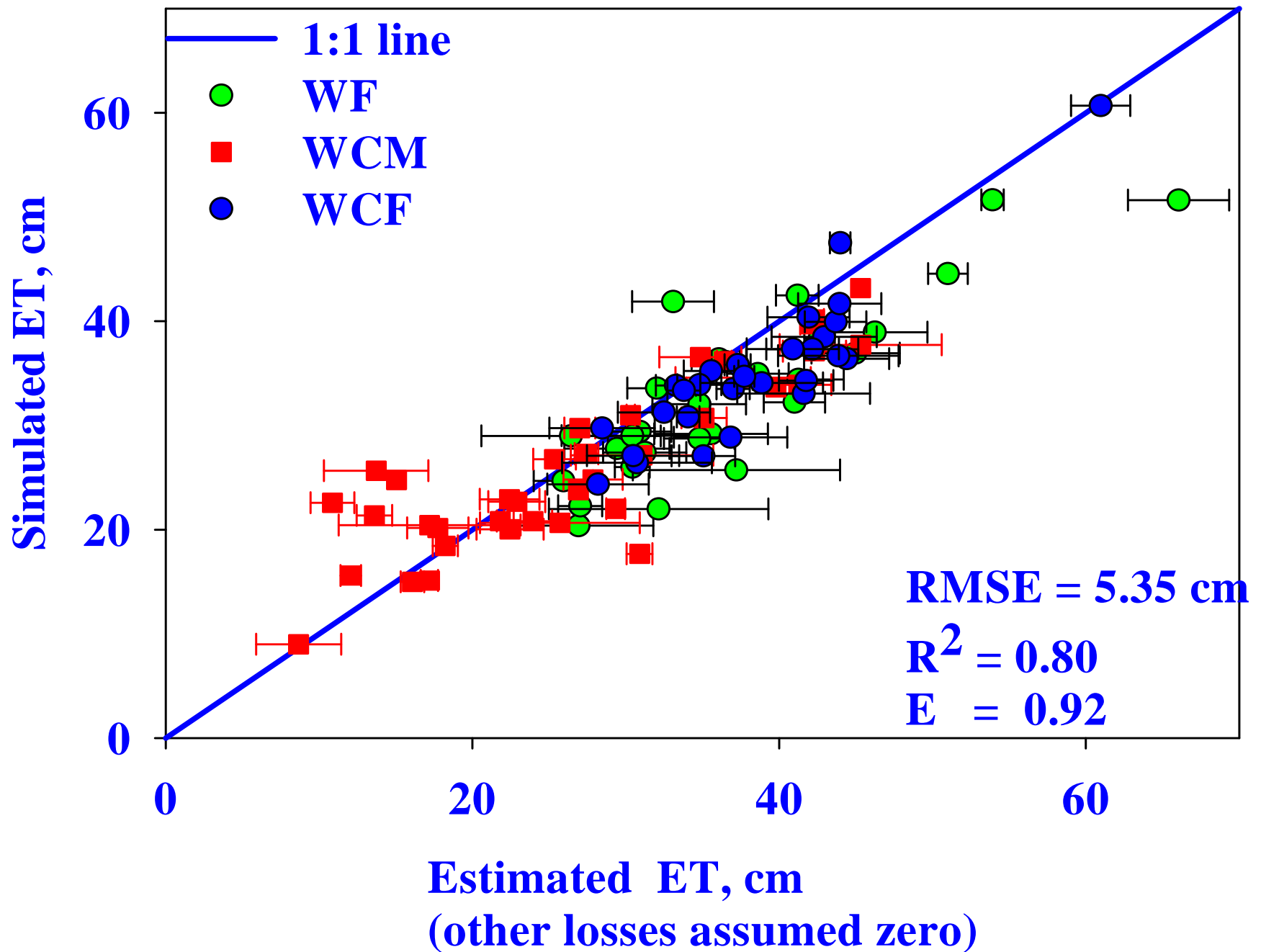


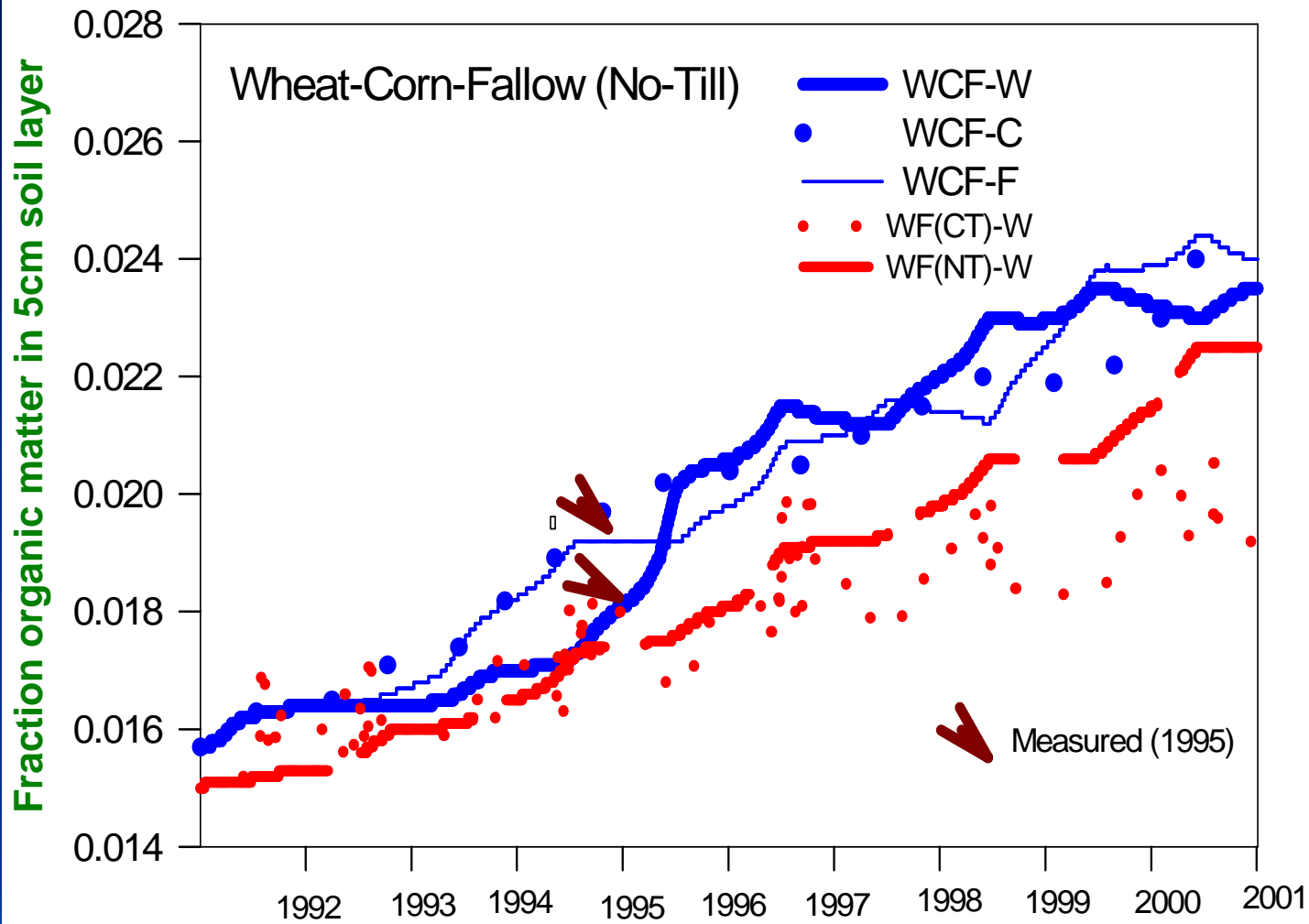


Measured and predicted (RZWQM) total profile (180 cm) soil water under wheat fallow (WF) for the beginning fallow data set. (a) conventional tillage (CT), (b) no-till (NT), (c) comparison of predicted soil water under WF(CT) and WF(NT), (d) comparison of measured soil water under WF(CT) and WF(NT) (Saseendran et al., 2005).



# ET - composite





FOM in the first 5 cm soil layer under W, C, and F phases of WCF, and W phase of WF(CT) and WF(NT) during 1992 to 2002.



# Using Validated Model to Explore Drought Management Strategies



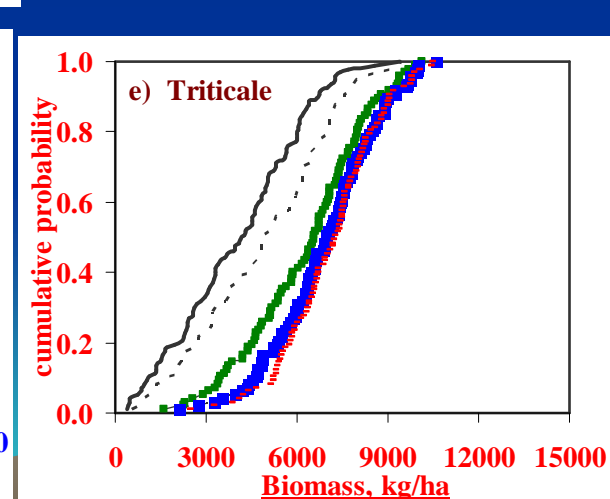
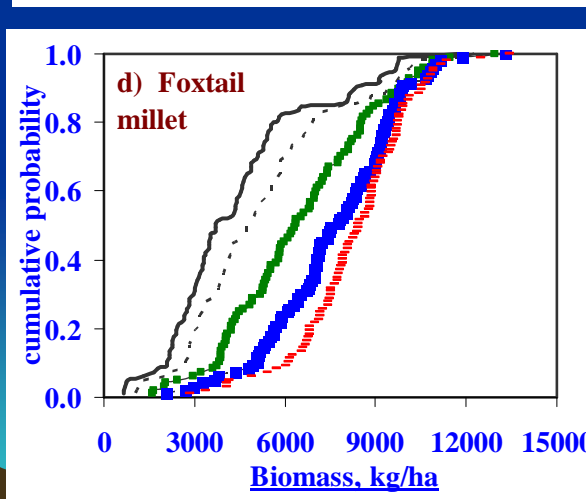
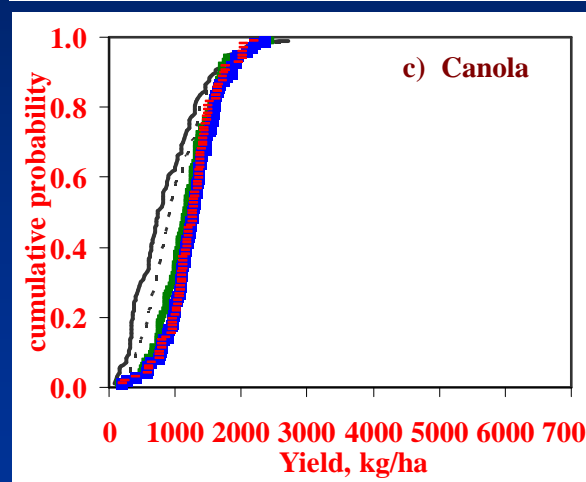
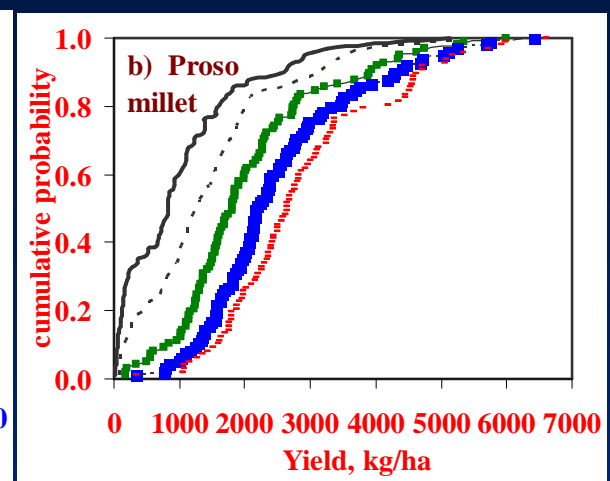
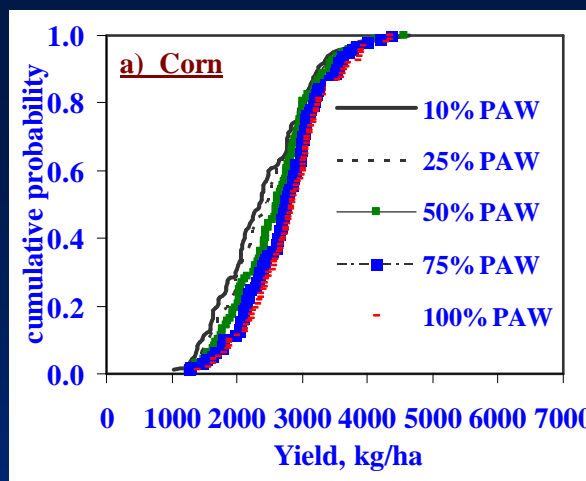
# Summer Crop Selection in Rotation with Wheat Based on Initial Water



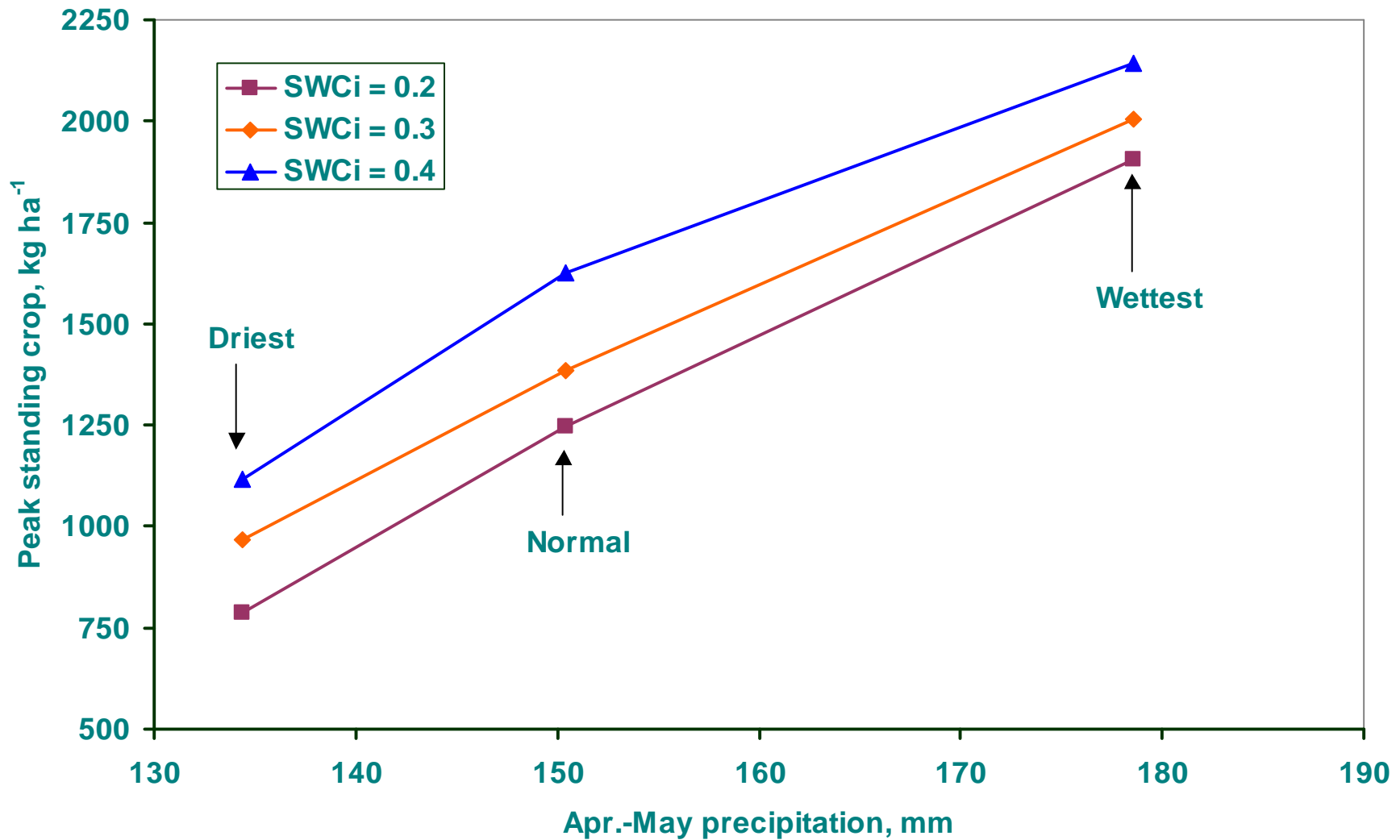


# Cumulative probabilities of Grain yields of Corn, Proso millet and Canola, and Biomass of Foxtail millet and Triticale planted with Plant Available Water at planting from 0 to 100%

**Note:** PAW in the soil profile below 45 cm was constrained not to exceed 50% of PAW at field capacity.



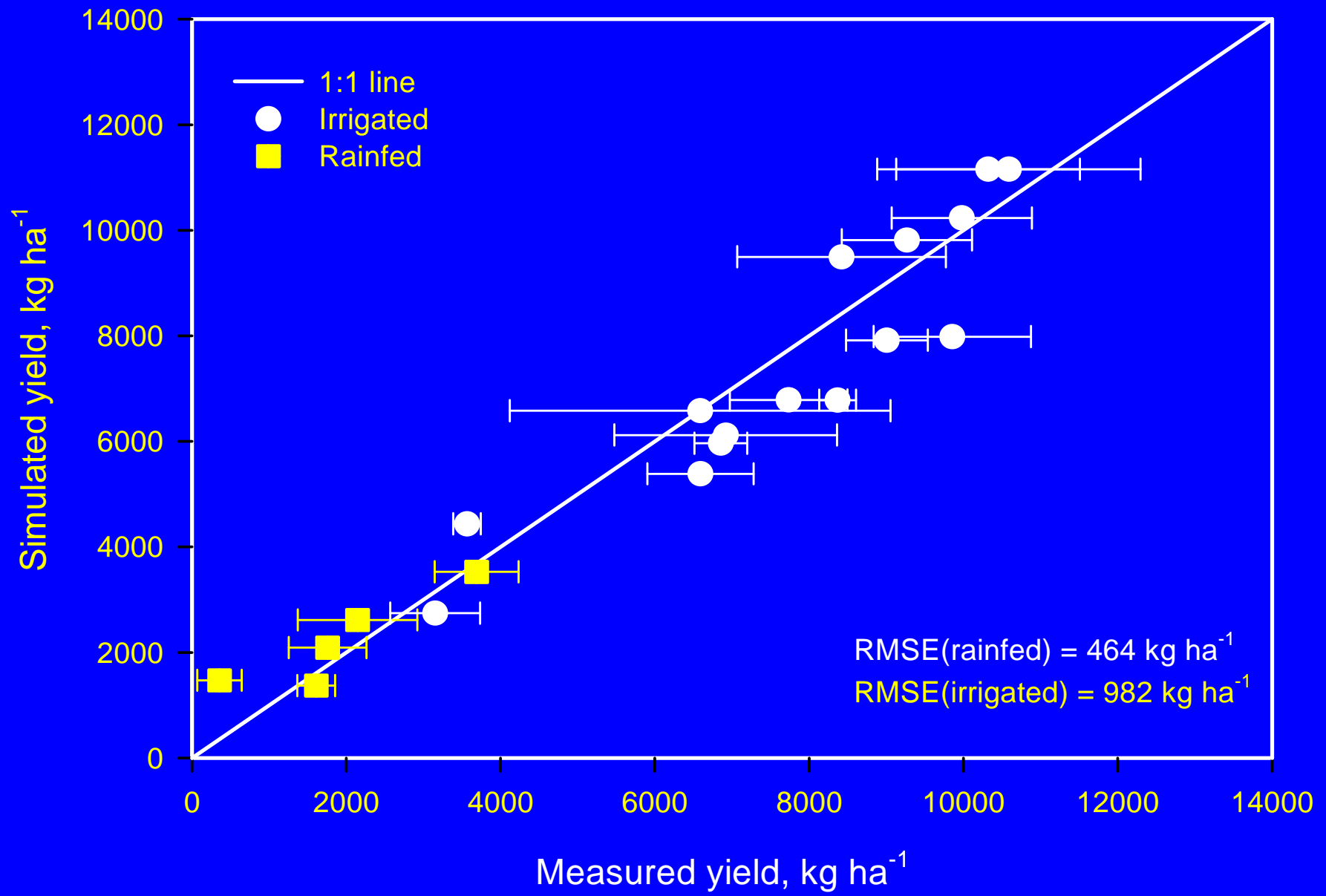
# Predicting Peak Standing Crop (rangeland biomass) at different levels of initial soil water Contents (SWC) and April-May precipitation



# Limited Irrigation Studies on Corn in the Central Great Plains



# Synthesis of Data: Grain Yield of Corn

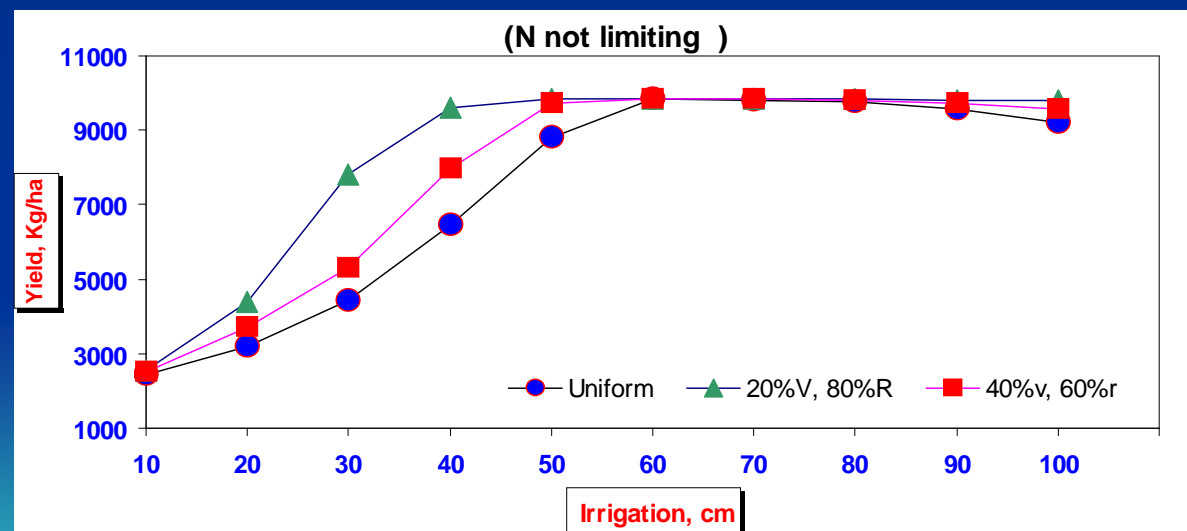
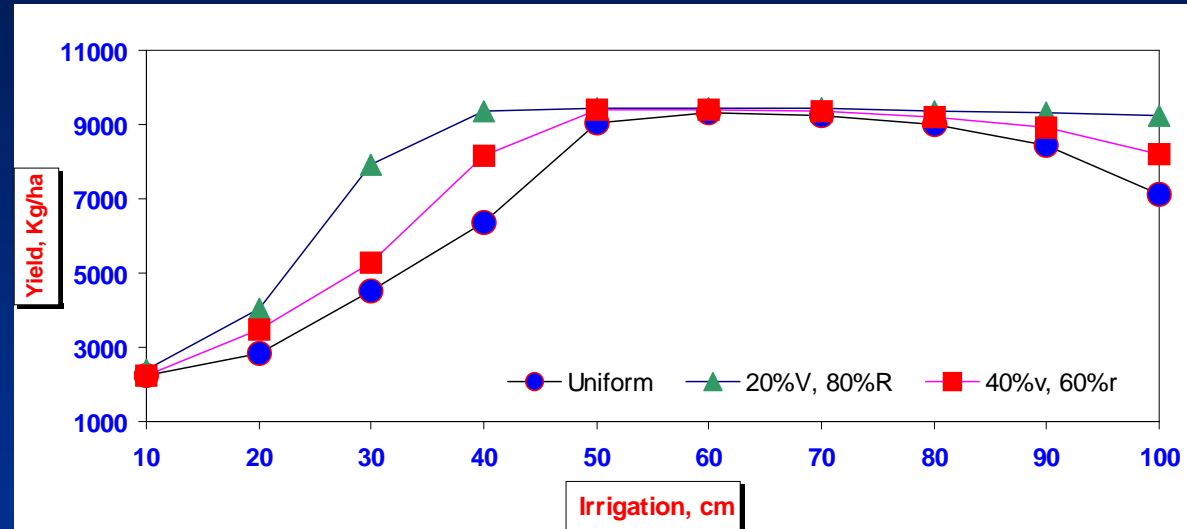


Using Validated Models to Explore  
alternative Scenarios for Managing Limited  
Irrigation Water

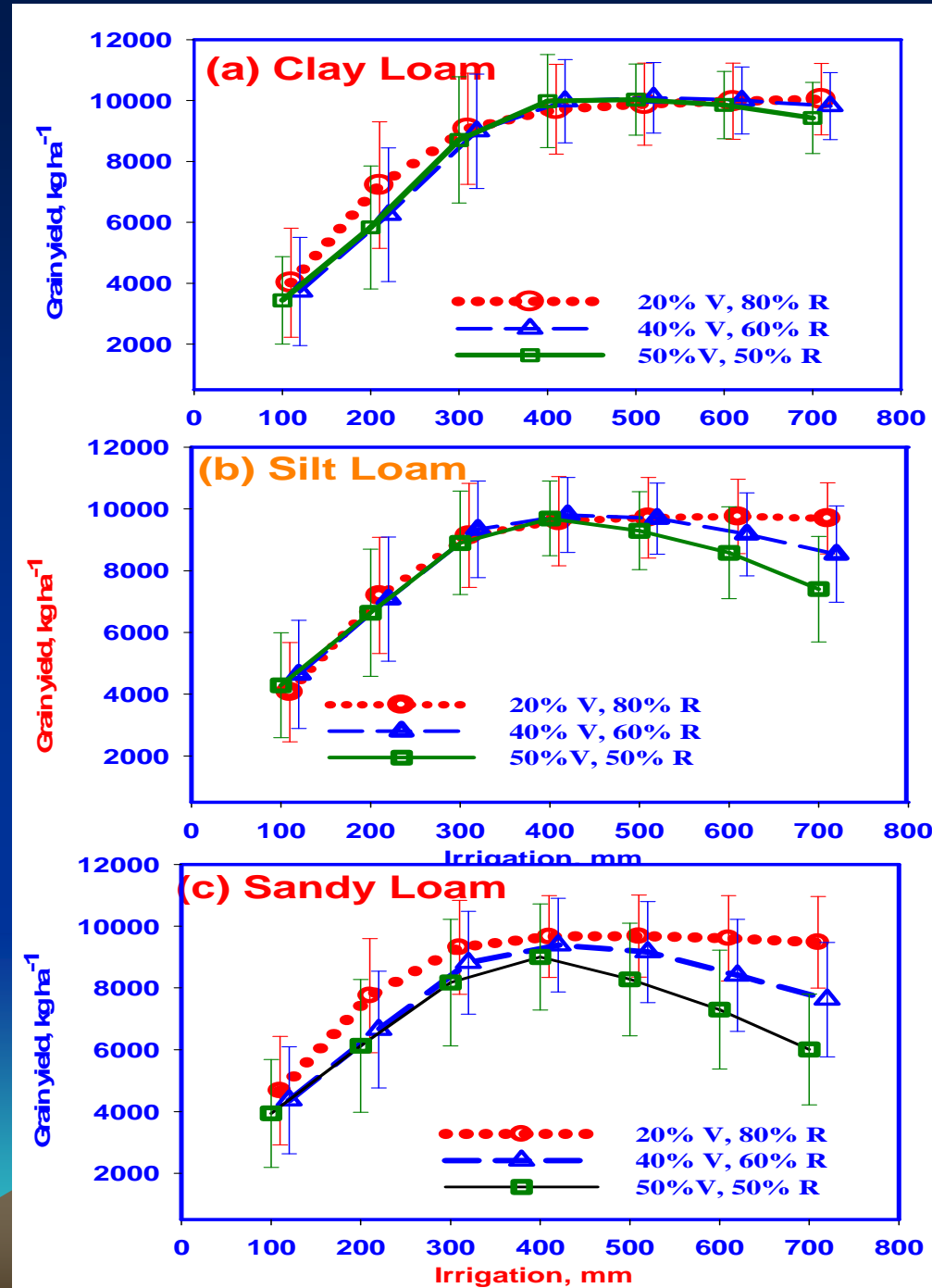


# Rain out experiments with different levels of irrigation in Corn

## (Seasonal PET=90 cm, irrigated weekly)

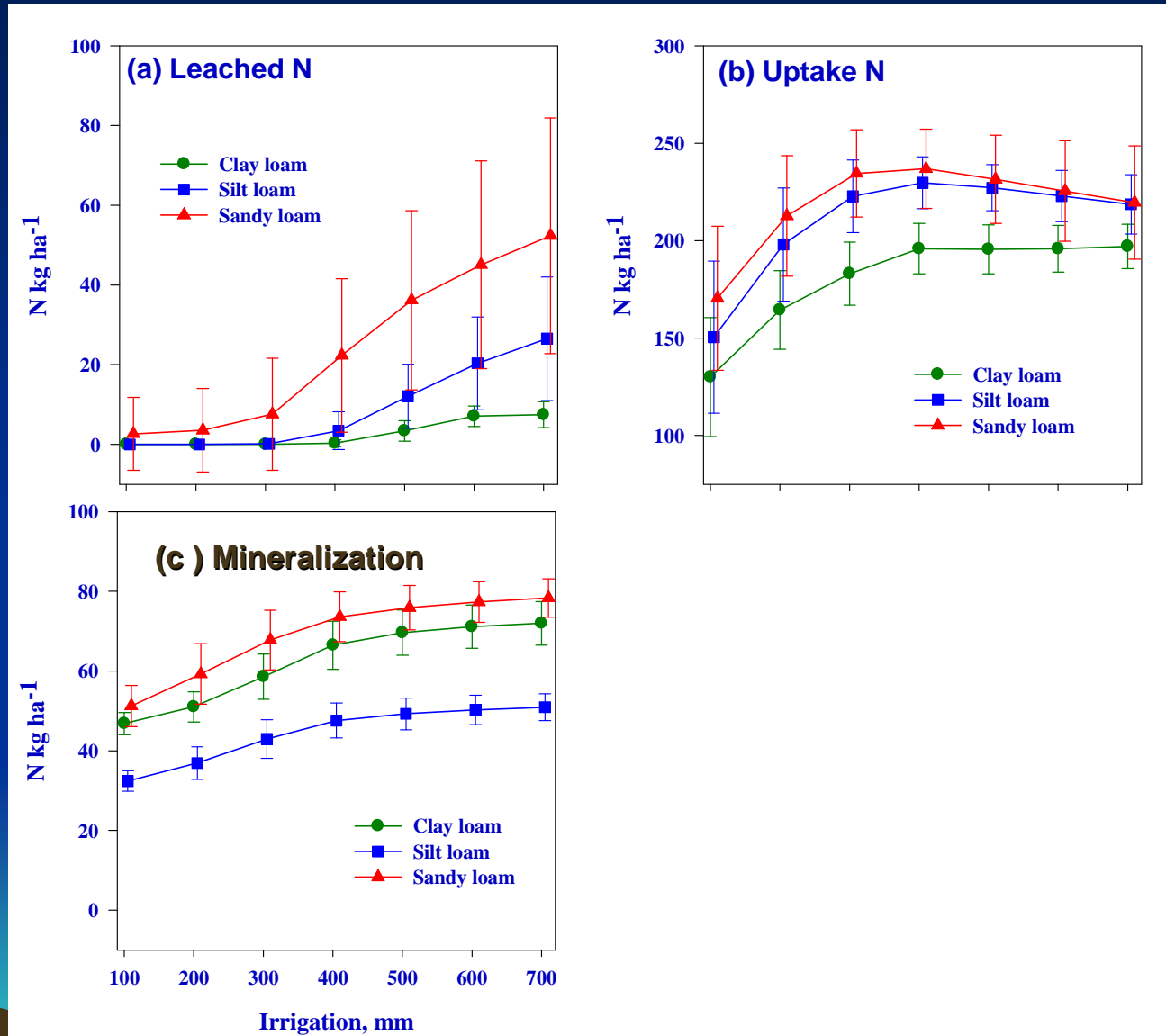


# Grain Yield (20:80, 40:60 & 50:50 split - 94 year average)



# N balance

(20:80 split - 94 year average)





# Limited Water Optimization Tool Interface

## Farm Income from a Typical Year

**Instructions:**

- Select Crops that contribute to Farm Net Profit (Table 1).
- Enter the percentage of contribution to Farm Net Profit for each crop selected and Total Acreage (Table 1).
- If the dollar value in Table 2 is not correct, adjust the % in Table 1.

**Step 1** Enter the Total Net Returns for the Whole Farm and the \$75,000.00

**Step 2** Confirm that the Net Returns for Each Crop is Correct. If not, Adjust the % on the

**Step 3 (optional)**  
If you would like to provide more detail for costs and profit push Button 1

Button 1

Crops that Contribute to Net Profit	% Contribution of Each Crop to Farm Net Profit and Total Acreage	
Table 1.		
1 Irrigated Corn - Grain	75%	100 Acres
2 Irrigated Corn - silage	5%	10 Acres
3 Irrigated Winter Wheat	10%	25 Acres
4 Irrigated Barley	10%	25 Acres
5 Blank	%	Acres
6 Blank	%	Acres

Crops that Contribute to Net Profit	Net Returns each Crop for a Typical Year
Table 2.	
1 Irrigated Corn - Grain	\$56,250.00
2 Irrigated Corn - silage	\$3,750.00
3 Irrigated Winter Wheat	\$7,500.00
4 Irrigated Barley	\$7,500.00
5 Blank	
6 Blank	

Screen 1 – lowest level of economic input

**Instructions:**

- For the crops chosen on Page 1, enter the percent contribution to Total Farm Operating
- Check the dollar contribution of each crop to Total Farm
- If the dollar value in Table 2 is not correct, adjust the % in Table 1.

**Step 1** Enter Total Operating Costs for a Typical Year: \$75,000.00

**Step 2 (optional)**  
If you would like to provide more detail for costs of production of each crop Button 1

Button 1

Crops that Contribute to Total Costs of Production	Estimated % Contribution of Each Crop
Table 1.	
1 Irrigated Corn - Grain	70%
2 Irrigated Corn - silage	10%
3 Irrigated Winter Wheat	10%
4 Irrigated Barley	
5 Blank	
6 Blank	
7 Blank	
8 Blank	
9 Blank	
10 Blank	
Fallow Costs	
Total	

Crops that Contribute to Total Costs of Production	Estimated % Contribution of Each Crop	\$\$ Contribution of Each Crop To Total Farm Costs on a Per Acre Basis
Table 2.		
1 Irrigated Corn - Grain	70%	\$51,800.00
2 Irrigated Corn - silage	10%	\$7,400.00
3 Irrigated Winter Wheat	10%	\$7,400.00
4 Irrigated Barley		
5 Blank		
6 Blank		
7 Blank		
8 Blank		
9 Blank		
10 Blank		
Fallow Costs		
Total		

Screen 2 – greater economic input detail

Fallow Costs	
Annual Costs	\$1,000.00
Acres	50
Costs per Acre	\$20.00

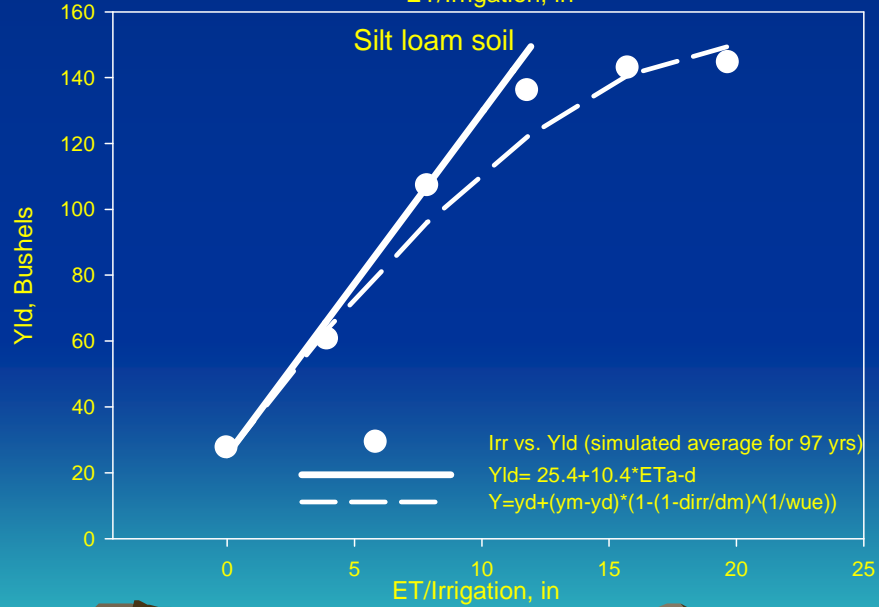
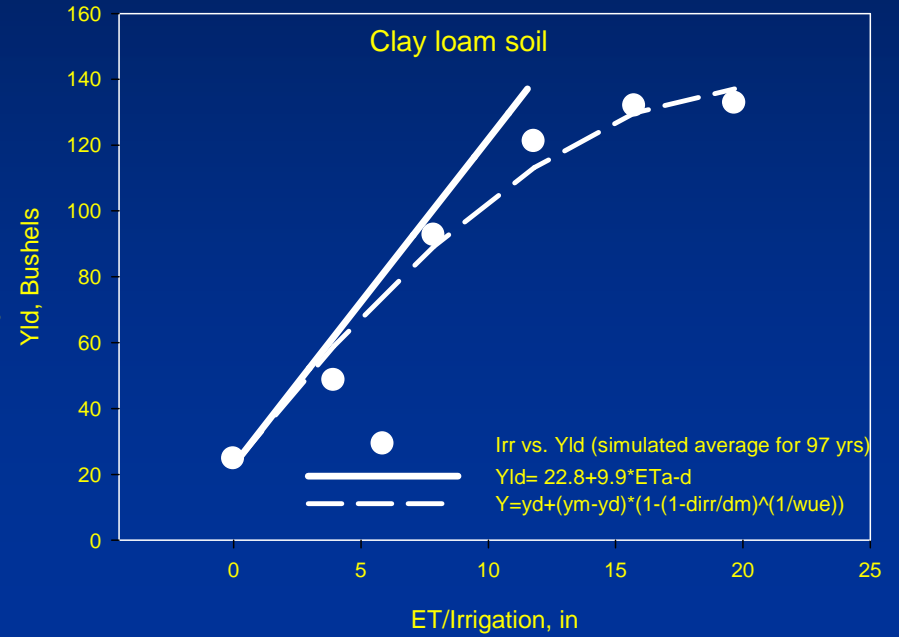
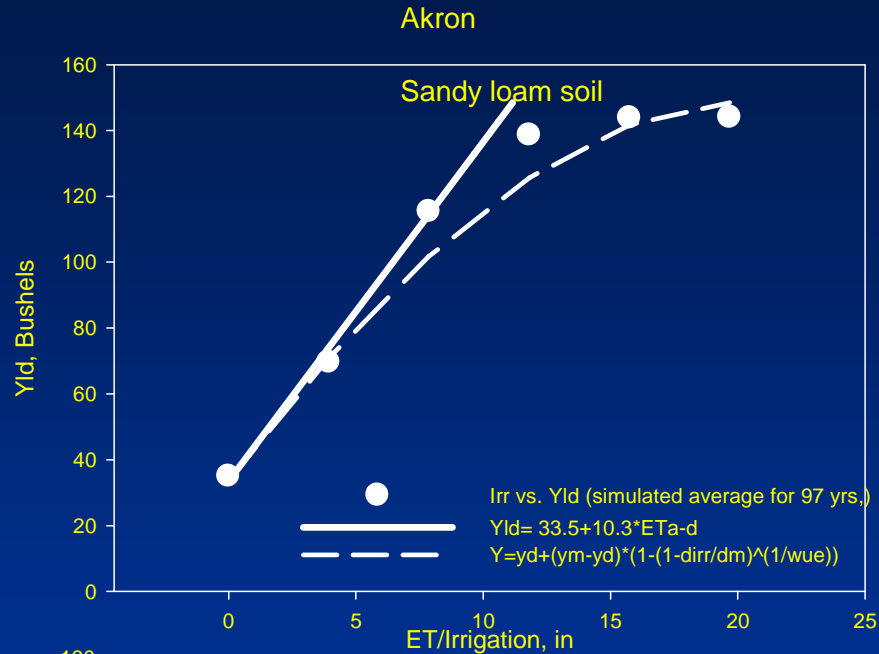
Irrigated Crops	Dryland Crops	Crop Prices
		Crop    Unit    Price \$/unit
Corn-grain	Corn-grain	Corn - grain    bu/ac    \$3.50
Corn-silage	Winter Wheat	Corn - silage    ton/ac    \$46.00
Winter Wheat	Alfalfa	Winter Wheat    bu/ac    \$3.00
Pinto Beans	Barley	Pinto Beans    cwt/ac    \$20.00
Alfalfa	Sunflower	Alfalfa    ton/ac    \$120.00
Sugarbeets	Sunflower	Sugarbeets    ton/ac    \$32.00
Barley	Canola	Barley    bu/ac    \$3.50
Alfalfa	Sorghum	Sunflower    cwt/ac    \$12.00
Sugarbeets	Millet	Canola    cwt/ac    \$4.00
Barley		Sorghum    bu/ac    \$3.00
		Millet    bu/ac    \$3.00

Screen 3 – greatest economic input detail

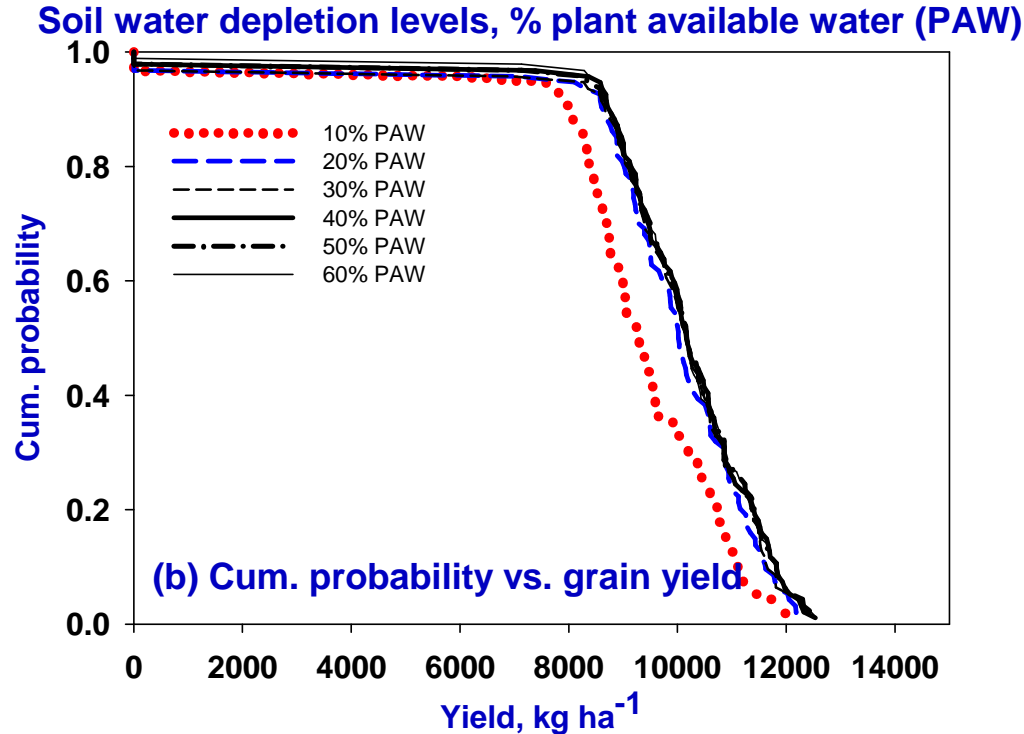
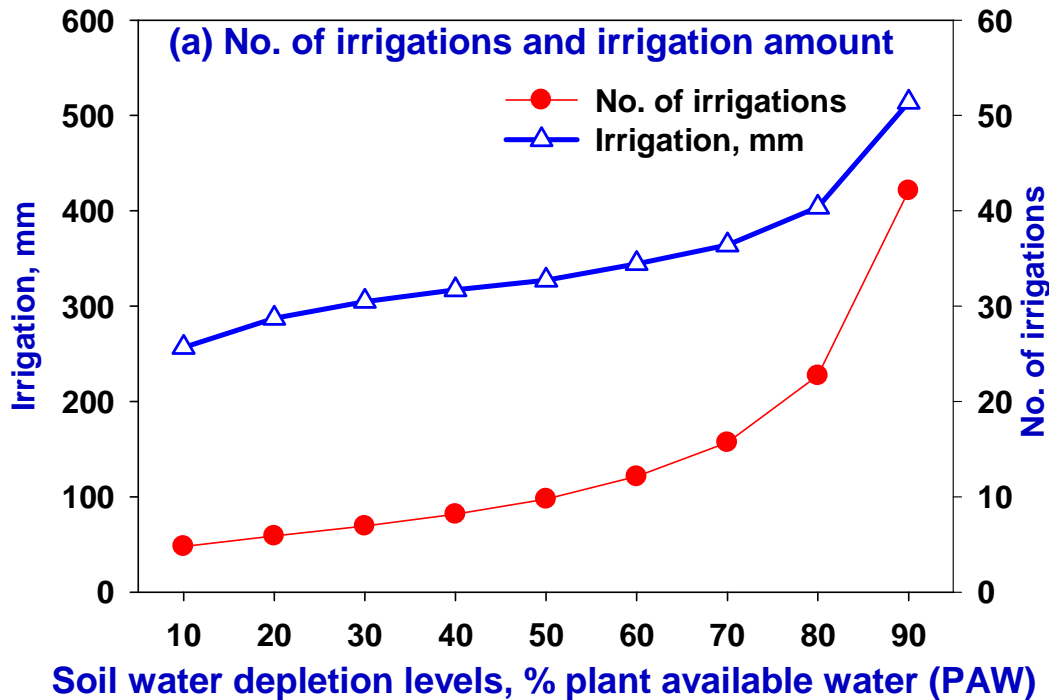
# Production Function for Water Optimizer



# Simulate yield response to irrigation and ETcrop



# SOIL WATER DEPLETION LEVEL FOR IRRIGATION

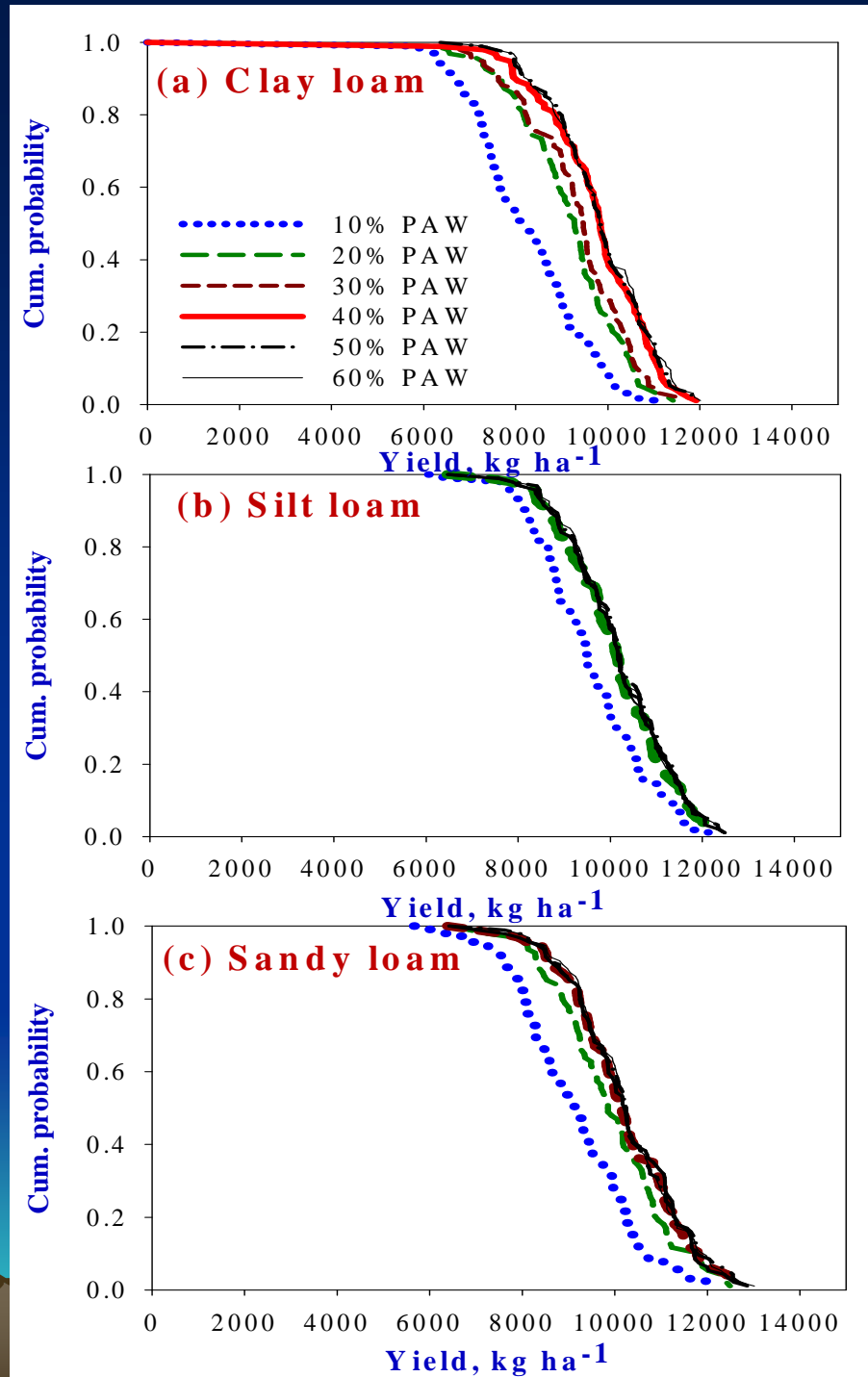


Simulated corn grain yield response to initiation of irrigation at different soil water depletion levels at Akron, Colorado

(a) number of irrigations and irrigation amounts simulated with the 94-yr weather record in response to initiation of irrigations at soil water depletions until 10 to 90% plant available water (PAW), and

(b) cumulative probabilities for corn grain yields simulated with the 94-yr weather record in response to initiation of irrigations at soil water depletions until 10 to 40% PAW. Bars represent one standard deviation above the mean.

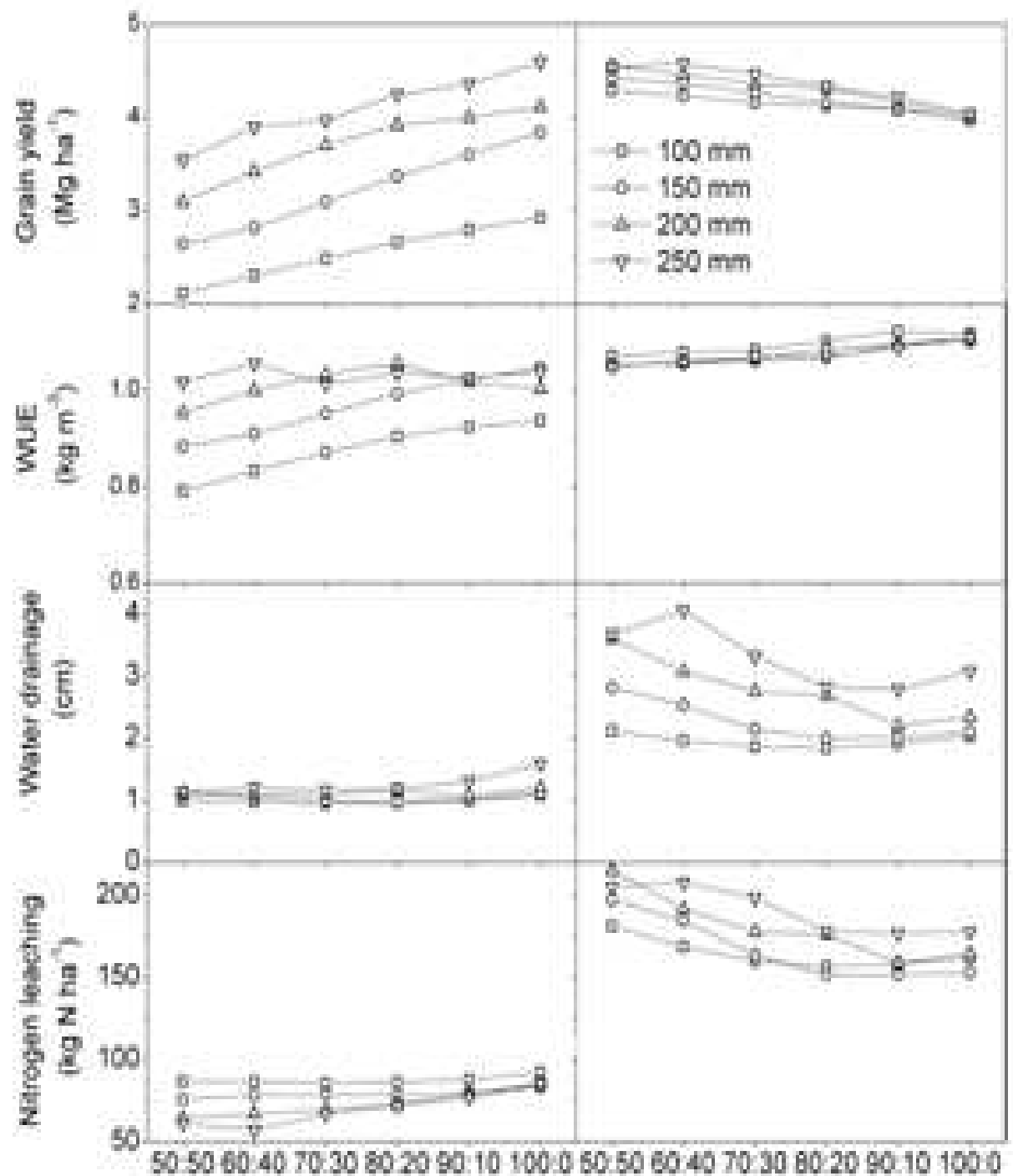
# Late Initiation of irrigation - Comparison between soils



# 3. Water and N Management for Wheat-Maize Double-Cropping System in China



Grain yield, water use efficiency (WUE), water drainage, and N leaching for wheat (A) and maize seasons (B) at the four limited available water levels (100 mm,  $\square$ ; 150 mm,  $\circ$ ; 200 mm,  $\triangle$ ; 250 mm,  $\nabla$ ) simulated by RZWQM2 from 1961 to 1999.

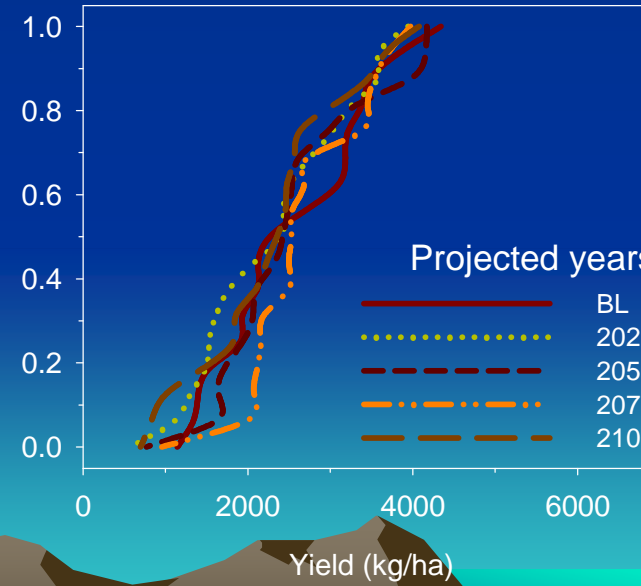
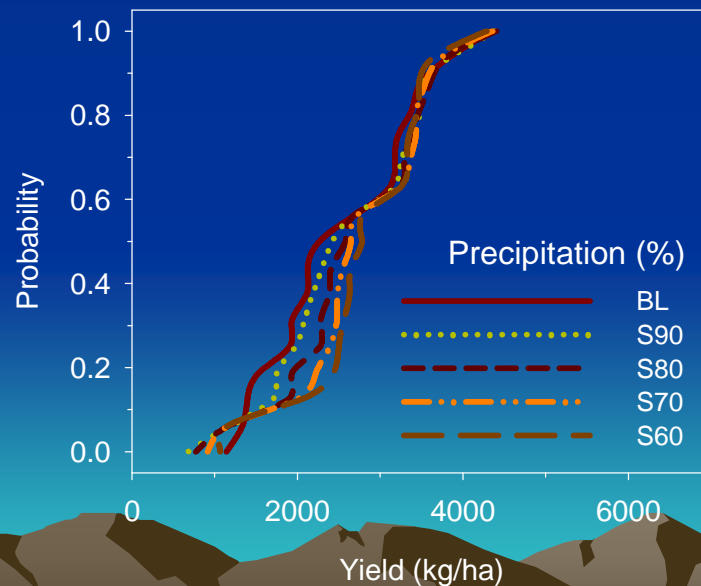
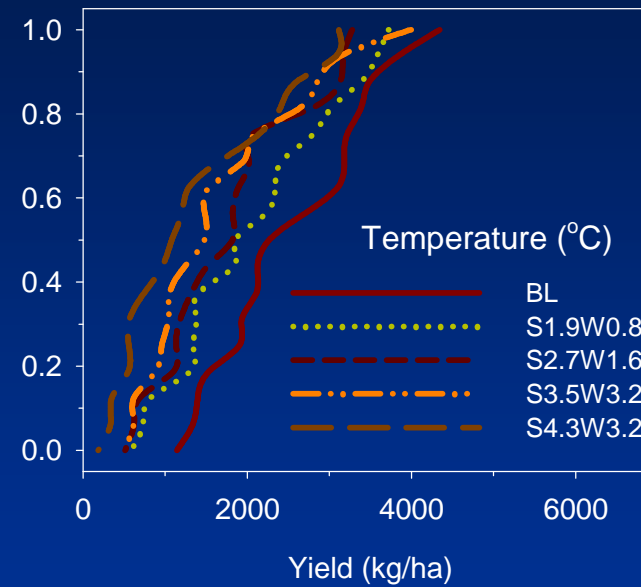
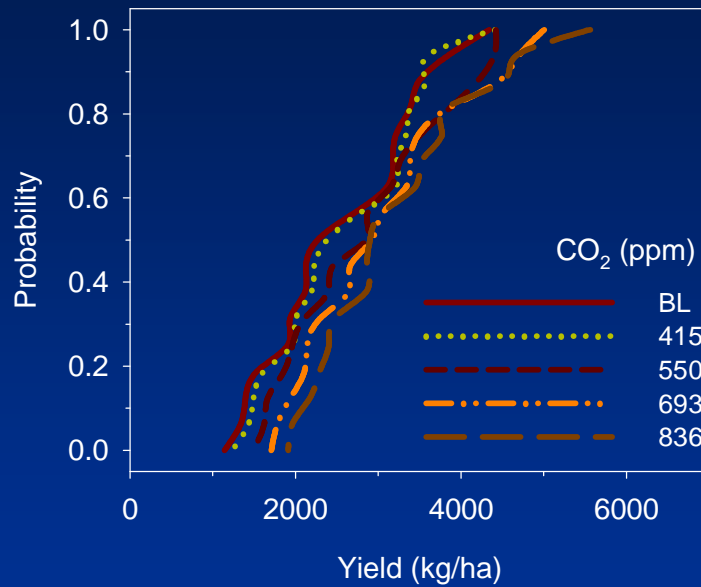


# Climate Change Effects on Cropping Systems in the Central Great Plains

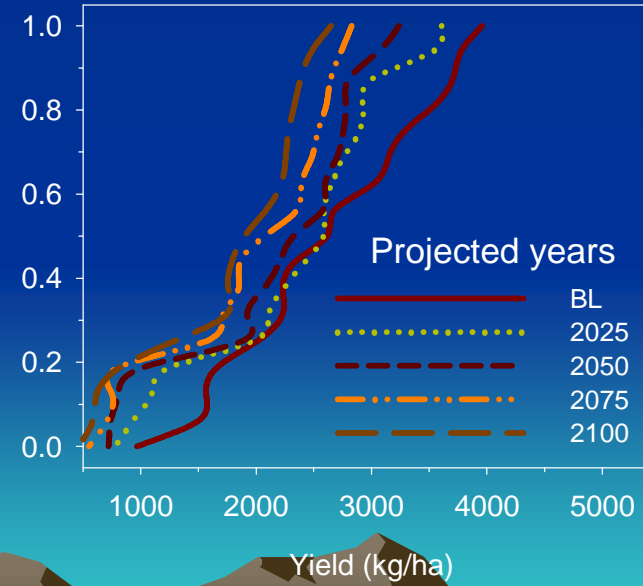
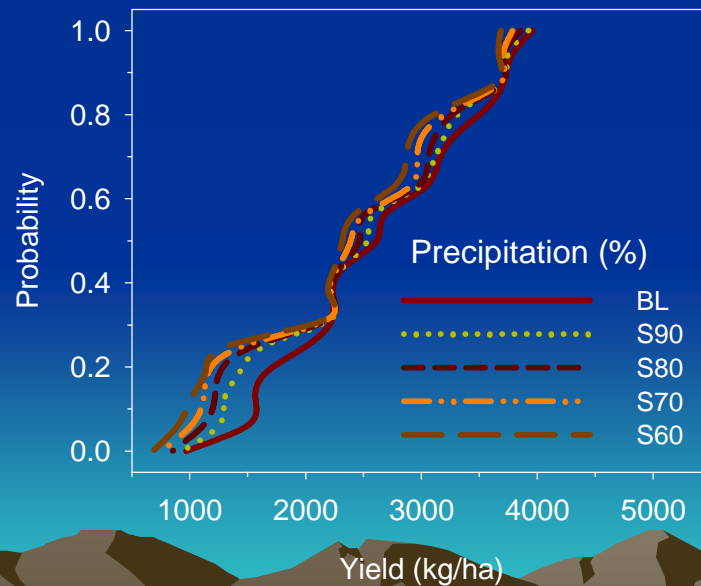
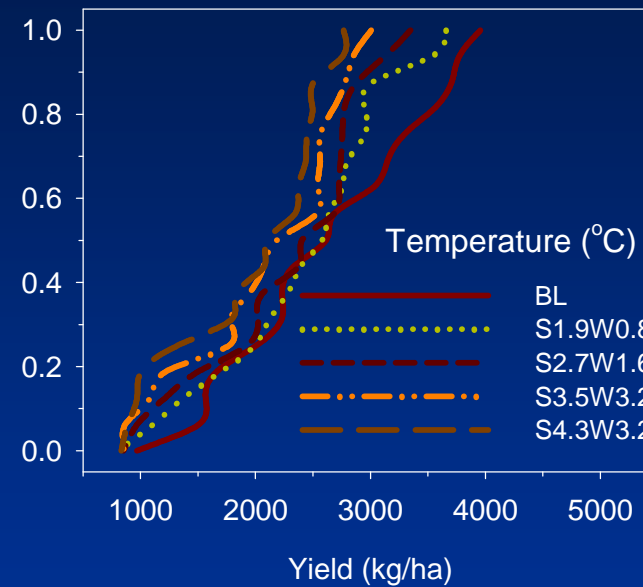
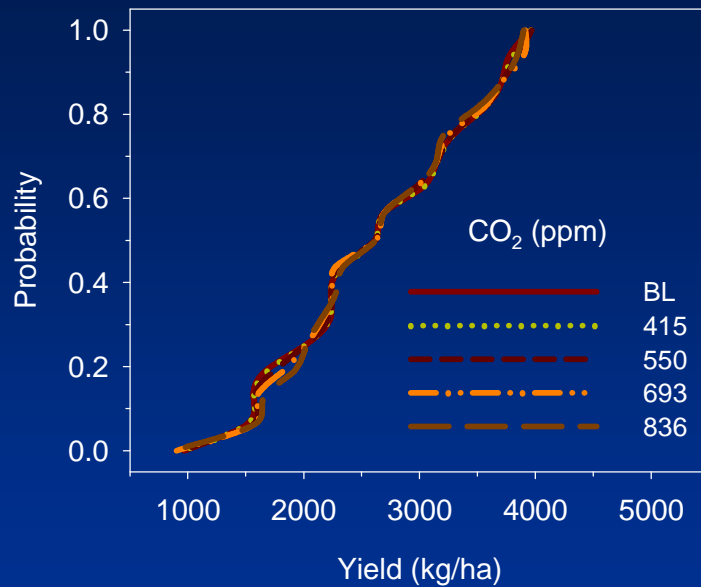




# Wheat Yield in WCF for Projected Scenarios Over the Baseline Experiment Years, 1992 to 2007



# Maize Yield in WCF for Projected Scenarios Over the Baseline Experiment Years, 1992 to 2007



**Thank you very much for your  
attention**



United States Department Of Agriculture  
Agricultural Research Service



# International Collaborations

1. Enhancing applications of existing models in field research
2. Easier parameterization of models for field scientists—effective properties of soils/crops
3. Improving model components, e.g., water stress response, N uptake, management effects, ----



# International Collaborations Contd.

4. Developing next-generation, stand-alone modular process components
5. Sharing model components and databases
6. Possibly developing a common modular modeling framework, with parameterization, visualization, and analysis tools




# ASA-SSSA-CSSA Initiatives to Advance Models and Applications

## A. A new book series on Advances in Ag Systems Modeling:

1. Response of crops to limited water
2. Introducing system models in field research
3. Root-soil interactions
4. Quantifying soil structure effects
5. Quantifying soil carbon changes in cropping systems

# ASA-SSSA-CSSA Initiatives to Advance Models and Applications

## B. Ad-hoc Committee on Modules, Models, and Databases:

1. E-publish well-documented code for process modules, after having them peer reviewed for quality of science, documentation and meta data, industry-standard code structure, and pre-published validation.
  2. E-publish the models built from peer-reviewed modules, after peer review of the model interfaces and pre-published validations.
- 

# Ad-hoc Committee Contd.

3. E-publish experimental databases needed for modules and models after peer review for quality of measurements, spatial representation, and completeness for calibration/validation
4. Maintain a library of peer-reviewed modules, models, and databases on the CSA website or website of a contractor or collaborator





# Purpose of the Proposed Activities

- Advance science through synthesis and quantification of processes and interactions in the form of code, which scientists can use to build future models.
- Promote sharing of modules, models, and databases, which will reduce duplication and encourage the best science in the modules contributed by the experts for each process.
- E-publishing and web storage of modules, models, and databases will provide publishing credit to the contributors, an essential motivation for time consuming tasks of using standard code structure and documentation.



- Important Note:

The above proposed activities are not supposed to interfere with or impede further development and applications of existing models. Rather, they are meant to help future enhancement of these models by providing peer-reviewed components.



The Tri-Societies welcome your  
feedback on these initiatives  
And future collaborations

