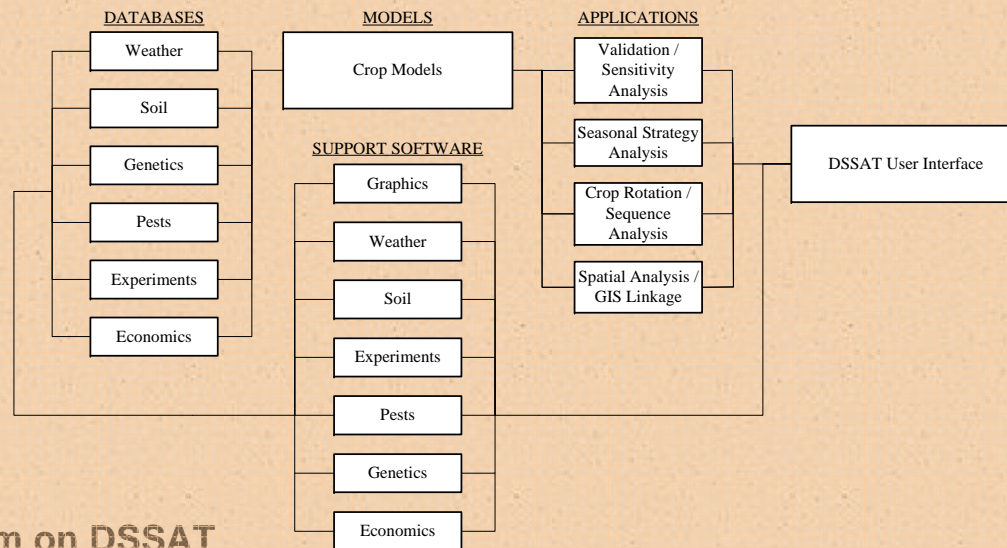


# Introduction to Systems Approach

- Basic Concepts
- Simple Crop Growth Model
- Example Uses of Crop System Models



# Information Needs in a Systems Approach

- Agricultural Science is not a science unless it predicts and tests its predictions (P. G. Cox, 1996)
- Understanding  $\longrightarrow$  Prediction  $\longrightarrow$  Control, Manage  
(H. Nix, 1983)
- A wealth of research information exists concerning the possibilities for change, the options available and the likely effects of a range of land use practices. However, it is less clear how this information is of use to, or can be filtered into, decision making processes. (J. Park and R. A. F. Seaton, 1996)

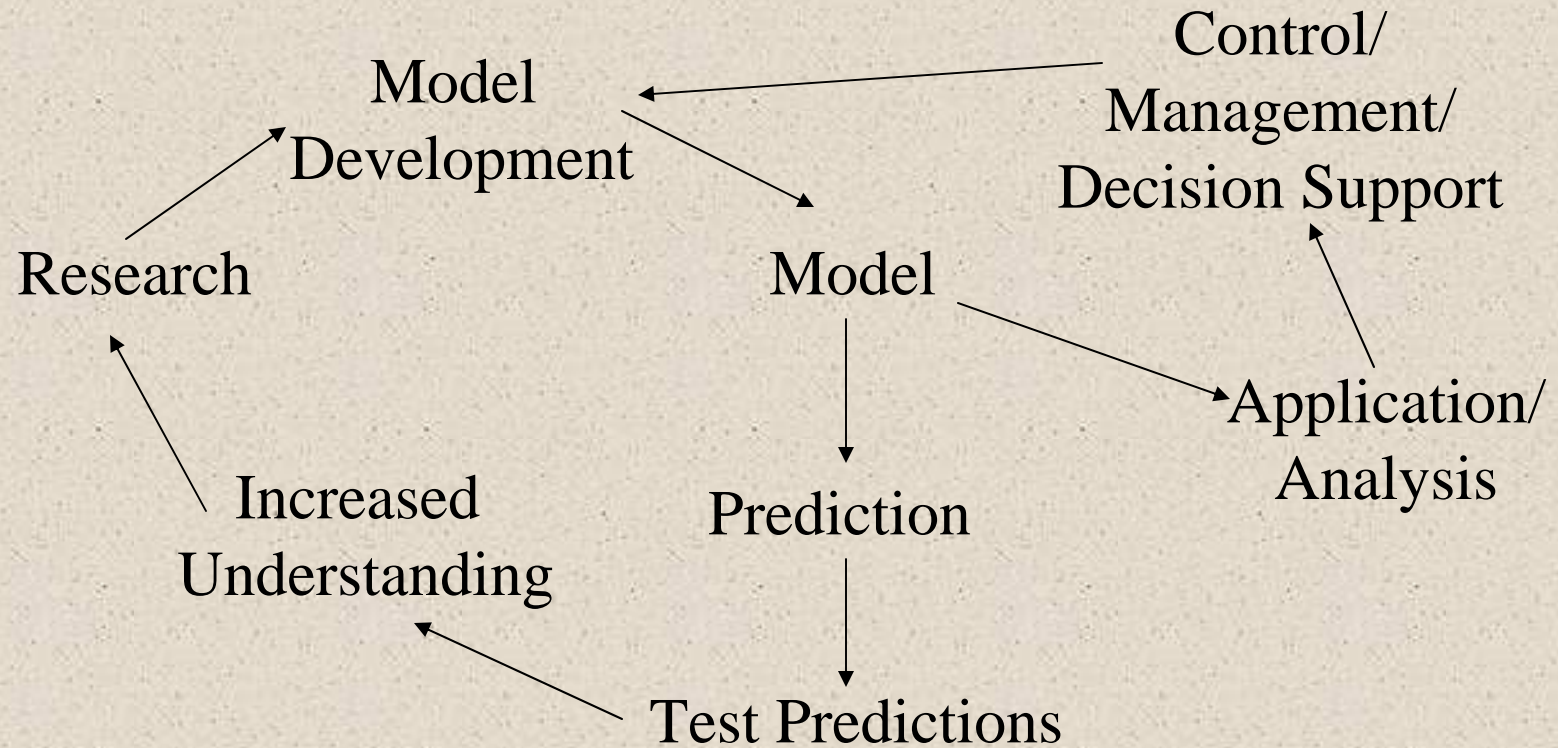
# Terminology

- System – Collection of Components
- Boundary – Separates System Components from its Environment
- Model – Mathematical Representation of System (Components & their Interactions)
- State Variables – Measures of System that Change over Time
- Environmental Variables (inputs) – system dynamics do not affect them
- Simulation – Solving a Model, predicting system behavior over time

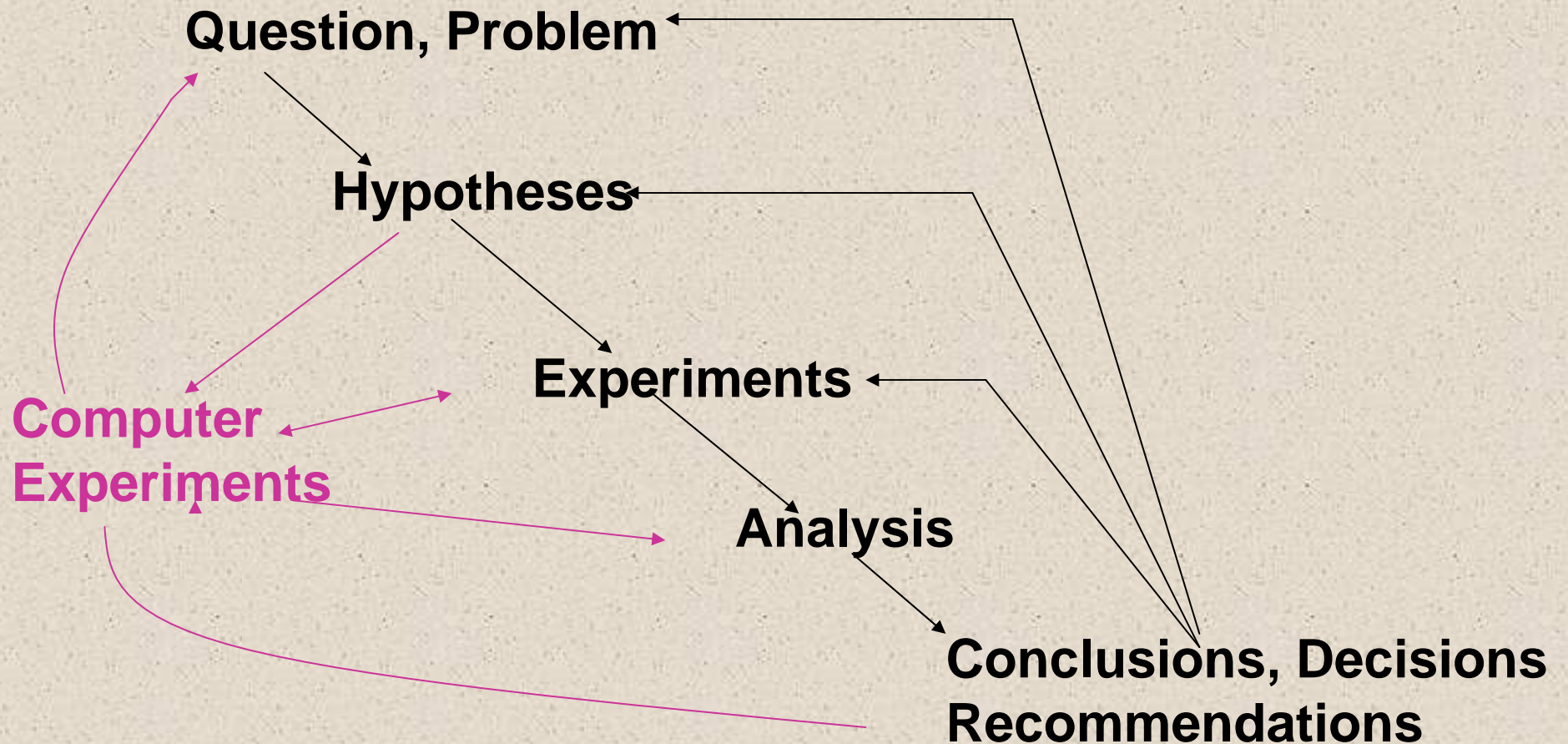
# Systems Approach

Research for  
Understanding

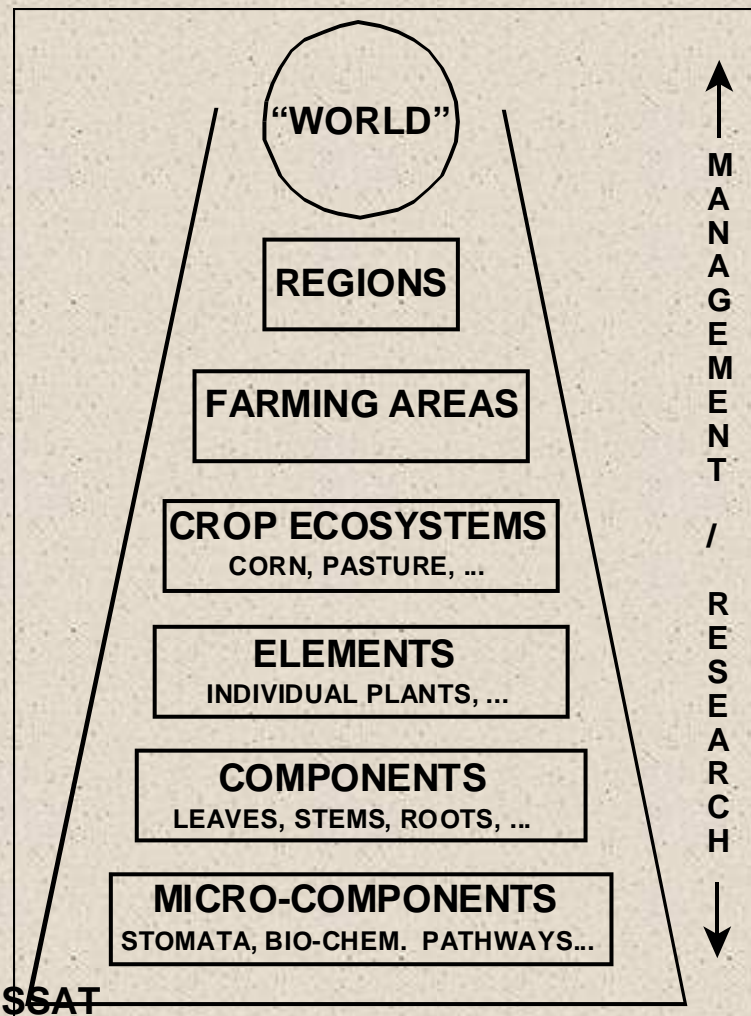
Problem Solving



# Incorporating **Crop Models** into Traditional Agronomic Research



# Hierarchy is Important in Biological/Ecological/Agricultural Systems



# Models

## Statistical Model Example

$$Y = a_0 + a_1 X_1 + a_2 X_2 + \varepsilon$$

Where

$Y$  = dependent variable

$X_i$  = independent variables,  $i = 1, 2$  in this example

$a_i$  = regression coefficients, and

$\varepsilon$  = residual error

# Dynamic Models

Biophysical Model Example

$$\bar{X}(t) = f\{\bar{X}, \bar{p}, \bar{u}(t), \bar{\omega}(t), t\}$$

Where

- $\bar{X}(t)$  = vector of variables that describe state of system at time t
- $f$  = functional relationships among variables
- $\bar{p}$  = vector of parameters or coefficients associated with physiological, physical relationships of components in the model
- $\bar{u}(t)$  = vector of control or management variables, varying with time t
- $\bar{\omega}(t)$  = vector of input variables, varying with time t



# A Simple Dynamic Model

Rate of Change of  $N = k * N$

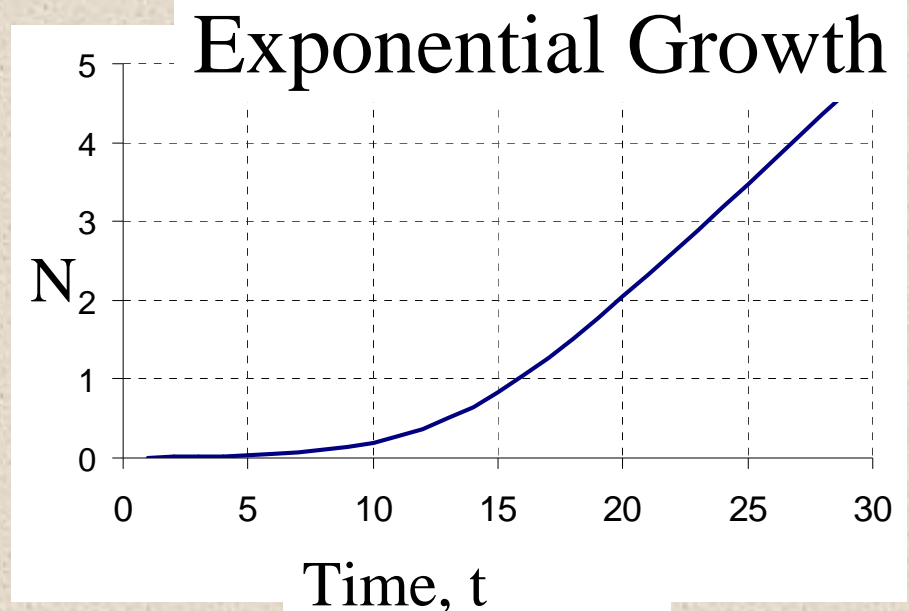
$$dN_t/dt = k * N_t$$

Which can be approximated by

$$(N_{t+dt} - N_t)/dt = k * N_t$$

Solving the model

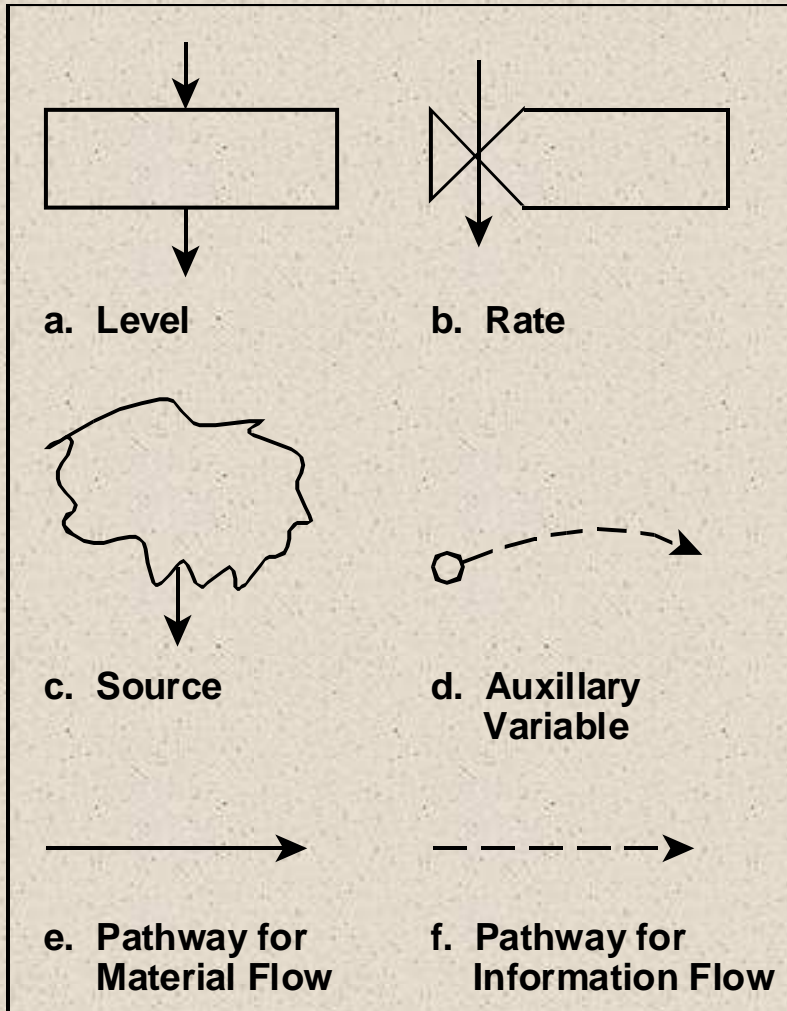
$$N_{t+1} = N_t + k * N_t * dt$$



# Modeling

- Development of equations that describe the relationships among state variables, parameters, control/management inputs, and environmental inputs. In other words, developing the  $f$  in the previous slide

# Forrester Diagrams; Developing and Communicating Conceptual Model of System



General Equations for *Level i* Dynamics:

$$dx_i / dt = \sum_j I_{i,j} - \sum_k O_{i,k}$$

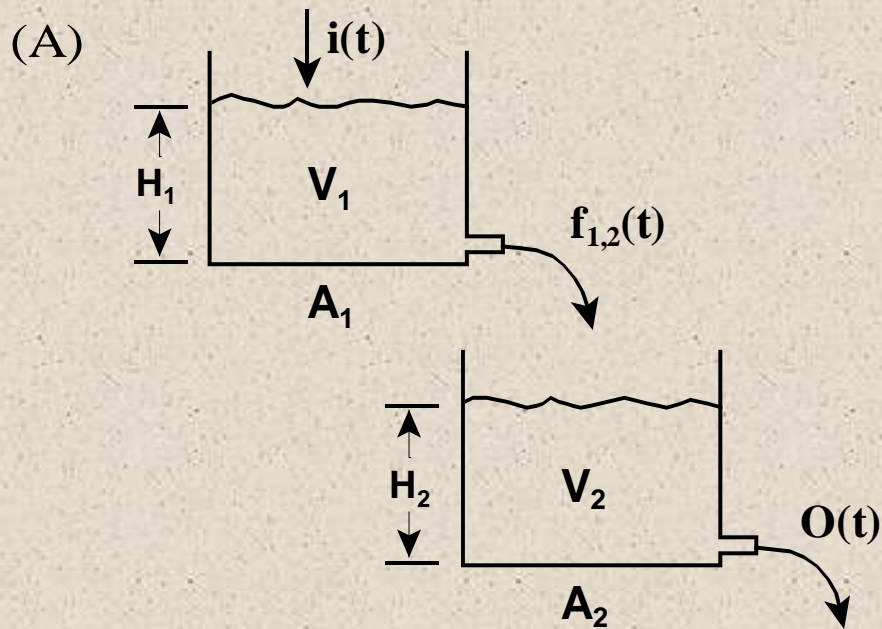
where  $x_i$  = level of  $i^{\text{th}}$  variable,

$dx_i / dt$  = rate of change in the level of the  $i^{\text{th}}$  variable,

$I_{i,j}$  = rate of flow into level  $i$ , from source  $j$ ,

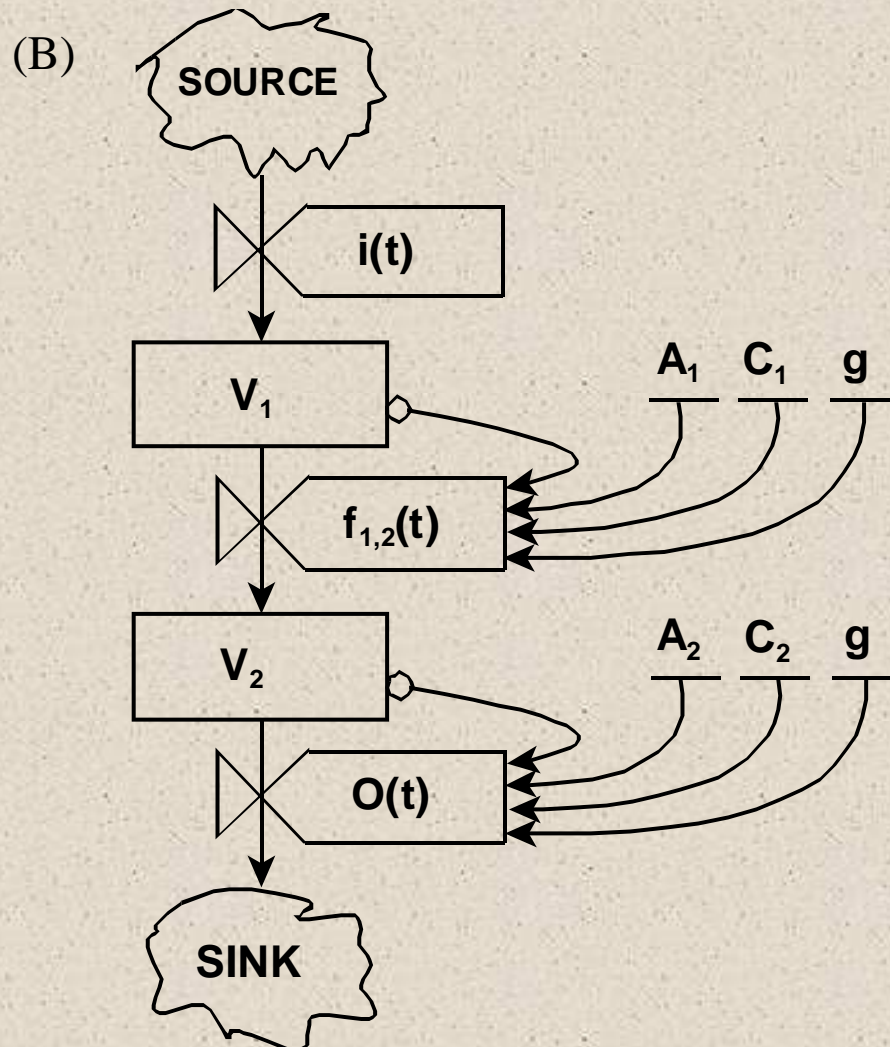
$O_{i,k}$  = rate of flow out of level  $i$ , to source  $k$ .

# Simple 2- State Variable Example



Two tanks, water flow between them

# Forrestor Diagram, Two-tank System



Equations of Conservation:

$$dV_1/dt = i(t) - f_{1,2}(t)$$

$$dV_2/dt = f_{1,2}(t) - O(t)$$

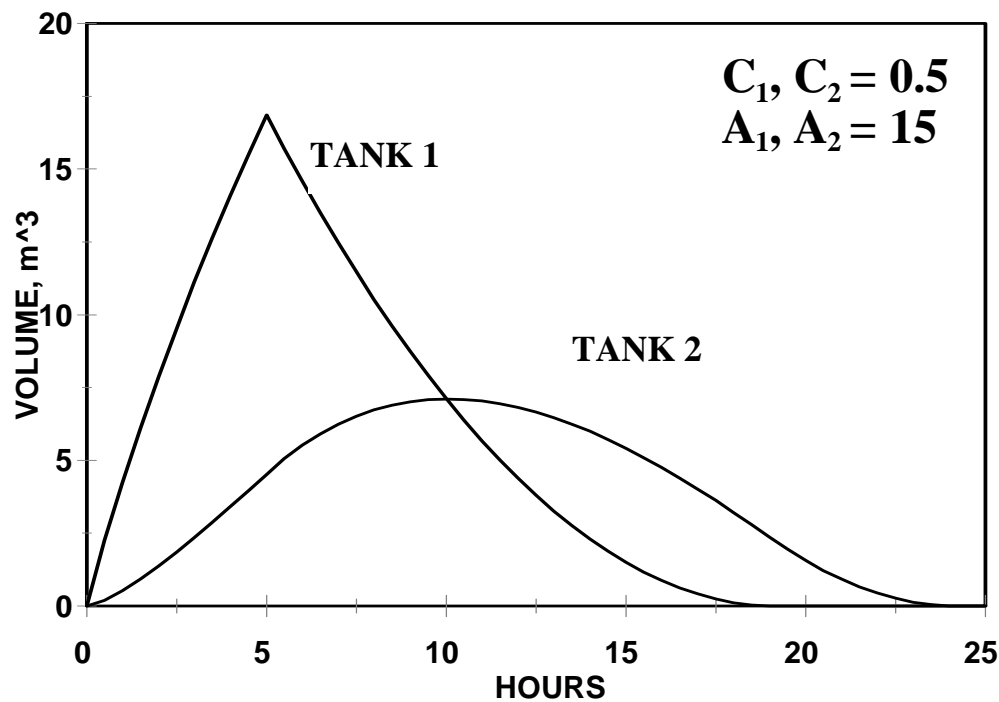
Final Equations:

$$dV_1/dt = i(t) - C_1(2gV_1/A_1)^{1/2}$$

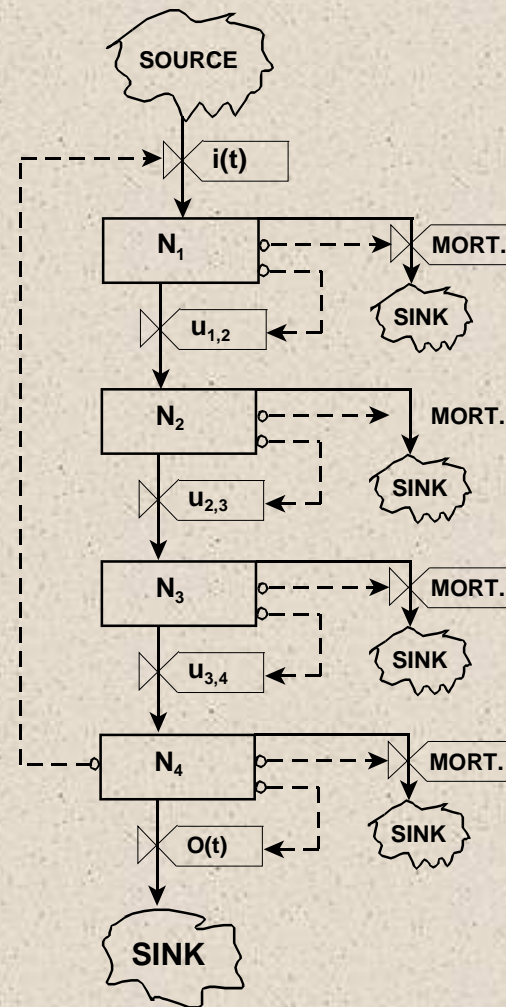
$$dV_2/dt = C_1(2gV_1/A_1)^{1/2} - C_2(2gV_2/A_2)^{1/2}$$

# Simulation Results

Constant  $i(t)$  for 5 hours, specific values of coefficients



# Forrester Diagram for Insect Population Model



## BIOLOGICAL MODEL EXAMPLES

- Crop Growth
- Soil Organic Matter
- Microbial Growth
- Insect Populations
- Predator-Prey Populations
- Bio Reactors
- Fish Growth and Reproduction
- Heart Function
- Animal Temperature Regulation
- Eutrophication Processes
- Chemical Transport in Soil, Water
- Food Chain
- Livestock growth
- Plant and Animal Genetics



# Crop System Models

- Crop growth and yield models have been developed for various purposes, among others:

precision agriculture

yield forecasting

irrigation management

crop sequencing

nutrient management

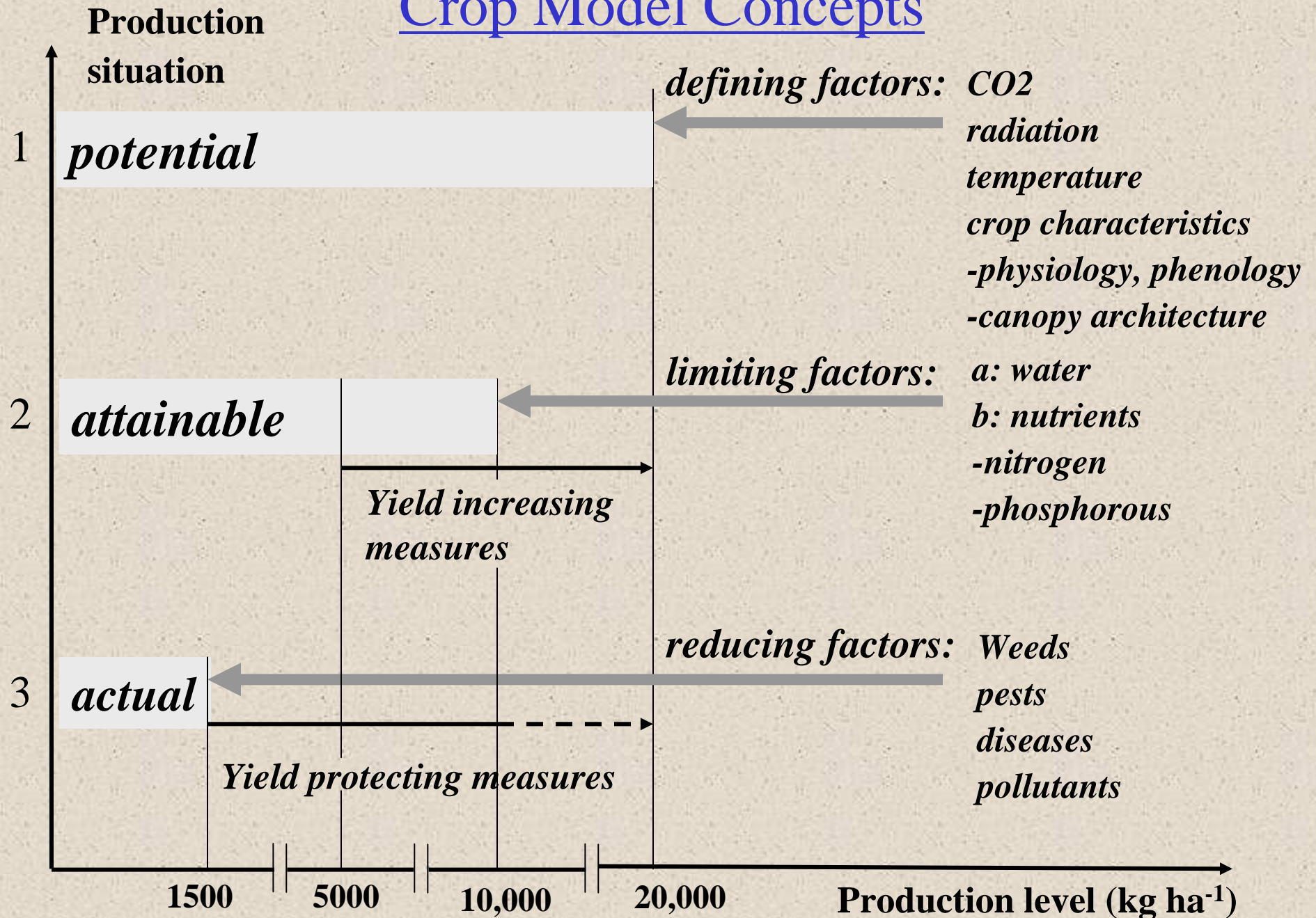
pest management

land use planning

climate change assessment

economic risk

# Crop Model Concepts



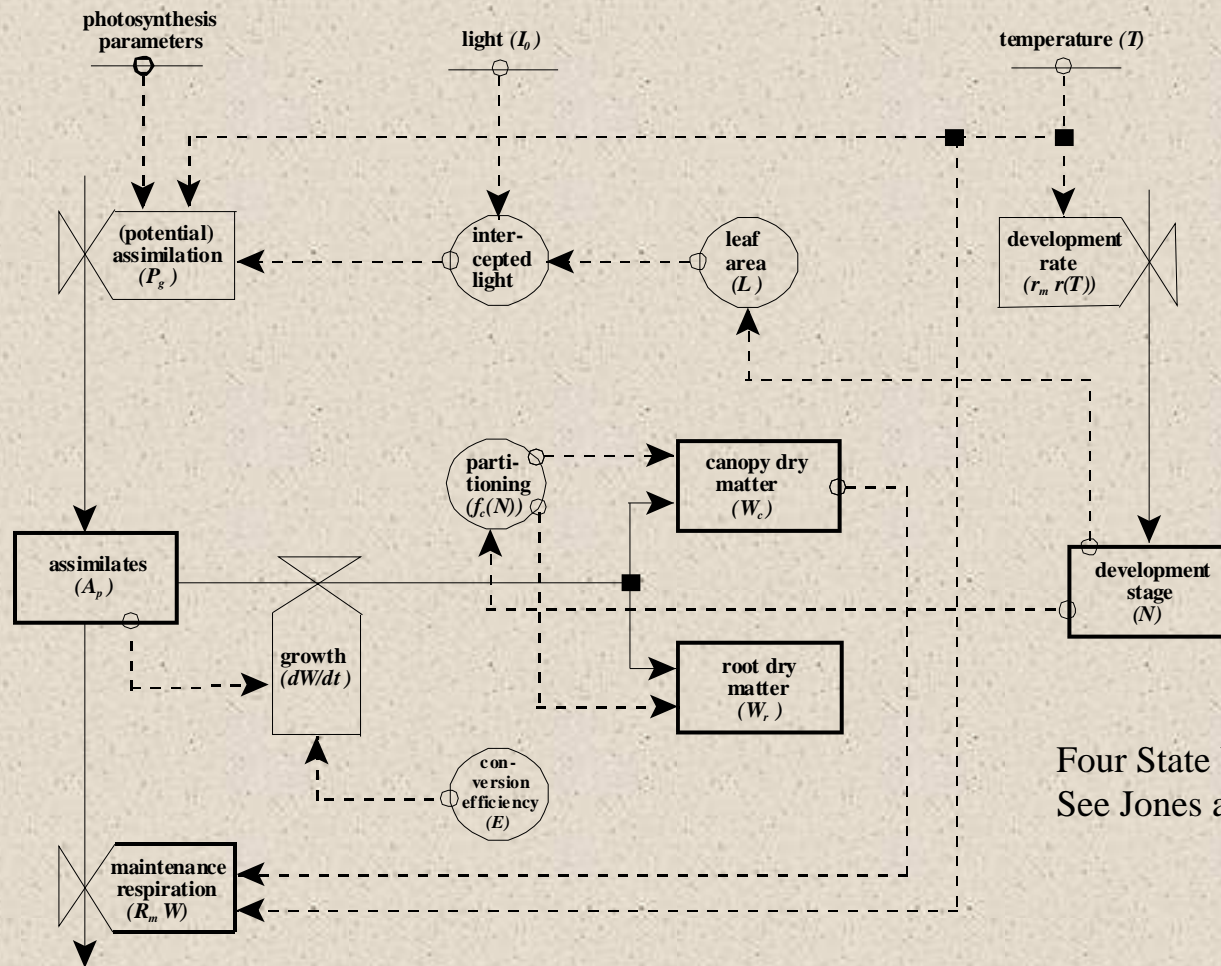
Source: World Food Production: Biophysical Factors of Agricultural Production, 1992.

# Simple Crop Model

## Reference:

J.W. Jones and J.C. Luyten, 1998. Simulation of biological processes. Pages 19-62 in: R.M. Peart and R.B. Curry (Eds) Agricultural Systems Modeling and Simulation.

# Simple Crop Model



Four State Variables.  
See Jones and Luyten, 1998

# Rate of Crop Dry Weight Growth

- Photosynthesis minus maintenance respiration

$$dW/dt = E (P_g - R_m W)$$

where

$dW/dt$  = rate of dry weight growth of the crop, g [tissue] m<sup>-2</sup> h<sup>-1</sup>,

$W$  = total plant dry weight, g m<sup>-2</sup>,

$R_m$  = maintenance respiration rate, g [CH<sub>2</sub>O] g<sup>-1</sup> [tissue] h<sup>-1</sup>,

$E$  = conversion efficiency of CH<sub>2</sub>O to plant tissue, g [tissue] g<sup>-1</sup> [CH<sub>2</sub>],

$P_g$  = canopy gross photosynthesis rate, g [CH<sub>2</sub>O] m<sup>-2</sup> [ground] h<sup>-1</sup>.

# Canopy Photosynthesis (1)

- Many different models. We used the Acock et al. (1978) model.
- $P_g$  is a function of light,  $\text{CO}_2$ , temperature and plant size.

$$P_g = D \frac{\tau C p(T)}{K} \text{Ln} \left[ \frac{\alpha K I_o + (1 - m) \tau C}{\alpha K I_o \exp(-KL) + (1 - m) \tau C} \right]$$

where

$D$  = coefficient to convert photosynthesis calculations from  $\mu\text{mol} [\text{CO}_2] \text{m}^{-2}\text{s}^{-1}$  to  $\text{g} [\text{CH}_2\text{O}] \text{m}^{-2}\text{h}^{-1}$ ,

$\tau$  = leaf conductance to  $\text{CO}_2$ ,  $\mu\text{mol} [\text{CO}_2] \text{m}^{-2}[\text{leaf}] \text{s}^{-1}$

$C$  =  $\text{CO}_2$  concentration of the air,  $\mu\text{mol} [\text{CO}_2] \text{mol}^{-1} [\text{air}]$ ,

$p(T)$  = dimensionless function of temperature,

$\alpha$  = leaf light utilization efficiency,  $\mu\text{mol} [\text{CO}_2] \mu\text{mol}^{-1} [\text{photon}]$ ,

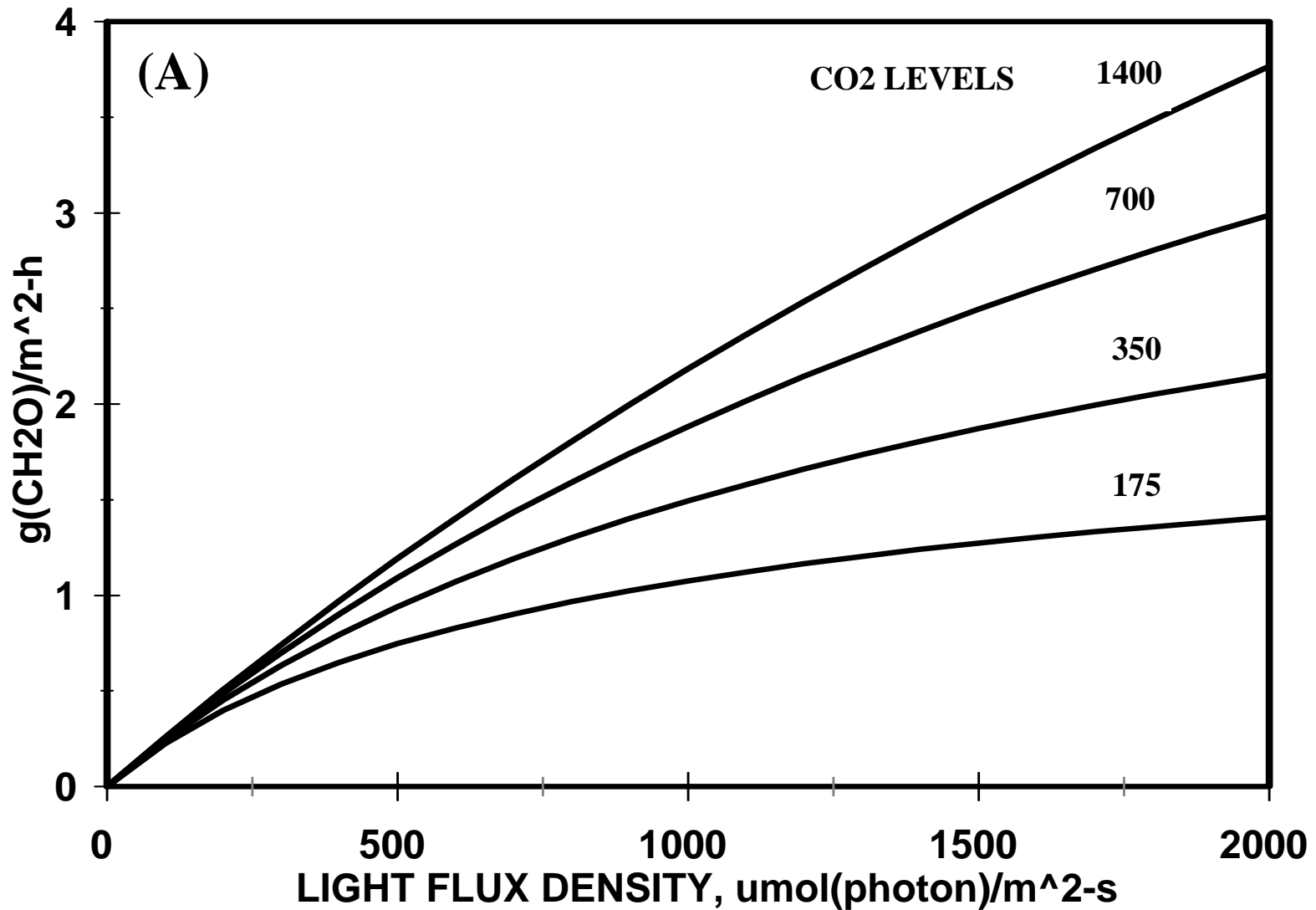
$K$  = canopy light extinction coefficient,

$I_o$  = light flux density at the top of the canopy,  $\mu\text{mol} [\text{photon}] \text{m}^{-2} [\text{ground}] \text{s}^{-1}$ ,

$m$  = light transmission coefficient of leaves,

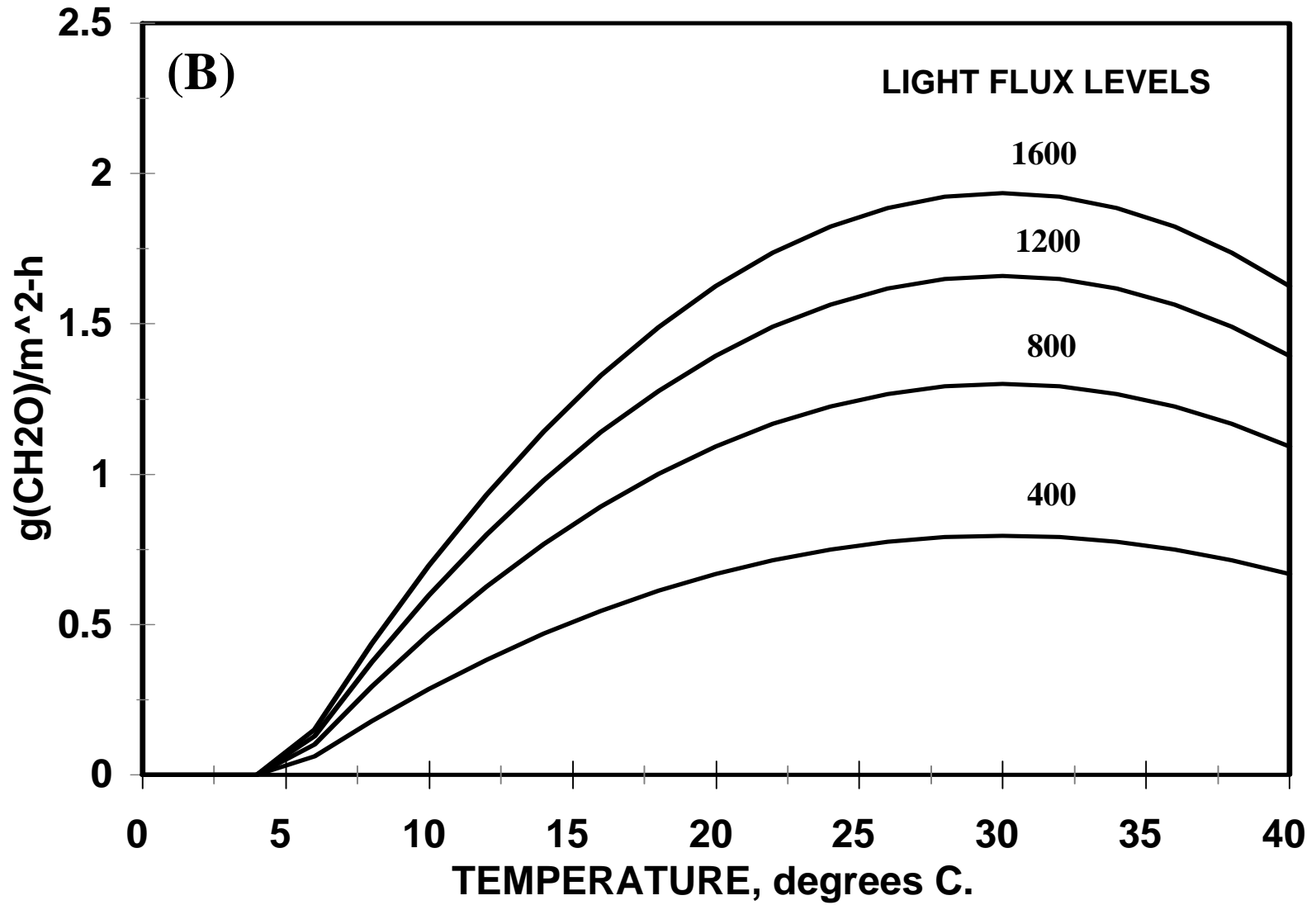
$L$  = canopy leaf area index,  $\text{m}^2 [\text{leaf}] \text{m}^{-2} [\text{ground}]$ .

# PHOTOSYNTHESIS vs. LIGHT FLUX



*Constant: LAI=4; T=30 °C*

# PHOTOSYNTHESIS vs. TEMP.



*Constant: LAI=4; CO<sub>2</sub> = 350*



# Respiration (maintenance)

- Loss of CO<sub>2</sub> from plants due to breakdown and resynthesis of existing tissue

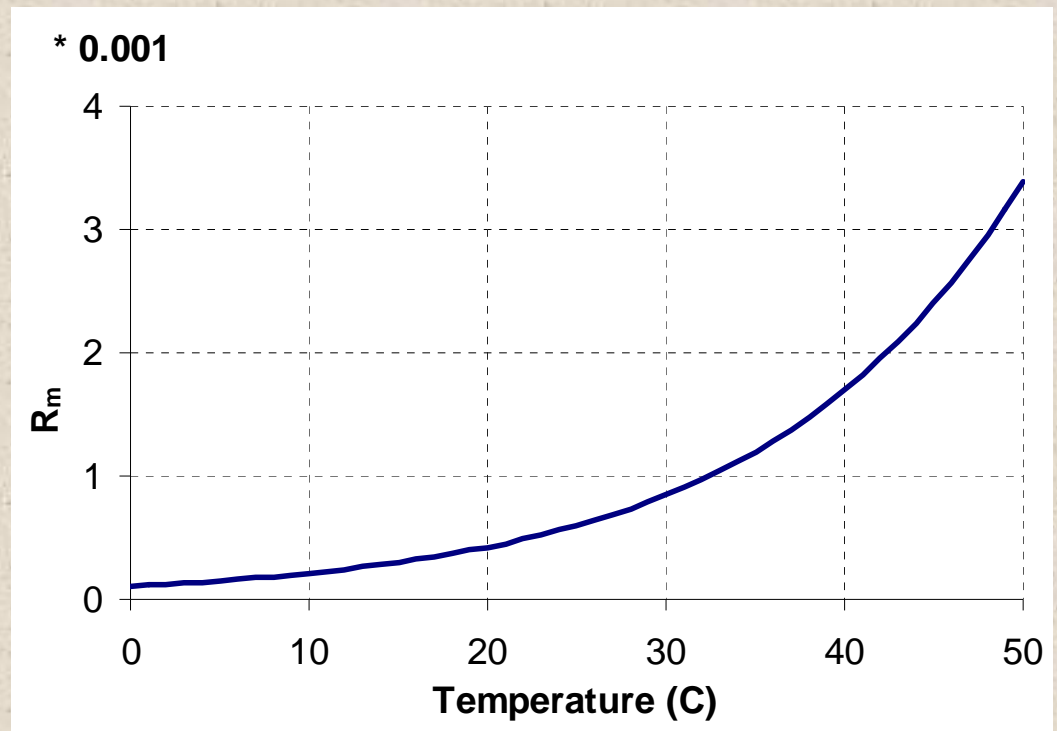
$$R_m = k_m \exp(0.0693[T-25])$$

where

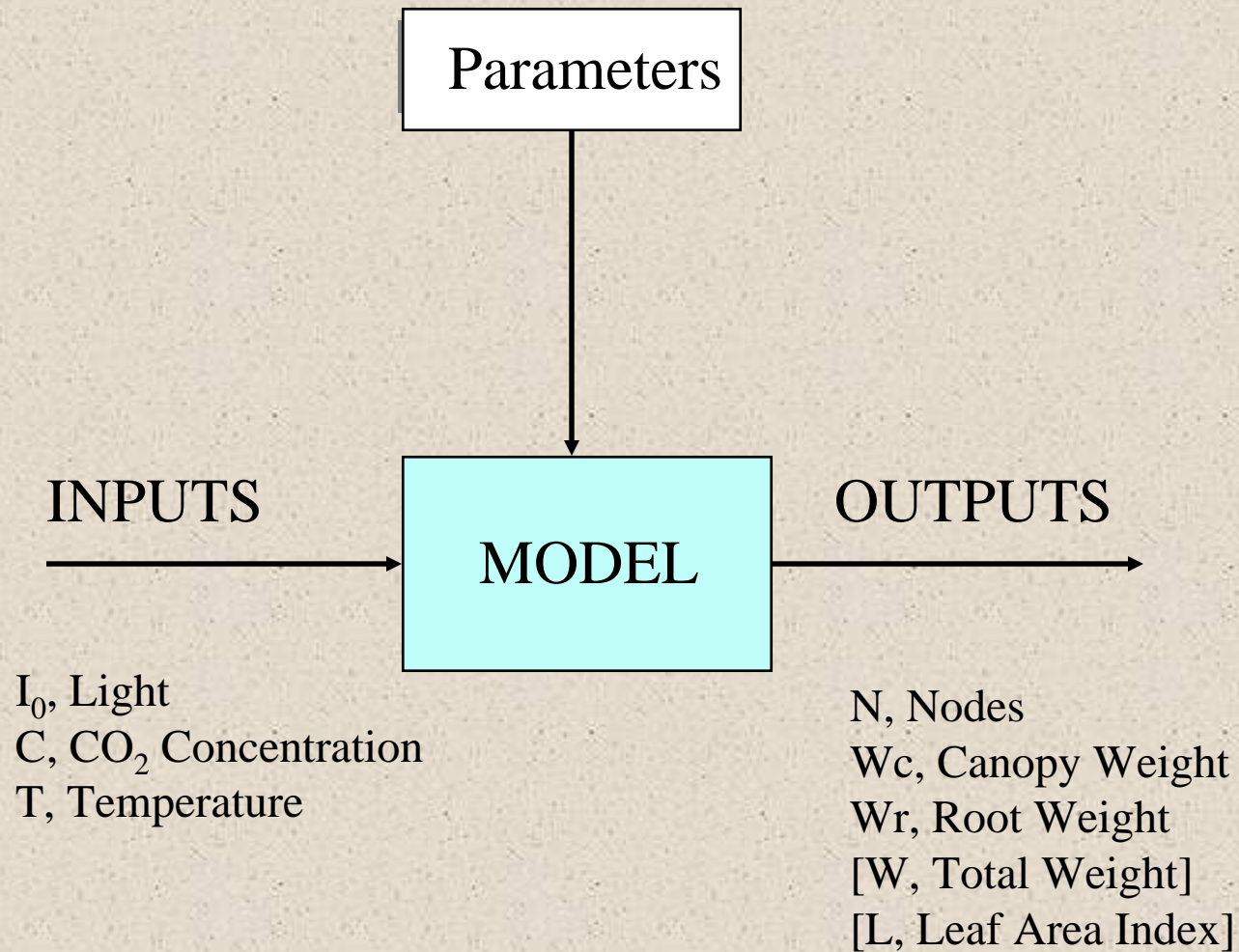
$R_m$  = maintenance respiration rate,  
g [CH<sub>2</sub>O] g<sup>-1</sup> [tissue] h<sup>-1</sup>,

T = temperature,

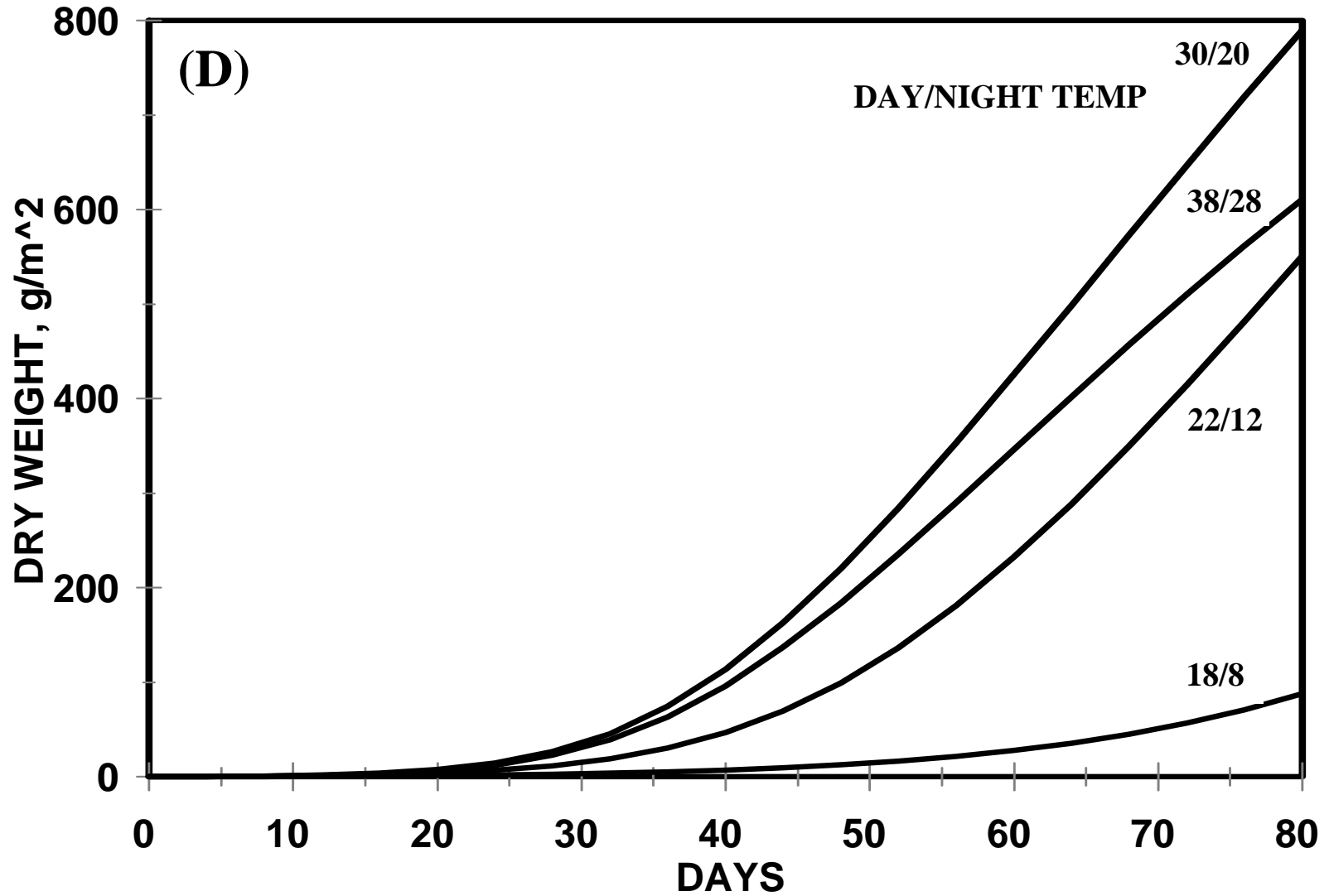
$k_m$  = respiration rate at 25°C,  
g [CH<sub>2</sub>O] g<sup>-1</sup> [tissue] h<sup>-1</sup>,



## SIMPLE CROP GROWTH MODEL EXAMPLE

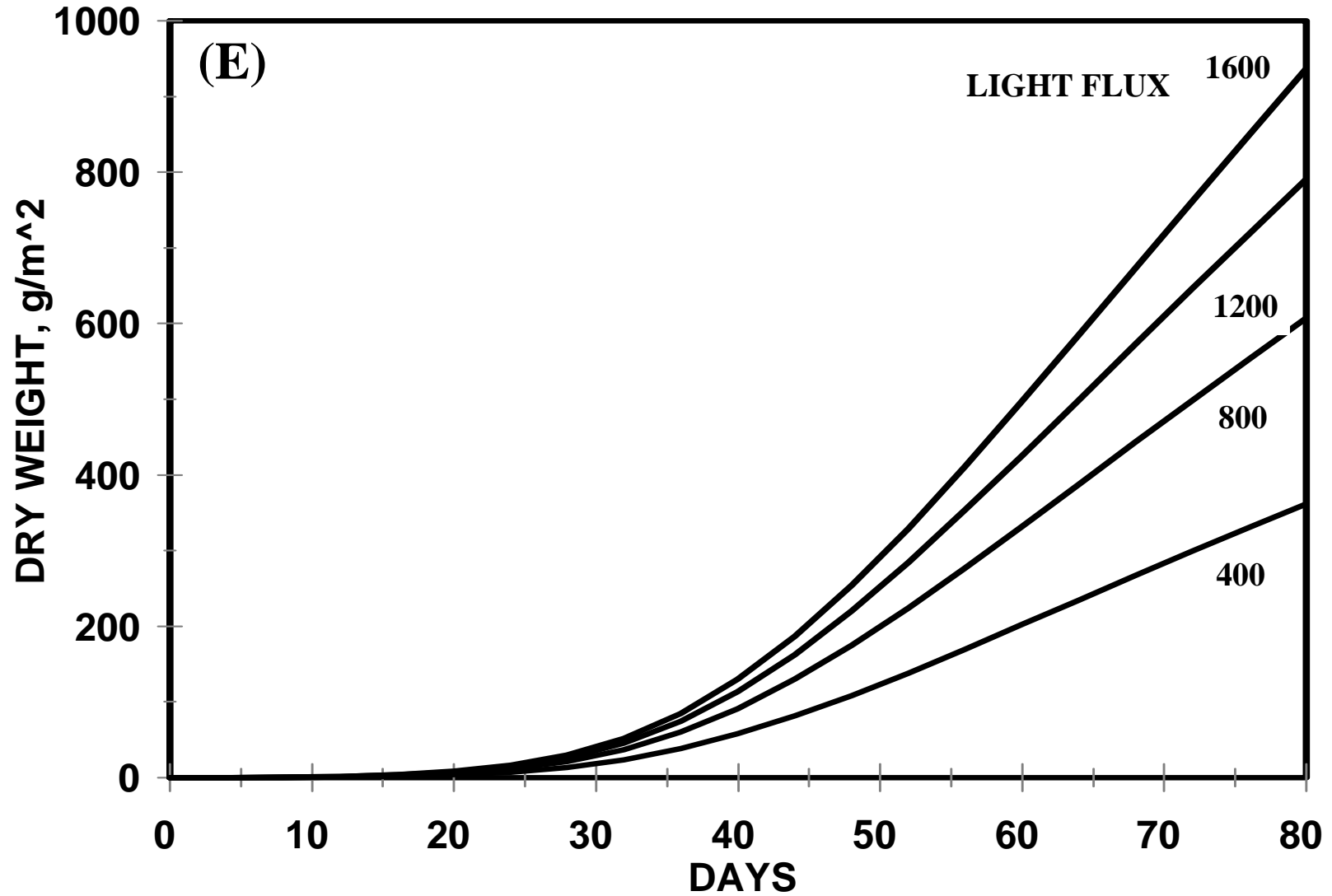


# DRY WEIGHT vs. TIME



**Constant:  $CO_2 = 350$ , Light flux = 1200; 12 hr days**

# DRY WEIGHT vs. TIME

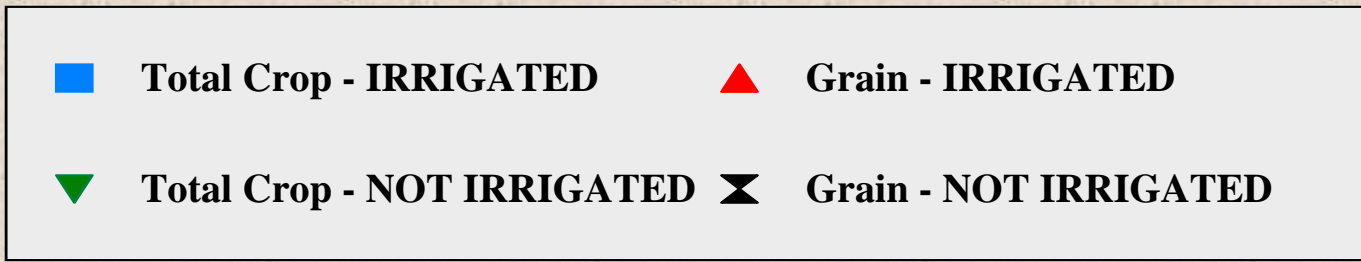
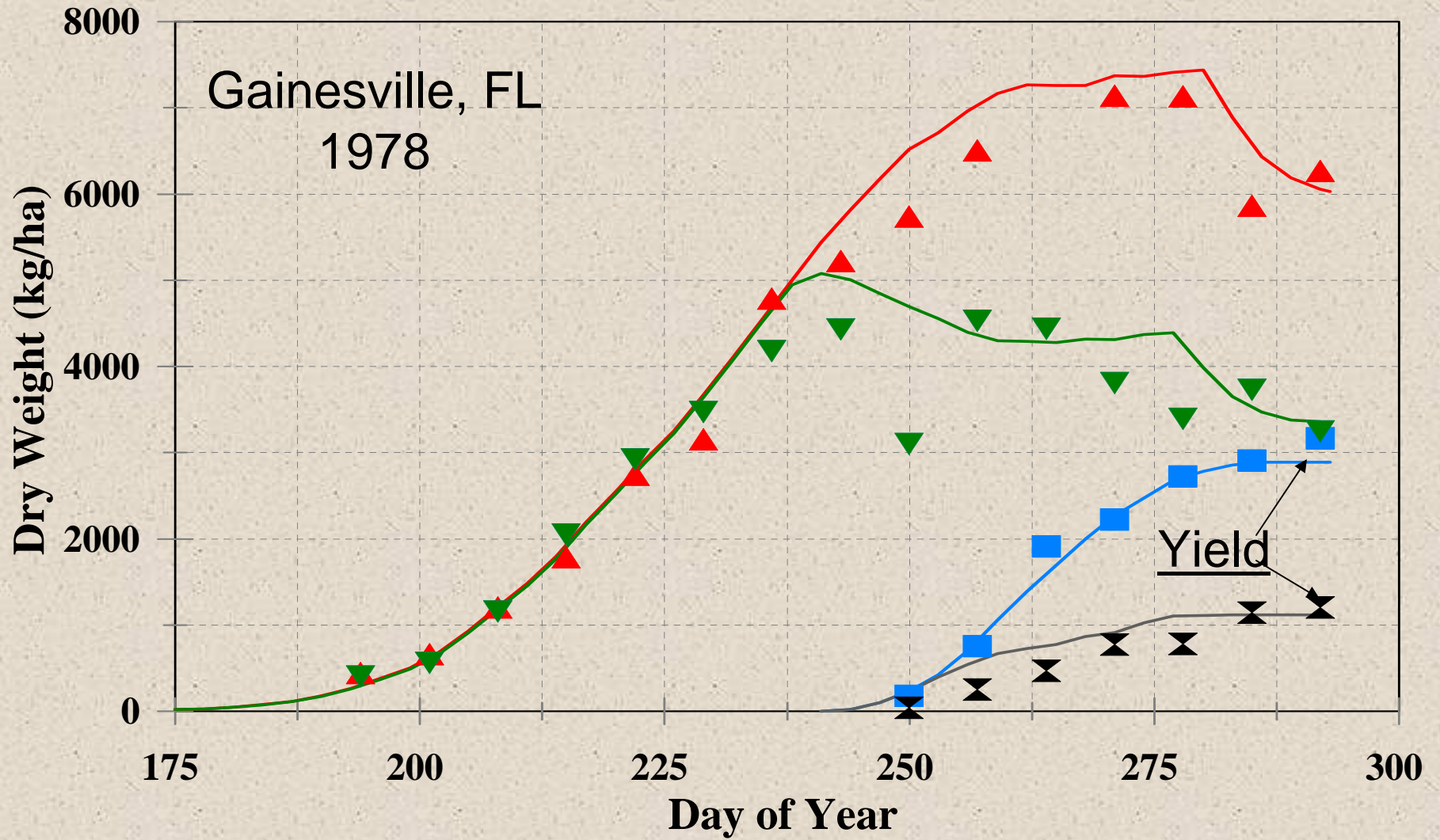


*Constant: CO<sub>2</sub> = 350, 12 hr days; day/night temp = 30/20 °C*

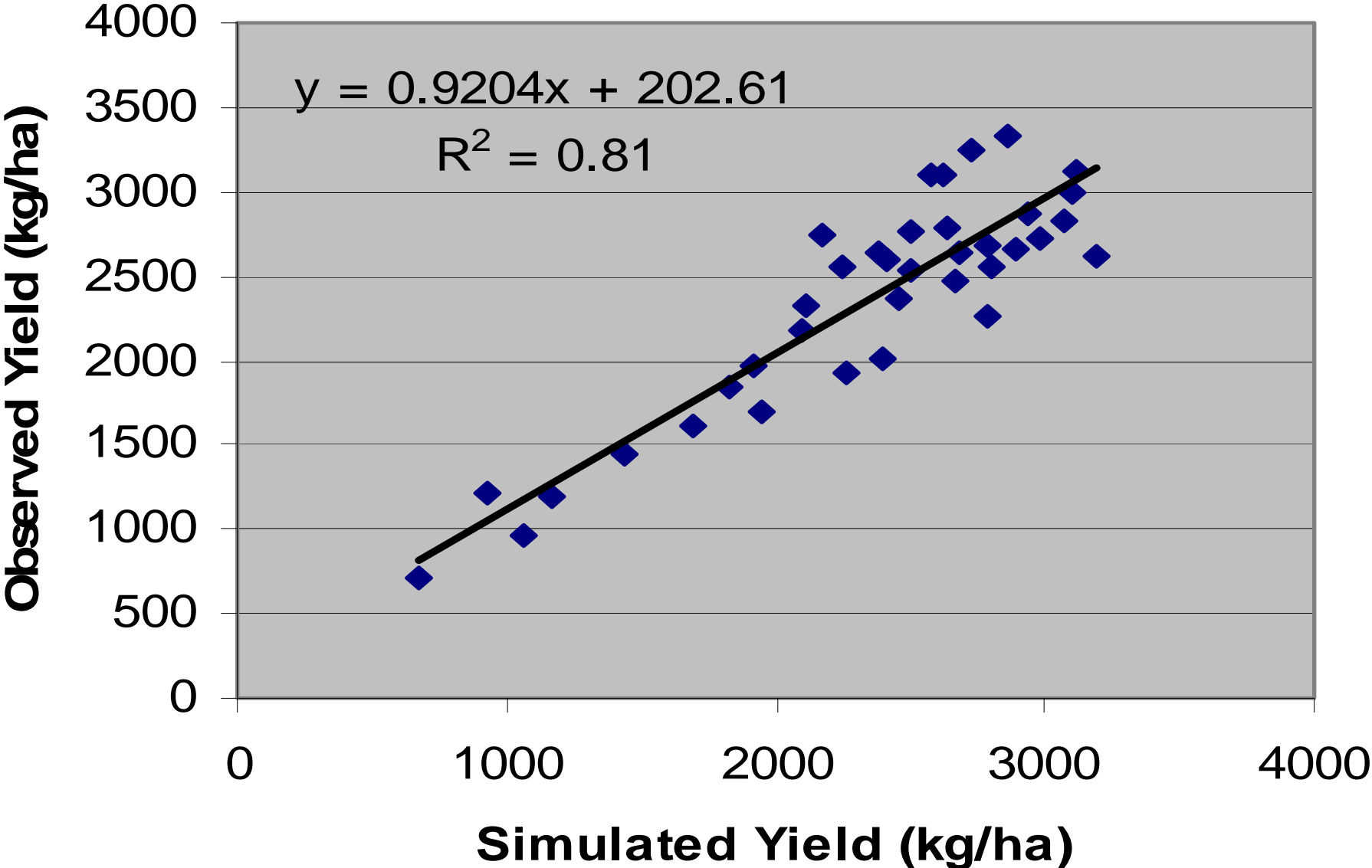
# Evaluation of Crop Models for Intended Applications is Critically Important

- Conduct sensitivity analysis of model, critically evaluate results based on existing knowledge, trends
- Demonstrate ability to re-create results from existing and/or new experiments
- Do conclusions from model agree with conclusions from experiments?
- Evaluate using independent data
- Be careful and ensure that inputs are accurate
- Be critical; characterize limitations

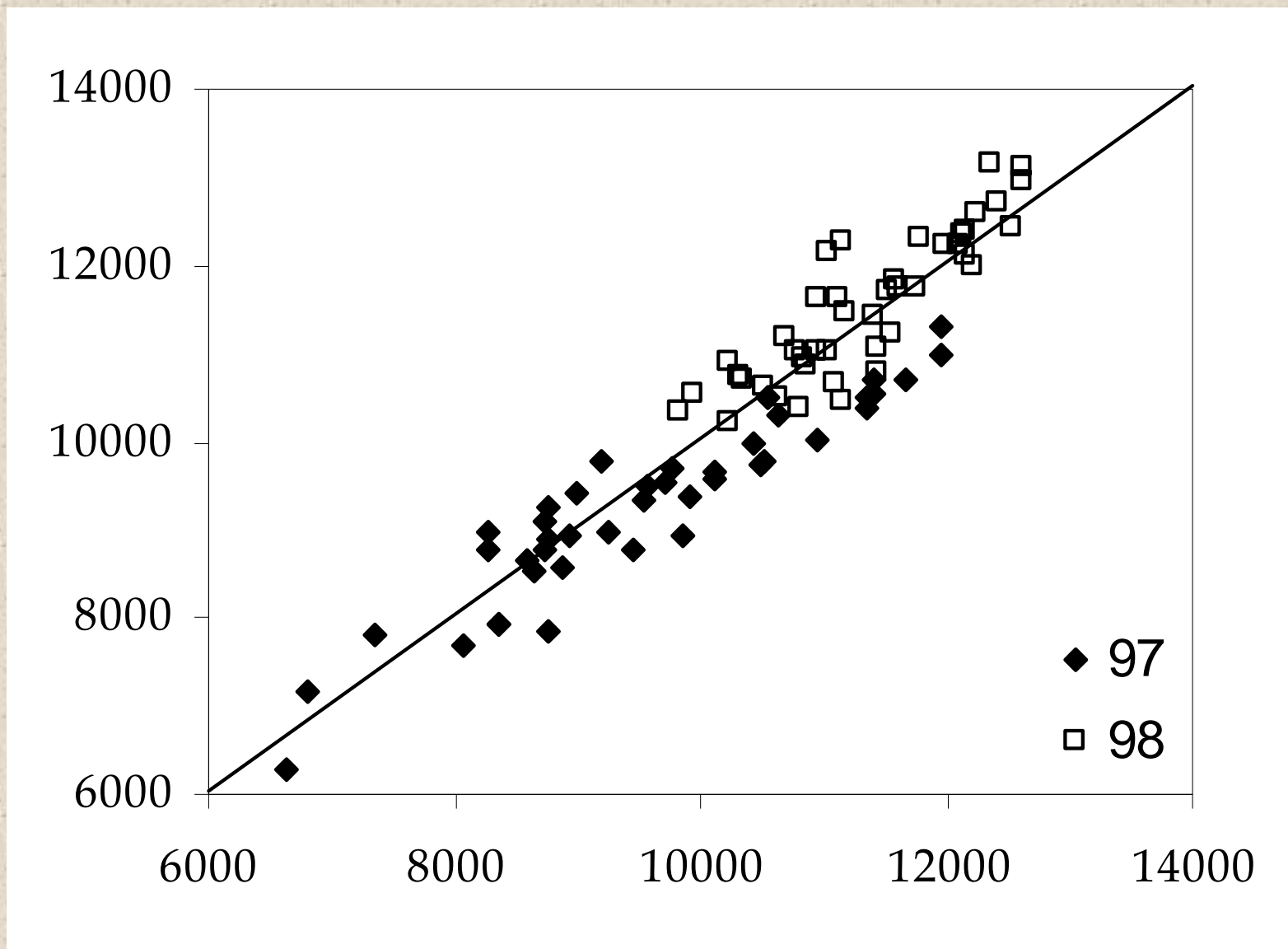
# Simulated and Measured Soybean



*Testing model predictions, Soybean in Georgia (1987-1996)*



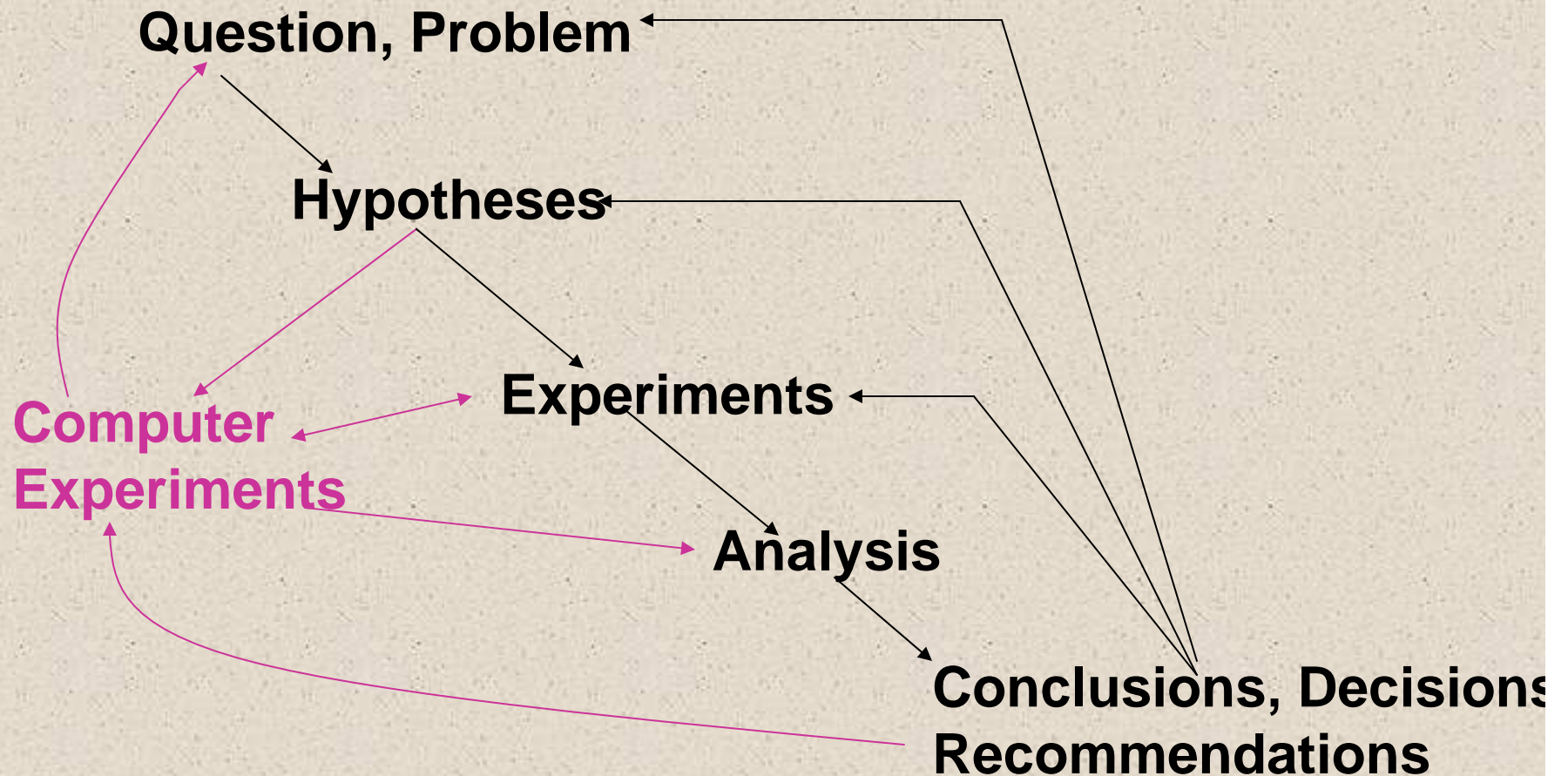
With accurate inputs, crop models can accurately predict yield



Simulated versus observed maize grain yield, two years, using field-measured spatially varying soil parameters in Michigan. R. Braga (2000).



# Incorporating **Crop Models** into Traditional Agronomic Research



# Need for Modeling, Systems Approach

- Complex problems, Interdisciplinary Research Needed
- Increased demands for agricultural products
- Increased pressures on natural resources
- Rapid changes in technology, ...
- Globalization of trade, economies
- Information needed for decision making
- Gap between information needed and that created by disciplinary research
- Trial & Error approach to agricultural research is inadequate
- Integration of knowledge is essential